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Computing Research Association
Uniting Industry, Academia and Government to Advance Computing Research and Change the World.

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CRN At-A-Glance

## 2017 CRA Taulbee Survey: Another Year of Record Undergrad Enrollment; Doctoral Degree Production Steady While Master's Production Rises Again

This article and the accompanying figures and tables present the results from the 47th annual CRA Taulbee Survey. The survey, conducted annually by the Computing Research Association, documents trends in student enrollment, degree production, employment of graduates, and faculty salaries in academic units in the United States and Canada that grant the Ph.D. in computer science (CS), computer engineering (CE), or information (I). Most of these academic units are departments, but some are colleges or schools of information or computing. In this report, we will use the term "department" to refer to the unit offering the program.

See page 2 for full article.

> Expanding the Pipeline: 2018 CRA-W Grad Cohort for Women Inspires Attendees to Persist in Computing

On April 13-14, more than 400 women graduate students in computing from more than 150 institutions converged on San Francisco, CA, for the 2018 CRA-W Graduate Cohort for Women (CRA-W Grad Cohort). Throughout the two-day workshop, professional connections were made, new friendships were formed, and mentoring relationships with senior researchers were established. CRA-W organizes this workshop as part of its mission to increase the success and participation of women in computing research.

See page 58 for article.

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By Stuart Zweben and Betsy Bizot


#### Abstract

This article and the accompanying figures and tables present the results from the 47th annual CRA Taulbee Survey'. The survey, conducted annually by the Computing Research Association, documents trends in student enrollment, degree production, employment of graduates, and faculty salaries in academic units in the United States and Canada that grant the Ph.D. in computer science (CS), computer engineering (CE), or information (I)². Most of these academic units are departments, but some are colleges or schools of information or computing. In this report, we will use the term "department" to refer to the unit offering the program.


CRA gathers survey data during the fall. Responses received by February 9, 2018 are included in the analysis. The period covered by the data varies from table to table. Degree production and enrollment (Ph.D., Master's, and Bachelor's) refer to the previous academic year (2016-17). Data for new students in all categories refer to the current academic year (2017-18). Projected student production and information on faculty salaries are also for the current academic year; salaries are those effective January l, 2018.

We surveyed a total of 281 Ph.D.-granting departments; we received salary responses from 171 and main survey responses from 168, for a total of 181 departments responding to one or both parts of the survey. This is similar to last year's 183 respondents, although the overall response rate of 64 percent is lower than last year's 68 percent. The response rates from CE and Canadian departments in particular continue to be low. The U.S. CS response rate of 77 percent is, as usual, the highest of all of the categories, although it also dropped from last year's 80 percent. Figure 1 shows the history of the survey's response rates. Response rates are inexact because some departments provide only partial data, and some institutions provide a single joint response for multiple departments. Thus, in some tables the number of departments shown as reporting will not equal the overall total number of respondents shown in Figure 1 for that category of department.

To account for the changes in response rate, we will comment not only on aggregate totals but also on averages per department reporting or data from those departments that responded to both 2016 and 2017 surveys. This is a more meaningful indication of the one-year changes affecting the data.

Departments that responded to the survey were sent preliminary results about faculty salaries in December 2017; these results included additional distributional information not contained in this report. The CRA Board views this as a benefit of participating in the survey.

Degree, enrollment, and faculty salary data for the U.S CS departments are stratified according to: a) whether the institution is public or private; and b) the tenure-track faculty size of the reporting department. The faculty size strata deliberately overlap, so that data from most departments affect multiple strata. This may be especially useful to departments near the boundary of one stratum. Salary data is also stratified according to the population of the locale in which the institution is located ${ }^{3}$. These stratifications allow our readers to see multiple views of important data, and hopefully gain new insights from them. In addition to tabular presentations of data, we will use "box and whisker" diagrams to show medians, quartiles, and the range between the $10^{\text {th }}$ and $90^{\text {th }}$ percentile data points.

For the first time this year, we requested information about supported master's students. The information collected is comparable to that about supported doctoral students, which we have been collecting and reporting for many years. The results are reported in the section on Graduate Student Support. Also in this year's report, we provide a summary of course-level enrollment data. We began collecting this in last year's survey to monitor continuing changes after the publication of the Generation-CS report. This data helps us understand enrollment trends at a somewhat finer level of detail than the aggregated data we have been gathering previously.

We thank all of the respondents to this year's questionnaire. The participating departments are listed at the end of this article. CRA member respondents will again be given the opportunity to obtain certain survey information for a self-selected peer group. Instructions for doing this will be emailed to all such departments.

## 2017 CRA Taulbee Survey (continued)

Computing Research Association

Figure 1. Number of Respondents to the Taulbee Survey

| Year | US CS Depts. | US CE Depts. | Canadian | US Information | Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1995 | 110/133 (83\%) | 9/13 (69\%) | 11/16 (69\%) |  | 130/162 (80\%) |
| 1996 | 98/131 (75\%) | 8/13 (62\%) | 9/16 (56\%) |  | 115/160 (72\%) |
| 1997 | 111/133 (83\%) | 6/13 (46\%) | 13/17 (76\%) |  | 130/163 (80\%) |
| 1998 | 122/145 (84\%) | 7/19 (37\%) | 12/18 (67\%) |  | 141/182 (77\%) |
| 1999 | 132/156 (85\%) | 5/24 (21\%) | 19/23 (83\%) |  | 156/203 (77\%) |
| 2000 | 148/163 (91\%) | 6/28 (21\%) | 19/23 (83\%) |  | 173/214 (81\%) |
| 2001 | 142/164 (87\%) | 8/28 (29\%) | 23/23 (100\%) |  | 173/215 (80\%) |
| 2002 | 150/170 (88\%) | 10/28 (36\%) | 22/27 (82\%) |  | 182/225 (80\%) |
| 2003 | 148/170 (87\%) | 6/28 (21\%) | 19/27 (70\%) |  | 173/225 (77\%) |
| 2004 | 158/172 (92\%) | 10/30 (33\%) | 21/27 (78\%) |  | 189/229 (83\%) |
| 2005 | 156/174 (90\%) | 10/31 (32\%) | 22/27 (81\%) |  | 188/232 (81\%) |
| 2006 | 156/175 (89\%) | 12/33 (36\%) | 20/28 (71\%) |  | 188/235 (80\%) |
| 2007 | 155/176 (88\%) | 10/30 (33\%) | 21/28 (75\%) |  | 186/234 (79\%) |
| 2008 | 151/181 (83\%) | 12/32 (38\%) | 20/30 (67\%) | 9/19 (47\%) | 192/264 (73\%) |
| 2009 | 147/184 (80\%) | 13/31 (42\%) | 16/30 (53.3\%) | 12/20 (60\%) | 188/265 (71\%) |
| 2010 | 150/184 (82\%) | 12/30 (40\%) | 18/29 (62\%) | 15/22 (68\%) | 195/265 (74\%) |
| 2011 | 142/185 (77\%) | 13/31 (42\%) | 13/30 (43\%) | 16/21 (76\%) | 184/267 (69\%) |
| 2012 | 152/189 (80\%) | 11/32 (34\%) | 14/30 (47\%) | 16/26 (62\%) | 193/277 (70\%) |
| 2013 | 144/188 (77\%) | 10/30 (33\%) | 14/26 (54\%) | 11/22 (50\%) | 179/266 (67\%) |
| 2014 | 143/188 (76\%) | 13/31 (42\%) | 12/26 (46\%) | 13/19 (68\%) | 181/268 (68\%) |
| 2015 | 146/190 (77\%) | 8/32 (25\%) | 12/26 (46\%) | 12/18 (67\%) | 178/266 (67\%) |
| 2016 | 150/188 (80\%) | 8/33 (24\%) | 11/26 (42\%) | 14/21 (67\%) | 183/268 (68\%) |
| 2017 | 148/192 (77\%) | 8/35 (23\%) | 11/30 (37\%) | 14/24 (58\%) | 181/281 (64\%) |

## Doctoral Degree Production, Enrollment, and Employment

## (Tables DI-DIO; Figures DI-D6)

## Degree Production

On a per department basis, doctoral degree production held steady in 2016-17. This year's respondents produced 13.1 degrees per U.S. CS department, and 12.4 degrees per department overall. This compares with 12.9 and 12.3 , respectively, reported last year. Fewer departments reported their Ph.D. production this year, so Table DI shows 1,834 degrees produced in 2016-17 compared with 1,888 in 2015-16.

Among all departments reporting both this year and last year, the number of total doctoral degrees increased by 1.2 percent. Among U.S. CS departments reporting both years, the increase was 0.8 percent.

Women received 18.3 percent of CS doctoral degrees and 19.3 percent of all doctoral computing degrees (Table D2). Both values represent an increase from last year. The CS percentage is the same as it was two years ago. The ethnicity profile of CS doctoral graduates is similar to what it has been for the past two years, except that the proportion of resident Asians increased this year while the proportion of Non-resident Aliens decreased, each between one and two percentage points. The percentage of CS doctoral graduates who were American Indian or Alaska Native, Black or African American, Native Hawaiian/Pacific Islander, Hispanic, or Multiracial Non-Hispanic totaled less than 3 percent again this year. CE and I degree areas also reported a decreased percentage of Non-resident Alien doctoral graduates, following an increase last year. These areas each had a corresponding increase in the proportion of degrees going to resident Asians and Whites.

## 2017 CRA Taulbee Survey (continued)

## Doctoral Program Enrollment

Among programs that reported both years, total doctoral enrollment increased by 3.0 percent. If only U.S. computer science departments are considered, the increase was 3.7 percent (Table I). For the second straight year, total doctoral enrollment by gender is more diverse compared with last year in all department areas (CS, CE, and I). The overall fraction of current doctoral students who are women is 22.1 percent, versus 21.6 percent last year (Table D7). The fraction of doctoral

Table DI. PhD Production and Pipeline by Department Type

| Department Type | \# Depts | PhDs Awarded |  | PhDs Next Year |  | Passed Qualifier |  | Passed Thesis (if dept has) |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | \# | Avg/ Dept | \# | Avg/ Dept | \# | Avg/ Dept | \# | \# Dept | Avg/ Dept |
| US CS Public | 93 | 1,166 | 13.1 | 1,300 | 14.0 | 1,384 | 16.3 | 940 | 73 | 11.8 |
| US CS Private | 31 | 391 | 13.0 | 538 | 17.4 | 497 | 15.5 | 213 | 24 | 8.8 |
| US CS Total | 124 | 1,557 | 13.1 | 1,838 | 14.8 | 1,881 | 16.1 | 1,153 | 97 | 11.1 |
| US CE | 7 | 59 | 8.4 | 94 | 13.4 | 151 | 30.2 | 135 | 5 | 28.9 |
| US Info | 13 | 78 | 6.5 | 125 | 9.6 | 110 | 8.5 | 89 | 11 | 8.0 |
| Canadian | 11 | 140 | 14.0 | 155 | 14.1 | 82 | 10.3 | 89 | 7 | 12.8 |
| Grand Total | 93 | 1,834 | 12.4 | 2,212 | 14.3 | 2,224 | 15.6 | 1,466 | 120 | 12.0 |

Table D2. PhDs Awarded by Gender

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
| Male | 1,298 | $81.7 \%$ | 98 | $89.1 \%$ | 78 | $60.9 \%$ | 1,474 | $80.7 \%$ |
| Female | 291 | $18.3 \%$ | 12 | $10.9 \%$ | 50 | $39.1 \%$ | 353 | $19.3 \%$ |
| Total Known Gender | 1,589 |  | 110 |  | 128 |  | 1,827 |  |
| Gender Unknown | 3 |  | 0 |  | 4 |  | 7 |  |
| Grand Total | 1,592 |  | 110 |  | 132 |  | 1,834 |  |

Table D3. PhDs Awarded by Ethnicity

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Nonresident Alien | 891 | $62.3 \%$ | 54 | $55.7 \%$ | 42 | $35.0 \%$ | 987 | $59.9 \%$ |
| Amer Indian or Alaska Native | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ |
| Asian | 130 | $9.1 \%$ | 16 | $16.5 \%$ | 12 | $10.0 \%$ | 158 | $9.6 \%$ |
| Black or African-American | 10 | $0.7 \%$ | 0 | $0.0 \%$ | 8 | $6.7 \%$ | 18 | $1.1 \%$ |
| Native Hawaiian/Pac Islander | 1 | $0.1 \%$ | 0 | $0.0 \%$ | 1 | $0.8 \%$ | 2 | $0.1 \%$ |
| White | 371 | $25.9 \%$ | 24 | $24.7 \%$ | 48 | $40.0 \%$ | 443 | $26.9 \%$ |
| Multiracial, not Hispanic | 4 | $0.3 \%$ | 1 | $1.0 \%$ | 2 | $1.7 \%$ | 7 | $0.4 \%$ |
| Hispanic, any race | 24 | $1.7 \%$ | 2 | $2.1 \%$ | 7 | $5.8 \%$ | 33 | $2.0 \%$ |
| Total Residency \& Ethnicity Known | 1,431 |  | 97 |  | 120 |  | 1,648 |  |
| Resident, ethnicity unknown | 91 |  | 1 |  | 4 |  | 96 |  |
| Residency unknown | 70 |  | 12 |  | 8 |  | 90 |  |
| Grand Total | 1,592 |  | 110 |  | 139 |  | 1,834 |  |

Table D4. Employment of New PhD Recipients By Specialty

|  |  |  |  |  |  | 6u!̣ndmoう әэиешлодəд-4б! |  |  |  |  |  |  |  |  |  |  |  |  |  | $\begin{aligned} & \overline{\text { ¢ }} \\ & \stackrel{5}{\square} \end{aligned}$ | $\begin{aligned} & \overline{\bar{\circ}} \\ & \stackrel{\rightharpoonup}{\circ} \end{aligned}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| North American PhD Granting Depts. |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Tenure-track | 22 | 3 | 11 | 2 | 5 | 4 | 12 | 5 | 10 | 5 | 8 | 2 | 2 | 2 | 0 | 14 | 0 | 9 | 2 | 11 | 129 | 9.1\% |
| Researcher | 2 | 0 | 0 | 1 | 0 | 1 | 3 | 2 | 1 | 1 | 2 | 3 | 2 | 0 | 1 | 4 | 0 | 1 | 1 | 2 | 27 | 1.9\% |
| Postdoc | 28 | 1 | 8 | 10 | 4 | 2 | 1 | 6 | 3 | 2 | 7 | 2 | 12 | 12 | 1 | 12 | 1 | 4 | 15 | 20 | 151 | 10.7\% |
| Teaching Faculty | 7 | 5 | 4 | 1 | 4 | 3 | 5 | 2 | 3 | 0 | 4 | 0 | 1 | 1 | 1 | 3 | 0 | 3 | 0 | 7 | 54 | 3.8\% |
| North American, Other Academic |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Other CS/CE/I Dept. | 1 | 0 | 3 | 1 | 0 | 0 | 3 | 1 | 2 | 0 | 3 | 0 | 1 | 1 | 0 | 4 | 0 | 2 | 3 | 7 | 32 | 2.3\% |
| Non-CS/CE/I Dept | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 3 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 7 | 0.5\% |
| North American, Non-Academic |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Industry | 116 | 2 | 57 | 48 | 45 | 38 | 34 | 22 | 4 | 11 | 62 | 29 | 28 | 54 | 5 | 58 | 8 | 77 | 37 | 106 | 841 | 59.4\% |
| Government | 2 | 0 | 0 | 2 | 1 | 3 | 1 | 0 | 2 | 1 | 1 | 1 | 0 | 0 | 1 | 7 | 1 | 2 | 0 | 4 | 29 | 2.0\% |
| Self-Employed | 8 | 0 | 1 | 1 | 1 | 1 | 2 | 0 | 2 | 0 | 0 | 2 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 20 | 1.4\% |
| Unemployed | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 3 | 0.2\% |
| Other | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 0 | 0 | 0 | 1 | 0 | 2 | 3 | 2 | 2 | 0 | 7 | 22 | 1.6\% |

Total Inside North America

|  | 188 |  | 1 | 84 | 67 | 60 |  | 2 | 61 | 41 | 32 | 20 | 87 | 40 | 47 | 71 | 11 | 106 | 12 | 101 | 59 | 165 | 1,315 | 92.8\% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Outside North America |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Ten-Track in PhD | 2 | 0 | 3 |  |  | 0 | 1 | 4 | 1 |  | 5 | 0 | 1 | 1 | 0 | 0 | 1 | 2 | 0 | 3 | 2 | 4 | 31 | 2.2\% |
| Researcher in PhD | 1 | 0 | 0 |  | 0 | 1 | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 1 | 0 | 4 | 0.3\% |
| Postdoc in PhD | 6 | 0 | 0 |  | 0 | 1 | 0 | 3 | 0 |  | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 3 | 1 | 18 | 1.3\% |
| Teaching in PhD | 0 | 0 | 1 |  | 0 | 0 | 0 | 1 | 0 |  | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 3 | 0 | 1 | 7 | 0.5\% |
| Other Academic | 1 | 0 | 0 |  | 0 | 1 | 0 | 1 | 0 |  | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 1 | 1 | 1 | 0 | 0 | 8 | 0.6\% |
| Industry | 5 | 0 | 2 |  | 3 | 0 | 0 | 2 | 0 |  | 0 | 1 | 2 | 0 | 1 | 1 | 0 | 1 | 1 | 1 | 1 | 3 | 24 | 1.7\% |
| Government | 0 | 1 | 1 |  |  | 0 | 0 | 0 | 0 |  | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 5 | 0.4\% |
| Self-Employed | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.0\% |
| Unemployed | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.0\% |
| Other | 0 | 0 | 0 |  | 0 | 0 | 0 | 0 | 0 |  | 1 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 5 | 0.4\% |
| Total Outside NA | 15 | 1 | 7 |  | 5 | 3 | 1 | 11 | 1 |  | 6 | 3 | 7 | 1 | 2 | 1 | 1 | 5 | 3 | 11 | 7 | 11 | 102 | 7.2\% |

Total with Employment Data, Inside North America plus Outside North America

|  | 203 | 12 | 91 | 72 | 63 | 53 | 72 | 42 | 38 | 23 | 94 | 41 | 49 | 72 | 12 | 11 | 15 | 112 | 66 | 176 | 1,417 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Employment Type \& Location Unknown |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
|  | 43 | 2 | 19 | 21 | 16 | 5 | 11 | 7 | 2 | 5 | 17 | 7 | 2 | 8 | 3 | 9 | 2 | 14 | 18 | 206 | 417 |
| Grand Total | 246 | 14 | 110 | 93 | 79 | 58 | 83 | 49 | 40 | 28 | 11 | 48 | 51 | 80 | 15 | 120 | 17 | 126 | 84 | 382 | 1,834 |

## 2017 CRA Taulbee Survey (continued)

Among those pursuing I degrees, 58 percent of the men and 61 percent of the women are Non-resident Aliens or Resident Asians. Last year these percentages were 59 and 54, respectively. This year, Whites comprise a higher percentage of men than they do women among those pursuing I degrees; last year, the reverse was true (Table DIO).

At U.S. CS departments, the average number of students per department who passed qualifier exams in 2016-17 was 16.1. For the past three years, this average was between 13.9 and 14.3. Both public and private

Table D4a. Detail of Industry Employment

|  |  |  |  |  |  |  |  |  |  |  | $\begin{aligned} & \text { n } \\ & \text { sì } \\ & \sum_{0}^{0} \\ & \frac{10}{2} \\ & \hline \end{aligned}$ |  | $\bar{⿹}$ 0 0 0 0 0 $\vdots$ 0 0 $\vdots$ $\vdots$ $\vdots$ 0 0 0 0 0 0 0 0 0 |  |  |  |  |  |  | $\begin{aligned} & \stackrel{\rightharpoonup}{ \pm} \\ & \stackrel{\rightharpoonup}{\leftrightarrows} \end{aligned}$ | $\begin{aligned} & \stackrel{\rightharpoonup}{0} \\ & \stackrel{\rightharpoonup}{\circ} \end{aligned}$ |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Inside North America |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Research | 82 | 1 | 21 | 20 | 27 | 14 | 20 | 14 | 3 | 6 | 21 | 12 | 15 | 40 | 3 | 24 | 2 | 34 | 17 | 23 | 28 | 427 | 50.8\% |
| Non-Research | 18 | 1 | 29 | 20 | 16 | 22 | 12 | 6 | 1 | 1 | 27 | 15 | 11 | 6 | 1 | 23 | 6 | 39 | 9 | 17 | 12 | 292 | 34.7\% |
| Postdoctorate | 0 | 0 | 2 | 1 | 0 | 2 | 0 | 1 | 0 | 0 | 4 | 1 | 2 | 1 | 1 | 2 | 0 | 0 | 4 | 3 | 2 | 26 | 3.1\% |
| Type Not Specified | 16 | 0 | 5 | 7 | 2 | 0 | 2 | 1 | 0 | 4 | 10 | 1 | 0 | 7 | 0 | 9 | 0 | 4 | 7 | 17 | 4 | 96 | 11.4\% |
| Total Inside NA | 116 | 2 | 57 | 48 | 45 | 38 | 34 | 22 | 4 | 11 | 62 | 29 | 28 | 54 | 5 | 58 | 8 | 77 | 37 | 60 | 46 | 841 |  |
| Outside North America |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Research | 3 | 0 | 2 | 3 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 13 | 54.2\% |
| Non-Research | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 0 | 1 | 0 | 0 | 1 | 1 | 1 | 0 | 1 | 1 | 8 | 33.3\% |
| Postdoctorate | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0.0\% |
| Type Not Specified | 2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 3 | 12.5\% |
| Total Outside NA | 5 | 0 | 2 | 3 | 0 | 0 | 2 | 0 | 0 | 1 | 2 | 0 | 1 | 1 | 0 | 1 | 1 | 1 | 1 | 1 | 2 | 24 |  |

Table D5. New PhD Students by Department Type

|  | CS |  |  |  | CE |  |  |  | Total |  |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Department <br> Type | New <br> Admit | MS <br> to <br> PhD | Total | Avg. <br> per <br> Dept. | New <br> Admit | MS to <br> PhD | Total | Avg. <br> per <br> Dept. | New <br> Admit | MS to <br> PhD | Avg. <br> Total <br> per <br> Dept. | Total | Avg. <br> per <br> Dept |  |
| US CS Public | 1,668 | 135 | 1,803 | 18.8 | 112 | 3 | 115 | 7.2 | 84 | 0 | 84 | 10.5 | 2,002 | 20.6 |
| US CS Private | 781 | 61 | 842 | 24.1 | 12 | 1 | 13 | 2.6 | 17 | 1 | 18 | 6.0 | 873 | 24.9 |
| US CS Total | 2,449 | 196 | 2,645 | 20.2 | 124 | 4 | 128 | 6.1 | 101 | 1 | 102 | 9.3 | 2,875 | 21.8 |
| US CE | 0 | 0 | 0 | 0.0 | 56 | 35 | 91 | 13.0 | 0 | 0 | 0 | 0.0 | 91 | 13.0 |
| US Information | 9 | 0 | 9 | 9.0 | 0 | 0 | 0 | 0.0 | 126 | 5 | 131 | 9.4 | 140 | 10.0 |
| Canadian | 141 | 17 | 158 | 14.4 | 0 | 0 | 0 | 0.0 | 0 | 0 | 0 | 0.0 | 158 | 14.4 |
| Grand Total | 2,599 | 213 | 2,812 | 19.7 | 180 | 39 | 219 | 7.8 | 227 | 6 | 233 | 9.3 | 3,264 | 19.9 |

Table D5a. New PhD Students from Outside North America

| Department <br> Type | CS | CE | $\mathbf{I}$ | Total New <br> Outside | Total New | \% outside <br> North <br> America |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 1,226 | 88 | 44 | 1,358 | 2,002 | $67.8 \%$ |
| US CS Private | 488 | 8 | 14 | 510 | 873 | $58.4 \%$ |
| Total US CS | 1,714 | 96 | 58 | 1,868 | 2,875 | $65.0 \%$ |
| US CE | 0 | 61 | 0 | 61 | 91 | $67.0 \%$ |
| US Info | 4 | 0 | 72 | 76 | 140 | $54.3 \%$ |
| Canadian | 101 | 0 | 0 | 101 | 158 | $63.9 \%$ |
| Grand Total | 1,819 | 157 | 130 | 2,106 | 3,264 | $64.5 \%$ |

Table D6. PhD Enrollment by Department Type

| Department Type | \# Depts | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 99 | 9,336 | $66.2 \%$ | 511 | $66.2 \%$ | 410 | $66.2 \%$ | 10,257 | $66.2 \%$ |
| US CS Private | 36 | 3,353 | $24.2 \%$ | 81 | $24.2 \%$ | 165 | $24.2 \%$ | 3,599 | $24.2 \%$ |
| Total US CS | 135 | 12,689 | $90.3 \%$ | 592 | $90.3 \%$ | 575 | $90.3 \%$ | 13,856 | $90.3 \%$ |
| US CE | 6 | 0 | $0.1 \%$ | 549 | $0.1 \%$ | 0 | $0.1 \%$ | 549 | $0.1 \%$ |
| US Info | 14 | 37 | $0.2 \%$ | 0 | $0.2 \%$ | 652 | $0.2 \%$ | 689 | $0.2 \%$ |
| Canadian | 11 | 832 | $9.3 \%$ | 25 | $9.3 \%$ | 0 | $9.3 \%$ | 857 | $9.3 \%$ |
| Grand Total | 166 | 13,558 |  | 1,166 |  | 1,227 |  | 15,951 |  |

Table D7. PhD Enrollment by Gender

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Male | 10,251 | $78.9 \%$ | 957 | $82.1 \%$ | 669 | $60.7 \%$ | 11,877 | $77.9 \%$ |
| Female | 2,734 | $21.1 \%$ | 208 | $17.9 \%$ | 434 | $39.3 \%$ | 3,376 | $22.1 \%$ |
| Total Known <br> Gender | 12,985 |  | 1,165 |  | 1,103 |  | 15,253 |  |
| Gender Unknown | 573 |  | 1 |  | 124 |  | 698 |  |
| Grand Total | 13,558 |  | 1,166 |  | 1,227 |  | 15,951 |  |

Table D8. PhD Enrollment by Ethnicity

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Nonresident Alien | 8,058 | $64.3 \%$ | 750 | $68.1 \%$ | 507 | $46.7 \%$ | 9,315 | $63.2 \%$ |
| Amer Indian or Alaska Native | 22 | $0.2 \%$ | 0 | $0.0 \%$ | 3 | $0.3 \%$ | 25 | $0.2 \%$ |
| Asian | 1069 | $8.5 \%$ | 99 | $9.0 \%$ | 108 | $9.9 \%$ | 1276 | $8.7 \%$ |
| Black or African-American | 170 | $1.4 \%$ | 17 | $1.5 \%$ | 54 | $5.0 \%$ | 241 | $1.6 \%$ |
| Native Hawaiian/Pac Islander | 32 | $0.3 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 32 | $0.2 \%$ |
| White | 2,884 | $23.0 \%$ | 194 | $17.6 \%$ | 371 | $34.2 \%$ | 3,449 | $23.4 \%$ |
| Multiracial, not Hispanic | 73 | $0.6 \%$ | 18 | $1.6 \%$ | 12 | $1.1 \%$ | 103 | $0.7 \%$ |
| Hispanic, any race | 233 | $1.9 \%$ | 24 | $2.2 \%$ | 31 | $2.9 \%$ | 288 | $2.0 \%$ |
| Total Known | 12,541 |  | 1,102 |  | 1,086 |  | 14,729 |  |
| Resident, ethnicity unknown | 565 |  | 17 |  | 21 |  | 603 |  |
| Residency unknown | 452 |  | 47 |  | 120 |  | 619 |  |
| Grand Total | 13,558 |  | 1,166 |  | 1,227 |  | 15,951 |  |

Table D9. PhDs Awarded by Gender and Ethnicity, From 154 Departments

|  |  |  | CS |  |  |  |  | CE |  |  |  |  | I |  |  | Ethn Tot | icity <br> als |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | $\%$ of M* | \% of F* | Male | Fem | N/R | \% of M* | $\%$ of F* | Male | Fem | N/R | \% of M* | \% of F* | Total | \% |
| Nonresident Alien | 727 | 164 | 0 | 62 | 63 | 48 | 6 | 0 | 55 | 60 | 33 | 9 | 0 | 46 | 19 | 987 | 59.9 |
| Amer Indian or Alaska Native | - | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | - | 0.0 |
| Asian | 103 | 27 | 0 | 9 | 10 | 15 | 1 | 0 | 17 | 10 | 6 | 6 | 0 | 8 | 13 | 158 | 9.6 |
| Black or AfricanAmerican | 6 | 4 | 0 | 1 | 2 | 0 | 0 | 0 | 0 | 0 | 3 | 5 | 0 | 4 | 10 | 18 | 1.1 |
| Native Hawaiian/ Pac Islander | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 2 | 0.1 |
| White | 307 | 64 | 0 | 26 | 25 | 21 | 3 | 0 | 24 | 30 | 26 | 22 | 0 | 36 | 46 | 443 | 26.9 |
| Multiracial, not Hispanic | 4 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 2 | 0 | 0 | 3 | 0 | 7 | 0.4 |
| Hispanic, any race | 22 | 2 | 0 | 2 | 1 | 2 | 0 | 0 | 2 | 0 | 2 | 5 | 0 | 3 | 10 | 33 | 2.0 |
| Total Res \& Ethnicity Known | 1,170 | 261 | 0 | 0 | 0 | 87 | 10 | 0 |  |  | 72 | 48 | 0 |  |  | 1,648 |  |
| Resident, ethnicity unknown | 76 | 15 | 0 |  |  | 1 | 0 | 0 |  |  | 2 | 2 | 0 |  |  | 96 |  |
| Not Reported (N/R) | 52 | 15 | 3 |  |  | 10 | 2 | 0 |  |  | 4 | 0 | 4 |  |  | 90 |  |
| Gender Totals | 1,298 | 291 | 3 |  |  | 98 | 12 | 0 |  |  | 78 | 50 | 4 |  |  | 1,834 |  |
| \% | 81.7\% | 18.3\% |  |  |  | 89.1\% | 10.9\% |  |  |  | 60.9\% | 39.1\% |  |  |  |  |  |
| * \% of M and \% of F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table D10. PhD Enrollment by Gender and Ethnicity, From 164 Departments Providing Breakdown Data

|  | CS |  |  |  |  | CE |  |  |  |  | I |  |  |  |  | Ethnicity |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | $\begin{gathered} \% \text { of } \\ M^{*} \end{gathered}$ | $\begin{gathered} \text { \% of } \\ \mathrm{F}^{*} \end{gathered}$ | Male | Fem | N/R | $\begin{gathered} \% \text { of } \\ \mathbf{M}^{*} \end{gathered}$ | $\% \text { of }$ | Male | Fem | N/R | $\%$ of M* | \% of | Total | \% |
| Nonresident Alien | 6,125 | 1,689 | 244 | 64 | 66 | 627 | 123 | 0 | 69 | 62 | 303 | 193 | 11 | 49 | 52 | 9,315 | 63.2\% |
| Amer Indian or Alaska Native | 18 | 3 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 1 | 0 | 0 | 0 | 25 | 0.2\% |
| Asian | 783 | 249 | 37 | 8 | 10 | 75 | 24 | 0 | 8 | 12 | 58 | 32 | 5 | 9 | 9 | 1276 | 8.7\% |
| Black or AfricanAmerican | 107 | 58 | 5 | 1 | 2 | 12 | 5 | 0 | 1 | 3 | 24 | 21 | 2 | 4 | 6 | 241 | 1.6\% |
| Native Hawaiian/ Pac Islander | 21 | 11 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 32 | 0.2\% |
| White | 2,273 | 495 | 116 | 24 | 19 | 153 | 41 | 0 | 17 | 21 | 207 | 107 | 28 | 34 | 29 | 3,449 | 23.4\% |
| Multiracial, not Hispanic | 52 | 17 | 4 | 1 | 1 | 16 | 2 | 0 | 2 | 1 | 7 | 4 | 1 | 1 | 1 | 103 | 0.7\% |
| Hispanic, any race | 181 | 43 | 9 | 2 | 2 | 20 | 4 | 0 | 2 | 2 | 14 | 12 | 2 | 2 | 3 | 288 | 2.0\% |
| Total Res \& Ethnicity Known | 9,560 | 2,565 | 416 |  |  | 903 | 199 |  |  |  | 615 | 370 | 49 |  |  | 14,729 |  |
| Resident, ethnicity unknown | 448 | 106 | 11 |  |  | 17 | 0 |  |  |  | 16 | 4 | 1 |  |  | 603 |  |
| Not Reported (N/R) | 243 | 63 | 146 |  |  | 37 | 9 |  |  |  | 24 | 22 | 74 |  |  | 619 |  |
| Gender Totals | 10,251 | 2,734 | 573 |  |  | 957 | 208 |  |  |  | 669 | 434 | 124 |  |  | 15,951 |  |
| \% | 78.9\% | 21.1\% |  |  |  | 82.1\% | 17.9\% |  |  |  | 60.7\% | 39.3\% | 0 \% |  |  | 0.0\% |  |
| * \% of $M$ and \% of $F$ columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Figure DI. PhD Production CRA Taulbee Survey 2017


Figure D2. Nonresident Aliens as Fraction of PhD Enrollments
CRA Taulbee Survey 2017


Figure D3. PhD Degrees Granted by Tenure-Track Size
CRA Taulbee Survey 2017


Figure D4. PhD Enrollment Normalized by Tenure-Track Size
CRA Taulbee Survey 2017


Figure D5. CS Pipeline corrected for year of entry
CRA Taulbee Survey 2017


Figure D6. Employment Trends for New Ph.D.s
CRA Taulbee Survey 2017


## 2017 CRA Taulbee Survey (continued)

institutions reported increases. The average number per U.S. CS department who passed thesis candidacy exams in 2016-17 (most, but not all, departments have such exams) increased slightly from 2015-16, mainly due to increases at private institutions (Table DI).

The number of new Ph.D. students per department reporting increased this year compared with those from last year's reporting departments (Tables 1 and D5) in CS, CE and Canadian departments. There was somewhat of a decrease in I departments. Among all departments that reported both years, the number of new Ph.D. students increased 3.9 percent. If only U.S. CS departments that reported both years are considered, the increase was 4.1 percent.

The proportion of new doctoral students from outside North America rose this year to $64.5 \%$ from $62.0 \%$ last year. There were increases in all categories of departments, while last year there were decreases in all categories of departments (Table D5a).

Figure D5 shows a graphical view of the Ph.D. pipeline for U.S. computer science and Canadian departments, the main producers of CS doctoral degrees. The data in this graph are normalized by the number of reporting departments. The graph offsets the qualifier data by two years from the data for new students, and offsets the graduation data by five years from the data for new students.

These data have been useful in estimating the timing of changes in production rates. The graph suggests small growth in doctoral production during the next two years. However, departments are forecasting a double-digit percent increase in production during 2017-18 (Table DI). Last year's optimistic departmental production forecast was not realized.

## Ph.D. Employment

Figure D6 shows the employment trend of new Ph.D.s in academia and industry within North America, those taking employment outside of North America, and those going to academia in North America who took positions in departments other than Ph.D.-granting CS and CE departments. Table D4 shows a more detailed breakdown of the employment data for new Ph.D.s. The percentage of new Ph.D.s who took positions in North American industry was 59.4 percent, an increase from the 57.2 percent reported last year. Among those doctoral graduates who went to North American industry and for whom the type of industry position was known, about 57 percent took research positions (Table D4a). This is lower than the 60 percent reported in 2016, but the same as the percentage in 2015. This year, definitive data was provided for 89 percent of the graduates who went to North American industry, slightly less than the 91 percent last year.

Table 1. Degree Production and Enrollment Change From Previous Year

|  | Total |  |  |  |  |  | Only Departments Responding Both Years |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | US CS Only |  |  | All Departments |  |  | US CS Only |  |  | All Departments |  |  |
| PhDs | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg |
| PhD Awarded | 1,655 | 1,557 | -5.9\% | 1,888 | 1,834 | -2.9\% | 1,444 | 1,456 | 0.8\% | 1,633 | 1,653 | 1.2\% |
| \#Units PhD Awd | 128 | 119 | -7.0\% | 154 | 148 | -3.9\% | 108 | 108 |  | 129 | 129 |  |
| PhD Enrollment | 13,243 | 13,856 | 4.6\% | 15,093 | 15,951 | 5.7\% | 12,836 | 13,310 | 3.7\% | 14,467 | 14,901 | 3.0\% |
| \#Units PhD Enr | 134 | 135 | 0.7\% | 164 | 166 | 1.2\% | 126 | 126 |  | 152 | 152 |  |
| New PhD Enroll | 2,672 | 2,875 | 7.6\% | 2,996 | 3,264 | 8.9\% | 2,604 | 2,710 | 4.1\% | 2,902 | 3,014 | 3.9\% |
| \#Units New PhD | 130 | 132 | 1.5\% | 161 | 164 | 1.9\% | 120 | 120 |  | 147 | 147 |  |
| Bachelor's | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg | 2016 | 2017 | \% chg |
| BS Awarded | 20,709 | 24,291 | 17.3\% | 25,508 | 29,587 | 16.0\% | 19,980 | 23,577 | 18.0\% | 24,125 | 28,178 | 16.8\% |
| \#Units BS Awd | 131 | 131 | 0.0\% | 156 | 157 | 0.6\% | 123 | 123 |  | 146 | 146 |  |
| BS Enrollment | 114,607 | 127,739 | 11.5\% | 136,589 | 153,610 | 12.5\% | 109,510 | 121,371 | 10.8\% | 130,903 | 141,670 | 8.2\% |
| \#Units BS Enr | 131 | 131 | 0.0\% | 155 | 160 | 3.2\% | 123 | 123 |  | 145 | 145 |  |
| New BS Majors | 27,266 | 30,734 | 12.7\% | 32,216 | 35,902 | 11.4\% | 26,011 | 27,139 | 4.3\% | 30,541 | 31,704 | 3.8\% |
| \#Units New BS | 112 | 113 | 0.9\% | 137 | 138 | 0.7\% | 101 | 101 |  | 123 | 123 |  |
| BS Enroll/Dept | 874.9 | 975.1 | 11.5\% | 881.2 | 960 | 9.0\% | 890 | 986.8 | 10.8\% | 902.8 | 97 | 8.2\% |

## 2017 CRA Taulbee Survey (continued)

CRA

After a two-year rise, the percentage of Ph.D. graduates who took North American academic jobs fell in 2016-17 to 28.2 from 30.7 last year. However, the percentage of graduates taking tenure-track positions in North American doctoral-granting computing departments rose slightly, from to 9.0 in 2015-16 to 9.8 in 2016-17. The percentage taking positions in North American non-Ph.D.-granting computing departments jumped from 1.6 percent in last year's report to 2.8 percent, while the percentage taking North American academic postdoctoral positions fell from 14.3 percent to 10.7 percent.

Among those whose employment is known, the proportion of Ph.D. graduates who were reported taking positions outside of North America was 7.2 percent, similar to last year's reported value. In 2016-17, 24 percent of those employed outside of North America went to industry. This is similar to the percentage reported for 2014-15, but lower than the 28 percent reported for 2015-16. About 30 percent went to tenuretrack academic positions, similar to last year's 33 percent, while approximately 18 percent went to academic postdoctoral positions, compared with 15 percent last year. Of the doctoral graduates who went to non-North American industry positions, there was a much greater balance between research and non-research positions than was the case last year. Last year, the positions were in research by more than a three-to-one margin, while this year the positions still favored research, but by less than two-to-one. Definitive data was provided for 88 percent of these graduates.

When academic and industry postdocs are combined, the result is that 13.8 percent of 2016-17 doctoral graduates whose employment was known took some type of postdoctoral position. This is lower than the 16.6 percent reported last year. Thirteen percent of these were industry postdocs, an increase over last year's 8 percent, indicating that academic postdocs were the basis for the overall decline.

The unemployment rate for new Ph.D.s again this year was below 1 percent. In 2016-17, 22.7 percent of new Ph.D.s' employment status was unknown; in 2015-16 it was 20.6 percent. The lack of information about the employment of more than one in five graduates may skew the real overall percentages for certain employment categories.

Table D4 also indicates the areas of specialty of new Ph.D.s. Artificial intelligence/machine learning, software engineering, security/information assurance, networks, and databases are the most popular areas of specialization for doctoral graduates, in that order. These five areas comprise almost 39 percent of all the doctoral degrees produced in 2016-17. The hardware/architecture, HCl , and HPC areas showed decent increases in degree production. There are many Ph.D.s categorized as "other," which includes "unknown." It is unclear how many of these are really "other" and how many were just not categorized.

Table MI. Master's Degrees Awarded by Department Type

| Department <br> Type | \# Depts | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 97 | 7,388 | $56.7 \%$ | 372 | $40.9 \%$ | 1,005 | $30.4 \%$ | 8,765 | $50.8 \%$ |
| US CS Private | 35 | 5,095 | $39.1 \%$ | 81 | $8.9 \%$ | 534 | $16.2 \%$ | 5,710 | $33.1 \%$ |
| Total US CS | 132 | 12,483 | $95.8 \%$ | 453 | $49.8 \%$ | 1,539 | $46.6 \%$ | 14,475 | $83.9 \%$ |
| US CE | 6 | 0 | $0.0 \%$ | 448 | $49.2 \%$ | 0 | $0.0 \%$ | 448 | $2.6 \%$ |
| US Inf0 | 12 | 39 | $0.3 \%$ | 0 | $0.0 \%$ | 1,763 | $53.4 \%$ | 1,802 | $10.4 \%$ |
| Canadian | 11 | 515 | $4.0 \%$ | 9 | $1.0 \%$ | 0 | $0.0 \%$ | 524 | $3.0 \%$ |
| Grand Total | 161 | 13,037 |  | 910 |  | 3,302 |  | 17,249 |  |

Table M2. Master’s Degrees Awarded by Gender

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Male | 8,956 | $73.9 \%$ | 710 | $78.0 \%$ | 1,690 | $54.3 \%$ | 11,356 | $70.4 \%$ |
| Female | 3,162 | $26.1 \%$ | 200 | $22.0 \%$ | 1,422 | $45.7 \%$ | 4,784 | $29.6 \%$ |
| Total Known Gender | 12,118 |  | 910 |  | 3,112 |  | 16,140 |  |
| Gender Unknown | 919 |  | 0 |  | 190 |  | 1,109 |  |
| Grand Total | 13,037 |  | 910 |  | 3,302 |  | 17,249 |  |

Table M3. Master's Degrees Awarded by Ethnicity

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Nonresident Alien | 8,813 | $73.8 \%$ | 675 | $76.1 \%$ | 1,589 | $49.9 \%$ | 11,077 | $69.2 \%$ |
| Amer Indian or Alaska Native | 23 | $0.2 \%$ | 0 | $0.0 \%$ | 2 | $0.1 \%$ | 25 | $0.2 \%$ |
| Asian | 921 | $7.7 \%$ | 41 | $4.6 \%$ | 252 | $7.9 \%$ | 1,214 | $7.6 \%$ |
| Black or African-American | 111 | $0.9 \%$ | 9 | $1.0 \%$ | 137 | $4.3 \%$ | 257 | $1.6 \%$ |
| Native Hawaiian/Pac Island | 3 | $0.0 \%$ | 1 | $0.1 \%$ | 2 | $0.1 \%$ | 6 | $0.0 \%$ |
| White | 1,842 | $15.4 \%$ | 126 | $14.2 \%$ | 1,040 | $32.7 \%$ | 3,008 | $18.8 \%$ |
| Multiracial, not Hispanic | 62 | $0.5 \%$ | 10 | $1.1 \%$ | 58 | $1.8 \%$ | 130 | $0.8 \%$ |
| Hispanic, any race | 173 | $1.4 \%$ | 25 | $2.8 \%$ | 102 | $3.2 \%$ | 300 | $1.9 \%$ |
| Total Residency \& Ethnicity Known | 11,948 |  | 887 |  | 3,182 |  | 16,017 |  |
| Resident, ethnicity unknown | 307 |  | 12 |  | 89 |  | 408 |  |
| Residency unknown | 782 |  | 11 |  | 31 |  | 824 |  |
| Grand Total | 13,037 |  | 910 |  | 3,302 |  | 17,249 |  |

Table M4. Master's Degrees Expected Next Year by Department Type

| Department <br> Type | \# <br> Depts | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 89 | 5,863 | $54.7 \%$ | 163 | $26.4 \%$ | 504 | $19.0 \%$ | 6,530 | $46.7 \%$ |
| US CS Private | 31 | 4,305 | $40.1 \%$ | 102 | $16.5 \%$ | 405 | $15.3 \%$ | 4,812 | $34.4 \%$ |
| Total US CS | 120 | 10,168 | $94.8 \%$ | 265 | $42.9 \%$ | 909 | $34.3 \%$ | 11,342 | $81.0 \%$ |
| US CE | 6 | 0 | $0.0 \%$ | 343 | $55.5 \%$ | 0 | $0.0 \%$ | 343 | $2.5 \%$ |
| US Info | 11 | 35 | $0.3 \%$ | 0 | $0.0 \%$ | 1,744 | $65.7 \%$ | 1,779 | $12.7 \%$ |
| Canadian | 11 | 523 | $4.9 \%$ | 10 | $1.6 \%$ | 0 | $0.0 \%$ | 533 | $3.8 \%$ |
| Grand Total | 148 | 10,726 |  | 618 |  | 2,653 |  | 13,997 |  |

Table M5. New Master's Students by Department Type

| Department Type | CS |  |  | CE |  |  | I |  |  | Total |  |  | Outside North America |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Total | Depts | Avg. per Dept. | Total | Depts | Avg. <br> per Dept. | Total | Depts | Avg. per Dept. | Total | Depts | Avg. per Dept. | Depts | \% |
| US CS Public | 7,994 | 96 | 83.3 | 301 | 17 | 17.7 | 797 | 10 | 79.7 | 9,092 | 96 | 94.7 | 5,714 | 62.8\% |
| US CS Private | 4,176 | 33 | 126.5 | 99 | 5 | 19.8 | 366 | 5 | 73.2 | 4,641 | 33 | 140.6 | 3,016 | 65.0\% |
| Total US CS | 12,170 | 129 | 94.3 | 400 | 22 | 18.2 | 1,163 | 15 | 77.5 | 13,733 | 129 | 106.5 | 8,730 | 63.6\% |
| US CE | 0 | 0 | 0.0 | 382 | 6 | 63.7 | 0 | 0 | 0.0 | 382 | 6 | 63.7 | 297 | 77.7\% |
| US Info | 18 | 1 | 18.0 | 0 | 0 | 0.0 | 1,651 | 12 | 137.6 | 1,669 | 12 | 139.1 | 714 | 42.8\% |
| Canadian | 679 | 11 | 61.7 | 9 | 1 | 9.0 | 0 | 0 | 0.0 | 688 | 11 | 62.5 | 295 | 42.9\% |
| Grand Total | 12,867 | 141 | 91.3 | 791 | 29 | 27.3 | 2,814 | 27 | 104.2 | 16,472 | 158 | 104.3 | 10,036 | 60.9\% |

## Master's and Bachelor's Degree Production and Enrollments

This section reports data about enrollment and degree production for master's and bachelor's programs in the doctoral-granting departments. Although the absolute number of degrees and enrolled students reported herein only reflect departments that offer the doctoral degree, the trends observed in the master's and bachelor's data from these departments tend to strongly reflect trends in the larger population of programs that offer such degrees.

## Master's

(Tables MI-M8;
Figures MI-M2)
On a per department basis, CS master's degree production in U.S. CS departments rose over 19 percent in 2016-17; this follows approximately 17 and 25 percent increases in the previous two years. Both public and private departments again reported large increases.

Table M6. Total Master's Enrollment by Department Type

| DepartmentType | CS |  |  | CE |  |  | I |  |  | Total |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Total | Depts | Avg. per Dept. | Total | Depts | Avg. per Dept. | Total | Depts | Avg. <br> per <br> Dept. | Total | Depts | Avg. per Dept. |
| US CS Public | 16,425 | 96 | 171.1 | 769 | 21 | 36.6 | 2,325 | 14 | 166.1 | 19,519 | 96 | 203.3 |
| US CS Private | 10330 | 34 | 303.8 | 322 | 6 | 53.7 | 1938 | 6 | 323.0 | 12590 | 35 | 359.7 |
| Total US CS | 26,755 | 130 | 205.8 | 1,091 | 27 | 40.4 | 4,263 | 20 | 213.2 | 32,109 | 131 | 245.1 |
| US CE | 0 | 0 | 0.0 | 974 | 7 | 139.1 | 0 | 0 | 0.0 | 974 | 7 | 139.1 |
| US Info | 74 | 1 | 74.0 | 0 | 0 | 0.0 | 4095 | 12 | 341.3 | 4169 | 12 | 347.4 |
| Canadian | 1237 | 11 | 112.5 | 27 | 1 | 27.0 | 0 | 0 | 0.0 | 1264 | 11 | 114.9 |
| Grand Total | 28,066 | 142 | 197.6 | 2,092 | 35 | 59.8 | 8,358 | 32 | 261.2 | 38,516 | 161 | 239.2 |

Table M7. Masters Degrees Awarded by Gender and Ethnicity, From 163 Departments Providing Breakdown Data

|  | CS |  |  |  |  | CE |  |  |  |  | I |  |  |  |  | Ethnicity |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | $\begin{aligned} & \% \\ & \text { \% } \\ & \text { M } \end{aligned}$ | $\begin{aligned} & \hline \% \\ & \text { of } \\ & F^{*} \end{aligned}$ | Male | Fem | N/R | $\begin{aligned} & \% \\ & \text { of } \\ & \mathbf{M}^{*} \end{aligned}$ | $\begin{aligned} & \% \\ & \text { of } \\ & F^{*} \end{aligned}$ | Male | Fem | N/R | $\begin{aligned} & \% \\ & \text { of } \\ & \mathbf{M}^{*} \end{aligned}$ | $\begin{aligned} & \hline \% \\ & \text { of } \\ & F^{*} \end{aligned}$ | Total | \% |
| Nonresident Alien | 6,094 | 2,462 | 257 | 71 | 81 | 514 | 161 | 0 | 74 | 83 | 923 | 595 | 71 | 57 | 43 | 11,077 | 69.2 |
| Amer Indian or Alaska Native | 13 | 10 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 25 | 0.2 |
| Asian | 641 | 272 | 8 | 7 | 9 | 31 | 10 | 0 | 5 | 5 | 137 | 109 | 6 | 8 | 8 | 1214 | 7.6 |
| Black or AfricanAmerican | 87 | 24 | 0 | 1 | 1 | 8 | 1 | 0 | 1 | 1 | 68 | 61 | 8 | 4 | 4 | 257 | 1.6 |
| Native Hawaiian/ Pac Islander | 3 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 6 | 0.0 |
| White | 1,579 | 250 | 13 | 18 | 8 | 110 | 16 | 0 | 16 | 8 | 436 | 529 | 75 | 27 | 38 | 3,008 | 18.8 |
| Multiracial, not Hispanic | 51 | 9 | 2 | 1 | 0 | 8 | 2 | 0 | 1 | 1 | 19 | 34 | 5 | 1 | 3 | 130 | 0.8 |
| Hispanic, any race | 139 | 32 | 2 | 2 | 1 | 22 | 3 | 0 | 3 | 2 | 46 | 49 | 7 | 3 | 4 | 300 | 1.9 |
| Total Res \& Ethnicity Known | 8,607 | 3,059 | 282 |  |  | 694 | 193 | 0 |  |  | 1,631 | 1,378 | 173 |  |  | 16,017 |  |
| Resident, ethnicity unknown | 228 | 61 | 18 |  |  | 8 | 4 | 0 |  |  | 47 | 42 | 0 |  |  | 408 |  |
| Not Reported (N/R) | 121 | 42 | 619 |  |  | 8 | 3 | 0 |  |  | 12 | 2 | 17 |  |  | 824 |  |
| Gender Totals | 8,956 | 3,162 | 919 |  |  | 710 | 200 | 0 |  |  | 1,690 | 1,422 | 190 |  |  | 17,249 |  |
| \% | 73.9\% | 26.1\% |  |  |  | 78.0\% | 22.0\% |  |  |  | 54.3\% | 45.7\% |  |  |  |  |  |
| * \% of M and \% of F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table M8. Masters Enrollment by Gender and Ethnicity, From 162 Departments Providing Breakdown Data

|  |  |  | CS |  |  |  |  | CE |  |  |  |  | I |  |  | $\begin{aligned} & \text { Eth } \\ & \text { To } \end{aligned}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | \% of M* | $\underset{F^{*}}{\%}$ | Male | Fem | N/R | \% of M* | \% of F* | Male | Fem | N/R | \% of M* | \% of F* | Total | \% |
| Nonresident Alien | 11,231 | 5,183 | 196 | 61 | 78 | 1,082 | 354 | 83 | 73 | 82 | 1,864 | 1,298 | 94 | 50 | 40 | 21,385 | 61.5 |
| Amer Indian or Alaska Native | 16 | 3 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 | 4 | 2 | 0 | 0 | 27 | 0.1 |
| Asian | 1793 | 620 | 18 | 10 | 9 | 81 | 27 | 0 | 5 | 6 | 319 | 205 | 16 | 9 | 6 | 3,079 | 8.9 |
| Black or AfricanAmerican | 341 | 81 | 2 | 2 | 1 | 22 | 4 | 0 | 2 | 1 | 232 | 182 | 19 | 6 | 6 | 883 | 2.5 |
| Native Hawaiian/ Pac Islander | 5 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 3 | 8 | 0 | 0 | 0 | 17 | 0.0 |
| White | 4,335 | 661 | 78 | 24 | 10 | 236 | 33 | 1 | 16 | 8 | 1,098 | 1,349 | 171 | 29 | 42 | 7,962 | 22.9 |
| Multiracial, not Hispanic | 191 | 38 | 2 | 1 | 1 | 6 | 6 | 0 | 0 | 1 | 50 | 65 | 4 | 1 | 2 | 362 | 1.0 |
| Hispanic, any race | 532 | 95 | 9 | 3 | 1 | 63 | 10 | 0 | 4 | 2 | 166 | 140 | 21 | 4 | 4 | 1,036 | 3.0 |
| Total Res \& Ethnicity Known | 18,444 | 6,682 | 305 |  |  | 1,491 | 434 | 84 |  |  | 3,733 | 3,251 | 327 |  |  | 34,751 |  |
| Resident, ethnicity unknown | 950 | 258 | 12 |  |  | 15 | 3 | 1 |  |  | 217 | 162 | 14 |  |  | 1632 |  |
| Not Reported (N/R) | 715 | 230 | 470 |  |  | 27 | 16 | 21 |  |  | 1 | 0 | 653 |  |  | 2,133 |  |
| Gender Totals | 20,109 | 7,170 | 787 |  |  | 1,533 | 453 | 106 |  |  | 3,951 | 3,413 | 994 |  |  | 38,516 |  |
| \% | 73.7\% | 26.3\% |  |  |  | 77.2\% | 22.8\% |  |  |  | 53.7\% | 46.3\% |  |  |  |  |  |
| * \% of M and \% of F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Overall production of master's degrees in the CE and Information areas also rose in 2015-16. Canadian departments showed a decline in master's production (Table MI).

The proportion of female graduates among CS master's degree recipients rose from 25.2 percent to 26.1 percent. The CE area also showed a small increase in gender diversity. The overall percentage of master's degrees to women increased only 0.2 to 29.6 percent, due to a drop in the I area from 47.9 percent to 45.7 percent (Table M2).

In CS, 73.8 percent of master's degrees went to Non-resident Aliens, a dip from the 75.6 percent in 2015-16. The CE area showed a bit of an increase, from 73.6 percent to 76.1 percent, while in the Information area, the percentage of the master's recipients that were Non-resident Aliens remained steady at 49.9 percent. The CS decline in non-resident Alien percentage was offset by slight gains by Whites and resident Asians. The percentage of master's recipients among American Indian/ Alaska Native, Black/African-American, Native Hawaiian/Pacific Islander, Hispanic, and Multiracial in CS was approximately 3 percent in 2016-17, similar to that reported last year. This percentage dropped in the I area from 10.6 percent to 9.5 percent (Table M3).

Non-resident Aliens again comprised a much larger proportion of female CS and CE degree recipients than male CS and CE degree recipients, while Whites again comprised a larger percentage of male CS and CE degree recipients than female CS and CE degree recipients (Table M7). In the I area, Non-resident Aliens again comprised a larger percentage of male master's graduates than female master's graduates, and Whites comprised a smaller fraction of male master's graduates than female master's graduates. The current enrollment breakdown by gender and ethnicity (Table M8) suggests that these observations will continue to be reflected in master's recipients in the near future.

The average number of new master's students enrolled in U.S. CS departments rose again this year, from 89.1 to 106.5. Once again, U.S. CS departments at both public and private institutions experienced increases (Table M5).

The fraction of new master's students in U.S. CS departments that is reported to be from outside North America dropped to 63.6 percent in 2017-18 from 67.5 percent in 2016-17 (Table M5). The fraction of new master's students at U.S. CS institutions is approximately at the level from 2015-16. This year's decrease was in departments at public institutions; private institutions showed an increase from 60.8 percent



## 2017 CRA Taulbee Survey (continued)

to 65.0 percent. At U.S. Information departments, the fraction of new master's students from outside North America dropped from 49.3 percent to 42.8 percent, following a large increase last year.

## Bachelor's

(Tables l, BI-B8; Figures BI-B4)
Bachelor's degree production continues its upward trend, with doubledigit percentage increases for the fourth consecutive year. Overall degree production, aggregated across all three areas of computing, is 15.3 percent higher at this year's reporting departments than it was at
last year's reporting departments. In U.S. CS departments, the increase is 17.3 percent. When considering only those departments that reported both years, the increase was 16.8 percent for all departments and 18.0 percent for U.S. CS departments (Table I). When only the CS area is considered, bachelor's degree production per department increased 21.2 percent at U.S. CS departments, and it increased 17.1 percent among all reporting departments (Table BI).

Figure Bl shows the trend in total computing bachelor's degree production since 1995 for all departments reporting to the Taulbee

Table BI. Bachelor's Degrees Awarded by Department Type

| Department <br> Type | \# Depts | CS |  | CE |  | I |  | Total |  |
| :--- | :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 96 | 15,345 | $68.7 \%$ | 1,910 | $64.5 \%$ | 1,869 | $43.6 \%$ | 19,124 | $64.6 \%$ |
| US CS Private | 35 | 4,562 | $20.4 \%$ | 277 | $9.4 \%$ | 328 | $7.7 \%$ | 5,167 | $17.5 \%$ |
| Total US CS | 131 | 19,907 | $89.1 \%$ | 2,187 | $73.9 \%$ | 2,197 | $51.3 \%$ | 24,291 | $82.1 \%$ |
| US CE | 6 | 0 | $0.0 \%$ | 756 | $25.5 \%$ | 0 | $0.0 \%$ | 756 | $2.6 \%$ |
| US Info | 10 | 129 | $0.6 \%$ | 0 | $0.0 \%$ | 1,738 | $40.6 \%$ | 1,867 | $6.3 \%$ |
| Canadian | 10 | 2,307 | $10.3 \%$ | 17 | $0.6 \%$ | 349 | $8.1 \%$ | 2,673 | $9.0 \%$ |
| Grand Total | 157 | 22,343 |  | 2,960 |  | 4,284 |  | 29,587 |  |

Table B2. Bachelor's Degrees Awarded by Gender

|  | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Male | 17,252 | $81.0 \%$ | 2,551 | $87.4 \%$ | 3,159 | $75.0 \%$ | 22,962 | $80.8 \%$ |
| Female | 4,036 | $19.0 \%$ | 369 | $12.6 \%$ | 1,054 | $25.0 \%$ | 5,459 | $19.2 \%$ |
| Total Known Gender | 21,288 |  | 2,920 |  | 4,213 |  | 28,421 |  |
| Gender Unknown | 1,055 |  | 40 |  | 71 |  | 1,166 |  |
| Grand Total | 22,343 |  | 2,960 |  | 4,284 |  | 29,587 |  |

Table B3. Bachelor's Degrees Awarded by Ethnicity

|  | CS |  | CE |  | I |  |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: |
| Nonresident Alien | 2,205 | $12.5 \%$ | 344 | $13.7 \%$ | 304 | $8.2 \%$ | 2,853 | $12.0 \%$ |  |
| Amer Indian or Alaska Native | 42 | $0.2 \%$ | 20 | $0.8 \%$ | 21 | $0.6 \%$ | 83 | $0.3 \%$ |  |
| Asian | 4,564 | $25.9 \%$ | 602 | $24.0 \%$ | 629 | $16.9 \%$ | 5,795 | $24.3 \%$ |  |
| Black or African-American | 547 | $3.1 \%$ | 88 | $3.5 \%$ | 258 | $6.9 \%$ | 893 | $3.7 \%$ |  |
| Native Hawaiian/Pac Islander | 45 | $0.3 \%$ | 4 | $0.2 \%$ | 49 | $1.3 \%$ | 98 | $0.4 \%$ |  |
| White | 8,402 | $47.6 \%$ | 1,174 | $46.8 \%$ | 1,893 | $51.0 \%$ | 11,469 | $48.1 \%$ |  |
| Multiracial, not Hispanic | 511 | $2.9 \%$ | 64 | $2.5 \%$ | 159 | $4.3 \%$ | 734 | $3.1 \%$ |  |
| Hispanic, any race | 1,322 | $7.5 \%$ | 215 | $8.6 \%$ | 401 | $10.8 \%$ | 1,938 | $8.1 \%$ |  |
| Total Residency \& Ethnicity Known | 17,638 |  | 2,511 |  | 3,714 |  | 23,863 |  |  |
| Resident, ethnicity unknown | 1,385 |  | 69 |  | 127 |  | 1,581 |  |  |
| Residency unknown | 3,320 |  | 380 |  | 443 |  | 4,143 |  |  |
| Grand Total | 22,343 |  | 2,960 |  | 4,284 |  | 29,587 |  |  |

Table B4. Bachelor's Degrees Expected Next Year by Department Type

| Department <br> Type | \# Depts | CS |  | CE |  | I |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| US CS Public | 88 | 15,261 | $63.9 \%$ | 1,793 | $61.9 \%$ | 1,471 | $45.9 \%$ | 18,525 | $61.7 \%$ |
| US CS Private | 31 | 5,103 | $21.4 \%$ | 325 | $11.2 \%$ | 230 | $7.2 \%$ | 5,658 | $18.9 \%$ |
| Total US CS | 119 | 20,364 | $85.2 \%$ | 2,118 | $73.1 \%$ | 1,701 | $53.0 \%$ | 24,183 | $80.6 \%$ |
| US CE | 6 | 0 | $0.0 \%$ | 728 | $25.1 \%$ | 0 | $0.0 \%$ | 728 | $2.4 \%$ |
| US Info | 10 | 140 | $0.6 \%$ | 0 | $0.0 \%$ | 1,506 | $47.0 \%$ | 1,646 | $5.5 \%$ |
| Canadian | 10 | 3,393 | $14.2 \%$ | 51 | $1.8 \%$ | 0 | $0.0 \%$ | 3,444 | $11.5 \%$ |
| Grand Total | 145 | 23,897 |  | 2,897 |  | 3,207 |  | 30,001 |  |

Table B5. New Bachelor's Students by Department Type

|  | CS |  |  |  | CE |  |  |  | I |  |  |  | Total |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Department Type | Major | PreMajor | Depts | Avg. <br> Major <br> IDept | Total | PreMajor | Depts | Avg. <br> Major <br> /Dept | Total | PreMajor | Depts | Avg. <br> Major <br> IDept | Total Major | Avg. <br> Major <br> IDept |
| US CS Public | 20,457 | 7,467 | 87 | 235.1 | 2,468 | 956 | 27 | 91.4 | 1,111 | 408 | 19 | 58.5 | 24,036 | 276.3 |
| US CS Private | 6,004 | 1,691 | 26 | 230.9 | 334 | 55 | 8 | 41.8 | 360 | 13 | 5 | 72.0 | 6,698 | 257.6 |
| US CS Total | 26,461 | 9,158 | 113 | 234.2 | 2,802 | 1,011 | 35 | 80.1 | 1,471 | 421 | 24 | 61.3 | 30,734 | 272.0 |
| US CE | 0 | 0 | 0 | 0.0 | 707 | 356 | 6 | 117.8 | 0 | 0 | 0 | 0.0 | 707 | 117.8 |
| US Information | 275 | 0 | 1 | 275.0 | 0 | 0 | 0 | 0.0 | 885 | 132 | 10 | 88.5 | 1,160 | 116.0 |
| Canadian | 3,301 | 1,123 | 9 | 366.8 | 0 | 0 | 0 | 0.0 | 0 | 0 | 0 | 0.0 | 3,301 | 366.8 |
| Grand Total | 30,037 | 10,281 | 123 | 244.2 | 3,509 | 1,367 | 41 | 85.6 | 2,356 | 553 | 34 | 69.3 | 35,902 | 260.2 |

Table B6. Total Bachelor's Enrollment by Department Type

|  | CS |  |  |  | CE |  |  |  | I |  |  |  | Total |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Department Type | Major | PreMajor | Depts | Avg. <br> Major <br> /Dept | Total | PreMajor | Depts | Avg. <br> Major <br> /Dept | Total | PreMajor | $\stackrel{\text { \# }}{\text { Dept }}$ | Avg. <br> Major <br> /Dept | Total Major | Avg. <br> Major <br> /Dept |
| US CS Public | 81,200 | 17,215 | 96 | 845.8 | 9,699 | 1,830 | 33 | 293.9 | 8,905 | 738 | 23 | 387.2 | 99,804 | 1039.6 |
| US CS Private | 25,087 | 3,169 | 34 | 737.9 | 1,085 | 113 | 10 | 108.5 | 1,763 | 90 | 6 | 293.8 | 27,935 | 798.1 |
| US CS Total | 106,287 | 20,384 | 130 | 817.6 | 10,784 | 1,943 | 43 | 250.8 | 10,668 | 828 | 29 | 367.9 | 127,739 | 975.1 |
| US CE | 0 | 0 | 0 | 0.0 | 4,210 | 1,089 | 7 | 601.4 | 0 | 0 | 0 | 0.0 | 4,210 | 601.4 |
| US Info | 799 | 0 | 1 | 799.0 | 0 | 0 | 0 | 0.0 | 5,335 | 1,346 | 12 | 444.6 | 6,134 | 511.2 |
| Canadian | 13,503 | 3,515 | 10 | 1350.3 | 175 | 0 | 1 | 175.0 | 1,849 | 0 | 1 | 1849.0 | 15,527 | 1552.7 |
| Grand Total | 120,589 | 23,899 | 141 | 855.2 | 9,699 | 1,830 | 33 | 293.9 | 17,852 | 2,174 | 42 | 425.0 | 153,610 | 960.1 |

Survey. Double-digit percentage increases in CS bachelor's degree production are likely to continue for the next few years based on current enrollments.

For the tenth consecutive year, there was an increase in the number of new undergraduate computing majors despite the capacity pressures facing departments. This year's respondents reported 11.4 percent more
new majors, with an average of 10.6 percent more per department than did last year's respondents (Table B5). The increase is only 3.8 percent when considering only those departments reporting both this year and last year. Among U.S. computer science departments, the increase was 12.7 percent overall (11.8 percent per department), and 4.3 percent among departments reporting both this year and last year. If only increases in new CS majors at U.S. CS departments are considered, the average

Table B7. Bachelors Degrees Awarded by Gender and Ethnicity, From 156 Departments Providing Breakdown Data

|  | CS |  |  |  |  | CE |  |  |  |  | I |  |  |  |  | Ethnicity Totals |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | \% of M* | \% of F* | Male | Fem | N/R | \% of M* | $\% \text { of }$ $\mathbf{F}^{*}$ | Male | Fem | N/R | \% of M* | \% of F* | Total | \% |
| Nonresident Alien | 1,673 | 529 | 3 | 12 | 17 | 289 | 55 | 0 | 13 | 17 | 202 | 102 | 0 | 7 | 11 | 2,853 | 12.0 |
| Amer Indian or Alaska Native | 34 | 8 | 0 | 0 | 0 | 15 | 5 | 0 | 1 | 2 | 11 | 10 | 0 | 0 | 1 | 83 | 0.3 |
| Asian | 3,415 | 1,104 | 29 | 24 | 35 | 494 | 105 | 3 | 23 | 32 | 427 | 202 | 0 | 15 | 22 | 5,795 | 24.3 |
| Black or AfricanAmerican | 448 | 93 | 5 | 3 | 3 | 72 | 16 | 0 | 3 | 5 | 185 | 73 | 0 | 7 | 8 | 893 | 3.7 |
| Native Hawaiian/ Pac Islander | 38 | 7 | 0 | 0 | 0 | 3 | 1 | 0 | 0 | 0 | 45 | 4 | 0 | 2 | 0 | 98 | 0.4 |
| White | 7,143 | 1,110 | 57 | 50 | 35 | 1,053 | 113 | 8 | 49 | 35 | 1,500 | 393 | 0 | 54 | 43 | 11,469 | 48.1 |
| Multiracial, not Hispanic | 361 | 147 | 3 | 3 | 5 | 54 | 10 | 0 | 3 | 3 | 104 | 54 | 1 | 4 | 6 | 734 | 3.1 |
| Hispanic, any race | 1,082 | 200 | 7 | 8 | 6 | 191 | 20 | 4 | 9 | 6 | 325 | 76 | 0 | 12 | 8 | 1,938 | 8.1 |
| Total Res \& Ethnicity Known | 14,194 | 3,198 | 104 |  |  | 2,171 | 325 | 15 |  |  | 2,799 | 914 | 1 |  |  | 23,863 |  |
| Resident, ethnicity unknown | 839 | 251 | 2 |  |  | 60 | 9 | 0 |  |  | 99 | 26 | 2 |  |  | 1,581 |  |
| Not Reported (N/R) | 1,867 | 504 | 949 |  |  | 320 | 35 | 25 |  |  | 261 | 114 | 68 |  |  | 4,143 |  |
| Gender Totals | 17,252 | 4,036 | 1,055 |  |  | 2,551 | 369 | 40 |  |  | 3,159 | 1,054 | 71 |  |  | 29,587 |  |
| \% | 81.0\% | 19.0\% |  |  |  | 87.4\% | 12.6\% |  |  |  | 75.0\% | 25.0\% |  |  |  |  |  |
| * \% of M and \% of F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table B8. Bachelors Enrollment by Gender and Ethnicity, From 155 Departments Providing Breakdown Data

|  | CS |  |  |  |  | CE |  |  |  |  | I |  |  |  |  | Ethnicity Totals |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | \% of M* | \% of F* | Male | Fem | N/R | \% of M* | \% of F* | Male | Fem | N/R | \% of M* | \% of F* | Total | \% |
| Nonresident Alien | 8,063 | 2,641 | 30 | 11 | 17 | 1,297 | 260 | 4 | 12 | 14 | 609 | 236 | 19 | 5 | 8 | 13,437 | 11.4 |
| Amer Indian or Alaska Native | 230 | 56 | 0 | 0 | 0 | 21 | 6 | 0 | 0 | 0 | 37 | 16 | 2 | 0 | 1 | 372 | 0.3 |
| Asian | 15,933 | 5,180 | 139 | 23 | 32 | 2,501 | 612 | 14 | 24 | 33 | 1,954 | 754 | 144 | 17 | 24 | 28,374 | 24.0 |
| Black or AfricanAmerican | 2,997 | 803 | 21 | 4 | 5 | 426 | 118 | 9 | 4 | 6 | 900 | 301 | 127 | 8 | 10 | 5,945 | 5.0 |
| Native Hawaiian/ Pac Islander | 149 | 54 | 0 | 0 | 0 | 33 | 9 | 21 | 0 | 1 | 27 | 5 | 0 | 0 | 0 | 305 | 0.3 |
| White | 34,069 | 5,347 | 348 | 48 | 33 | 4,704 | 614 | 45 | 45 | 33 | 5,824 | 1,347 | 118 | 52 | 43 | 54,129 | 45.7 |
| Multiracial, not Hispanic | 2,142 | 537 | 21 | 3 | 3 | 355 | 64 | 13 | 3 | 3 | 346 | 127 | 22 | 3 | 4 | 3,753 | 3.2 |
| Hispanic, any race | 7,014 | 1,381 | 41 | 10 | 9 | 1,140 | 195 | 15 | 11 | 10 | 1,537 | 342 | 43 | 14 | 11 | 12,030 | 10.2 |
| Total Res \& Ethnicity Known | 70,597 | 15,999 | 600 |  |  | 10,477 | 1,878 | 121 |  |  | 11,234 | 3,128 | 475 |  |  | 118,345 |  |
| Resident, ethnicity unknown | 3,862 | 1,498 | 2,360 |  |  | 345 | 55 | 1 |  |  | 429 | 96 | 3 |  |  | 9,951 |  |
| Not Reported (N/R) | 11,235 | 3,251 | 6,049 |  |  | 2,041 | 244 | 7 |  |  | 1,422 | 694 | 371 |  |  | 25,314 |  |
| Gender Totals | 89,847 | 21,733 | 9,009 |  |  | 12,863 | 2,177 | 129 |  |  | 13,085 | 3,918 | 849 |  |  | 153,610 |  |
| \% | 80.5\% | 19.5\% |  |  |  | 85.5\% | 14.5\% |  |  |  | 77.0\% | 23.0\% |  |  |  |  |  |
| * \% of $M$ and \% of $F$ columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table B9. Undergraduate Representative Course Enrollments 2015-2017, Department-Level Percentiles

| Number of Students Reported |  |  |  | \% Who Are Majors |  |  |  | \% Who Are Women |  |  |  | \% URM at Non-MSI |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Intro-Level for Non Majors |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| ( $\mathrm{N}=54$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=37$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=33$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=23$ ) | 2015 | 2016 | 2017 |
| 25 | 74 | 77 | 76.75 | 25 | 0.9 | 0.4 | 0.3 | 25 | 26.6 | 26.1 | 33.4 | 25 | 11.1 | 8.8 | 12.0 |
| 50 | 182 | 207.5 | 210 | 50 | 3.5 | 3.5 | 2.7 | 50 | 38.6 | 38.2 | 40.6 | 50 | 15.9 | 12.5 | 15.8 |
| 75 | 347 | 382.5 | 343 | 75 | 16.6 | 16.6 | 11.9 | 75 | 49.7 | 45.8 | 48.0 | 75 | 22.9 | 23.8 | 23.7 |
| Intro for Majors |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| (N=55) | 2015 | 2016 | 2017 | ( $\mathrm{N}=39$ ) | 2015 | 2016 | 2017 | (N=33) | 2015 | 2016 | 2017 | ( $\mathrm{N}=22$ ) | 2015 | 2016 | 2017 |
| 25 | 185 | 193 | 221 | 25 | 22.4 | 15.2 | 20.4 | 25 | 16.7 | 17.1 | 18.0 | 25 | 9.2 | 9.1 | 8.5 |
| 50 | 286 | 299 | 314 | 50 | 44.8 | 41.9 | 36.5 | 50 | 20.6 | 21.9 | 22.2 | 50 | 12.9 | 15.1 | 15.8 |
| 75 | 454 | 436 | 489 | 75 | 60.3 | 56.5 | 73.7 | 75 | 32.7 | 36.3 | 35.8 | 75 | 20.3 | 21.2 | 21.5 |
| Mid-Level |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| ( $\mathrm{N}=54$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=40$ ) | 2015 | 2016 | 2017 | (N33) | 2015 | 2016 | 2017 | ( $\mathrm{N}=21$ ) | 2015 | 2016 | 2017 |
| 25 | 85.75 | 107 | 113.5 | 25 | 45.2 | 43.5 | 39.0 | 25 | 13.2 | 14.5 | 15.1 | 25 | 7.4 | 8.2 | 9.5 |
| 50 | 134.5 | 151.5 | 176.5 | 50 | 62.2 | 60.8 | 57.2 | 50 | 17.4 | 20.0 | 19.2 | 50 | 12.6 | 11.3 | 13.6 |
| 75 | 260.25 | 294.25 | 355.75 | 75 | 81.7 | 86.1 | 83.2 | 75 | 25.1 | 26.7 | 28.1 | 75 | 17.8 | 18.6 | 20.8 |
| Upper-Level |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| ( $\mathrm{N}=52$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=38$ ) | 2015 | 2016 | 2017 | ( $\mathrm{N}=31)$ | 2015 | 2016 | 2017 | ( $\mathrm{N}=21$ ) | 2015 | 2016 | 2017 |
| 25 | 56 | 54.5 | 67.25 | 25 | 60.9 | 69.3 | 63.5 | 25 | 8.8 | 10.8 | 11.5 | 25 | 3.6 | 4.0 | 7.0 |
| 50 | 100.5 | 123.5 | 132.5 | 50 | 82.0 | 82.2 | 86.5 | 50 | 14.1 | 16.0 | 17.6 | 50 | 10.2 | 8.9 | 10.8 |
| 75 | 186 | 194 | 191.5 | 75 | 95.4 | 97.6 | 96.3 | 75 | 23.9 | 23.1 | 29.9 | 75 | 18.0 | 20.2 | 19.4 |

Figure BI. BS Production (CS \& CE)
CRA Taulbee Survey 2017



Figure B3. Bachelor's Degrees Granted by Tenure-Track Size CRA Taulbee Survey 2017


Figure B4. Bachelor's Enrollment Normalized by Tenure-Track Size
CRA Taulbee Survey 2017


Figure B5. Average New and Continuing CS Majors per Academic Unit (U.S. CS Programs Only) CRA Taulbee Survey 2017


Table Fl. Actual and Anticipated Faculty Size by Position and Department Type


## 2017 CRA Taulbee Survey (continued)

increase is 11.4 percent per department. Figure B2 illustrates the trend in the total number of newly declared computing undergraduate majors as reported in the Taulbee Survey. Total undergraduate enrollment in computing majors among U.S. CS departments (i.e., the sum of the number of majors in CS, CE, and I at these departments) increased 11.5 percent (also 11.5 percent per department) when all respondents are compared, and increased 10.8 percent among U.S. CS departments reporting both this year and last year. Total enrollment per department increased in all three computing areas (CS, CE, and I) (Table B6).

Per-department averages smooth out comparisons from year to year when there are differences in the number of reporting departments, but the averages include both very large and very small departments. Figures B3 and B4 show the distribution of number of degrees awarded (Figure B3) and total enrollment (Figure B4) per tenured or tenuretrack faculty member, in department size groupings for the U.S. CS departments. Larger departments, both public and private, produce more bachelor's degrees per tenure-track faculty member than do smaller departments. Departments from private institutions enroll fewer bachelor's students per tenure-track faculty as faculty size increases. Departments from public institutions have a less clear relationship between faculty size and enrollment per tenure-track faculty member.

The enrollment increases in CS are of particular interest to our community. This year's Taulbee Survey data shows that the perdepartment enrollment of CS bachelor's majors in U.S. CS departments increased by 13.3 percent over last year. While understandably lower than the 24.8 percent reported last year, this increase is formidable given the sustained growth surge of more than decade and the capacity barriers that have caused several departments to limit entrance into the major. Figure B5 shows the enrollment trend from Taulbee Survey data since this surge began. The average enrollment per U.S. CS department has increased over 300 percent during this period; that is, it has more than quadrupled. For the past four years, it has exceeded the previous peak reached during the dot-com enrollment surge.

Another view of bachelor's enrollments can be gleaned from CS course-level data. Such data was first reported in CRA's Generation-CS report for the fall terms in 2005, 2010 and 2015. The Taulbee Survey began collecting follow-up data in the 2016 survey, and now does so annually. Table B9 shows the three-year enrollment trends for the four types of courses for which data is collected. Only those departments are included that reported data for each of the three years. The data indicate that, between fall 2015 and fall 2017, median enrollment in the introductory course for CS majors, a representative mid-level course, and a representative upper-level course each increased. The percentage increases were 9.8\%, 31.2\% and 31.8\%, respectively. The table further

Table F2. Vacant Positions 2016-2017 by Position and Department Type

|  | Tried to fill | Filled |
| :---: | :---: | :---: |
| US CS Public |  |  |
| TenureTrack | 307 | 261 |
| Teaching | 167 | 147 |
| Research | 51 | 52 |
| Postdoc | 79 | 103 |
| Total | 604 | 563 |
| US CS Private |  |  |
| TenureTrack | 127 | 99 |
| Teaching | 52 | 44 |
| Research | 21 | 21 |
| Postdoc | 90 | 88 |
| Total | 290 | 252 |
| All US CS |  |  |
| TenureTrack | 434 | 360 |
| Teaching | 219 | 191 |
| Research | 72 | 73 |
| Postdoc | 169 | 191 |
| Total | 894 | 815 |
| US CE |  |  |
| TenureTrack | 11 | 10 |
| Teaching | 11 | 11 |
| Research | 8 | 8 |
| Postdoc | 5 | 5 |
| Total | 35 | 34 |
| US I |  |  |
| TenureTrack | 18 | 19 |
| Teaching | 15 | 14 |
| Research | 1 | 2 |
| Postdoc | 18 | 17 |
| Total | 52 | 50 |
| Canadian |  |  |
| TenureTrack | 46 | 33 |
| Teaching | 12 | 10 |
| Research | 0 | 1 |
| Postdoc | 2 | 28 |
| Total | 59 | 71 |
| Grand Total |  |  |
| TenureTrack | 509 | 421 |
| Teaching | 257 | 226 |
| Research | 81 | 84 |
| Postdoc | 194 | 241 |
| Total | 1,040 | 970 |

## 2017 CRA Taulbee Survey (continued)

Gender diversity among bachelor's graduates in CS improved again this year, with women comprising 19.0 percent of the 2016-17 graduates, compared to 17.9 percent in 2015-16. In CE, the percentage of women among bachelor's graduates was steady at 12.6 percent and the percentage of women among I graduates rose from 22.9 percent to 25.0 percent (Table B2). The percentage of CS bachelor's degrees awarded to Whites again declined from 50.3 percent in 2015-16 to 47.6 percent in

Table F2a. Reasons Positions Left Unfilled

| Reason | \# Reported | \% of Reasons |
| :--- | :---: | :---: |
| Didn't find a person who met our hiring goals* | 19 | $14.3 \%$ |
| Offers turned down | 69 | $51.9 \%$ |
| Technically vacant, not filled for admin reasons | 3 | $2.3 \%$ |
| Hiring in progress | 37 | $27.8 \%$ |
| Other | 5 | $3.8 \%$ |
| Total Reasons Provided | 133 |  |
| *What hiring goals could not be met? |  | \# Given |
| Specific specialty area not found (no two the same) | 7 |  |
| Poor qualifications for teaching faculty | 2 |  |
| Not right qualifications or complement to current faculty |  | 4 |

Table F3. Gender of Newly Hired Faculty

|  | Tenure-Track |  | Teaching |  | Research |  | Postdoc |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
| Male | 313 | $79.2 \%$ | 104 | $67.5 \%$ | 28 | $66.7 \%$ | 111 | $74.5 \%$ | 556 |  |
| Female | 82 | $20.8 \%$ | 50 | $32.5 \%$ | 14 | $33.3 \%$ | 38 | $25.5 \%$ | 184 |  |
| Unknown | 1 |  | 0 |  | 0 |  | $24.9 \%$ |  |  |  |
| Total | 396 |  | 154 |  | 42 |  | 157 |  | 9 |  |

Table F4. Ethnicity of Newly Hired Faculty

|  | Tenure-Track |  | Teaching |  | Research |  | Postdoc |  | Total |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Nonresident Alien | 47 | $13.5 \%$ | 14 | $10.4 \%$ | 3 | $7.9 \%$ | 46 | $32.2 \%$ | 110 | $16.6 \%$ |
| American Indian / Alaska Native | 1 | $0.3 \%$ | 1 | $0.7 \%$ | 0 | $0.0 \%$ | 3 | $2.1 \%$ | 5 | $0.8 \%$ |
| Asian | 102 | $29.4 \%$ | 15 | $11.1 \%$ | 13 | $34.2 \%$ | 30 | $21.0 \%$ | 160 | $24.1 \%$ |
| Black or African-American | 6 | $1.7 \%$ | 1 | $0.7 \%$ | 1 | $2.6 \%$ | 2 | $1.4 \%$ | 10 | $1.5 \%$ |
| Native Hawaiian/ Pacific Islander | 1 | $0.3 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 1 | $0.2 \%$ |
| White | 145 | $41.8 \%$ | 82 | $60.7 \%$ | 18 | $47.4 \%$ | 41 | $28.7 \%$ | 286 | $43.1 \%$ |
| Multiracial, not Hispanic | 1 | $0.3 \%$ | 0 | $0.0 \%$ | 0 | $0.0 \%$ | 3 | $2.1 \%$ | 4 | $0.6 \%$ |
| Hispanic, any race | 9 | $2.6 \%$ | 6 | $4.4 \%$ | 1 | $2.6 \%$ | 2 | $1.4 \%$ | 18 | $2.7 \%$ |
| Resident, race/ethnic unknown | 35 | $10.1 \%$ | 16 | $11.9 \%$ | 2 | $5.3 \%$ | 16 | $11.2 \%$ | 69 | $10.4 \%$ |
| Total known residency | 347 |  | 135 |  | 38 |  | 143 |  | 663 |  |
| Residency Unknown | 49 |  | 19 |  | 3 |  | 14 |  | 86 |  |
| Total | 396 |  | 154 |  | 42 |  | 157 |  | 732 |  |

## 2017 CRA Taulbee Survey (continued)

2016-17, while the percentage awarded to Asians was up slightly, from 25.3 percent to 25.9 percent. The percentage awarded to Non-resident Aliens rose from 10.4 percent to 12.5 percent. Changes in other ethnicity categories were less than I percent in CS. In aggregate across the three areas of computing, 48.1 percent of the graduates were White, 24.3 percent Asian, 12.0 percent Non-resident Aliens, and 15.6 percent all other ethnicity categories combined. However, in I programs, the other ethnicity categories accounted for approximately 24 percent of the graduates (Table B3).

Table F5. Faculty Losses

| Died | 5 |
| :--- | ---: |
| Retired | 80 |
| Took Academic Position Elsewhere | 85 |
| Took Nonacademic Position | 26 |
| Remained, but Changed to Part Time | 12 |
| Other | 20 |
| Unknown | 6 |
| Total | 234 |

In all three computing areas (CS, CE, and I), Resident Asians and Non-resident Aliens once again comprise a larger fraction of female enrollment than male enrollment, while Whites comprise a larger fraction of male enrollment than female enrollment (Table B8). Table B7 indicates that the same comparisons hold true for degree awardees.

## Faculty Demographics ${ }^{4}$

(Tables FI-F9; Figure FI)
Table Fl shows the current and anticipated sizes, in FTE, for tenuretrack, teaching, and research faculty, and postdocs. The total tenuretrack faculty count in U.S. CS departments increased by 5.2 percent over last year, and the average tenure-track faculty size increased by 5.1 percent. Both of these values are larger increases than last year (2.3 and 4.6 percent, respectively). In U.S. CS departments, the average number of teaching faculty increased from 7.7 to 8.2 (6.5 percent vs 11.6 percent last year) and the average number of research faculty is 5.8 , vs 5.7 last year. The average number of postdocs increased from 6.5 to 7.7 . Canadian, CE, and I departments have much more volatile data due to the small number of departments reporting in each of these categories.

Table F6. Gender of Current Faculty

|  | Full |  | Associate |  | Assistant |  | Teaching |  | Research |  | Postdoc |  | Total |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Male | 2,051 | 84.9\% | 997 | 77.2\% | 920 | 76.8\% | 914 | 73.1\% | 360 | 80.0\% | 607 | 80.4\% | 5,849 | 79.5\% |
| Female | 365 | 15.1\% | 294 | 22.8\% | 278 | 23.2\% | 336 | 26.9\% | 90 | 20.0\% | 148 | 19.6\% | 1,511 | 20.5\% |
| Unknown | 66 |  | 28 |  | 21 |  | 38 |  | 4 |  | 35 |  | 192 |  |
| Total | 2,482 |  | 1,319 |  | 1,219 |  | 1,288 |  | 454 |  | 790 |  | 7,552 |  |

Table F7. Ethnicity of Current Faculty

|  | Full |  | Associate |  | Assistant |  | Teaching |  | Research |  | Postdoc |  | Total |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Nonresident Alien | 22 | 1.0\% | 7 | 0.6\% | 139 | 12.6\% | 40 | 3.5\% | 59 | 13.9\% | 217 | 31.6\% | 484 | 7.1\% |
| American Indian / Alaska Native | 1 | 0.0\% | 4 | 0.3\% | 3 | 0.3\% | 2 | 0.2\% | 1 | 0.2\% | 0 | 0.0\% | 11 | 0.2\% |
| Asian | 609 | 26.9\% | 357 | 30.9\% | 327 | 29.6\% | 120 | 10.4\% | 73 | 17.2\% | 168 | 24.5\% | 1,654 | 24.4\% |
| Black or African-American | 22 | 1.0\% | 31 | 2.7\% | 35 | 3.2\% | 34 | 3.0\% | 2 | 0.5\% | 8 | 1.2\% | 132 | 1.9\% |
| Native Hawaiian / Pacific Islander | 1 | 0.0\% | 0 | 0.0\% | 0 | 0.0\% | 0 | 0.0\% | 0 | 0.0\% | 1 | 0.1\% | 2 | 0.0\% |
| White | 1,447 | 63.9\% | 637 | 55.1\% | 511 | 46.2\% | 846 | 73.5\% | 258 | 60.8\% | 216 | 31.5\% | 3,915 | 57.7\% |
| Multiracial, not Hispanic | 11 | 0.5\% | 10 | 0.9\% | 10 | 0.9\% | 7 | 0.6\% | 1 | 0.2\% | 6 | 0.9\% | 45 | 0.7\% |
| Hispanic, any race | 44 | 1.9\% | 32 | 2.8\% | 21 | 1.9\% | 39 | 3.4\% | 15 | 3.5\% | 13 | 1.9\% | 164 | 2.4\% |
| Resident, race/ethnic unknown | 107 | 4.7\% | 79 | 6.8\% | 60 | 5.4\% | 63 | 5.5\% | 15 | 3.5\% | 57 | 8.3\% | 381 | 5.6\% |
| Total known residency | 2,264 |  | 1,157 |  | 1,106 |  | 1,151 |  | 424 |  | 686 |  | 6,788 |  |
| Residency Unknown | 218 |  | 162 |  | 113 |  | 137 |  | 30 |  | 104 |  | 764 |  |
| Total | 2,482 |  | 1,319 |  | 1,219 |  | 1,288 |  | 454 |  | 790 |  | 7,552 |  |

Table F8. Current Tenured and Tenure-Track Faculty by Gender and Ethnicity, From 159 Departments

|  | Full Professor |  |  |  |  | Associate Professor |  |  |  |  | Assistant Professor |  |  |  |  | Ethnicity Totals |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | $\begin{gathered} \% \text { of } \\ M^{*} \end{gathered}$ | $\begin{gathered} \% \text { of } \\ F^{*} \end{gathered}$ | Male | Fem | N/R | $\% \text { of }$ $\mathbf{M}^{*}$ | $\begin{gathered} \text { \% of } \\ \mathrm{F}^{*} \end{gathered}$ | Male | Fem | N/R | $\% \text { of }$ $\mathbf{M}^{*}$ | \% of $\mathrm{F}^{*}$ | Total | \% |
| Nonresident Alien | 17 | 5 | 0 | 1 | 2 | 7 | 0 | 0 | 1 | 0 | 104 | 29 | 0 | 13 | 12 | 168 | 3.9 |
| Amer Indian or Alaska Native | 1 | 0 | 0 | 0 | 0 | 2 | 2 | 0 | 0 | 1 | 1 | 2 | 0 | 0 | 1 | 8 | 0.2 |
| Asian | 525 | 78 | 0 | 29 | 25 | 256 | 98 | 0 | 31 | 38 | 250 | 77 | 0 | 32 | 30 | 1,293 | 30.2 |
| Black or AfricanAmerican | 18 | 3 | 0 | 1 | 1 | 20 | 11 | 0 | 3 | 4 | 21 | 14 | 0 | 3 | 6 | 88 | 2.1 |
| Native Hawaiian/ Pac Islander | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0.0 |
| White | 1,220 | 220 | 0 | 67 | 70 | 495 | 137 | 1 | 61 | 54 | 385 | 123 | 0 | 49 | 49 | 2,595 | 60.6 |
| Multiracial, not Hispanic | 11 | 0 | 0 | 1 | 0 | 8 | 2 | 0 | 1 | 1 | 7 | 3 | 0 | 1 | 1 | 31 | 0.7 |
| Hispanic, any race | 33 | 10 | 0 | 2 | 3 | 27 | 5 | 0 | 3 | 2 | 16 | 5 | 0 | 2 | 2 | 97 | 2.3 |
| Total Res \& Ethnicity Known | 1,826 | 316 | 0 |  |  | 815 | 255 | 1 |  |  | 784 | 253 | 0 |  |  | 4,281 |  |
| Resident, ethnicity unknown | 83 | 20 | 0 |  |  | 59 | 17 | 0 |  |  | 43 | 13 | 0 |  |  | 246 |  |
| Not Reported (N/R) | 126 | 26 | 66 |  |  | 113 | 22 | 27 |  |  | 82 | 10 | 21 |  |  | 493 |  |
| Gender Totals | 2,051 | 365 | 66 |  |  | 997 | 294 | 28 |  |  | 920 | 278 | 21 |  |  | 5,020 |  |
| \% | 84.9\% | 15.1\% |  |  |  | 77.2\% | 22.8\% |  |  |  | 76.8\% | 23.2\% |  |  |  |  |  |
| * \%M and \%F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table F9. Current Non-Tenure-Track Faculty and Postdoctorates by Gender and Ethnicity, From 160 Departments

|  | Non-Tenure-Track Teaching |  |  |  |  | Non-Tenure-Track Research |  |  |  |  | Postdoctorates |  |  |  |  | Ethnicity Totals |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Male | Fem | N/R | $\%$ of M* | $\%$ of ${ }^{\mathrm{F}}{ }^{*}$ | Male | Fem | N/R | $\%$ of M* | $\begin{gathered} \% \text { of } \\ F^{*} \end{gathered}$ | Male | Fem | N/R | $\begin{gathered} \% \text { of } \\ M^{*} \end{gathered}$ | $\begin{gathered} \text { \% of } \\ F^{*} \end{gathered}$ | Total | \% |
| Nonresident Alien | 29 | 8 | 0 | 4 | 3 | 43 | 13 | 0 | 13 | 17 | 184 | 31 | 0 | 36 | 26 | 316 | 15 |
| Amer Indian or Alaska Native | 1 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 3 | 0 |
| Asian | 78 | 41 | 0 | 10 | 14 | 59 | 14 | 0 | 18 | 18 | 137 | 31 | 0 | 27 | 26 | 361 | 17 |
| Black or AfricanAmerican | 22 | 12 | 0 | 3 | 4 | 0 | 2 | 0 | 0 | 3 | 4 | 4 | 0 | 1 | 3 | 44 | 2 |
| Native Hawaiian/ Pac Islander | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 1 | 0 |
| White | 620 | 218 | 0 | 79 | 75 | 212 | 45 | 0 | 65 | 57 | 172 | 44 | 0 | 34 | 37 | 1,320 | 62 |
| Multiracial, not Hispanic | 5 | 2 | 0 | 1 | 1 | 1 | 0 | 0 | 0 | 0 | 3 | 3 | 0 | 1 | 3 | 14 | 1 |
| Hispanic, any race | 31 | 8 | 0 | 4 | 3 | 10 | 4 | 0 | 3 | 5 | 8 | 5 | 0 | 2 | 4 | 67 | 3 |
| Total Res \& Ethnicity Known | 786 | 290 | 0 |  |  | 325 | 79 | 0 |  |  | 508 | 119 | 0 |  |  | 2,126 |  |
| Resident, ethnicity unknown | 40 | 17 | 0 |  |  | 10 | 4 | 0 |  |  | 46 | 11 | 0 |  |  | 135 |  |
| Not Reported (N/R) | 71 | 28 | 38 |  |  | 20 | 6 | 4 |  |  | 51 | 18 | 35 |  |  | 271 |  |
| Gender Totals | 914 | 336 | 38 |  |  | 360 | 90 | 4 |  |  | 607 | 148 | 35 |  |  | 2,532 |  |
| \% | 73.1\% | 26.9\% |  |  |  | 80.0\% | 20.0\% |  |  |  | 80.4\% | 19.6\% |  |  |  |  |  |
| * \%M and \%F columns are the percent of that gender who are of the specified ethnicity, of those whose ethnicity is known |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

## 2017 CRA Taulbee Survey (continued)

While the increases in both tenure-track and teaching faculty are no doubt welcome, they again lag the increases in undergraduate student enrollment, as reported in an earlier section. Figure Fl illustrates the comparative changes in enrollment and faculty since 2006, when the current enrollment surge began. This figure updates with recent years' data a figure from the Generation-CS report. Keeping instructional resources apace of enrollment increases remains a continuing challenge to the doctoral-granting departments.

As noted in previous Taulbee reports, Canadian universities, on average, have several more tenure-track faculty members per department than do U.S. universities, while U.S. I and CE departments, on average, are somewhat smaller than U.S. CS departments. The observations about U.S. CE and I departments may reflect the fact that we ask departments to report only computing-related faculty, so departments with Library Science or EE programs may report only part of their faculty.

Among U.S. CS departments, those at private universities have more of each category of faculty, including postdocs, than do those at public universities on average. However, there now is little difference in the average number of teaching faculty at publics and privates. The average tenure-track size at private universities rose from 30.9 to 33.5 while the average number of teaching faculty declined from 8.7 to 8.3 . At the public universities, both the average tenure-track size and the average teaching faculty size increased. The specific set of departments reporting from one year to the next can impact these figures.

Table F2 summarizes faculty hiring this past year. The success rate for hiring tenure-track faculty at U.S. CS departments rose quite a bit this year, from 72.7 percent last year to 82.9 percent this year. The
success rate among departments at public universities was higher than that at private universities ( 85.2 percent vs 78.0 percent). Again this year, Canadian departments had lower success rates, on average, than did U.S. CS, CE, and I departments. In aggregate across all types of departments, the tenure-track hiring success rate increased from 71.9 percent to 82.7 percent.

Among those hired into all categories of academic positions (tenuretrack, teaching faculty, research faculty, and postdoc) for 2016-17, 24.9 percent were women, similar to last year's percentage (Table F3). However, among those newly hired into tenure-track positions, the proportion of women declined from 24.3 percent last year to 20.8 percent this year. This year's figure is still slightly higher than that of two years ago. The percentage of positions going to women in each of the teaching faculty, research faculty, and postdoctoral positions rose as compared with those reported last year. Both the percentage of women among new tenure-track faculty hires and among newly hired faculty overall are once again higher than the percentage of new female Ph.D.s produced this past year.

Among new tenure-track faculty, the fraction who are White again declined slightly, from 43.8 percent to 41.8 percent, while the fraction who are Non-resident Alien or Asian new hires declined from 47.7 percent to 42.9 percent. This year, there was a larger fraction of new hires who are residents with unknown race. Once again, Whites dominated the newly hired teaching faculty, with Asians and Nonresident Aliens accounting for much of the remainder (and an even larger part of the remainder than was the case last year). Among research faculty, Whites comprised 47.4 percent of new hires, while Non-resident Aliens or resident Asians in aggregate comprised 42.1


## 2017 CRA Taulbee Survey (continued)

percent of new hires. Both figures are higher than those reported last year. Among postdoc new hires, Whites comprised 28.7 percent, compared to 29.3 percent last year, while Non-resident Aliens and resident Asians collectively comprised 53.2 percent compared with 62.1 percent last year. Note, however, that the fraction of new postdocs who are residents with ethnicity unknown is greater than that reported last year (Table F4).

Since 2015, the Taulbee Survey has been collecting information on the number of new faculty hires who had been postdocs in the previous
year. In 2015, the departments reporting to the survey hired 233 new assistant professors. Of those, 78 (33 percent) had received their Ph.D. in the previous academic year, and 72 ( 31 percent) had previously been in a postdoc. In 2016, 279 new assistant professors were hired, 87 of whom were new Ph.D.s ( 31 percent) and 86 of whom were recent postdocs (also 31 percent). In 2017, 298 new assistant professors were hired, 91 of whom ( 31 percent) were new Ph.D.s and 63 of whom ( 21 percent) were recent postdocs. The percent of new hires who are new Ph.D.s has been relatively constant, but this year, the percent who were recent postdocs dropped quite a bit. This suggests that more of the new

Table RI. Total Expenditure from External Sources for Computing Research

| Department Type | \# Depts | 10th | 25th | 50th | 75th | 90th |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| US CS Public | 85 | $\$ 501,735$ | $\$ 1,957,603$ | $\$ 4,054,147$ | $\$ 7,983,775$ | $\$ 17,096,345$ |
| US CS Private | 26 | $\$ 1,996,536$ | $\$ 3,190,845$ | $\$ 7,466,028$ | $\$ 11,814,182$ | $\$ 18,864,715$ |
| US CE | 6 |  | $\$ 1,180,526$ | $\$ 2,090,478$ | $\$ 2,978,273$ |  |
| US Information | 13 | $\$ 1,081,357$ | $\$ 2,078,548$ | $\$ 2,808,247$ | $\$ 3,913,548$ | $\$ 4,925,074$ |
| Canadian | 6 |  | $\$ 754,225$ | $\$ 1,871,107$ | $\$ 5,624,497$ |  |

Figure RI. Research Expenditures Normalized by Tenure-Track Size CRA Taulbee Survey 2017


assistant professor hires are coming from other institutions or from industry. From other data in the Taulbee Survey, we note that a greater percentage of new doctoral graduates have been taking teaching faculty positions. It is possible that some of these are short-term, fulltime appointments at the institution in which the student graduated, prior to taking a tenure-track position elsewhere. However, we have no definitive data to support this conjecture.

There were fewer faculty losses reported this year as compared with last year (Table F5). Reported deaths, retirements and faculty taking nonacademic positions each were lower than last year, while movement from one academic position to another was comparable to last year.

The proportion of women at the full and associate professor ranks rose slightly from those reported last year, while the proportion at the assistant professor level dropped slightly (Table F6). There was a slight increases in the proportion of women among research faculty, while there was a slight decrease in the proportion of women among teaching faculty and postdocs. This is the reverse of what happened last year, but is the same as what happened two years ago. Whites, Asians, and Non-resident Aliens dominate each category of faculty members (Table F7).

Among the 163 departments who report gender by ethnicity breakdowns (which represents the vast majority of departments), Whites again comprised a greater percentage of female full professors than they do male full professors, while the reverse is true at the associate professor level. Asians comprise a greater percentage of male full professors than they do female full professors while the reverse is true at the associate professor level (Table F8).

For next year, U.S. CS departments forecast an average 6.5 percent growth in tenure-track faculty and 11.0 percent growth in teaching faculty. They also forecast an average 5.2 percent growth in postdocs. The departments missed last year's expectations for both tenuretrack and research faculty hiring. They exceeded their expectations for postdoc hiring.

## Non-Tenure-Track Teaching Faculty

The 2016 Taulbee Survey contained several questions about non-tenuretrack teaching faculty to help CRA decide what, if anything, the survey should collect differently about those faculty.

## 2017 CRA Taulbee Survey (continued)

The majority of responding units ( 61 percent) were interested in having the Taulbee Survey provide more fine-grained information about non-tenure-track teaching faculty. To further probe the landscape of teaching faculty, CRA formed a special committee that conducted a targeted survey about teaching faculty during fall of 2017. The results of this survey are now being analyzed and are expected to inform the 2018 Taulbee Survey.

## Research Expenditures

(Table RI; Figures RI-R2)
Table RI shows the distribution of departments' total research expenditure (including indirect costs or "overhead" as stated on project budgets) from external sources of support. Figures R1 and R2 show the per capita expenditure, where capitation is computed two ways. The first (Figure RI) is relative to the number of tenure-track faculty members. The second (Figure R2) is relative to research faculty and postdocs as well as tenure-track faculty. Canadian levels are shown in Canadian dollars.

Table Gl. Doctoral Students Supported as Full-Time Students by Department Type

|  |  | On Institutional Funds |  |  |  |  |  | On External Funds |  |  |  |  |  | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Department Type | $\begin{gathered} \text { \# } \\ \text { Dept } \end{gathered}$ | Teaching Assistants |  | Research Assistants |  | Full-Support Fellows |  | Teaching Assistants |  | Research Assistants |  | Full-Support Fellows |  |  |
| US CS Public | 93 | 3,188.1 | 39.5\% | 1,034.0 | 12.8\% | 412.5 | 5.1\% | 13.4 | 0.2\% | 3,198.6 | 39.7\% | 217.5 | 2.7\% | 8,064.1 |
| US CS Private | 32 | 1,126.0 | 29.4\% | 432.0 | 11.3\% | 271.0 | 7.1\% | 10.0 | 0.3\% | 1,870.0 | 48.7\% | 127.0 | 3.3\% | 3,836.0 |
| US CS Total | 125 | 4,314.1 | 36.3\% | 1,466.0 | 12.3\% | 683.5 | 5.7\% | 23.4 | 0.2\% | 5,068.6 | 42.6\% | 344.5 | 2.9\% | 11,900.1 |
| US CE | 6 | 143.0 | 41.2\% | 152.0 | 43.8\% | 11.0 | 3.2\% | 0.0 | 0.0\% | 41.0 | 11.8\% | 0.0 | 0.0\% | 347.0 |
| US I | 14 | 204.3 | 38.9\% | 64.8 | 12.3\% | 30.0 | 5.7\% | 0.2 | 0.0\% | 204.7 | 39.0\% | 21.0 | 4.0\% | 525.0 |
| Canadian | 9 | 307.5 | 52.8\% | 95.0 | 16.3\% | 6.0 | 1.0\% | 0.0 | 0.0\% | 174.0 | 29.9\% | 0.0 | 0.0\% | 582.5 |
| Grand Total | 154 | 4,968.9 | 37.2\% | 1,777.8 | 13.3\% | 730.5 | 5.5\% | 23.6 | 0.2\% | 5,488.3 | 41.1\% | 365.5 | 2.7\% | $13,354.6$ |

Table Gla. Master's Students Supported as Full-Time Students by Department Type

| On Institutional Funds |  |  |  |  |  |  |  | On External Funds |  |  |  |  |  | Total |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| Department <br> Type | \# <br> Dept | Teaching <br> Assistants | Research <br> Assistants | Full-Support <br> Fellows | Teaching <br> Assistants | Research <br> Assistants | Full-Support <br> Fellows |  |  |  |  |  |  |  |
| US CS Public | 72 | $1,400.7$ | $67.6 \%$ | 196.8 | $9.5 \%$ | 7.0 | $0.3 \%$ | 5.0 | $0.2 \%$ | 417.1 | $20.1 \%$ | 47.0 | $2.3 \%$ | $2,073.5$ |
| US CS Private | 18 | 100.0 | $63.7 \%$ | 29.0 | $18.5 \%$ | 3.0 | $1.9 \%$ | 1.0 | $0.6 \%$ | 19.0 | $12.1 \%$ | 5.0 | $3.2 \%$ | 157.0 |
| US CS Total | 90 | $1,500.7$ | $67.3 \%$ | 225.8 | $10.1 \%$ | 10.0 | $0.4 \%$ | 6.0 | $0.3 \%$ | 436.1 | $19.6 \%$ | 52.0 | $2.3 \%$ | $2,230.5$ |
| US CE | 7 | 44.0 | $65.7 \%$ | 21.0 | $31.3 \%$ | 0.0 | $0.0 \%$ | 0.0 | $0.0 \%$ | 2.0 | $3.0 \%$ | 0.0 | $0.0 \%$ | 67.0 |
| US I | 10 | 61.2 | $34.5 \%$ | 18.6 .6 | $10.5 \%$ | 47.0 | $26.5 \%$ | 1.8 | $1.0 \%$ | 47.0 | $26.5 \%$ | 2.0 | $1.1 \%$ | 177.5 |
| Canadian | 7 | 338.5 | $59.6 \%$ | 77.0 | $13.6 \%$ | 7.0 | $1.2 \%$ | 0.0 | $0.0 \%$ | 145.0 | $25.6 \%$ | 0.0 | $0.0 \%$ | 567.5 |
| Grand Total | 114 | 1,944 | $63.9 \%$ | 342 | $11.3 \%$ | 64 | $2.1 \%$ | 8 | $0.3 \%$ | 630 | $20.7 \%$ | 54 | $1.8 \%$ | 3,043 |

Table Glb. Master's Students Eligibility for Assistantship Support

|  | \# Depts | \% of Depts |
| :--- | ---: | ---: |
| All master's students are eligible for assistantships | 83 | $59.7 \%$ |
| No master's students are eligible for assistantships | 18 | $12.9 \%$ |
| Students in some master's programs but not others are eligible for assistantships | 25 | $18.0 \%$ |
| Other* | 13 | $9.4 \%$ |
| *Other responses divided between individual student qualifications (e.g. GPA or training) and department needs or resources (research <br> needs, funds availability) |  |  |



Table G2. Fall 2017 Academic-Year Graduate Stipends by Department Type and Support Type

| Teaching Assistantships |  |  |  |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Percentiles of Department Averages |  |  |  |  |  |
| Department Type | \# Depts | 10th | $\mathbf{2 5 t h}$ | $\mathbf{5 0 t h}$ | 75th | 90th |  |
| US CS Public | 94 | $\$ 12,045$ | $\$ 15,648$ | $\$ 18,498$ | $\$ 20,199$ | $\$ 23,966$ |  |
| US CS Private | 25 | $\$ 18,540$ | $\$ 22,050$ | $\$ 24,225$ | $\$ 27,333$ | $\$ 31,270$ |  |
| US CE | 7 |  | $\$ 15,291$ | $\$ 18,000$ | $\$ 19,876$ |  |  |
| US Info | 11 | $\$ 16,783$ | $\$ 18,113$ | $\$ 20,520$ | $\$ 23,339$ | $\$ 25,369$ |  |
| Canadian | 8 |  | $\$ 5,175$ | $\$ 14,005$ | $\$ 17,937$ |  |  |



Figure G2. Research Assistantship Stipends
CRA Taulbee Survey 2017


Figure G3. Full Support Fellows Stipends
CRA Taulbee Survey 2017


## 2017 CRA Taulbee Survey (continued)

Overall median research expenditures for 2016-17 at U.S. CS public departments increased 8.7 percent in comparison with 2015-16. At U.S. CS departments in private institutions, median expenditures rose 19.6 percent. The direction of change at private universities was the reverse of what was experienced last year. The median research expenditure at U.S. CS departments in private institutions remains considerably higher that of public institutions. Median expenditures at U.S. I departments was within one-half of one percent of last year's figure, and that for Canadian departments was one percent higher than last year. The sample size for I departments and Canadian departments is small, which makes these comparisons subject to more volatility.

The U.S. CS data show a tendency for larger departments to have more external funding per capita than smaller departments. This holds for departments at both public and private institutions.

## Graduate Student Support

(Tables GI-G2; Figures GI-G3)
Table Gl shows the number of doctoral students supported as full-time students as of fall 2017, further categorized as teaching assistants (TAs), research assistants (RAs), and full-support fellows. In the past,
the heading for this table read "Graduate Students Supported as FullTime Students by Department Type". In fact, this table only reported responses to a question that was about support of doctoral students, and has been renamed accordingly. The table also shows the split between those on institutional vs. external funds. The average number of TAs on institutional funds in U.S. CS departments dropped slightly from last year's value, from 35.3 to 34.5. Public universities reported a slight decrease, while the average at private universities rose by 7.9 percent after declining by a similar percentage last year. The reported values at private universities have been somewhat volatile in recent years. Since there are fewer of them, compared with public universities, they are more sensitive to the specific units reporting in a given year. The small number of CE, I, and Canadian departments also make these comparative averages subject to volatility.

The average number of RAs on external funding was slightly lower at public and slightly higher at private U.S. CS departments, while the average number of RAs supported on institutional funds declined at private universities and rose at publics. The average number of fullsupport fellows on internal funds dropped slightly in U.S. CS public departments and rose at U.S. private departments. The average number of

Table Sl. Nine-month Salaries, 141 Responses of 192 US CS Departments, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 113 | 117 | 123 | 138 | 111 | 129 | 138 | 137 | 107 | 52 | 48 |
| Indiv | 673 | 518 | 714 | 1,992 | 404 | 562 | 1,024 | 1,028 | 848 | 289 | 425 |
| 10 | \$134,404 | \$124,614 | \$120,732 | \$124,517 | \$99,151 | \$102,139 | \$100,004 | \$89,327 | \$66,015 | \$60,754 | \$47,891 |
| 25 | \$152,091 | \$142,483 | \$132,108 | \$143,451 | \$105,687 | \$109,353 | \$108,597 | \$95,440 | \$70,906 | \$74,157 | \$50,000 |
| 50 | \$173,987 | \$165,230 | \$149,469 | \$159,958 | \$114,204 | \$120,595 | \$117,505 | \$103,014 | \$80,102 | \$92,228 | \$57,159 |
| 75 | \$193,929 | \$191,967 | \$168,729 | \$179,071 | \$127,500 | \$130,397 | \$128,569 | \$111,085 | \$91,852 | \$122,020 | \$62,378 |
| 90 | \$216,805 | \$213,326 | \$188,049 | \$197,867 | \$138,611 | \$142,850 | \$140,675 | \$120,516 | \$103,122 | \$150,085 | \$69,066 |

Table S2. Nine-month Salaries, 103 Responses of 139 US CS Public (All Public), Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 81 | 83 | 93 | 101 | 84 | 95 | 101 | 100 | 77 | 36 | 34 |
| Indiv | 447 | 374 | 521 | 1,404 | 300 | 400 | 742 | 748 | 567 | 184 | 203 |
| 10 | \$130,839 | \$118,948 | \$119,475 | \$122,317 | \$98,224 | \$100,192 | \$99,707 | \$88,598 | \$63,269 | \$51,975 | \$47,747 |
| 25 | \$147,991 | \$137,913 | \$129,424 | \$142,178 | \$102,250 | \$108,756 | \$106,568 | \$93,584 | \$69,692 | \$71,000 | \$49,807 |
| 50 | \$167,790 | \$159,207 | \$144,760 | \$155,652 | \$111,643 | \$118,108 | \$114,581 | \$99,176 | \$77,226 | \$84,503 | \$54,249 |
| 75 | \$186,554 | \$179,282 | \$162,209 | \$171,320 | \$122,500 | \$125,331 | \$124,261 | \$107,128 | \$85,445 | \$109,169 | \$59,602 |
| 90 | \$199,575 | \$196,250 | \$175,351 | \$183,118 | \$132,129 | \$134,392 | \$136,236 | \$113,557 | \$97,200 | \$122,479 | \$63,139 |

## 2017 CRA Taulbee Survey (continued)

The median TA salaries at U.S. CS departments increased 3.0 percent at public universities and increased 1.1 percent at private universities. Median salaries of RAs rose 2.2 percent at public universities and 0.7 percent at private universities. For full-support fellows, median salaries rose 3.9 percent at U.S. public universities and 1.3 percent at U.S. private universities.

Median stipends are higher at private U.S. CS departments, compared with public U.S. CS departments, in each of the three stipend categories. Stipends at U.S. I schools fall in between those at public and private U.S. CS departments. These relationships are unchanged from previous years.

At U.S. CS departments in public institutions, larger departments have higher salaries than do smaller departments for both TAs and RAs. Stipends in U.S. CS departments at private institutions do not exhibit a clear relationship based on department size for RAs, but for TAs, stipends are lower at larger departments.

Table S3. Nine-month Salaries, 38 Responses of 53 US CS Private (All Private), Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank <br> 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank <br> 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 32 | 34 | 30 | 37 | 27 | 34 | 37 | 37 | 30 | 16 | 14 |
| Indiv | 226 | 144 | 193 | 588 | 104 | 162 | 282 | 280 | 281 | 105 | 222 |
| 10 | \$148,797 | \$134,032 | \$140,007 | \$140,051 | \$106,399 | \$106,751 | \$107,454 | \$101,096 | \$76,896 | \$73,824 | \$57,470 |
| 25 | \$164,928 | \$147,968 | \$155,716 | \$160,936 | \$109,316 | \$121,079 | \$117,007 | \$103,862 | \$81,170 | \$93,582 | \$61,102 |
| 50 | \$198,716 | \$191,491 | \$172,029 | \$184,034 | \$122,784 | \$131,888 | \$128,015 | \$112,525 | \$92,378 | \$138,789 | \$65,136 |
| 75 | \$218,000 | \$221,125 | \$193,762 | \$204,459 | \$136,724 | \$144,234 | \$143,289 | \$123,150 | \$100,616 | \$157,024 | \$68,007 |
| 90 | \$238,456 | \$253,604 | \$205,195 | \$221,400 | \$146,813 | \$153,837 | \$149,849 | \$128,419 | \$112,708 | \$161,890 | \$69,148 |

Table S4. Nine-month Salaries, 23 Responses of US CS Public With <-15 Tenure-Track Faculty, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank $8+$ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 14 | 11 | 19 | 22 | 18 | 20 | 23 | 22 | 15 | 2 | 1 |
| Indiv | 38 | 16 | 35 | 95 | 52 | 47 | 108 | 72 | 53 |  |  |
| 10 | \$116,617 | \$100,778 | \$111,988 | \$115,400 | \$95,380 | \$94,915 | \$94,594 | \$85,001 | \$57,306 |  |  |
| 25 | \$126,804 | \$115,522 | \$114,138 | \$119,132 | \$99,016 | \$99,231 | \$98,838 | \$87,070 | \$61,247 |  |  |
| 50 | \$136,190 | \$118,593 | \$121,311 | \$126,624 | \$100,083 | \$103,243 | \$102,327 | \$90,436 | \$66,199 |  |  |
| 75 | \$152,100 | \$129,333 | \$128,423 | \$143,435 | \$109,792 | \$109,539 | \$109,088 | \$94,361 | \$73,359 |  |  |
| 90 | \$171,945 | \$145,288 | \$151,497 | \$151,194 | \$127,965 | \$122,503 | \$122,118 | \$98,379 | \$78,387 |  |  |

## 2017 CRA Taulbee Survey (continued)

## Faculty Salaries

(Tables SI-S2I; Figures SI-S9)
Each department was asked to report individual (but anonymous) faculty salaries if possible; otherwise, the department was requested to provide the mean salary for each rank (full, associate, and assistant professors and non-tenure-track teaching faculty, research faculty, and post-doctorates) and the number of persons at each rank. The salaries are those in effect on January 1,2018 for U.S. departments; ninemonth salaries are reported in U.S. dollars. For Canadian departments, twelve-month salaries are reported in Canadian dollars. Respondents were asked to include salary supplements such as salary monies from endowed positions.
U.S. CS data are reported in Tables SI-SI6 and in the box and whiskers diagrams. Data for CE, I, Canadian, and new Ph.D.s are reported in Tables SIT-S20. The tables and diagrams contain distributional data (first decile, quartiles, and ninth decile) computed from the department averages only. Thus, for example, a table row labeled " 50 " or the median line in a diagram is the median of the averages for the departments that
reported within the stratum (the number of such departments reporting is shown in the "depts" row). Therefore, it is not a true median of all of the salaries.

We also report salary data for senior faculty based on time in rank, for more meaningful comparison of individual or departmental faculty salaries with national averages. We report associate professor salaries for time in rank of 7 years or less, and of more than 7 years. For full professors, we report time in rank of 7 years or less, 8 to 15 years, and more than 15 years.

Those departments reporting salary data were provided a summary report in December 2017. Those departments that provided individual salaries were additionally provided more comprehensive distributional information based on these individual salaries. This year, 70 percent of those reporting salary data provided salaries at the individual level.

The remainder of this section summarizes the basic report provided in December 2017 to all departments that provided salary data. The

Table S5. Nine-month Salaries, 38 Responses of US CS Public With 10 < Tenure-Track Faculty <=20, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 27 | 25 | 32 | 37 | 32 | 34 | 37 | 35 | 25 | 5 | 7 |
| Indiv | 82 | 62 | 85 | 243 | 86 | 85 | 186 | 135 | 114 | 25 | 16 |
| 10 | \$114,463 | \$108,741 | \$113,099 | \$117,105 | \$94,099 | \$95,886 | \$95,922 | \$86,000 | \$57,086 |  |  |
| 25 | \$129,319 | \$118,580 | \$120,095 | \$125,425 | \$99,106 | \$101,700 | \$99,918 | \$89,205 | \$61,671 |  | \$48,163 |
| 50 | \$145,683 | \$134,613 | \$132,791 | \$143,028 | \$102,542 | \$108,756 | \$107,786 | \$93,654 | \$71,792 | \$62,000 | \$50,000 |
| 75 | \$161,775 | \$149,500 | \$148,896 | \$153,799 | \$110,551 | \$120,040 | \$114,154 | \$98,319 | \$76,451 |  | \$57,070 |
| 90 | \$181,204 | \$173,452 | \$162,041 | \$164,918 | \$115,746 | \$124,938 | \$120,956 | \$100,995 | \$83,138 |  |  |

Table S6. Nine-month Salaries, 31 Responses of US CS Public With 15 < Tenure-Track Faculty $<=25$, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 23 | 26 | 27 | 30 | 25 | 28 | 29 | 29 | 22 | 7 | 9 |
| Indiv | 79 | 85 | 103 | 278 | 68 | 78 | 157 | 134 | 107 | 31 | 19 |
| 10 | \$132,783 | \$120,708 | \$122,644 | \$137,494 | \$95,776 | \$100,375 | \$99,551 | \$91,322 | \$58,774 |  |  |
| 25 | \$145,047 | \$134,985 | \$132,791 | \$140,747 | \$102,001 | \$109,038 | \$105,900 | \$94,442 | \$69,732 | \$53,817 | \$50,000 |
| 50 | \$160,044 | \$152,479 | \$142,012 | \$151,234 | \$109,254 | \$114,562 | \$112,737 | \$98,187 | \$73,664 | \$76,000 | \$54,325 |
| 75 | \$174,560 | \$179,489 | \$149,129 | \$165,187 | \$114,136 | \$121,188 | \$117,616 | \$101,333 | \$78,958 | \$117,636 | \$59,814 |
| 90 | \$192,454 | \$190,506 | \$168,558 | \$172,557 | \$121,961 | \$125,586 | \$124,723 | \$110,528 | \$91,497 |  |  |

Table S7. Nine-month Salaries, 29 Responses of US CS Public With 20 < Tenure-Track Faculty <=35, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank $16+\mathrm{yrs}$ | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank <br> 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 24 | 28 | 29 | 29 | 24 | 28 | 28 | 29 | 20 | 11 | 10 |
| Indiv | 106 | 99 | 154 | 361 | 87 | 106 | 197 | 203 | 125 | 26 | 28 |
| 10 | \$141,945 | \$143,095 | \$123,727 | \$138,580 | \$101,525 | \$104,542 | \$104,470 | \$93,622 | \$69,154 | \$37,923 | \$48,221 |
| 25 | \$152,536 | \$152,489 | \$132,039 | \$148,241 | \$107,808 | \$109,919 | \$110,524 | \$96,325 | \$69,662 | \$71,199 | \$49,807 |
| 50 | \$170,016 | \$170,156 | \$145,299 | \$162,766 | \$114,170 | \$117,531 | \$117,059 | \$99,868 | \$76,032 | \$88,592 | \$55,336 |
| 75 | \$188,041 | \$182,599 | \$164,985 | \$175,445 | \$121,316 | \$125,671 | \$124,224 | \$107,496 | \$82,332 | \$105,211 | \$59,340 |
| 90 | \$195,629 | \$204,215 | \$168,999 | \$181,027 | \$127,500 | \$133,703 | \$128,507 | \$113,601 | \$92,452 | \$113,712 | \$64,540 |

Table S8. Nine-month Salaries, 38 Responses of US CS Public With Tenure-Track Faculty >30, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 36 | 36 | 36 | 38 | 31 | 36 | 38 | 38 | 33 | 24 | 21 |
| Indiv | 298 | 247 | 315 | 905 | 138 | 232 | 392 | 460 | 362 | 139 | 173 |
| 10 | \$157,977 | \$145,474 | \$134,751 | \$152,683 | \$106,849 | \$111,916 | \$113,051 | \$98,295 | \$70,606 | \$67,899 | \$45,042 |
| 25 | \$168,740 | \$155,907 | \$143,442 | \$158,470 | \$115,862 | \$119,814 | \$116,789 | \$103,166 | \$79,307 | \$74,157 | \$51,844 |
| 50 | \$181,869 | \$166,889 | \$158,063 | \$170,200 | \$121,001 | \$125,670 | \$124,886 | \$107,251 | \$84,590 | \$90,086 | \$54,828 |
| 75 | \$193,892 | \$185,752 | \$167,158 | \$180,782 | \$129,952 | \$134,386 | \$134,720 | \$112,268 | \$92,189 | \$109,169 | \$58,964 |
| 90 | \$215,402 | \$202,628 | \$177,983 | \$190,600 | \$138,611 | \$138,178 | \$140,382 | \$115,159 | \$102,855 | \$125,981 | \$61,010 |

data reported below, and the accompanying tables, were updated to reflect a small amount of data provided after the deadline for the December report.

Salaries at private institutions tend to be higher than those at public institutions for all faculty types (Tables S2 and S3). This pattern is consistent with data from previous years.

When viewed relative to faculty size (Figures S1-S7), salaries at each tenure-track rank tend to be higher for larger departments at both public and private institutions. This pattern is consistent with last year's pattern. Salaries for teaching faculty exhibit this pattern at private institutions and, for the most part, also at public institutions.

When viewed relative to type of locale (also Figures $\mathrm{Sl}-\mathrm{S} 7$ ), public institution salaries appear to be generally lower in smaller locales than in mid-size or large cities for all tenure-track faculty ranks and for teaching faculty, Private institution salaries also exhibit this behavior except for full professors in rank 8-15 years.

Our analysis of faculty salary changes from one year to the next uses only those departments that reported both years; otherwise, the departments that reported during only one year can skew the comparison. Because some departments that reported both years provided only aggregate salaries for their full and associate professors during one year and in the other year reported them by years in rank, we only report salary changes for all full professors and for all associate professors in the year-to-year comparison. Table S21 shows, by type of faculty and type of department, the change in the median of the average salaries from departments that reported both years (the number of departments being compared is indicated in parentheses in each column heading). Using the cell showing full professors at U.S. CS departments as an example, the table indicates that the median of the 124 average salaries for full professors was 2.4 percent higher in 2017 than was the median of the average full professor salaries in 2016 from these same 124 departments.

When interpreting these changes, it is important to remember the effect that promotions have on the departmental data from

Table S9. Nine-month Salaries, 15 Responses of US CS Private With <<20 Tenure-Track Faculty, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  |  | Assistant | Non-Tenure Track |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: |
|  | In rank <br> 16+ yrs | In rank <br> $8-15$ yrs | In rank <br> 0-7 years | All years <br> in rank | In rank <br> $8+$ years | In rank <br> $0-7$ <br> years | All years <br> in rank n |  | Teach | Research | Postdoc |  |
| Depts | 11 | 13 | 11 | 14 | 11 | 13 | 14 | 14 | 10 | 3 | 2 |  |
| Indiv | 37 | 29 | 32 | 101 | 22 | 33 | 60 | 48 | 38 |  |  |  |
| 10 | $\$ 130,076$ | $\$ 132,213$ | $\$ 140,037$ | $\$ 124,771$ | $\$ 100,025$ | $\$ 104,282$ | $\$ 101,058$ | $\$ 96,840$ | $\$ 76,102$ |  |  |  |
| 25 | $\$ 151,143$ | $\$ 133,790$ | $\$ 148,601$ | $\$ 147,796$ | $\$ 107,067$ | $\$ 106,526$ | $\$ 108,018$ | $\$ 101,869$ | $\$ 80,270$ |  |  |  |
| 50 | $\$ 163,728$ | $\$ 152,435$ | $\$ 169,014$ | $\$ 169,014$ | $\$ 114,585$ | $\$ 120,688$ | $\$ 118,008$ | $\$ 106,128$ | $\$ 83,103$ |  |  |  |
| 75 | $\$ 176,403$ | $\$ 194,150$ | $\$ 181,625$ | $\$ 183,401$ | $\$ 125,536$ | $\$ 131,775$ | $\$ 127,511$ | $\$ 117,850$ | $\$ 89,591$ |  |  |  |
| 90 | $\$ 206,690$ | $\$ 222,479$ | $\$ 198,359$ | $\$ 193,657$ | $\$ 130,268$ | $\$ 139,268$ | $\$ 132,918$ | $\$ 123,402$ | $\$ 95,506$ |  |  |  |

Table SIO. Nine-month Salaries, 18 Responses of US CS Private With 15 < Tenure-Track Faculty <<30, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 15 | 15 | 14 | 17 | 11 | 15 | 17 | 18 | 14 | 9 | 7 |
| Indiv | 82 | 51 | 66 | 210 | 22 | 41 | 72 | 109 | 74 | 33 | 58 |
| 10 | \$162,620 | \$150,783 | \$145,376 | \$162,279 | \$107,829 | \$120,176 | \$114,594 | \$102,940 | \$77,339 |  |  |
| 25 | \$170,398 | \$169,630 | \$155,998 | \$170,701 | \$114,317 | \$122,487 | \$119,000 | \$104,772 | \$80,361 | \$111,400 | \$61,120 |
| 50 | \$183,850 | \$191,967 | \$170,280 | \$183,581 | \$122,784 | \$132,000 | \$128,642 | \$111,634 | \$92,057 | \$137,518 | \$62,008 |
| 75 | \$207,106 | \$214,373 | \$192,655 | \$203,454 | \$133,223 | \$146,613 | \$140,247 | \$124,909 | \$109,537 | \$141,667 | \$67,996 |
| 90 | \$230,439 | \$234,937 | \$214,487 | \$213,029 | \$134,105 | \$153,561 | \$148,241 | \$127,170 | \$121,960 |  |  |

Table Sll. Nine-month Salaries, 23 Responses of US CS Private With Tenure-Track Faculty >20, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank <br> 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 21 | 21 | 19 | 23 | 16 | 21 | 23 | 23 | 20 | 13 | 12 |
| Indiv | 189 | 115 | 161 | 487 | 82 | 129 | 222 | 232 | 243 | 99 | 216 |
| 10 | \$165,924 | \$147,396 | \$144,191 | \$153,344 | \$107,728 | \$122,250 | \$115,368 | \$103,646 | \$77,257 | \$73,643 | \$57,118 |
| 25 | \$183,850 | \$172,010 | \$156,876 | \$177,308 | \$116,159 | \$129,392 | \$122,480 | \$108,855 | \$84,235 | \$98,899 | \$61,182 |
| 50 | \$205,973 | \$197,960 | \$174,714 | \$194,490 | \$133,303 | \$140,295 | \$137,381 | \$113,662 | \$97,052 | \$140,060 | \$66,984 |
| 75 | \$235,233 | \$228,729 | \$197,971 | \$216,785 | \$146,118 | \$148,740 | \$145,405 | \$124,764 | \$108,010 | \$157,793 | \$68,401 |
| 90 | \$240,269 | \$259,830 | \$219,477 | \$224,481 | \$152,142 | \$171,200 | \$155,229 | \$130,329 | \$115,455 | \$163,956 | \$69,189 |

Table SI2. Nine-month Salaries, 38 Responses of US CS Public In Large City or Suburbs, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  |  | Assistant |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |

Table SI3. Nine-month Salaries, 25 Responses of US CS Public In Midsize City or Suburbs, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank <br> 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 21 | 19 | 21 | 24 | 18 | 23 | 24 | 23 | 17 | 9 | 6 |
| Indiv | 127 | 93 | 157 | 386 | 64 | 93 | 166 | 159 | 139 | 39 | 36 |
| 10 | \$135,953 | \$114,421 | \$125,000 | \$137,257 | \$100,060 | \$106,496 | \$102,331 | \$92,029 | \$63,479 |  |  |
| 25 | \$152,867 | \$135,356 | \$140,581 | \$145,251 | \$105,383 | \$111,904 | \$110,708 | \$95,217 | \$69,692 | \$73,642 |  |
| 50 | \$173,987 | \$164,693 | \$151,471 | \$159,563 | \$111,358 | \$120,170 | \$115,341 | \$101,084 | \$79,000 | \$83,685 | \$54,983 |
| 75 | \$192,881 | \$170,555 | \$164,913 | \$173,191 | \$177,609 | \$126,910 | \$124,689 | \$110,592 | \$88,644 | \$115,100 |  |
| 90 | \$194,825 | \$192,022 | \$176,383 | \$185,927 | \$137,364 | \$135,088 | \$138,294 | \$118,383 | \$111,889 |  |  |

Table S14. Nine-month Salaries, 39 Responses of US CS Public in Small City, Town, or Rural, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank $16+\mathrm{yrs}$ | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 25 | 30 | 36 | 39 | 31 | 34 | 38 | 39 | 31 | 11 | 15 |
| Indiv | 115 | 115 | 171 | 452 | 102 | 135 | 265 | 294 | 189 | 50 | 78 |
| 10 | \$121,826 | \$118,345 | \$114,138 | \$118,830 | \$97,208 | \$98,043 | \$98,069 | \$85,267 | \$61,671 | \$68,000 | \$47,897 |
| 25 | \$138,166 | \$133,496 | \$121,130 | \$126,624 | \$99,437 | \$101,700 | \$101,704 | \$89,272 | \$66,760 | \$73,165 | \$51,396 |
| 50 | \$151,542 | \$157,567 | \$137,832 | \$147,969 | \$107,199 | \$112,369 | \$109,811 | \$96,325 | \$74,213 | \$75,458 | \$54,828 |
| 75 | \$180,019 | \$179,034 | \$158,140 | \$162,396 | \$117,941 | \$124,668 | \$121,625 | \$99,919 | \$84,725 | \$86,871 | \$60,412 |
| 90 | \$190,053 | \$197,450 | \$170,794 | \$177,601 | \$126,538 | \$129,300 | \$127,394 | \$109,133 | \$91,956 | \$92,284 | \$62,852 |

Table S15. Nine-month Salaries, 25 Responses of US CS Private in Large City or Suburbs, Percentiles from Department Averages

|  | Full Professor |  |  |  | Associate |  |  | Assistant | Non-Tenure Track |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | In rank 16+ yrs | In rank 8-15 yrs | In rank 0-7 years | All years in rank | In rank 8+ years | In rank 0-7 years | All years in rank |  | Teach | Research | Postdoc |
| Depts | 22 | 23 | 24 | 25 | 19 | 25 | 25 | 24 | 21 | 11 | 8 |
| Indiv | 123 | 102 | 160 | 401 | 86 | 121 | 215 | 195 | 240 | 78 | 154 |
| 10 | \$141,061 | \$135,116 | \$139,830 | \$139,771 | \$107,467 | \$111,772 | \$111,034 | \$100,602 | \$77,218 | \$77,629 |  |
| 25 | \$164,128 | \$148,123 | \$153,024 | \$167,631 | \$112,694 | \$120,688 | \$118,222 | \$106,523 | \$81,443 | \$105,150 | \$61,139 |
| 50 | \$204,449 | \$191,015 | \$170,280 | \$184,034 | \$128,287 | \$132,000 | \$128,642 | \$115,148 | \$94,755 | \$141,667 | \$65,460 |
| 75 | \$216,070 | \$221,174 | \$190,087 | \$203,454 | \$136,724 | \$144,512 | \$144,994 | \$125,552 | \$98,186 | \$157,281 | \$68,401 |
| 90 | \$238,456 | \$267,333 | \$202,117 | \$219,849 | \$149,254 | \$153,561 | \$150,533 | \$130,288 | \$107,247 | \$165,334 |  |

Table S16. Nine-month Salaries, 13 Responses of US CS Private in Other than Large City, Percentiles from Department Averages

|  | Full Professor |  |  |  |  | Associate |  |  |  | Assistant | Non-Tenure Track |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
|  | In rank <br> l6+ yrs | In rank <br> $8-15$ yrs | In rank <br> $0-7$ years | All years <br> in rank | In rank <br> $8+$ years | In rank <br> $0-7$ years | All years <br> in rank |  | Teach | Research | Postdoc |  |  |
| Depts | 10 | 11 | 6 | 12 | 8 | 9 | 12 | 13 | 9 | 5 | 6 |  |  |
| Indiv | 103 | 42 | 33 | 187 | 18 | 41 | 67 | 85 | 41 | 27 | 68 |  |  |
| 10 | $\$ 153,312$ | $\$ 134,595$ |  | $\$ 146,954$ |  |  | $\$ 104,113$ | $\$ 103,283$ |  |  |  |  |  |
| 25 | $\$ 168,310$ | $\$ 157,323$ |  | $\$ 158,563$ | $\$ 106,916$ | $\$ 124,700$ | $\$ 113,015$ | $\$ 103,862$ | $\$ 81,079$ |  |  |  |  |
| 50 | $\$ 189,471$ | $\$ 192,706$ | $\$ 180,803$ | $\$ 185,537$ | $\$ 117,064$ | $\$ 129,776$ | $\$ 123,705$ | $\$ 111,820$ | $\$ 89,907$ | $\$ 114,052$ | $\$ 64,396$ |  |  |
| 75 | $\$ 217,288$ | $\$ 217,024$ |  | $\$ 205,873$ | $\$ 127,419$ | $\$ 142,759$ | $\$ 140,259$ | $\$ 118,256$ | $\$ 110,300$ |  |  |  |  |
| 90 | $\$ 237,723$ | $\$ 228,729$ |  | $\$ 221,880$ |  |  | $\$ 142,990$ | $\$ 122,359$ |  |  |  |  |  |

Table SI7. Nine-month Salaries, 8 Responses of 35 US Computer Engineering Departments, Percentiles from Department Averages

|  | Full Professor |  |  |  |  | Associate |  |  |  | Assistant | Non-Tenure Track |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
|  | In rank <br> 16+ yrs | In rank <br> $8-15$ yrs | In rank <br> $0-7$ years | All years <br> in rank | In rank <br> $8+$ years | In rank <br> $0-7$ <br> years | All years <br> in rank |  | Teach | Research | Postdoc |  |  |
| Depts | 5 | 6 | 6 | 8 | 5 | 7 | 8 | 8 | 5 | 1 | 3 |  |  |
| Indiv | 26 | 15 | 28 | 77 | 16 | 27 | 49 | 27 | 19 | 0 | 0 |  |  |
| 10 |  |  |  |  |  |  |  |  |  |  |  |  |  |
| 25 |  |  |  | $\$ 150,943$ |  | $\$ 108,959$ | $\$ 109,878$ | $\$ 94,125$ |  |  |  |  |  |
| 50 | $\$ 186,903$ | $\$ 165,184$ | $\$ 132,624$ | $\$ 172,792$ | $\$ 114,052$ | $\$ 111,573$ | $\$ 120,319$ | $\$ 98,500$ | $\$ 77,915$ |  |  |  |  |
| 75 |  |  |  | $\$ 183,667$ |  | $\$ 117,033$ | $\$ 124,967$ | $\$ 105,548$ |  |  |  |  |  |
| 90 |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table S18. Nine-month Salaries, 14 Responses of 24 US Information Departments, Percentiles from Department Averages

|  | Full Professor |  |  |  |  | Associate |  |  |  | Assistant | Non-Tenure Track |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
|  | In rank <br> l6+ yrs | In rank <br> 8-15 yrs | In rank <br> 0-7 years | All years <br> in rank | In rank <br> 8+ years | In rank <br> 0-7 years | All years <br> in rank |  | Teach | Research | Postdoc |  |  |
| Depts | 11 | 13 | 12 | 14 | 10 | 14 | 14 | 14 | 13 | 5 | 6 |  |  |
| Indiv | 33 | 55 | 62 | 151 | 42 | 93 | 135 | 137 | 109 | 17 | 31 |  |  |
| 10 | $\$ 138,603$ | $\$ 131,607$ | $\$ 124,507$ | $\$ 140,778$ | $\$ 95,752$ | $\$ 96,788$ | $\$ 95,403$ | $\$ 83,635$ | $\$ 73,922$ |  |  |  |  |
| 25 | $\$ 156,674$ | $\$ 145,438$ | $\$ 143,136$ | $\$ 148,582$ | $\$ 101,953$ | $\$ 106,333$ | $\$ 106,333$ | $\$ 92,870$ | $\$ 78,718$ |  |  |  |  |
| 50 | $\$ 176,408$ | $\$ 159,207$ | $\$ 148,075$ | $\$ 164,306$ | $\$ 115,800$ | $\$ 118,028$ | $\$ 119,457$ | $\$ 100,671$ | $\$ 90,953$ | $\$ 79,977$ | $\$ 56,141$ |  |  |
| 75 | $\$ 193,204$ | $\$ 183,027$ | $\$ 156,561$ | $\$ 172,478$ | $\$ 125,205$ | $\$ 138,546$ | $\$ 138,134$ | $\$ 106,370$ | $\$ 103,304$ |  |  |  |  |
| 90 | $\$ 199,984$ | $\$ 197,404$ | $\$ 172,154$ | $\$ 192,851$ | $\$ 138,956$ | $\$ 143,546$ | $\$ 142,240$ | $\$ 114,724$ | $\$ 135,420$ |  |  |  |  |

Table S19. Twelve-month Salaries, 9 Responses of 30 Canadian Departments, Percentiles from Department Averages

|  | Full Professor |  |  |  |  | Associate |  |  |  | Assistant | Non-Tenure Track |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: | :---: |
|  | In rank <br> l6+ yrs | In rank <br> $8-15$ yrs | In rank <br> 0-7 years | All years <br> in rank | In rank <br> $8+$ years | In rank <br> $0-7$ years | All years <br> in rank |  | Teach | Research | Postdoc |  |  |
| Depts | 9 | 8 | 9 | 9 | 9 | 7 | 9 | 9 | 6 | 3 | 4 |  |  |
| Indiv | 57 | 50 | 56 | 163 | 64 | 37 | 101 | 51 | 59 |  | 4 |  |  |
| 10 |  |  |  |  |  |  |  |  |  |  |  |  |  |
| 25 | $\$ 167,307$ | $\$ 166,529$ | $\$ 145,915$ | $\$ 170,603$ | $\$ 142,851$ | $\$ 127,311$ | $\$ 134,901$ | $\$ 100,653$ |  |  |  |  |  |
| 50 | $\$ 205,063$ | $\$ 176,028$ | $\$ 157,979$ | $\$ 176,965$ | $\$ 151,064$ | $\$ 144,960$ | $\$ 148,775$ | $\$ 118,994$ | $\$ 120,506$ |  | $\$ 55,525$ |  |  |
| 75 | $\$ 210,452$ | $\$ 197,717$ | $\$ 188,592$ | $\$ 197,802$ | $\$ 173,843$ | $\$ 163,028$ | $\$ 168,398$ | $\$ 132,508$ |  |  |  |  |  |
| 90 |  |  |  |  |  |  |  |  |  |  |  |  |  |

Table S20. Nine-month Salaries for New PhDs (Twelve-month for Canadian)

|  | US (CS, CE, and Info Combined) |  |  |  | Canadian |  |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | :---: |
|  | Tenure-Track | Non-ten <br> Teaching | Non-ten <br> Research | Postdoc | Tenure-Track | Non-ten <br> Teaching | Non-ten <br> Research | Postdoc |
| Depts | 81 | 27 | 8 | 28 | 4 | 1 | 1 |  |
| Indiv | 151 | 37 | 11 | 132 | 15 | 2 | 2 |  |
| 10 | $\$ 90,000$ | $\$ 64,500$ | $\$ 60,000$ | $\$ 43,436$ |  |  |  | 17 |
| 25 | $\$ 95,200$ | $\$ 72,500$ | $\$ 65,421$ | $\$ 50,689$ |  |  |  |  |
| 50 | $\$ 102,504$ | $\$ 78,000$ | $\$ 68,333$ | $\$ 59,000$ | $\$ 120,000$ |  |  |  |
| 75 | $\$ 110,000$ | $\$ 90,000$ | $\$ 72,750$ | $\$ 67,425$ |  |  |  |  |
| 90 | $\$ 114,400$ | $\$ 97,221$ | $\$ 84,999$ | $\$ 67,425$ |  |  |  |  |

## 2017 CRA Taulbee Survey (continued)

one year to the next, since a promotion causes an individual faculty member to move from one rank to another. Thus, a department with a small number of faculty members in a particular rank can have its average salary in that rank change appreciably (in either direction) by a single promotion to or from that rank. Departures via resignation or retirement also impact these figures, particularly in the non-tenuretrack categories. Because of the small number of Canadian, CE, and I departments reporting, the values in those columns are considerably more volatile; this is evident in several of the entries in Table S21.

For new Ph.D.s in tenure-track positions at U.S. CS, CE, and I school departments (Table S20) the median of the averages was $\$ 102,504$, an increase of 2.5 percent vs. last year. There were not enough new tenure-track faculty salaries from Canadian institutions last year to report any salary distribution data, so year-to-year comparisons cannot be made.

Table S21. Change in Salary Median for Departments that Reported in Both 2016 and 2017

|  | U.S. CS | U.S. CE | U.S. I | Canadian |
| :--- | :---: | :---: | :---: | :---: |
| Departments | 133 | 8 | 13 | 8 |
| Full Profs | $1.3 \%$ | $5.5 \%$ | $2.6 \%$ | $-1.8 \%$ |
| Assoc. Profs. | $3.5 \%$ | $1.8 \%$ | $4.3 \%$ | $1.5 \%$ |
| Asst. Profs. | $1.5 \%$ | $-2.5 \%$ | $2.5 \%$ | $5.4 \%$ |
| Non-ten-track teaching faculty | $2.8 \%$ | $-4.3 \%$ | $4.5 \%$ |  |
| Research faculty | $2.4 \%$ |  | $0.2 \%$ |  |
| Post doctorates | $3.9 \%$ | $0.5 \%$ | $-3.2 \%$ | $1.7 \%$ |

Figure SI. US CS Department Average Salary, Full Professor in Rank 16+ Years CRA Taulbee Survey 2017


Figure S2. US CS Department Average Salary, Full Professor in Rank 8-15 Years
CRA Taulbee Survey 2017


Figure S3. US CS Department Average Salary, Full Professor in Rank 0-7 Years CRA Taulbee Survey 2017


Figure S4. US CS Department Average Salary, Associate Professor in Rank 8+ Years CRA Taulbee Survey 2017


Figure S5. US CS Department Average Salary, Associate Professor in Rank 0-7 Years CRA Taulbee Survey 2017


Figure S6. US CS Department Average Salary, Assistant Professor
CRA Taulbee Survey 2017


Figure S7. US CS Department Average Salary, Non-Tenure Track Teaching Faculty CRA Taulbee Survey 2017


Figure S8. US CS Department Average Salary, Non-Tenure Track Research Faculty CRA Taulbee Survey 2017


Figure S9. US CS Department Average Salary, Postdoctorates


## 2017 CRA Taulbee Survey (continued)

## Concluding Observations

Once again, undergraduate enrollments in U.S. doctoral-granting computer science programs increased, as did the number of new students in the departments' graduate programs at both the master's and doctoral levels. While there also were increases in the number of tenure-track and teaching faculty, these increases continue to not keep pace with the increases in students. Next year, as part of the Department Profiles section of the Taulbee Survey that runs every three years, we intend to gather updated information about how departments are coping with this situation.

## Participating CS, CE, I and Canadian Departments

 (Departments marked with * have participated in all 5 of the most recent Taulbee surveys)U.S. CS Public (109): Arizona State*, Auburn*, Binghamton, Clemson*, College of William \& Mary*, Colorado School of Mines*, Colorado State*, Florida International*, George Mason*, Georgia Tech*, Georgia State, Indiana*, Iowa State*, Kansas State*, Kent State*, Michigan State*, Michigan Technological University, Mississippi State*, Missouri University of Science and Technology, Montana State*, Naval Postgraduate School*, New Jersey Institute of Technology, New Mexico State, North Carolina State*, North Dakota State*, Ohio State*, Ohio*, Oklahoma State*, Old Dominion, Oregon State, Pennsylvania State*, Portland State*, Purdue*, Rutgers, Southern Illinois (Carbondale), Stony Brook (SUNY)*, Texas A\&M*, Texas Tech, University at Buffalo, Universities of: Alabama (Birmingham* and Tuscaloosa*), Arizona, Arkansas*, Arkansas at Little Rock*, California (Berkeley*, Davis*, Irvine*, Los Angeles, Riverside*, San Diego, Santa Barbara*, and Santa Cruz**), Central Florida*, Colorado (Boulder)*, Connecticut, Delaware*, Florida*, Georgia*, Houston*, Idaho, Illinois (Chicago* and Urbana-Champaign*), lowa*, Kansas*, Kentucky, Louisiana at Lafayette*, Maryland (College Park* and Baltimore County*), Massachusetts (Amherst*, Boston*,
and Lowell), Memphis, Michigan*, Minnesota*, Nebraska (Omaha and Lincoln*), Nevada (Las Vegas and Reno*), New Hampshire*, New Mexico, North Carolina (Chapel Hill* and Charlotte*), North Dakota, North Texas*, Oklahoma*, Oregon*, Pittsburgh, Rhode Island*, South Carolina*, South Florida*, Southern Mississippi, Tennessee (Knoxville)*, Texas (Arlington, Austin*, Dallas*, and El Paso*), Utah*, Vermont, Virginia*, Washington*, Wisconsin (Madison* and Milwaukee), Wyoming, Virginia Commonwealth, Virginia Tech*, Washington State*, Wayne State, Western Michigan, and Wright State.
U.S. CS Private (40): Boston University*, Brandeis, Brown, Carnegie Mellon*, Case Western Reserve*, Clarkson, Columbia, Cornell*, DePaul*, Drexel*, Duke*, Emory, George Washington, Georgetown, Harvard, Illinois Institute of Technology, Johns Hopkins*, Lehigh*, MIT*, New York University*, Northeastern*, Northwestern, Polytechnic*, Princeton*, Rensselaer*, Rice, Rochester Institute of Technology*, Stanford*, Stevens Institute of Technology, Toyota Technological Institute at Chicago*, Tufts*, Universities of: Chicago*, Notre Dame, Pennsylvania*, Rochester*, Southern California*, and Tulsa*, Washington in St. Louis*, Worcester Polytechnic Institute*, and Yale.
U.S. CE (8): Iowa State, North Carolina State*, Northeastern, Universities of: California (Santa Cruz), Central Florida*, Illinois (Urbana-Champaign), New Mexico*, and Southern California.
U.S. Information (15): Cornell*, Drexel*, Florida State, Indiana*, Penn State*, Syracuse, Universities of: California (Berkeley)*, Colorado (Boulder), Illinois (Urbana-Champaign), Maryland (College Park ISchool and Baltimore County*), Michigan*, North Carolina (Chapel Hill)*, Pittsburgh*, and Washington*

Canadian (II): Concordia*, McGill, Simon Fraser*, Universities of: British Columbia*, Calgary*, Manitoba*, Toronto*, Victoria*, Waterloo, Western Ontario, and York*.
'The title of the survey honors Orrin E. Taulbee of the University of Pittsburgh, who conducted these surveys for the Computer Science Board until 1984, with retrospective annual data going back to 1970.
${ }^{2}$ Information (I) programs included here are Information Science, Information Systems, Information Technology, Informatics, and related disciplines with a strong computing component. Surveys were sent to CRA members, the CRA Deans group members, and participants in the iSchools Caucus (www.ischools.org) who met the criteria of granting Ph.D.s and being located in North America. Other I programs who meet these criteria and would like to participate in the survey in future years are invited to contact survey@cra.org for inclusion.
${ }^{3}$ Classification of the population of an institution's locale is in accordance with the Carnegie Classification database. Large cities are those with population $>=250,000$. Mid-size cities have population between 100,000 and 250,000 . Town/rural populations are less than 100,000 .
${ }^{4}$ All faculty tables: The survey makes no distinction between faculty specializing in CS vs. CE programs. Every effort is made to minimize the inclusion of faculty in electrical engineering who are not computer engineers.

## Should NSF CISE Implement a No-Deadlines Approach?

Our friends at the National Science Foundation (NSF) have asked for research community input on a proposed policy change to eliminate/ reduce deadlines for core programs in the CISE Directorate

The question comes as two other directorates at the Foundation - the Directorate for Geosciences (GEO) and the Directorate for Biological Sciences (BIO) - have announced they will implement a "no-deadline" full-proposal mechanism for receiving and reviewing proposals submitted to core programs. A Dear Colleague Letter released by the BIO directorate explains their plan:

In order to promote interdisciplinary research that crosses biological scales and traverses current divisional boundaries, BIO will implement a "no-deadline," full-proposal mechanism for receiving and reviewing proposals submitted to core programs....

By accepting proposals at any time, investigators will have greater opportunities to prepare their proposals, build strong collaborations, and think more creatively, thereby resulting in more complex, interdisciplinary projects that have the potential to dramatically advance biological science. We anticipate that the elimination of deadlines will reduce the burden on institutions and the community by expanding the submission period over the course of the year, in contrast to the previous fixed yearly deadlines.

Given the increased pressures on securing federal funding and, in some cases, reduced capacity for grant management at computing research institutions, do you think the Computer \& Information Science \& Engineering (CISE) Directorate should follow the lead of the BIO and GEO directorates and consider eliminating or reducing deadlines for proposal submissions? What positive or negative impact could such a shift have on our community?

Please fill out this informal, non-scientific survey and let us know. We'll collect responses through May l5th and then share the collective feedback with NSF.

## Envisioning the Future of CERP

## By Burçin Tamer, Director of CERP and Heather Wright, Associate Director of CERP

CRA's Center for Evaluating the Research Pipeline (CERP) recently underwent staffing changes when former Director Jane Stout left the CRA. Burçin Tamer, Ph.D., is now the Director of CERP and Heather Wright is the Associate Director. Under their leadership, CERP will extend its reach as a resource for the computing community through its Data Buddies Project, evaluation services, and other activities. Heather and Burçin are both excited to make contributions to the computing community and drive the broader mission of CRA to facilitate the development of strong, diverse talent in the field.

## CERP as a Resource for the Computing Community

CERP's main goal is to be a valuable resource for the computing community. It has an extensive data collection infrastructure and uses their data to perform evaluation, provide evidence-based recommendations, and contribute knowledge to the computing community at large. With the goal of increasing responsiveness to the computing community, the center will further develop services based on the community's needs and make resources publicly and widely available.

## The Data Buddies Project

CERP collects survey data from undergraduate and graduate students through the Data Buddies Project. The project currently includes 99 colleges and universities that volunteer as a network to reach computing students across the United States and Canada. The institutions distribute a survey link on behalf of CERP to all students affiliated with computing degree programs within their departments. With minimal-to-no burden on the departments that distribute the Data Buddies survey, the center is able to collect nearly 20,000 responses from students each year.

Once data collection through the project concludes, volunteer departments receive a customized annual report that provides several unique features. These reports include an executive

"Your Institution at a Glance" page that visualizes some of the key variables for each institution. Additionally, the reports provide aggregated data tables comparing students from their institution against students from similar institutions. Finally, two additional chapters compare the institution's students by gender and race/ethnicity presented alongside the comparison of similar institutions' students by gender and race/ethnicity. These reports allow departments to not only learn about their students but also explore how their students' experiences measure against those from similar institutions.

The Data Buddies Project also provides an opportunity to formulate a longitudinal data collection process through which CERP obtains data at multiple time points from students who agree to participate in the study. These data are invaluable for understanding the progression of students' academic careers.

Is your department involved with Data Buddies? Contribute to this project and start receiving your own customized report by volunteering here!

## Envisioning the Future (continued)

Computing Research Association Evaluation

## Evaluation Services

CERP has an extensive number of evaluation services that can provide specific recommendations to clients seeking to improve their programs for participants at all career stages (i.e., undergraduates, graduate students, postdocs, career professionals, and faculty members). The center evaluates programs using a diverse set of methods, including formative assessment, pretest-posttest design, comparative evaluation, and quasi-experimental design. Data collected through Data Buddies provides a unique opportunity to produce these comparative and quasi-experimental evaluations.

CERP currently provides evaluative assessment of webinars, stand-alone workshops, conference workshops, formal Research Experience for Undergraduates programs, fellowship programs, Living-Learning-Communities, and professional development seminars. Examples of evaluation reports are available here.

Do you have a program you would like CERP to evaluate? Contact CERP here!

## Other Activities

In addition to collecting survey data and providing program evaluation services, the center engages in a number of other activities. CERP's data and analysis results are shared with the broader community through an interactive data visualization page and monthly infographics in Computing Research News. Furthermore, CERP uses its data resources and social science skills to make scholarly contributions to CS education research.

The center also has the capacity to provide data and research services beyond the available survey data. To date, it has responded to requests for empirical information on the state of computing education, designed and implemented data collection strategies to address specific research and evaluation needs, and served as a consulting body for social science research design.

What would you like to see in CERP's future infographics? Submit your ideas here!

## Support

CERP's work is supported through National Science Foundation awards CNS-1246649 and DUE-1431112, and direct CRA contributions.

## About the CERP Team

Burçin Tamer is the Director of CERP. She is responsible for overall operations and manages CERP's data resources and infrastructure as well as analysis activities. Her work provides social science support to the computing community's efforts for broadening participation.

Burçin joined CRA as a Research Scientist at CERP in May 2015 and has been Director since April 2018. Prior to joining CRA, she completed her doctoral training in Political Science and Women's Studies in 2015 at Pennsylvania State University, where she also received her Master of Arts degree in Political Science. At Penn State, she worked as a researcher on several large scale projects for which she designed and implemented data collection processes, performed analyses, and contributed to dissemination activities.

As Associate Director, Heather Wright leads CERP's evaluation efforts
for programs aimed at broadening participation in computing-related fields. Heather also manages CERP's Data Buddies Project, a national survey initiative that collects data from undergraduate and graduate students across the United States and Canada. Heather holds a B.S. in Sociology and two minors in Technical \& Business Writing and Women's Studies. She has been with the CRA since 2013.

Want to receive more updates about CERP? Subscribe to their newsletter!

# About 1 in 3 Underrepresented Minority Students and Students with Disabilities (URMD) Reported Thinking About Leaving Their Graduate Program 

CERP
Computing Research Association
Evaluation

By Burçin Tamer, CERP Director

## Seriously considered leaving graduate program



This chart presents survey data from graduate students collected during the fall 2017 semester. Students were asked whether they have seriously considered leaving their program during their academic career to date. Compared to White and Asian students (Majority), who are considered the racial and ethnic majority in computing fields, students who are members of underrepresented racial and ethnic groups and students with disabilities (URMD) were 1.5 times more likely to report having seriously considered leaving their graduate program.

Broadening participation in computing requires efforts that go beyond recruiting a diverse group of students. Retaining these students is what ensures a sustainable increase in diversity across the board. While retention is an issue to consider for all students, it is particularly pertinent for students who are not in the majority in the discipline, as these students tend to face a variety of obstacles that may adversely affect their persistence in their programs.

Providing strong support structures and opportunities for networking is an important component of retaining URMD students (as well as women). For instance, CRA organized the inaugural URMD Grad Cohort Workshop on March 16-17, 2018. These types of events bring together students to form supportive relationships, network with their peers and professionals in their area, and gain insights about various professional development topics.


#### Abstract

Notes: The survey data used in this chart were collected during the fall 2017 by Center for Evaluating the Research Pipeline (CERP) via The Data Buddies Project. The sample includes 3.856 Master's and Ph.D. students who are in a computing related field. The difference between the proportions of URMD and majority students who reported having seriously considered leaving their graduate program was tested using a $z$-test and is statistically significant at $p \leq .05$ level.

Underrepresented minority (URM) students include students who identify as African American/Black, American Indian/Alaska Native, Native Hawaiian/Pacific Islander, Arab/Middle Eastern/Persian, and Mexican American/Chicano/Puerto Rican/Other Latino. Students with disabilities include students who reported having at least one type of disability (auditory, intellectual. mental illness, mobility/orthopedic, speech/ language, specific learning disability, and visual). Majority includes racial/ethnic groups who are in the majority in computing, which are White/Caucasian, East Asian, Southeast Asian, South Asian, and Other Asian.


This analysis is brought to you by the CRA's Center for Evaluating the Research Pipeline (CERP). CERP provides social science research and comparative evaluation for the computing community. Subscribe to the CERP newsletter here.

This material is based upon work supported by the National Science Foundation under grant numbers (CNS-1246649; and/ or DUE-1431112). Any opinions, findings, and conclusions or recommendations expressed in this material are those of the author and do not necessarily reflect the views of the National Science Foundation.

## CCC Announces New Council Members

CCC
Computing Community Consortium Catalyst

By CCC Staff

The Computing Research Association (CRA), in consultation with the National Science Foundation (NSF), has appointed four new members to the Computing Community Consortium (CCC) Council:

- Ian Foster, Argonne National Laboratory
- David C. Parkes, Harvard University
- Ronitt Rubinfeld, Massachusetts Institute of Technology
- Suresh Venkatasubramanian, University of Utah

Beginning July 1 , the new members will each serve three-year terms The CCC Council is comprised of 20 members who have expertise in diverse areas of computing. They are instrumental in leading CCC's visioning programs, which help catalyze and enable ideas for future computing research. Members serve staggered three-year terms that rotate every July.

The CCC and CRA thank those Council members whose terms end on June 30 for their exceptional dedication and service to the CCC and to the broader computing research community:

- Cynthia Dwork, Harvard University
- Katherine Yelick, University of California at Berkeley
- Elizabeth Churchill, Google

This July Mark D. Hill from the University of Wisconsin-Madison will become Chair and Liz Bradley from the University of Colorado Boulder will become the Vice Chair. Beth Mynatt from Georgia Tech will become the Past Chair.

The CCC encourages participation from all members of the computing research community in our various activities. Each fall, the CCC issues a call for proposals for visioning activities. Each spring, the CCC issues a call for nominations for Council members effective the following July. For more information, please visit the CCC website or contact Dr. Ann W. Drobnis, CCC Director, at adrobnis@cra.org.

## Full Bios of New CCC Council Members



Ian Foster is Distinguished Fellow and director of the Data Science and Learning Division at Argonne National Laboratory. He is also the Arthur Holly Compton Distinguished Service Professor of Computer Science at the University of Chicago. Ian received a BSc (Hons I) degree from the University of Canterbury, New Zealand, and a PhD from Imperial College, United Kingdom, both in computer science. His research deals with distributed, parallel, and data-intensive computing technologies, and innovative applications of those technologies to scientific problems in such domains as climate change and biomedicine. His Globus software is widely used in national and international cyberinfrastructures. Foster is a fellow of the American Association for the Advancement of Science, the Association for Computing Machinery, and the British Computer Society. His awards include the Global Information Infrastructure Next Generation award, the British Computer Society's Lovelace Medal, the IEEE's Kanai award, and honorary doctorates from the University of Canterbury, New Zealand, and the Mexican Center for Research and Advanced Studies of the National Polytechnic Institute (CINVESTAV). He was a co-founder of Univa, Inc., a company established to deliver grid and cloud computing solutions.


David C. Parkes is the George F. Colony Professor of Computer Science in the Paulson School of Engineering and Applied Sciences at Harvard University, where he founded the EconCS research group and leads research with a focus on artificial intelligence, machine learning, and economics. He is codirector of the Harvard University Data Science Initiative, a faculty co-lead for planning the expansion of the Paulson school into the Allston campus, and was Area Dean for Computer Science, 2013-2017. Parkes served on the inaugural panel of the "Stanford 100 Year Study on Artificial Intelligence," co-organized the 2016 OSTP Workshop on "Al for Social Good," and served as chair of the ACM Special Interest Group on Electronic Commerce (2011-16). Parkes is Fellow of the Association for the Advancement of Artificial Intelligence (AAAI), and recipient of the 2017 ACM/SIGAI Autonomous Agents Research Award, the NSF Career Award, the Alfred P. Sloan Fellowship, the Thouron Scholarship, and the Roslyn Abramson Award for Teaching. Parkes has degrees from the University of Oxford and the University of Pennsylvania, serves on several international scientific advisory boards, and is a technical advisor to a number of start-ups.


Ronitt Rubinfeld is a professor in the Department of Electrical Engineering and Computer Science and a member of the Computer Science and Artificial Intelligence Laboratory at MIT. Ronitt is also on the faculty of the Computer Science Department at Tel Aviv University. Ronitt's main research area is the study of algorithms which run in sublinear time. Ronitt received her PhD from the University of California, Berkeley in 1991. Prior to her position at MIT, Ronitt was on the faculty at Cornell University and at NEC Research Labs. She was an ONR Young Investigator, a Sloan Research Fellow, the 1995 Cornell Association for Computer Science Undergraduates Faculty of the Year, and a recipient of the Cornell College of Engineering Teaching Award. Ronitt has given an invited lecture at the International Congress of Mathematicians in 2006, and is an ACM Fellow.


Suresh Venkatasubramanian is a professor at the University of Utah. His background is in algorithms and computational geometry, as well as data mining and machine learning. His current research interests lie in algorithmic fairness, and more generally the problem of understanding and explaining the results of black box decision procedures. Suresh received a CAREER award from the NSF for his work in the geometry of probability, as well as a test-of-time award at ICDE 2017 for his work in privacy. His research on algorithmic fairness has received press coverage across North America and Europe, including NPR's Science Friday, NBC, and CNN, as well as in other media outlets. He is a member of the board of the ACLU in Utah, and is a member of New York City's Failure to Appear Tool (FTA) Research Advisory Council.

Learn more about the CCC Council and its members on our webpage!

# John Hennessy and David Patterson Share ACM Turing Award 

CCC
Computing Community Consortium
Catalyst

By Mark D. Hill

The following is from the ACM SIGARCH Computer Architecture Today Blog by CCC Vice Chair Mark D. Hill, the John P. Morgridge Professor and Gene M. Amdahl Professor of Computer Sciences at the University of Wisconsin-Madison.

ACM recently announced that computer scientists John Hennessy and David Patterson have shared the 2017 ACM Turing Award with the official citation, "For pioneering a systematic, quantitative approach to the design and evaluation of computer architectures with enduring impact on the microprocessor industry." The Turing Award is the highest award in computer science. It is given for "lasting and major technical importance to the computer field" and has been compared to a Nobel Prize, whose categories pre-date our field. ACM's formal press release is available here.


Hennessy \& Patterson will present their public Turing lecture at the International Symposium on Computer Architecture (ISCA) in Los Angeles, CA on Monday, June 4, 2018. The abstract for the lecture is at the end of this blog post. FYI: I have known Hennessy and Patterson since the 1980s and Patterson was my Ph.D. co-advisor.

For this blog, I complement ACM's press release with a story-necessarily oversimplified-for how Hennessy \& Patterson's work fundamentally changed and accelerated computer architecture work. First, the background. From the beginning to the late 1960s, computer architecture was in a "golden" pioneer era when, instruction set architecture, instruction level parallelism, and caches were discovered. The next phase-until early 1980s-was an era with many computer architecture proposals often supported with incomplete metrics (e.g., MFLOPS or MIPS) and qualitative arguments. Progress during this interregnum was slower.

Hennessy \& Patterson ushered in multiple eras in which quantitative methods drove progress, wherein new ideas were judged experimentally on whether they systematically improved end-to-end metrics (e.g., time/program = instructions/ program×cycles/instruction×time/cycle). Idea development required more rigor and more time, but the field began to move much faster because we built upon each other more systematically. Quantitative methods flourished first in the instructionlevel parallelism era until early 2000s and then in multicore era to the early 2010s. Now we are experiencing a new heterogeneous era-with CPUs augmented with graphics processing units and a sea of other accelerators-whose rich possibilities will enable another golden age of computer architecture, provided good quantitative methods are developed and applied following the tenets and inspiration of Turing Laureates John Hennessy and David Patterson.

The abstract for Hennessy \& Patterson's Turing lecture follows.

## A New Golden Age for Computer Architecture:

Domain-Specific Hardware/Software CoDesign, Enhanced Security, Open Instruction Sets, and Agile Chip Development John Hennessy and David Patterson June 4, 2018

In the 1980s, Mead and Conway [1] democratized chip design and highlevel language programming surpassed assembly language programming, which made instruction set advances viable. Innovations like RISC, superscalar, multilevel caches, and speculation plus compiler advances (especially in register allocation) ushered in a Golden Age of computer architecture, when performance increased annually by $60 \%$. In the later 1990s and 2000s, architectural innovation decreased, so performance came primarily from higher clock rates and larger caches. The ending of Dennard Scaling and Moore's Law also slowed this path; single core performance improved only $3 \%$ last year! In addition to poor performance gains of modern microprocessors, Spectre

## ACM Turing Award (continued)

recently demonstrated timing attacks that leak information at high rates [2].

We're on the cusp of another Golden Age that will significantly improve cost, performance, energy, and security. These architecture challenges are even harder given that we've lost the exponentially increasing resources provided by Dennard scaling and Moore's law. We've identified areas that are critical to this new age:

## - Hardware/Software Co-Design for

 High-Level and Domain-Specific LanguagesAdvanced programming languages like Python and domain-specific languages like TensorFlow have dramatically improved programmer productivity by increasing software reuse and by raising the level of abstraction. Whereas compilerarchitecture co-design delivered gains of about three in the 1980s for C compilers and RISC architectures, new advances could create compilers and domainspecific architectures [3] (DSAs) that deliver tenfold or more jumps [4] in this new Golden Age.

## - Enhancing Security

We've made tremendous gains in information technology (IT) in the past 40 years, but if security is a war, we're losing it. Thus far, architects have been asked for little beyond page-level protection and supporting virtual machines. The very definition of computer architecture ignores timing, yet Spectre shows that attacks that can determine timing of operations can leak supposedly protected data. It's time for architects to redefine computer architecture and treat security
as a first class citizen to protect data from timing attacks, or at worst reduce information leaks to a trickle.

## - Free and Open Architectures and

 Open-Source ImplementationsProgress on these issues likely will require changes to the instruction set architecture (ISA), which is problematic for proprietary ISAs. For tall challenges like these, we want all the best minds to work on them, not only the engineers who work for the ISA owners. Thus, a free and open ISA such as RISC-V can be a boon to researchers [5] because:

- Many people in many organizations can innovate simultaneously using RISC-V.
- The ISA is designed for modularity and extensions.
- It comes with a complete software stack, including compilers, operating systems, and debuggers, which are open source and thus also modifiable.
- This modern ISA is designed to work for any application, from cloud-level servers down to mobile and loT devices.
- RISC-V is driven by a 100-member foundation [6] that ensures its long-term stability and evolution.

Unlike the past, open ISAs are viable because many engineers for a wide range of products are designing SOCs by incorporating IP and because ARM has demonstrated that IP works for ISAs.

An open architecture also enables opensource processor designs for both FPGAs and real chips, so architects can innovate by modifying an existing RISC-V design and its software stack. While FPGAs run at perhaps only 100 MHz , that is fast
enough to run trillions of instructions or to be deployed on the Internet to test a security feature against real attacks. Given the plasticity of FPGAs, the RISC-V ecosystem enables experimental investigations of novel features that can be deployed, evaluated, and iterated in days rather than in years. That vision requires more IP than CPUs, such as GPUs, neural network accelerators, DRAM controllers, and PCle controllers [7]. The stability of process nodes due to the ending of Moore's Law make this goal easier than in the past. This necessity opens a path for architects to have impact by contributing open-source components much as their software colleagues do for databases and operating systems.

## - Agile Chip Development

As the focus of innovation in architecture shifts from the general-purpose CPU to domain-specific and heterogeneous processors, we will need to achieve major breakthroughs in design time and cost (as happened for VLSI in the 1980s). Small teams should be able to design chips, tailored for a specific domain or application. This will require that hardware design become much more efficient, and more like modern software design.

Unlike the "waterfall" development process of giant chips by large companies, Agile development process [8] allows small groups to iterate designs of working but incomplete prototypes for small chips. Fortuitously, the same programming language advances that improved reuse of software have been incorporated in recent hardware design languages, which makes hardware design and reuse easier.

## ACM Turing Award (continued)

While one can stop at layout for a research paper, building real chips is inspiring for everyone in a project, and is the only way to verify important characteristics like timing and energy consumption. The good news is that today TMSC will deliver 100 small test chips in the latest technology for only $\$ 30,000$ [9]. Thus, virtually all projects can afford real chips as final validation of innovation as well as to enjoy the satisfaction of seeing your ideas work in silicon.

We believe the deceleration of performance gains for standard microprocessors, the opportunities in high-level, domain-specific languages and security, the freeing of architects from the chains of proprietary ISAs, and (ironically) the ending of Dennard scaling and Moore's law will lead to another Golden Age for architecture. Aided by an open-source ecosystem, agily developed prototypes will demonstrate advances and thereby accelerate commercial adoption. We envision the same rapid improvement as in the last Golden Age, but this time in cost, energy, and security as well in performance.

What an exciting time to be a computer architect!
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# Expanding the Pipeline: 2018 CRA-W Grad Cohort for Women Inspires Attendees to Persist in Computing 

By Shar Steed, CRA Communications Specialist

On April 13-14, more than 400 women graduate students in computing from more than 150 institutions converged on San Francisco, CA, for the 2018 CRA-W Graduate Cohort for Women (CRA-W Grad Cohort). Throughout the two-day workshop, professional connections were made, new friendships were formed, and mentoring relationships with senior researchers were established. CRA-W organizes this workshop as part of its mission to increase the success and participation of women in computing research.


## This Year's Workshop

During the presentations and informal networking opportunities, participants received advice on navigating their graduate education and gained relevant insights on a wide range of topics that included networking effectively, whether to get a Master's or a Ph.D., finding an advisor and developing an effective working relationship, finding a research topic, preparing your thesis proposal and becoming a Ph.D., publishing your research, presentation and other verbal communication skills, building your professional persona, balancing graduate school with your personal life, M.S. career opportunities and job search, industry vs. academic research positions, and Ph.D. academic and non-academic career paths and job search. One session also provided perspectives from Grad Cohort alumnae. In an inspiring keynote presentation, Maria Klawe, president of Harvey Mudd College, shared her life story, describing her career path and detailing hurdles she had to overcome and obstacles she still faces every day.

The plenary session on Strategies for Human-Human Interaction was another event highlight. The speakers-Jamika Burge, Capital One; Lori Clarke, University of Massachusetts Amherst; and Margaret Martonosi, Princeton University-encouraged students to stand up for themselves, bring up issues to an advisor, and look for allies. Even though the CRA-W Grad Cohort has grown to more than 400 participants, the environment is still very welcoming and supportive. During this session (and several others), attendees felt comfortable opening up to the group and lined up to share their stories about facing challenges and about positive outcomes that came out of difficult situations.

After the Friday afternoon poster session, the energy among the attendees remained high for a reception sponsored by Microsoft Research. The DJ spun a variety of music and participants, speakers, sponsors, and staff enjoyed dancing and socializing with friends, old and new.

## The Need for More Women in Computing

Women are underrepresented at all stages of the computing research career pipeline, and that is why events like the CRA-W Graduate Cohort for Women, which brings together those who may feel isolated, are crucial to supporting the creation of a diverse pipeline of the computing field. It's important to encourage women to stay the course and complete their graduate training. In testimonials collected after the workshop, a resounding theme was the participants' renewed motivation to complete their Ph.D. And CRA's Center for Evaluating the Research Pipeline (CERP) has data that supports this:

$\square$
"[At Grad Cohort], the session about being a woman in computing changed my life. I thought I was the only one dealing with this pressure and it is so helpful. Now I understand that differences will always be there and that my job is learning how to succeed in that environment. The session about self-confidence is another session that I will never forget; understanding that a successful career can be accompanied with failures motivates me to stand up even when I feel that I can't." - Grad Cohort participant, 2012


# CRA-W Accepting Proposals for Collaborative Research Experience for Undergraduates: May 18 Deadline 



We encourage you to participate in CRA-W's Collaborative Research Experience for Undergraduates (CREU) program, which is now accepting applications through May 18. CREU is an undergraduate research program that provides research stipends to teams of students working on research projects under the guidance of a mentor at their home institutions. Students supported by CREU collaborate with each other and with their mentors during the academic year and, in some cases, the following summer. Students are strongly encouraged to present their CREU research at national or regional conferences. The program provides travel funds to support such participation and past CREU participants have found such activities to be extremely valuable.

This is a great opportunity for your students to become involved in computing research and engage in the research community. Please forward this opportunity to your students and fellow faculty members, who may be interested in participating in this program.

Students and faculty may submit proposals at: https://cra.org/cra-w/creu/

If you have any questions or comments regarding this program, please feel free to contact creu@cra.org.

## Tuesday, July 17

| 6:00 am - 6:30 pm | Registration |
| :--- | :--- |
| 7:00 am | Breakfast |

8:30 am-10:00 am Plenary Panel

Diversity in Leadership

Chair: Carla Brodley, Northeastern University
Speakers: Michelle Craig, University of Toronto, Shinder Dhillon, Microsoft, Ayanna Howard, Georgia Tech, Diane Levitt, Cornell Tech, Mark Taguchi, Management Leadership for Tomorrow, and Ruth Watkins, University of Utah Much of the effort of the Conference at Snowbird community has focused on increasing the diversity of our students across all stages of the academic pipeline with some efforts post Ph.D. The focus of this panel of industry and academic experts is on the challenges and opportunities in retaining diverse employees. And further, on efforts to ensure leadership paths in industry and academia of diverse members of staff/faculty. In short, our focus will be on efforts to ensure that diversity does not stop at "bringing diversity in the door" - put another way, people go where they are invited and stay where they are welcomed.

10:00 am Break
10:30 am - noon
Parallel Tracks
Increasing Diversity in Computing is Easier Than You Think: Some Small Steps that Make a Big Difference Chair: Mary Hall, University of Utah
Speakers: Richard Ladner, University of Washington, and Manuel Pérez Quiñones
This panel will consider a number of common questions that colleges and universities face in trying to increase diversity of the population of computing students. The discussion will focus on the types of programs and activities that may be in reach for most academic units, and particularly for units that feel they are currently not doing enough to increase diversity and retain a diverse student population. The following questions are representative of the intended discussion.

- What programs are widely used and proven successful for recruitment, development and retention of diverse student populations in undergraduate computer science programs?
- Depending on type of institution, what are low-cost, low-effort programs that a unit can undertake?
- In universities where the entire student population is not very diverse, how can a unit create a community for students from underrepresented groups?
- Students from different underrepresented groups have unique needs. What are things a unit should think about in creating a welcoming environment for all students?
- What are examples of ways that a unit can partner with other institutions to create a diverse student pipeline?


# Tuesday, July 17 (continued) 

10:30 am - noon

## Parallel Tracks (continued)

## Growing a CS Department into a School/College of Computing

Chair: Chris Johnson, University of Utah
Speakers: Farnam Jahanian, Carnegie Mellon University, and Ruth Watkins, University of Utah
As computing continues to grow by tremendous leaps and bounds and to permeate universities' intellectual landscape, many department chairs are finding their programs have outgrown, or are outgrowing, the confines of their current locations in colleges of engineering or science. Discussions are taking place in many departments about exploring the possibility of expanding to a school or college of computing (or a similar name). In this panel, we have gathered a set of Provosts from Universities who have successfully made the transition from a Department of Computer Science to a College of Computing. The panelists will discuss the benefits of becoming a College of Computing, as well as, the challenges Departments face in making a successful transition to a College.

## Department Rankings

Chair: H.V. Jagadish, University of Michigan
Speakers: Emery Berger, University of Massachusetts-Amherst, Kathryn McKinley and Kuansan Wang, Microsoft Department rankings matter, whether we like it or not. Our community suffers when these rankings are performed poorly by external parties who may have limited understanding of our field. This is the case, even though we all understand that ranking reduces complex multi-attribute entities to a single number. This panel will describe some ways forward that are recently being explored.

Noon-1:30 pm Lunch

## 1:30-3:00 pm Parallel Tracks

Improving Faculty Recruiting in the Computing Community
Co-chairs: Shashi Shekhar, University of Minnesota, and Josep Torrellas, University of Illinois at Urbana-Champaign Speakers: Michael Franklin, University of Chicago, Juan Gilbert, University of Florida, Brian Noble, University of Michigan, Jennifer Rexford, Princeton University, and Craig Wills, Worcester Polytechnic Institute Faculty recruiting challenges are on the minds of many computing research members. In this session, the panelists will discuss faculty recruiting challenges faced by departmental leadership (e.g., low yield), faculty members (e.g., multiple candidates per week), and faculty candidates (e.g., many strong candidates not getting academic interviews). It will also assess the needs, if any, for computing research community action.

## Using CRA Data to Improve Your Department and Inform Decision Making

Co-chairs: Betsy Bizot, CRA, and Burçin Tamer, CRA
Speakers: James Allan, University of Massachusetts-Amherst, Tracy Camp, Colorado School of Mines,
Thu Nguyen, Rutgers University, and Cal Ribbens, Virginia Tech
This session will discuss two of CRA's data sources: the Taulbee Survey and the Data Buddies Project. Attendees will learn how these data sources are distinct yet complementary and gain a better understanding of the information available from each in published reports and departmental comparison reports. Speakers will describe how departments have made use of these data, and discuss issues of individual and departmental privacy and the tradeoffs of survey length, comprehensiveness, and response rate. A portion of the session will be devoted to getting feedback on how Taulbee and Data Buddies can be of better use to the community.

## Tuesday, July 17 (continued)

| 1:30-3:00 pm | Parallel Tracks <br> Augmenting, Not Replacing, People <br> Chair: Ann Drobnis, CRA <br> Speakers: Greg Hager, Johns Hopkins University, Monica Lam, Stanford, and Jenna Wiens, University of Michigan Artificial intelligence (Al) technologies are rapidly maturing into tools that are impacting our everyday lives. However, contrary to popular conception, most of these tools will not be autonomous, stand-alone systems, but rather will manifest as human assistants and augmentations. While autonomous driving is featured in the headlines, the shortterm impact of advances in this field will be increased safety, comfort, and convenience, with the driver still at the wheel. New technologies in healthcare will not replace doctors, but will leverage their skill and judgement by providing super-human augmentations for eyes, hands, and intellect. As more robots move onto the manufacturing floor, they are most likely to function as ever-smarter programmable tools, and will still require human coworkers to teach them new tasks and to do those elements that are simply too hard to automate. Meanwhile, the scope of Al personal assistants continues to broaden in terms of their impact on different aspects of human interactions. This session explores these themes, emphasizing in particular the areas where Al and people will work together to do what neither can do alone. |
| :---: | :---: |
| 3:00 pm | Break |
| 3:30-5:00 pm | Networking Activities |
| 6:30-9:00 pm | Dinner <br> After Dinner Talks - Computing Research Futures <br> Chair: Mark Hill, University of Wisconsin-Madison |
|  | Muddied Waters: Online Disinformation During Crisis Events <br> Speaker: Kate Starbird, University of Washington |
|  | Recent public attention and debate around "fake news" has highlighted the growing challenge of determining information veracity online. This is a complex and dynamic problem at the intersection of technology, human cognition, and human behavior-i.e. our strategies and heuristics for making sense of information may make us vulnerable, within online spaces, to absorbing and passing along misinformation. Increasingly, it appears that certain actors are intentionally exploiting these vulnerabilities, spreading intentional misinformation-or disinformation-for various purposes, including geopolitical goals. Drawing on research conducted on online rumors in the context of crisis response, this talk explores what alternative narratives (or "conspiracy theories") of crisis events reveal about "fake news", political propaganda, and disinformation online. |

## Program Update (continued)

## Tuesday, July 17 (continued)

## Dinner

Machine Learning for Science
Speaker: Kathy Yelick, University of California, Berkeley, and Lawrence Berkeley National Laboratory
While machine learning is revolutionizing many areas of computer science, it is also impacting the theory and practice of physical, energy and life sciences. But the challenges and opportunities in these domains are somewhat different. First, science requires the need to interpret and generalize models and to explain behavior in a manner consistent with physical laws. Second, the scaling problems go beyond large data sets and include very large models and machines, leveraging the access to systems and expertise in high performance computing. Third, the data may be highly complex, and may have a low signal to noise ratio, come from highly optimized sensors, or involve multi-modal data from different experiments or simulations. We expect progress in "ML for Science" will benefit these other disciplines, but will also provide feedback to aid in the power and understanding of machine learning more broadly

## Wednesday, July 18

6:00 am-6:30 pm Registration

7:00 am Breakfast

8:30-10:00 am Plenary Session
Plenary Speaker: Raquel Urtasun, University of Toronto and Uber Advanced Technologies Group

10:00 am Break

10:30 am - Noon

## Parallel Tracks

## Self-driving Cars: When Will They Become Mainstream?

Speakers: Raj Rajkumar, Carnegie Mellon University, Maarten Sierhuis, Nissan, and Raquel Urtasan, University of Toronto and Uber Advanced Technologies Group

## Wednesday, July 18 (continued)

10:30 am - Noon

Parallel Tracks

Booming Faculty: Opportunities and Challenges

Chair: Laura Haas, University of Massachusetts - Amherst
Speakers: Carla Brodley, Northeastern University, Juan Gilbert, University of Florida, Elizabeth Jessup, University of Colorado, Boulder, and Dean Tullsen, UC San Diego

To cope with the rapid growth of student enrollments, many departments have been scrambling to rapidly grow their faculty. This panel will look at a number of questions raised by this rapid growth, among them:

- How can we navigate the transition from small(ish) to big(ger), and the impacts on processes (e.g., faculty meetings, hiring committees, annual review processes)?
- How can political issues from the rapid growth of one department or college in a time of budget pressures be avoided or reduced?
- How are departments coping with the additional pressure explosive growth is putting on space?
- What are the needs for additional staff to support the growth in faculty, and how are departments handling them?
- How are departments preserving collegiality, and growing or maintaining diversity as they expand?
- How are we supporting faculty research in a time of shrinking federal budgets but rising faculty numbers?
- How can we recruit sufficient high quality graduate students and deal with the additional pressures these growing numbers cause?


## Diversity in Research Conferences: Spotlight and Brainstorming Solutions

Co-chairs: Sarita Adve, University of Illinois at Urbana-Champaign, and Kathryn McKinley, Google
Noon-1:30 pm Lunch
1:30-3:00 pm Parallel Tracks
Recruiting, Retaining, and Advancing Teaching Faculty
Co-chairs: Dan Grossman, University of Washington and Penny Rheingans, University of Maryland Baltimore County Speakers: Carla Brodley, Northeastern University, Michelle Craig, University of Toronto, Kevin Skadron, University of Virginia, and Ross Whitaker, University of Utah
This panel will address questions being considered by the CRA ad hoc committee on the role of teaching faculty in computing units at research universities, and in particular how administrative leaders (in particular chairs) can improve the effectiveness and satisfaction of teaching faculty. Topics are likely to include:
-What are best practices for the role of teaching faculty?

- What can CRA data tell us about the role of teaching faculty across institutions currently?
- What are the common challenges for recruiting/retaining/advancing teaching faculty and how can they be met?
- What unique perspectives do teaching faculty themselves have on these topics and how can administrative leaders better understand those perspectives?


## Wednesday, July 18 (continued)

3:30-5:00 pm Making a Federal Case for Computing Plenary

## 1:30-3:00 pm

5:00 pm
6:30 pm

Parallel Tracks
New Models for Industrial Research in CS
Co-chairs: Brent Hailpern, IBM and Joe Sventek, University of Oregon
Speakers: Maria Ebling, Medaptive Health, Maarten Sierhuis, Nissan, and Norm Whitaker, Microsoft
Companies large and small are experimenting with new models for industrial research in computer science.
Some old labs have disappeared, others are re-inventing themselves, while new labs have sprung up outside the traditional IT industry. This panel will attempt to answer the following questions:

- Why change the model? What is broken and how do the new models fix the problem?
- Do students require different academic preparation to succeed (in both academia and industry)?
- Do these models enhance the ability for researchers to migrate between industry and academia? Is there a viable career path for researchers keeping one foot in an academic job and the other in industrial research?
- Do the traditional models of measuring impact (publications, citations, professional society participation and awards) still matter?

Increasing Social Responsibility in Computing Professionals - What Should CS Departments and Labs Do?
Chair: Moshe Vardi, Rice University
Speakers: Barbara Grosz, Harvard University, Vijay Kumar, University of Pennsylvania, Illah Nourbakhsh, Carnegie Mellon University, and Ellen Zegura, Georgia Tech
A profound shift in the public view of computing has taken place recently. Computing was traditionally viewed as a source of innovation, economic growth, good jobs, and cool gadgets. In the past few months, one reads in the mainstream media descriptions of Silicon Valley as "tax-avoiding, job-killing, soul-sucking machine" and of cyberspace as "a dark and lawless realm where malevolent actors ranging from Russian trolls to pro-ISIS Twitter users could work with impunity to subvert the institutional foundations of democracy." Computing today is one of the greatest forces driving societal change, and computing professionals must accept their share of social responsibility. The question to computer science departments and labs is "What specifically should we do to address this challenging responsibility?" The panel will present several points of view on how to respond to the social-responsibility challenge from both the research perspective and the education perspective.

Speaker: Peter Harsha, CRA
Break
Dinner

## By Jim Kurose, Assistant Director of the National Science Foundation (NSF) for Computer and Information Science and Engineering (CISE), and Erwin Gianchandani, Deputy Assistant Director of NSF for CISE

We are delighted to provide an update on recent leadership changes within the National Science Foundation's (NSF) Directorate for Computer \& Information Science \& Engineering (CISE) over the last several months:

- In the Office of Advanced Cyberinfrastructure (OAC), Dr. Manish Parashar joined CISE in February 2018 as the Office Director. Manish joined NSF from Rutgers, the State University of New Jersey, where he is a Distinguished Professor and was the founding Director of the Rutgers Discovery Informatics Institute and the Applied Software Systems Laboratory. Manish served as Program Director in the then-Office of Cyberinfrastructure from 2009 to 201.
- Dr. Balasubramanian "Bala" Kalyanasundaram, Professor and recent Chair of Computer Science at Georgetown University, rejoined CISE as the Acting Division Director for Computing and Communication Foundations (CCF) in March 2018. Bala previously served as program director in CCF and led the CISE-wide Exploiting Parallelism and Scalability program. Bala is providing the scientific expertise essential to the continued success of the CCF division and will ensure a smooth transition in leadership as the search for the next CCF DD continues and concludes.
- Dr. Thyagarajan "Thyaga" Nandagopal has been appointed as the Deputy Division Director in CCF. Thyaga has been with NSF/CISE since February 2012, and until his transition to CCF, he managed the wireless research portfolio, including the Platforms for Advanced Wireless Research (PAWR) program, within the CISE Division of Computer and Network Systems.
- We recently announced that Dr. Henry Kautz will join as the Division Director for Information and Intelligent Systems (IIS) on June ll, 2018. Henry is joining from the University of Rochester, where he is Professor and Founding Director of the Georgen Institute for Data Science.
- We are delighted Irene Qualters, who previously served as OAC Office Director (and ACI Division Director) since April 2014, will continue as a Senior Science Advisor in CISE. Irene will continue to contribute to strategic leadership and stewardship of new directions for CISE activities, particularly for the "Big Ideas for

Future NSF Investment" in Major Research Equipment and Facilities Construction and Midscale Infrastructure; and will help sustain the Nation's leadership in advanced computing through interagency and public-private partnerships, as articulated in the National Strategic Computing Initiative (NSCI).

- In addition, Howard Wactlar, from Carnegie Mellon University, who has served as the Acting Division Director for IIS since February 2017, will continue in CISE as a Senior Advisor upon Henry's arrival. Howard previously led IIS from 2010 to 2014. During his recent time at NSF, he has provided leadership for the Big Idea, Future of Work at the Human-Technology Frontier and has also led a major revision of the NSF-wide Cyberlearning for Work at the Human-Technology Frontier program, transitioning its focus toward continuous education and adult retraining in the face of emerging technologies, such as artificial intelligence.

We also want to acknowledge Dr. S. Rao Kosaraju, who returned to Johns Hopkins University earlier this year after serving as the Division Director for CCF since January 2014. Rao demonstrated tremendously thoughtful and effective leadership for CCF, CISE, and the broader computing research community.

While we highlight changes to our leadership team here, we want to also express that we are incredibly appreciative of all those who serve in CISE more generally! Indeed, many of our scientific staff come from the community and are on temporary leave from their home institutions, serving through Intergovernmental Personnel Act (IPA) assignments. These rotators help ensure important connections to the broader research community.

We invite you to get involved as well! You can serve on panels, participate in workshops, and serve on advisory committees. Even more, consider an IPA assignment at NSF or at another federal agency. To learn more about the life of computing researchers in policy roles in DC, see the CRN column CS in DC.

By serving at NSF, you can help to continue NSF's stellar track record for advancing transformative research through our investments in people, ideas, and infrastructure. We promise it'll be an interesting and rewarding experience!

## Dan Reed Named Senior Vice President for Academic Affairs at the University of Utah


(Photo by: Tom Jorgensen/University of Iowa)

Former CRA Board Chair Dan Reed has been named senior vice president for academic affairs at the University of Utah. Reed is currently on the faculty at the University of Iowa and will begin his new position on July 1.

From the University of Utah announcement:
"Dan is an exceptional addition to the university's leadership team and the thought leadership of our state," said university President Ruth V. Watkins. "He is a talented scholar and administrator and the perfect fit in our efforts to become one of the country's premier public universities. I look forward to working closely with him in the years ahead."

Click here to read the full news release.


From the everyday to the exceptional, Microsoft Research pushes boundaries to help you achieve more.

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## Column Editor

Expanding the Pipeline
Patty Lopez, Intel

## Professional Opportunities

## Brown University

Brown DSI-Tripods Postdoctoral Research Associate

The Data Science Initiative (DSI) at Brown University seeks applications for nontenure track faculty positions with a start date of July 1, 2018. These are one-year positions, potentially renewable for a second year. Candidates are required to have received a Ph.D. degree or equivalent by the start of this appointment.
There will be teaching opportunities in mathematics, statistics, and data science courses at the undergraduate and/or Masters level. Responsibilities include active engagement in DSI activities. Successful candidates will contribute to the data science research activities of the NSF-TRIPODS Phase I Institute, which include (but are not limited to) geometry and topology of data, causal and modelbased inference, and data analysis on massive graphs and networks.

To apply, please use Interfolio (https:// apply.interfolio.com/4965I) and submit the relevant materials (cover sheet, curriculum vitae, a concise description of research and teaching interests, and three letters of recommendation. Applications will be considered until the position(s) are filled but we strongly encourage the candidates to submit complete applications (including reference letters) by April 6, 2018 for full consideration). Inquiries should be sent electronically to dsi-info@brown.edu.

Brown University is committed to fostering a diverse and inclusive academic global community; as an EEO/AA employer, Brown considers applicants for employment without regard to, and does not discriminate on the basis of, gender, race, protected veteran status, disability, or any other legally protected status.

## Bryn Mawr College

Lecturer or Visiting Assistant Professor
The Department of Computer Science at Bryn Mawr College invites applications for a full-time, one-year position in Computer Science starting August 2018. An advanced degree (completed Ph.D. preferred, but ABD or Master's is acceptable) in Computer Science is required. For more details on the position, please visit the Interfolio link below.

To apply, submit a cover letter; curriculum vitae; sample syllabi of courses able to offer and course evaluations from past courses (if available); together with two letters of reference via Interfolio at: https://apply.interfolio.com/50115.

Review of applications will begin immediately and continue until position is filled.

## The Citadel

Tenure-Track Position in Computer Science
The Department of Mathematics and Computer Science invites applications for a tenure-track faculty position in computer science at the Assistant Professor level beginning August 2018. Minimum
qualifications include an earned Ph.D. in computer science and a commitment to excellence in teaching, research, and service. In addition, candidates should display the core values of The Citadel: honor, duty, and respect. Candidates from all areas of computer science are encouraged to apply, especially those with strong backgrounds in cybersecurity.

Located in beautiful Charleston, S.C., The Citadel is a fully accredited, public, comprehensive, co-educational college with a student body of 2300 undergraduate and 1000 evening and graduate students. The Citadel has been designated as a National Center of Academic Excellence in Cyber Defense Education by National Security Agency and Department of Homeland Security. The Department of Mathematics and Computer Science has 16 full-time faculty members covering the areas of mathematics, statistics, and computer science. The department offers B.S. in computer science, M.S. in computer and information science, a graduate certificate in cybersecurity, and minors in computer programming, management information systems, and cybersecurity. Teaching responsibilities include undergraduate courses in computer science for majors and minors and graduate-level courses in our joint Master of Science program with the College of Charleston. A normal teaching load is nine-twelve hours per week with small class sizes.

The Citadel supports faculty scholarship and professional development. Internal funding is available for research,

## Professional Opportunities

development, and travel. Salary and fringe benefits are competitive, and other benefits include convenient parking and access to the Citadel Beach House located on the Isle of Palms.

Applicants should submit a letter of application, curriculum vita, copies of transcripts, a statement of teaching philosophy, a statement of research plan, and at least three letters of recommendation with at least one that addresses applicant's teaching. All application materials should be submitted online at The Citadel Careers web site, http://careers.pageuppeople. com/743/cw/en/job/495434/assistant-professor-in-computer-science. If you have any questions or concerns while applying at the Citadel Careers web site, please call The Citadel's Human Resources Office at 843-953-6922.

Questions about the position may be directed to Dr. Shankar M. Banik, Chair, Computer Science Search Committee, Department of Mathematics and Computer Science, The Citadel, 171 Moultrie Street, Charleston, SC 29409, phone: 843-953-5039, or email: shankar.banik@citadel.edu. Review of applications will begin on March 1, 2018, and will continue until the position is filled.

Applications from women and minorities are especially encouraged. The Citadel is an affirmative action/equal opportunity employer actively committed to ensuring diversity in all campus employment.

## Georgetown University

Graduate Program Director, Department of Computer Science

The Department of Computer Science at Georgetown University seeks a Graduate Program Director to manage and provide administrative support for our graduate programs. The program currently supports roughly 40 MS students and 25 PhD students and is expected to grow over time

Responsibilities include but are not limited to:

- advertising the programs
- recruiting students for the Master's and PhD positions
- managing admissions for Master's students
- managing student visits and orientations
- advising students
- tracking student progress
- professional networking

The Program Director will teach one class each academic year in support of the department.

This position will report directly to the Chair of the Department. The person hired will work closely with and complement the role of the Director of Graduate Studies, who leads graduate curricular activities and PhD admissions. The Program Director will interact with the graduate committee on issues related to admissions and policy decision and will also work with the administrative officer in computer science and staff in the Graduate School of Arts Sciences to ensure that different needs of the students are met.

The position requires a PhD in Computer Science or closely related area. A minimum of 3 years in CS education is required. The successful applicant will have good interpersonal and administrative skills and be dedicated to excellence in graduate computer science education.

Please follow this link to see the full job description and to apply.

Georgetown University is an Equal Opportunity/Affirmative Action Employer fully dedicated to achieving a diverse faculty and staff. All qualified applicants are encouraged to apply and will receive consideration for employment without regard to race, color, religion, national origin, age, sex (including pregnancy, gender identity and expression, and sexual orientation), disability status, protected veteran status, or any other characteristic protected by law.

For questions, contact Clay Shields (clay@georgetown.edu) at 202-687-2004.

## Johns Hopkins University

## Teaching Track Faculty

The Whiting School of Engineering at Johns Hopkins University seeks applicants for a full-time teaching position in the area of engineering computation and programming. This is a career-oriented, renewable appointment that is responsible for the development and delivery of introductory computing courses to undergraduate students from majors throughout the university. Teaching faculty members are also encouraged to engage in departmental

## Professional Opportunities

and university service and may have advising responsibilities. Opportunities to teach upper-level and graduate level courses may also be available, depending on the candidate's background. Extensive grading support is given to all instructors. The Schools of Engineering and of Arts and Sciences have a well-established non-tenure track career path for full-time teaching faculty culminating in the rank of Teaching Professor.

Johns Hopkins is a private university known for its commitment to academic excellence and research. The teaching faculty member will be appointed in the academic department within the Whiting School of Engineering that most closely aligns with their academic background. See the school webpages at https:// engineering.jhu.edu/ for additional information about the school, including undergraduate programs and current course descriptions.

Applicants for the position must have a Masters degree or Ph.D. in Computer Science, Computer Science Education, Engineering Education or an engineering discipline in a closely related field, demonstrated excellence in and commitment to teaching, and excellent communication skills. Candidates with experience teaching programming in $\mathrm{C}, \mathrm{C}^{++}$, Java, Python or MATLAB are preferred.

Applicants should apply using the online application https://apply.interfolio. com/49117. Please submit a cover letter, curriculum vitae, teaching statement, and recent teaching evaluations. Three letters
of reference will also be required. Letter writer information should be provided in the application. Applications will be evaluated on a rolling basis. Questions should be directed to WSELecSearch@jhu.edu.

The Johns Hopkins University is committed to active recruitment of a diverse faculty and student body. The University is an Affirmative Action/Equal Opportunity Employer of women, minorities, protected veterans and individuals with disabilities and encourages applications from these and other protected group members. Consistent with the University's goals of achieving excellence in all areas, we will assess the comprehensive qualifications of each applicant.

The Whiting School of Engineering is committed to building a diverse educational environment.

## Johns Hopkins University

Head, Department of Computer Science
The Whiting School of Engineering at Johns Hopkins University (https:// engineering.jhu.edu/) invites nominations and applications for the role of Head of the Department of Computer Science. This is an outstanding opportunity for an accomplished scholar with leadership experience, in collaboration with a growing faculty and an enterprising dean, to further strengthen an exceptional department at the nation's first research university. Important opportunities for impact include continued expansion of the breadth, depth, and intensity of research and
education in the Department; recruiting and retaining outstanding faculty and students; increasing the diversity of faculty, students, and staff; broadening the Department's engagement with industry as well as with other departments, centers, and institutes in the University; increasing gift and grant support; and ensuring that degree programs are in the forefront of their fields. The means to these ends, the measures of success, and the prioritization of activities designed to achieve them are matters the Head will define in collaboration with the faculty and the Dean.

Established in 1986, the Department of Computer Science (CS) has grown to become one of the largest departments in the Whiting School. It currently has 29 full-time tenured and tenure-track faculty members, three full-time teaching faculty, ll full-time and adjunct research faculty members, over 450 undergraduate students pursuing a first or second major, and approximately 250 graduate students. The annual research budget has grown to over \$20M per year, and the research portfolio includes hundreds of papers appearing at top conferences and journals. The CS website is https://www.cs.jhu.edu.

Serving a renewable five-year term, the Head will be appointed as a fulltime tenured faculty member in CS and will be encouraged to remain active in research, though strategic leadership of the Department will be his/her top priority. S/he will be a distinguished computer scientist and proven leader who can inspire and collaborate with faculty, staff, and students and who will work proactively
with the Dean, other WSE department leaders, and leaders of academic and research units across and beyond Hopkins. Successful applicants will evidence the intellectual distinction, entrepreneurial creativity, collaborative spirit, transparency, inclusiveness, and creativity that characterize the School's culture, along with the scholarly credentials required for appointment as full professor.

The Whiting School of Engineering has engaged Opus Partners to support the recruitment of the CS Department Head. Applicants should submit a single PDF containing a letter of interest outlining their research and leadership experience, their CV, and a two- to three-page statement of research interests to laura. jenks@opuspartners.net. Nominations, recommendations, expressions of interest, and inquiries should go to the same address. Applications received by July 31,2018 will receive full consideration. Every effort will be made to ensure candidate confidentiality.

The Whiting School of Engineering and the Department of Computer Science are committed to building a diverse educational environment, and women and minorities are strongly encouraged to apply. The Johns Hopkins University is an equal opportunity employer and does not discriminate on the basis of gender, marital status, pregnancy, race, color, ethnicity, national origin, age, disability, religion, sexual orientation, gender identity or expression, veteran status, other legally protected characteristics or any other occupationally irrelevant
criteria. The University promotes Affirmative Action for minorities, women, individuals who are disabled, and veterans. Johns Hopkins University is a drug-free, smoke-free workplace.

## King's College

## Visiting Assistant Professor of Computer Science

King's College anticipates an opening for a visiting Assistant Professor of Computer Science starting Fall 2018. Candidates must hold an advanced degree, preferably a Ph.D., in Computer Science from an accredited institution by the start date. Teaching experience preferred. The successful candidate will teach a broad range of computer science courses as well as introductory courses to non-majors. Normal teaching load is 12 hours per semester. Primary interest and commitment must be to quality instruction and to formally training and mentoring young computer scientists.

To apply, send one *.pdf file containing a letter of interest, CV, teaching philosophy (two-page maximum length), transcripts, and three letters of professional reference to hrjobs@kings.edu. Review of applications will begin immediately and continue until the position is filled.

King's College is a private, Catholic, teaching college of the liberal arts and sciences and pre-professional programs sponsored by the Congregation of Holy Cross. It serves over 2400 full-time and part-time graduate and undergraduate
students. A rigorous core curriculum provides the foundation for all majors. The College is located near downtown Wilkes-Barre, on the edge of the Pocono Mountains. King's is committed to recruiting a diverse faculty and student body and welcomes applications from persons of traditionally under-represented groups. EOE www.kings.edu

## MIT Lincoln Laboratory

Cryptography Researcher
Our Secure, Resilient Systems and Technology Group is looking for a Cryptography Researcher. We are looking for someone to provide expertise in theoretical and applied cryptography and lead research in the areas of cryptographic algorithms and protocols.

For a full description, please go to: https://careers.ll.mit.edu/ job/Cryptography-ResearcherMA/463250800/

## NEC Laboratories America

## Researcher and Senior Associate Researcher - Data Science \& Systems Research

The Data Science \& Systems Research Department of NEC Laboratories America aims to build novel big data solutions and service platforms that simplify complex computer systems management, and to develop new information technology that supports innovative applications, from big data analytics to the Internet of Things.

## Professional Opportunities

Our research is both experimental and theoretical, covering many domains in data science and system research, such as: time series mining, graph mining, deep learning, text mining, anomaly detection, signal processing, cloud computing, data centers, software-defined networking and streaming processing.

The goal of our research is to fully understand the dynamics of big data from complex systems, retrieve patterns to profile them and build innovative solutions to help end user managing those systems. We have built a number of analytic engines and system solutions to process and analyze big data and support various applications in detection, prediction and optimization. Our research leads to both award-winning NEC products and publications in top conferences.

Our group is looking for Researchers and Senior Associate Researchers to work in the areas of artificial intelligence, machine learning and data mining. The ideal candidate must have expertise in one of the above areas, and can develop algorithms to analyze massive data and build innovative applications. He/she must have a PhD in CS/CE with a strong publication record in at least one of the following areas:

- Machine learning and Al (Especially neural networks and deep learning)
- Text mining and information retrieval
- Time series analysis and prediction
- Graph and information network mining
- Data mining and statistical learning
- Large scale optimization and learning
- Signal processing, image processing and computer vision

NEC Labs is located in Princeton, NJ, home of the Princeton University and one of New Jersey's most beautiful and idyllic towns. The area offers many exciting cultural, entertainment and outdoor activities. The office is minutes away from Princeton University and an hour from New York, Philadelphia, and the Atlantic Ocean.

For more information about NEC labs, access http://www.nec-labs.com/, and submit your CV and research statement through our career center at https:// www.appone.com/MainInfoReq.asp?R_ ID=1802426.

## EOE-M/F/D/V

## NYU Abu Dhabi

## Assistant Instructor <br> Computer Science

New York University has established a campus in Abu Dhabi, United Arab Emirates, and invites applications for an Assistant Instructor position in the field of Computer Science. We encourage applicants with experience in teaching of Computer Science undergraduate courses. A B.Sc. in Computer Science or a B.Eng. in Computer Engineering is required. Candidates with a Masters degree in Computer Science, Computer Engineering, or related fields are encouraged to apply, and those who have a Ph.D. in Computer Science, Computer Engineering, or related fields will also be considered in special cases.

The Assistant Instructor will support NYU Abu Dhabi's education mission by assisting in the instruction of the Computer Science courses that are part of the Computer Science undergraduate curriculum. The instructor will also be responsible for taking part in departmental activities and responsibilities, and providing assistance with the preparation, development, instruction, and assessment of recitations and labs. During January Term and Summer Term, Assistant Instructors will support teaching and research through a variety of activities that may include research with a faculty member or conducting instructional enhancement projects, or both. Instructors undergo training during the last two weeks of August each academic year. Salaries are extremely competitive with a generous benefits package, and appointments are for two to three years with the opportunity to renew. The Assistant Instructor is also expected to acquire, set up, and maintain hardware and software computing equipment required for teaching and research in Computer Science, as well as provide instrumentation support for faculty and students regarding research projects. The Assistant Instructor is expected to test-drive new equipment and software, and liaison with the main IT department regarding collaborative projects. It is desirable for the Assistant Instructor to have experience in areas such as hosting systems, networking, virtualization, databases, solid modeling, and distributed systems.

## Professional Opportunities

Applicants should submit a resume, teaching statement, cover letter, and three letters of reference in PDF format to be considered. Please visit our website at: https://apply.interfolio.com/49110 for instructions and other information on how to apply. Applications are open until filled. If you have any questions, please e-mail nyuad.science@nyu.edu

## About NYUAD:

NYU Abu Dhabi is a degree-granting research university with a fully integrated liberal arts and science undergraduate program in the Arts, Sciences, Social Sciences, Humanities, and Engineering. NYU Abu Dhabi, NYU New York, and NYU Shanghai, form the backbone of NYU's global network university, an interconnected network of portal campuses and academic centers across six continents that enable seamless international mobility of students and faculty in their pursuit of academic and scholarly activity. This global university represents a transformative shift in higher education, one in which the intellectual and creative endeavors of academia are shaped and examined through an international and multicultural perspective. As a major intellectual hub at the crossroads of the Arab world, NYUAD serves as a center for scholarly thought, advanced research, knowledge creation, and sharing, through its academic, research, and creative activities.

UAE Nationals are encouraged to apply.

NYU Shanghai

Postdoc Position in Human-Computer Interaction and Computer Music

Earliest Starting date: May, 2018
ONE postdoctoral position is available at the Music X Lab in the School of Computer Science and Engineering at New York University, Shanghai Campus, China. The project is haptic guidance for flute tutoring, which aims to develop a novel haptic approach to help people learn flute (instruments in general) much more efficient than traditional methods. The project is a collaboration between New York University, Dartmouth College, and Carnegie Mellon University. It includes 3D modeling, mechanical engineering, user study design, and computer music algorithm design for instrument tutoring. The position will be one year with possibility of an extension pending performance and funding.

The post-doc will be responsible to develop new haptic hardware and design haptic guidance techniques to effectively lead human motions via mechanical control. (The first prototype has just been accepted by a top computer music conference NIME; the arXiv version is at https://arxiv.org/ abs/l803.06625.) The post-doc will also coordinate the work of graduate and undergraduate team members. A strong background is required in human-computer interaction. The candidate should also be family with rapid prototyping tools, such as 3d-printing, fabrication, and Arduino. Strong experiences are preferred in either mechanical engineering, circuit design, or computer music.

Applications should be sent by email (to Dr. Gus Xia, gxia@nyu.edu) with subject "Postdoc at Music X Lab_YOURNAME". The email should include:

1. A comprehensive CV
2. Expected date of availability
3. Contact Information for at least two references.

## Oklahoma State University

Visiting Assistant Professor

Applications are invited for one Visiting Assistant Professor position for the 2018-2019 academic year, August 2018 to May 2019. The position is contingent upon availability of funds.

The Oklahoma State University (OSU) Computer Science Department is seeking applications from candidates in all areas of Computer Science. Candidates with teaching experience and knowledge of the Java programming language will be given preference. An earned Ph.D. in Computer Science or a closely-related field from an accredited institution is required at the time of appointment. The position is for the main OSU campus in Stillwater; however, duties may be assigned in either the OSU-Stillwater campus, the OSU satellite campus in Tulsa, or both.

The OSU Computer Science Department (http://www.cs.okstate.edu/) is strongly committed to excellence in research, teaching, and outreach. The Department offers the B.S., M.S., and Ph.D. degrees in Computer Science and has a Graduate Certificate Program in Big Data Analytics.

## Professional Opportunities

The Department also offers courses to students at remote sites using interactive video and the Internet. There are currently about 276 undergraduate students and about 75 graduate students enrolled in the Department.

To apply, visit: http://cs.okstate.edu/ VAP_Search-2018-2019

For full consideration, applications should be received by May 11, 2018; however, applications will be considered until the position has been filled.

OSU is an AA/EEO/E-Verify Employer

## Princeton University

Computer Science Lecturer
The Department of Computer Science seeks applications from outstanding individuals who share our strong commitment to undergraduate education to join our teaching faculty for full and part-time Lecturer positions.

Computer Science is enjoying record popularity at Princeton, and opportunities abound to engage with our outstanding students at many levels. Our large undergraduate courses are the shared responsibility of a team of faculty and graduate assistants. A successful candidate for this position will participate in such a team at the outset. Job responsibilities can also include teaching upper-level courses, advising undergraduate research, curriculum development, state-of-the-art software


## Postdoctoral Scholar, Software Systems Security Lab

We're seeking several researchers and postdoctoral scholars, broadly in the area of software and systems security, formal methods, and programming languages.

## See details at: http://apptrkr.com/1194384

CAMPUS SECURITY CRIME STATISTICS: For more about safety at Penn State, and to review the Annual Security Report which contains information about crime statistics and other safety and security matters, please go to http://www.police.psu.edu/clery/, which will also provide you with detail on how to request a hard copy of the Annual Security Report.
Penn State is an equal opportunity, affirmative action employer, and is committed to providing employment opportunities to all qualified applicants without regard to race, color, religion, age, sex, sexual orientation, gender identity, national origin, disability or protected veteran status.
technology development, data analytics, outreach to under-represented groups, and online content development.

Research and scholarship in CS education or in any area of CS is also encouraged. An advanced degree in computer science, or related field, is required (PhD preferred).

Applications must include a cover letter, curriculum vitae, teaching statement, material relevant to evaluating the applicant's teaching abilities and research accomplishments, and contact information for at least three references. To apply, please submit a cover letter, CV, and contact information for three references to https://puwebp.princeton.edu/AcadHire/ apply/application.xhtml?listingld=6401.

This position is subject to the University's background check policy.

## Purdue University

## Assistant/Associate Professor of Practice Positions

The Department of Computer Science at Purdue University is soliciting applications for Professor of Practice positions at the Assistant or Associate Professor level to begin Fall 2018. These are newly created positions offering three- to five-year appointments that are renewable based on satisfactory performance for faculty with primary responsibilities in teaching and service. Applicants should hold a PhD in computer science or a related field, or a BS degree in computer science or a related discipline and commensurate experience in teaching or industry. Applicants should be committed to excellence in teaching, and should have the ability to teach a broad collection of core courses in the undergraduate curriculum. Applicants will


The School of Information at the University of California, Berkeley seeks applications for a pool of part-time, non-tenure track lecturers to teach courses in Information. Screening of applicants is ongoing and will continue as needed. The number of positions varies from semester to semester, depending on the needs of the school. Positions may range from $17 \%$ to $35 \%$ time.

Applicants will be selected from this pool for the 2018-19 academic year (including summer semester), when there is curricular need. Positions typically start at the beginning of the semester, and appointments may be renewable based on need, funding, and performance.

## Responsibilities

We are seeking outstanding lecturers who can teach courses in our Master's of Information Management and Systems program. In addition to teaching responsibilities, general duties include holding office hours, assigning grades, advising students, and preparing course materials.

## Basic Qualifications

The minimum qualifications required to be an applicant are an advanced degree (Master's or Ph.D. or equivalent degree) or at least five years of relevant professional experience in a technical, social science, or interdisciplinary field such as Information, Information Science, Statistics, Computer Science, Engineering, Political Science, Sociology, Law, or Economics required at time of application.

## Additional Qualifications

The Information Management lecturer will have teaching experience in at least one of the following core areas:

- Information Management
- International Economics and Policy
- User-centered Design
- Data Analysis and Visualization
- Other Areas of Information Systems and Services

Preferred qualifications include: a record of superior academic or professional performance; the ability to be self-directed with broadly-defined limits on assignments; excellent communication skills, both oral and written; and a demonstrated ability to interact efficiently with diverse people in a highly multidisciplinary environment.

## Salary

The salary per course will be determined by level of education and experience (in teaching, research, and practice).
The School of Information is interested in candidates who will contribute to diversity and equal opportunity in higher education through their teaching or other related areas. If the candidate has made contributions to this area, we recommend they submit a statement addressing past and/or potential contributions.
UC Berkeley has an excellent benefits package as well as a number of policies and programs to support employees as they balance work and family, if applicable.
To apply, please go to the following link: http://apptrkr.com/1192482
Applicants should submit a Cover Letter, a Curriculum Vitae, and a Statement of Teaching Interest/Experience/Approach, and provide contact information only for three (3) references. Please indicate which MIMS class(es) you are qualified to teach in the Statement of Teaching Interest/Experience/Approach. Optionally, applicants may provide a Statement of Research and up to three (3) PDF copies of recent publications, as well as a Statement of Contributions to Diversity (statement addressing past and/or potential contributions to diversity through teaching or other related areas).
Letters of reference will only be solicited for finalists. All letters will be treated as confidential per University of California policy and California state law. Please refer potential referees, including when letters are provided via a third party (i.e., dossier service or career center), to the UC Berkeley statement of confidentiality (http:// apo.berkeley.edu/evalltr.html) prior to submitting their letters.
This pool will remain open until March 11, 2019 to accommodate course needs and new applicants. Appointments are made for three semesters per year: fall, spring, and summer. If you wish to remain in the pool after March 11, 2019 you will need to reapply.
Please note: The use of a lecturer pool does not guarantee that an open position exists. See the review date specified in AP Recruit to learn whether the school is currently reviewing applications for a specific position. If there is no future review date specified, your application may not be considered at this time.

## Please direct questions to: dean@ischool.berkeley.edu

The University of California is an Equal Opportunity/Affirmative Action Employer. All qualified applicants will receive consideration for employment without regard to race, color, religion, sex, sexual orientation, gender identity, national origin, disability, age or protected veteran status. For the complete University of California nondiscrimination and affirmative action policy see: http://policy.ucop.edu/doc/4000376/NondiscrimAffirmAct.
also be expected to develop and supervise project courses for undergraduates. Review of applications and candidate interviews will begin on April 1, 2018, and will continue until the positions are filled.

> The Department of Computer Science offers a stimulating and nurturing educational environment with thriving undergraduate and graduate programs and active research programs in most areas of computer science. Additional
information about the department is available at http://www.cs.purdue.edu. Salary and benefits will be competitive.


## Postdoctoral Scholar - Information and Cybersecurity - School of Information

The School of Information at the University of California, Berkeley seeks applications for multiple Postdoctoral Scholars, in the area of Information and Cybersecurity, at $100 \%$ time, to help teach in, build, and be an integral part of our web-based Master's of Information and Cybersecurity program (cybersecurity.berkeley.edu).
The number of positions varies from semester to semester, depending on the needs of the School. Positions typically start in January, May, and August, and appointments may be renewed based on need, funding, and performance.

This is a full-time, one- or two-year, renewable, postdoctoral position.
The position will include teaching sections in our online Master's program, research collaboration, and participation in the intellectual community at the School of Information and on the Berkeley campus.

Basic qualifications: A Ph.D. or equivalent degree is required at time of application or the completion of all degree requirements except the dissertation at the time of application. Additional Qualifications: A Ph.D. or equivalent degree is required by the date of hire.
Successful candidates will have earned a doctoral degree in a relevant technical, social science, or interdisciplinary field such as Information, Information Science, Cybersecurity, Statistics, Computer Science, Engineering, Political Science, Sociology, Law, or Economics. The Information and Cybersecurity postdoc will have teaching and research experience in at least one of the following core areas or course offerings:

- Cybersecurity Legal, Political, and Economic Context
- Cryptography
- Secure Programming
- Network Security
- Usable Privacy and Security
- Managing Cyber Risk
- Privacy Engineering
- Operating System Security
- Cloud Security
- Mobile Security
- Web Security

Please indicate in your Statement of Teaching which class(es) you believe you are qualified to teach.
Preferred qualifications include a record of superior academic or professional performance; the ability to be self-directed with broadly-defined limits on assignments; excellent communication skills, both oral and written; and a demonstrated ability to interact effectively with diverse people in a highly multidisciplinary environment.
Salary: Starting salaries are typically in the range of $\$ 60,000$ to $\$ 65,000$ per year and commensurate with qualifications and experience.
The School of Information is interested in candidates who will contribute to diversity and equal opportunity in higher education through their teaching or other related areas. If the candidate has made contributions to this area, we recommend they submit a statement addressing past and/or potential contributions.
To apply, please go to the following link: http://apptrkr.com/1203808
Applicants should submit a Cover Letter, a Curriculum Vitae, a Statement of Teaching Interests/Experience/Approach, a Short Statement of Research Interests/Experience/ Approach, and a PDF copy of recent publication. Optionally, applicants may provide Course Evaluations, up to two (2) additional PDF copies of recent publications, as well as a Statement of Contributions to Diversity (statement addressing past and/or potential contributions to diversity through teaching or other related areas).

All letters of reference will be treated as confidential per University of California policy and California State law. Please arrange for letters of recommendation to be uploaded directly by recommenders. Please refer potential referees, including when letters are provided via a third party (i.e., dossier service or career center), to the UC Berkeley statement of confidentiality:
http://apo.berkeley.edu/evalltr.html prior to submitting their letters.
This pool will remain open until April 9, 2019 to accommodate course needs and new applicants. Appointments are made for three starts per year: fall, spring, and summer. If you wish to remain in the pool after April 9, 2019 you will need to reapply.
Please direct questions to dean@ischool.berkeley.edu.
The University of California is an Equal Opportunity/Affirmative Action Employer. All qualified applicants will receive consideration for employment without regard to race, color, religion, sex, sexual orientation, gender identity, national origin, disability, age or protected veteran status. For the complete University of California nondiscrimination and affirmative action policy see:
https://policy.ucop.edu/doc/4000376/DiscriminatioHarassmentAffirmAction.

## About The I School

UC Berkeley's newest school, the School of Information (I School), was created in 1994 to address one of society's most compelling challenges: the need to organize and make sense of the abundance of information that we can now collect, store, and share without regard for cost or distance. The way we organize, represent, govern, and make sense of this information will shape our ability to achieve public as well as private goals.
The I School educates professionals and scholars to understand the problems and possibilities of information, to develop models of information practice, and to design useful and usable information applications, services, and solutions. This requires insights from diverse fields. Our faculty includes scholars and professionals with deep expertise in information and computer science, social sciences, management, law, design, and policy, as well as related fields.
We offer professional master's degrees and an academic doctoral degree. Our on-campus master's program (MIMS) trains students for careers as information professionals and emphasizes small classes and project-based learning. Our MICS program prepares cybersecurity leaders with the technical skills and contextual knowledge necessary to develop solutions for complex cybersecurity challenges. Our web-based master's program (MIDS) is the first and only degree available completely online to train data science professionals. Our Ph.D. program equips scholars to contribute to knowledge and to the policies that influence the organization, use, and sharing of information.

Our graduates work at well-known Bay Area companies that include Apple, Google, Facebook, Salesforce, Twitter, and Linkedln, as well as at nonprofits like Kaiser Permanente and established businesses like Wells Fargo and Chevron. Many of our graduates take advantage of the opportunity to get in on the ground floor to create or work for start-ups.

The University of California is an Equal Opportunity/Affirmative Action Employer. All qualified applicants will receive consideration for employment without regard to race, color, religion, sex, sexual orientation, gender identity, national origin, disability, age or protected veteran status. For the complete University of California nondiscrimination and affirmative action policy see: http://policy.ucop.edu/ doc/4000376/NondiscrimAffirmAct.

## Professional Opportunities

Purdue University's Department of Computer Science is committed to advancing diversity in all areas of faculty effort, including scholarship, instruction, and engagement. Candidates should address at least one of these areas in their cover letter, indicating their past experiences, current interests or activities, and/or future goals to promote a climate that values diversity, and inclusion.

Applicants are strongly encouraged to apply online at https://hiring.science.purdue. edu. Alternately hard-copy applications may be sent to: Professor of Practice Search Chair, Department of Computer Science, 305 N. University St., Purdue University, West Lafayette IN 47907. A background check will be required for employment.

Purdue University is an EEO/AA employer. All individuals, including minorities, women, individuals with disabilities, and veterans are encouraged to apply.

## St Cloud State University

Assistant/Associate Professor Position

St Cloud State University, CSIT department, seeks candidates for one-year fixed-term Assistant/Associate Professor position(s) to teach a variety of courses. At least an MS degree with an emphasis in Cybersecurity is required. ABDs may apply. Applicant review begins in late April/early May 2018; open until filled.

To apply, visit
http://agency.governmentjobs.com/ stcloudstate/default.cfm

## University of Colorado Boulder

High Assistant, Associate and Full T/ IT Position in Data Mining, Machine Learning, Information Retrieval or Information Visualization

The recently established Department of Information Science at the University of Colorado Boulder seeks outstanding candidates for a tenure line faculty appointment at all ranks, though assistant candidates must have at least 3 years in rank. Successful candidates will help shape the future of Information Scienceas a Department and as a discipline. The Department takes a progressive computational, social and humanistic approach to Information Science, focusing on human-data interaction in all its diverse forms and contexts.

We seek candidates who work in data mining, machine learning, information retrieval or information visualization. Successful candidates will take a strong role in the organizational and intellectual life of the department. Applications are being reviewed as received for starting dates of Fall 2018 or Spring 2019.

The University of Colorado is an Equal Opportunity Employer committed to building a diverse workforce. We encourage applications from women, racial and ethnic minorities, individuals with disabilities, and veterans. For more information and to apply, see https:// cu.taleo.net/careersection/2/jobdetail. ftl?job=l2894\&lang=en.

## University of Maryland

Assistant/Associate/Full Professor

The Department of Computer Science at the University of Maryland, College Park, MD, USA is recruiting to fill two endowed professorship funded through a generous gift from Capital One with start dates on or after July 1, 2018. The openings are not restricted to any rank and outstanding candidates at all levels are encouraged to apply. Successful applicants will also be given joint appointments with the University of Maryland Institute for Advanced Computer Studies (UMIACS), a multi-disciplinary research institute.

Exceptional candidates in Machine Learning, Data Science, and Cybersecurity are being sought. Applicants working at the boundary of computer science and other disciplines are also encouraged to apply, and may be considered for joint positions with other departments or institutes on campus. A candidate should indicate in their cover letter if they might be interested in such a joint appointment.

The department is committed to building a diverse faculty and it especially encourages applications from women and underrepresented minorities. In addition, candidates who have experience engaging with a diverse range of faculty, staff, and students and contributing to a climate of inclusivity are encouraged to discuss their perspectives on these subjects in their application materials.

## Professional Opportunities

Interested candidates should apply on-line at https://ejobs.umd.edu AND at http:// hiring.cs.umd.edu/capitalone/ in order to receive consideration. Search under Faculty for position \#123708. The review of applications the process will continue until the positions are filled. Candidates will be prompted when submitting applications to submit a cover letter, a curriculum vitae, research and teaching statements, and provide contact information for at least four references. Questions about these positions can be directed to the faculty recruitment committee at: capitalonesearch@cs.umd.edu.

The Department of Computer Science at the University of Maryland is consistently ranked among the top- 15 nationally. It is one of the largest departments in the country, with approximately 50 full-time tenured and tenure-track faculty covering a wide variety of research areas and over 200 doctoral students drawn from top undergraduate programs nationally and internationally. In 2018 the department is slated to occupy its new state-of-theart facility, the Brendan Iribe Center for Computer Science and Innovation, which is currently under construction. Additional information about the Department of Computer Science and UMIACS is available at http://www.cs.umd.edu and at http://www.umiacs.umd.edu. To learn more about the Iribe Center, please visit: http://csctr.cs.umd.edu.

The University of Maryland, College Park, was founded in 1856 and is the flagship institution in the University System of Maryland. Its 1,250 acre College Park
campus is minutes away from Washington, D.C., the nexus of the nation's legislative, executive, and judicial centers. This unique proximity to business and technology leaders, federal departments and agencies, and a myriad of research organizations, embassies, think tanks, cultural centers, and non- profit organizations offers unique opportunities for engagement for faculty and students.

The University of Maryland, College Park, an equal opportunity/affirmative action employer, complies with all applicable federal and state laws and regulations regarding nondiscrimination and affirmative action; all qualified applicants will receive consideration for employment. The University is committed to a policy of equal opportunity for all persons and does not discriminate on the basis of race, color, religion, sex, national origin, physical or mental disability, protected veteran status, age, gender identity or expression, sexual orientation, creed, marital status, political affiliation, personal appearance, or on the basis of rights secured by the First Amendment, in all aspects of employment, educational programs and activities, and admissions.

Apply Here: http://www.Click2Apply.net/ wz24dmttmf2wyc5k

## The University of Pittsburgh

## Multiple Non-Tenure Track Positions

The University of Pittsburgh (Pitt) recently created a new School of Computing and Information (SCI) to be the nexus of computing and information at Pitt.

SCl has many openings for non-tenure track positions that offer careers and paths for advancement in teaching across a spectrum of areas, which includes rethinking curricula to reflect emerging concepts, conducting research, and developing activities for the deep entwinement of new skills in computing and information into other disciplines. Such programs are essential to train polymaths who understand and apply the abstractions that unite disciplines. As SCI transitions to a four-year school and creates new undergraduate and graduate degree programs, individuals filling these openings will have the chance to develop and teach curricula in many areas, including computer science, information science, information culture, and data stewardship. In addition, we are seeking individuals with competencies and experience in cybersecurity for an anticipated new institute for professional education. SCI's leadership, faculty, and staff value the importance of and need for diversity and inclusion within computing and information. Candidates from underrepresented populations, as well as those experienced with diverse students and commitments to inclusion are especially encouraged to apply for these openings.

Full application instructions are available from http://www.sci.pitt.edu/recruiting. A MS is required and a PhD is strongly preferred. The review of applications is ongoing. The anticipated start date is August 2018. Questions about the search may be emailed to sci-recruit@pitt.edu.

## Professional Opportunities

The University of Pittsburgh is an affirmative action and equal opportunity employer and does not discriminate on the basis of age, color, disability, gender, gender identity, marital status, national or ethnic origin, race, religion, sexual orientation, or veteran status.

## University of Sydney

Senior Lecturer / Associate Professor in Security
School of Information Technologies
Faculty of Engineering and Information Technologies
Reference no. 653/0417B

## About the opportunity

The School of Information Technologies (SIT) invites applications from outstanding candidates for a continuing Senior Lecturer or Associate Professor position (Level C or D) in Security starting immediately. The level of appointment will be commensurate with qualifications and experience.

## About you

To be successful, you will have a PhD in computer science, or a closely related discipline. You must show evidence of excellent research achievements in one of more areas of computer security and the ability to publish your research in highlyranked outlets. A strong commitment to teaching and learning is required as well as evidence of ability to lecture and prepare new teaching material. You will be expected to teach a range of computer science and security related courses.

All applications must be submitted via the University of Sydney careers website. Visit
sydney.edu.au/recruitment and search by the reference number for more information and to apply.

Closing date: 11:30pm 22 April 2018
(Sydney time)

## University of Virginia

Postdoctoral Research Associate
The Center for Research on Intelligent Storage and Processing in Memory within the Department of Computer Science at the University of Virginia seeks candidates for a postdoctoral research associate, for a term of up to three years, to pursue and support research on hardware, software, and applications driving the state of the art in memory and storage systems. The candidate will join a team of multiple faculty and a large group of PhD students working in this area, spanning the departments of Computer Science and Electrical \& Computer Engineering. The incumbent will report to Prof. Kevin Skadron, but will have the opportunity to collaborate broadly, and will also have opportunities to help in leadership of the Center.

The responsibilities of this position consist of leading and publishing an independent research project, helping advise other graduate students in the Center, helping prepare technical presentations, reports, and proposals, and identifying/leading new research opportunities. In helping coordinate center-wide activities, the research associate will have guidance and support from Prof. Skadron, as well as support of the Center staff.

The successful candidate will have a strong research record in computer architecture relevant to memory or storage systems, be self-directed, exhibit leadership skills, select appropriate research problems and techniques, exhibit strong writing and communication skills, be able to mentor graduate students, and be able to work with other teams.

The candidate must have completed all requirements for a PhD by the start date for the position. The start date is flexible.

To apply, visit https://jobs.virginia.edu and search for posting 0623071. Complete a Candidate Profile online; attach a cover letter, curriculum vitae, a one-page letter of research interest, and contact information for three professional references.

Questions regarding the position can be directed to Kevin Skadron at skadron@virginia.edu.

With one of the highest graduation rates of minority undergraduate students and one of the highest percentages of women engineering students among public universities, the University of Virginia is fundamentally committed to increasing the diversity of its faculty and staff. The University of Virginia is an affirmative action and equal opportunity employer. We welcome nominations of and applications from women, members of minority groups, veterans and individuals with disabilities. We also welcome others who would bring additional dimensions of diversity to the university's research and teaching mission. We believe diversity is excellence expressing itself through every person's perspectives and lived experiences.

## UPENN

Non-Tenure Stream Track Positions
The University of Pittsburgh (Pitt) recently created a new School of Computing and Information (SCI) to be the nexus of computing and information at Pitt. SCl has many openings for non-tenure track positions that offer careers and paths for advancement in teaching across a spectrum of areas, which includes rethinking curricula to reflect emerging concepts, conducting research, and developing activities for the deep entwinement of new skills in computing and information into other disciplines. Such programs are essential to train polymaths who understand and apply the abstractions that unite disciplines. As SCI transitions to a four-year school and creates new undergraduate and graduate degree programs, individuals filling these openings will have the chance to develop and teach curricula in many areas, including computer science, information science, information culture, and data stewardship. In addition, we are seeking individuals with competencies and experience in cybersecurity for an anticipated new institute for professional education. SCl's leadership, faculty, and staff value the importance of and need for diversity and inclusion within computing and information. Candidates from underrepresented populations, as well as those experienced with diverse students and commitments to inclusion are especially encouraged to apply for these openings.

## Worcester Polytechnic Institute

## Teaching Professor (Open Rank), Computer Science

Looking for faculty colleagues who engage deeply in both teaching and research within a curriculum that embraces student projects and independent learning? Consider joining the faculty at WPI . The Computer Science Department is actively seeking applicants for one or more full-time, non-tenure-track positions for the Fall of 2018. Depending on background, appointments may be as a Teaching Professor or Instructor.Applicants with professional experience are encouraged to apply and may be appointed as a Professor of Practice. Appointments may be for multiple years and are renewable.

## Principal Duties and Responsibilities

The department is interested in applicants with teaching and project advising expertise in all areas of Computer Science, but is particularly interested in applicants with experience in introductory Computer Science, Systems, Programming Languages and Software Engineering. The successful candidate will teach and advise projects at the undergraduate and possibly graduate levels as well as be a contributing member of a collegial department with over 30 full-time faculty members.
Junior-year projects involving the interaction of society and technology, Senior-year projects in the major, graduate students and a number of computing-related degree programs make the WPI Computer Science Department a rewarding environment for candidates interested in teaching and project advising.

## Position Requirements

Candidates should have an advanced degree in Computer Science or a closely related field, and the potential for excellence in teaching and project advising.
Questions about the hiring process should be sent to recruit@cs.wpi.edu. More information about the positions and instructions for applying are available at http://web.cs.wpi.edu/ facultyhire/. You will need to include a teaching statement, vitae and contact information for at least three references.
To apply, visit: http://apptrkr.com/1206172. Review of applications will begin effective immediately and continue until the positions are filled.
Founded in 1865, WPI is one of the nation's first technological universities. A highly selective private university located within an hour of Boston, WPI is consistently ranked among the top 60 research institutions by US News \& World Report. The university is home to an innovative and intensive project-based curriculum that empowers students with the knowledge and skills to address real world problems around the globe, an approach repeatedly cited for excellence by The Fiske Guide to Colleges and The Princeton Review.
Located in the heart of New England, WPI is surrounded by cultural and recreational opportunities. The UMass Medical Center, a large number of technology companies and many colleges and universities are located in the immediate area making it ideal for two-career families.
We are an Equal Opportunity Employer and do not discriminate against applicants due to age, race, color, religion, sex, sexual orientation, gender identity, national origin, veteran status or disability. We are looking for individuals who value creativity, diversity, inclusion, and collaboration. A pre-employment criminal records check is required.

## GREAT MINDS at WORK

## Professional Opportunities

Full application instructions are available from http://www.sci.pitt.edu/recruiting. A MS is required and a PhD is strongly preferred. The review of applications is ongoing. The anticipated start date is August 2018. Questions about the search may be emailed to sci-recruit@pitt.edu.

The University of Pittsburgh is an affirmative action and equal opportunity employer and does not discriminate on the basis of age, color, disability, gender, gender identity, marital status, national or ethnic origin, race, religion, sexual orientation, or veteran status.

## Vassar College

I-Yr. and 2-Yr. Visiting Assistant Professor of Computer Science

The Department of Computer Science at Vassar College invites applications for a one- and a two-year position at the rank of Visiting Assistant Professor beginning Fall semester 2018. Vassar College is an affirmative action and equal opportunity employer with a strong commitment to increasing the diversity of the campus community and the curriculum, and promoting an environment of equality, inclusion, and respect for difference. Candidates who can contribute to this goal through their teaching, research, advising, and other activities are encouraged to identify their strengths and experiences in this area. Individuals from groups whose underrepresentation in the American professoriate has been severe and longstanding are particularly encouraged to apply.

A commitment to excellence in undergraduate teaching and research is expected. The Ph.D. in Computer Science is required. Strong candidates in all areas of Computer Science are encouraged to apply. Teaching responsibilities will include introductory, intermediate, and upper level courses. The expected teaching load will be one lecture-plus-lab course and one lecture-only course per semester.

To apply, please visit
https://employment.vassar.edu/ applicants/Central?quickFind=52494 to link to the posting for this position. Candidates should submit a letter of application, a CV, a statement of teaching experience and philosophy, a statement of research experience, a candidate diversity statement highlighting contributions to and/or future plans for promoting diversity and inclusion through teaching, research and/or professional involvements, an unofficial graduate transcript, and three (3) letters of recommendation, at least one of which directly addresses teaching. Additional information on candidate diversity statements can be found at http://deanofthefaculty.vassar. edu/positions/candidate-diversitystatement.html

For further inquiries, email
csFacSearch@vassar.edu.
Review of applications will begin on May lstand will continue until all positions are filled. Please direct any questions about the position to Luke Hunsberger, Acting Chair of the Computer Science Department (hunsberger@vassar.edu).

## Virginia Tech

## Research Assistant Professor / Postdoctoral Research Associate / Research Associate

Virginia Tech (https://vt.edu), founded in 1872 as a land-grant institution, is currently ranked as a Top 25 Public University by US News \& World Report (USNWR) and a Top 25 Public Research University by the National Science Foundation. The Department of Electrical and Computer Engineering (ECE; https://ece.vt.edu/)'s graduate programs are ranked in the Top 20 by USNWR.

ECE's Systems Software Research Group (SSRG; http://www.ssrg.ece.vt.edu/) has multiple research positions available in the category of Research Assistant Professor, Postdoctoral Associate, and Research Associate. The positions involve conducting research in the areas of operating systems, virtualization, programming languages, compilers, and formal methods, and their intersection across different projects. Projects in operating systems involve developing innovative operating systems for emerging multicore platforms, in particular those with heterogeneous instruction sets, from node-scale (e.g., ARM/x86, CPU/GPU/FPGAs) to rack-scale (e.g., Scale-out processors, Firebox). Virtualization projects involve designing hypervisor systems with significantly reduced attack surface and strong degree of isolation in untrusted, publicly available cloud computing environments. Projects in languages and compilers involve designing domain-specific languages that automatically generate parsers for OS/

## Professional Opportunities

hypervisor input handling, following the language-theoretic security paradigm. Projects in formal methods involve verifying machine code through decompilation, instruction-set-architecture formalization (e.g., x86, ARMv8), and reasoning about program behaviors, all inside theorem provers (e.g., Isabelle/HOL). A cross-cutting theme across projects is to understand how to build software systems that are scalable, energy-efficient, reliable, and secure

More details about the position, research projects, etc, can be found at: $h t t p: / / w w w$. ssrg.ece.vt.edu/positions.html

Position-specific responsibilities, minimum required qualifications, and details on how to apply are available at:

- Research Assistant Professor: https://listings.jobs.vt.edu/ postings/68372
- Postdoctoral Associate:
https://listings.jobs.vt.edu/ postings/63862
- Research Associate https://listings.jobs.vt.edu/ postings/63883

Interested applicants are strongly encouraged to contact Prof. Binoy Ravindran (binoy@vt.edu) for any questions.

