

**Carla Brodley**

Professor and Dean

College of Computer and Information Science

Northeastern University

**Awards and honors and year received (list--no more than \*five\* items):**

- NSF-CAREER Award, 1998-2002
- Alumni Award: Outstanding Educator, Department of Computer Science, the University of Massachusetts at Amherst, 2010
- AAAI Fellow, 2014 "For significant contributions to machine learning and its application to science, engineering and medicine, and to increasing the participation of underrepresented groups in computer science."
- 2016 NCWIT Harrold and Notkin Research and Graduate Mentoring Award Winner.
- ACM Fellow, 2016 "For applications of machine learning and for increasing participation of women in computer science."

**Have you previously been involved in any CRA activities? If so, describe.**

- I served as the AAAI liaison on the CRA board of directors from 2008-2012, during which I also served on the organizing committee for Snowbird, 2012.
- I served on the board of CRA-W from 2002 to 2013 including serving as co-chair (with Kathleen Fisher) from 2008 to 2011.
- In addition, I served on the Taulbee survey committee from 2009-2014, helping make the change from reporting data via ranking to reporting data via public/private, size, and city/not-city. I am currently serving on the CRA rankings subcommittee, which has to goal to re-examine how rankings of the CS graduate programs are conducted.

**List any other relevant experience and year(s) it occurred (list--no more than \*five\* items).**

- Member of the 2004-2005 Defense Science Study Group, DARPA
- Elected Member, AAAI Executive Council, 2008-2011
- Elected Member, International Machine Learning Society Board, 2011-present
- Elected Member-at-large of the Section Committee (Information, Computing, and Communication), AAAS
- Chair of the department of Computer Science, Tufts University (2010-2013) and Dean of the College of Computer and Information Science, Northeastern University (2014-present).

**Research interests: (list only)**

- Applied machine learning, unsupervised learning, predictive medicine, anomaly detection, human-in-the-loop machine learning

**Personal Statement**

I have three goals/projects. 1) I would like to continue serving on the CRA subcommittee examining rankings of CS graduate programs, with the collective goal of designing a meaningful, objective measure. 2) I remain committed to increasing diversity in CS and will help CRA efforts in this vein. 3) Having served as both a department chair and now as a dean of a college of CS, I believe a critical turning point for our field is to help research department chairs make the case to their administration for becoming a college, which increases flexibility and resources.

**Brief Biography or CV**

(Attached)

## Carla E. Brodley

December, 2016

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### Education:

B.A. 1985 McGill University, Mathematics and Computer Science  
M.S. 1991 University of Massachusetts at Amherst, Computer Science  
Ph.D. 1994 University of Massachusetts at Amherst, Computer Science

### Professional Experience:

05/84 – 08/84 Summer Research Assistant, Image Analysis Lab, Dana Farber Cancer Inst.  
09/85 – 09/86 Research Associate, Jensen Associates, Boston, MA  
10/86 – 02/88 Systems Analyst, The Wyatt Company, Wellesley, MA  
02/88 – 06/88 Consultant, Unisys Corporation, Cambridge, MA  
09/88 – 08/94 RA, Department of Computer Science, Univ. of Massachusetts at Amherst  
12/94 – 08/00 Assistant Professor, Electrical and Computer Engineering, Purdue University  
08/00 – 08/05 Associate Professor, Electrical and Computer Engineering, Purdue University  
08/04 – 10/04 Visiting Professor, Department of Computer Science, Tufts University  
10/04 – Present Professor, Department of Computer Science, Tufts University  
07/05 – 06/06 Acting Chair, Department of Computer Science, Tufts University  
09/10 – 08/13 Chair, Department of Computer Science, Tufts University  
10/11 – Present Professor, Clinical and Translational Science Institute, Tufts Medical Center  
08/14 – Present Professor and Dean, College of Computer and Information Science, Northeastern Univ.

### Honors:

1. NSF-CAREER Award, 1998-2002
2. Ruth and Joel Spira outstanding teacher award, Purdue University, 1998
3. Member of the 2004-2005 Defense Science Study Group, DARPA
4. Elected Member, AAAI Executive Council, 2008-2011
5. Alumni Award: Outstanding Educator, Department of Computer Science, the University of Massachusetts at Amherst, 2010
6. Elected Member, International Machine Learning Society Board, 2011-present
7. AAAI Fellow, 2014 *“For significant contributions to machine learning and its application to science, engineering and medicine, and to increasing the participation of underrepresented groups in computer science.”*
8. Elected Member-at-large of the Section Committee (Information, Computing, and Communication), AAAS
9. 2016 NCWIT Harrold and Notkin Research and Graduate Mentoring Award Winner.
10. ACM Fellow, 2016 *“For applications of machine learning and for increasing participation of women in computer science.”*

### Summary of Scholarship:

- Google Scholar Statistics on December 1, 2016: h-index = 49, i10-index = 90, total citations = 10816
- Publications: 30 journal articles, 50 highly-refereed conference papers, 6 magazine articles, 3 book chapters, 25 symposia and workshop papers

### Research Grants and Contracts Received:

1. *Jet Propulsion Laboratory*, \$9,978, Principal Investigator: Carla Brodley, “Development of Pattern Recognition and Machine Learning Techniques to Detect and Characterize Structure in Images of Scientific Interest,” 6/17/96-10/30/96.
2. *IBM*, \$48,212, Principal Investigator: Carla Brodley, “Knowledge Discovery in Databases,” 6/15/96-6/14/98.
3. *SGI*, \$50,000, Principal Investigator: Carla Brodley, “Purdue-SGI Collaboration in Data Mining,” 1/7/97-12/15/97.
4. *NSA*, Role: Co-PI, (my portion: \$116,476), “A Proposal on Autonomous Security Agents and Vulnerability Database,” 1/7/97-9/30/99, (PI: Gene Spafford, Computer Science, Purdue University).
5. *Showalter Trust*, \$49,877, Co-Principal Investigators: Carla Brodley and Avi Kak, “Content-Based Image Retrieval for Large-Scale Medical Databases,” 7/1/97-6/30/98.
6. *NSF*, \$526,417, Principal Investigator: Carla Brodley, “Content Based Image Retrieval for Medical Databases,” 9/1/97-8/30/00, (Co-PIs: Avi Kak, ECE, Purdue University and Alex Aisen, Indiana University Medical School).
7. *NASA*, \$81,113, Principal Investigator: Carla Brodley, “Machine Learning to Improve Land Cover Classifications from Multisensor and Multitemporal Data,” 3/1/98-2/28/01, (Co-PI’s: with separate proposals and separate funding: Mark Friedl, Geography, Boston University and Ruth DeFries, Geography, University of Maryland).
8. *NSF-CAREER*, \$236,729, Principal Investigator: Carla Brodley, “A Foundation for Applied Machine Learning,” 9/1/98-8/31/02.
9. *NIH*, \$1,067,940, Principal Investigator: Carla Brodley, “Content-Based Image Retrieval for Medical Databases,” 8/1/98-7/31/01, (Co-PIs: Avi Kak, ECE, Purdue University, Alex Aisen, Indiana University Medical School and Lynn Broderick, Radiology, University of Wisconsin).
10. *Schlumberger*, \$30,000, Principal Investigator: Carla Brodley, “Automatic Detection of Denial of Service Attacks,” 9/01/01-9/01/02.
11. *NSF*, \$20,000, Principal Investigator: Carla Brodley, “NSF Student Scholarship Program for the International Conference on Machine Learning,” 2001.
12. *NASA*, \$750,872, Principal Investigator: Carla Brodley, “Machine Learning and Data Mining for Intelligent Data Understanding of High Dimensional Earth Science Data,” 03/01/01-02/28/04 (Subcontract to Prof. M. Friedl, Department of Geography, Boston University).

13. *AFRL*, \$60,000, Principal Investigator: Carla Brodley, “Automatic Detection of Anomalous Behavior in Networks,” 10/1/02-9/30/03 (Co-PI: Catherine Rosenberg).
14. *CISCO*, \$40,000, Co-PI’s: Carla Brodley and Catherine Rosenberg, “Lightweight Software-only Anomaly Technique to Identify Pervasive Network Problems,” 9/1/02-8/31/03.
15. *AFRL*, \$109,000, Principal Investigator: Carla Brodley “User Re-authentication via Mouse Behavior,” 8/1/03-7/31/05.
16. *NSF-SGER*, \$50,658, Principal Investigator: Carla Brodley, “Behavioral Authentication of Server Flows,” 9/1/03-8/31/04.
17. *NSF-NRT*, \$819,000 Role: Co-PI (my portion: \$200,000), “Collaborative research: Testing and Benchmarking Methodologies for Future Networking Security Mechanisms,” 8/20/03-8/19/06.
18. *NSF-SGER*, \$61,791, Principal Investigator: Carla Brodley, “SGER: Mining for Planets,” 8/1/05-7/31/06.
19. *AFRL*, \$86,353, Principal Investigator: Carla Brodley “Automatic Detection of Covert Channels in Networks,” 6/6/05-8/31/06.
20. *DARPA*, \$298,042, Principal Investigator: Carla Brodley, “Detecting Natural versus Unnatural DNA,” 7/15/06-7/14/07 (Co-PI’s Lenore Cowen, Donna Slonim, Computer Science, Tufts University and Jonanthan Eisen, Genomics, UC-Davis).
21. *NIH*, \$12,484,287, Role: Co-PI (my portion \$572,614), “Microsensor Arrays for Saliva Diagnostics,” 9/1/06-8/31/11, (PI: David Walt, Chemistry, Tufts University, also with BU Dental and Medical Schools).
22. *NSF*, \$212,000, Principal Investigator: Carla Brodley, “SEI: Collaborative Research: Discovering Unexpected Planets and Other Astronomical Oddities,” 8/01/07-7/31/10 (companion proposal with separate funding, Charles Alcock, CFA, Harvard University).
23. *NASA*, \$120,000, Role: Co-PI (my portion \$52,000) “Discovering Anomalies in Astrophysics,” 8/01/07-7/31/09 (PI: Charles Alcock, CFA, Harvard University).
24. *NSF*, \$875,824, Principal Investigators: Carla Brodley and Roni Khardon, “III-CXT-Medium: Interdisciplinary Machine Learning Research and Education,” 09/15/08-8/31/13.
25. *NIH*, \$1,289,608, Role: Faculty (my portion: 1/2 of an RA, one summer month of salary), “Translational Bioinformatics for Developmental Genomics,” 12/01/08-11/30/12, (PI: Donna Slonim, Computer Science, Tufts University; Co-PI: Diana Bianci, Medical School, Tufts University).
26. *NIH*, Role: Faculty, (my portion: \$125,000), “Clinical and Translational Science Award (CTSA),” 5/1/08-4/31/11, (PI: Harry Selker, Tufts Medical Center).
27. *AHRQ*, \$1,135,531 Role: Co-PI, (my portion: 20% academic year support and 1 research scientist), “Semi-Automated Abstract Screening for Comparative Effectiveness Reviews,” 9/1/09-8/31/12, (PI: Tom Trikalinos, Tufts Medical Center),
28. *Draper Lab*, \$131,301, Principal Investigator: Carla Brodley, “User-Guided Clustering: A Synergy of Human Interaction, Machine Learning and Visualization,” 7/1/12-6/30/13.
29. *Multiple Sclerosis Society*, \$34,000, Principal Investigator: Carla Brodley, “Machine Learning for Outcome Prediction in Multiple Sclerosis,” 3/25/13-3/01/14.

**Professional Leadership Roles:**

- Co-Chair, (with R. Kohavi), The KDD-CUP, 2000.
- Program Co-Chair and General Co-Chair, (with Andrea Danyluk) the Eighteenth International Conference on Machine Learning (ICML), Williamstown, MA, June 28 - July 2, 2001.
- General Chair, the Twenty-First International Conference on Machine Learning (ICML), Banff, Alberta, July 4-8, 2004.
- Co-Chair, (with Kathleen Fisher) Committee on the Status of Women in Computing Research (CRA-W), 2008 - 2011.
- Program Co-Chair and General Co-Chair, (with Peter Stone) AAAI-2014, Quebec City, Canada, July 2014.
- Executive Committee, NSF Northeast Big Data Hub, 2015 - present.

**National/International Boards:**

- Committee on the Status of Women in Computing Research (CRA-W), 2002 - 2013.
- AAAI Council, 2008-2011 (elected).
- Computing Research Association Board of Directors, 2008 - 2012 (AAAI Liason).
- International Machine Learning Society Board, 2011 - 2016 (elected).
- Information Science and Technology Board, DARPA, 2013 - 2016.
- AAAS, Section T, member at large, 2016 - present.

**Purdue University Leadership Roles:**

- Elected as ECE representative to SOE Dean Search Committee, 2000
- Elected to Head of ECE Search Committee, 2001

**Tufts University Leadership Roles:**

- Acting Chair, Department of Computer Science 2005-2006
- Chair, Department of Computer Science, 2010-2013
- Member, Dean Search committee, Arts and Sciences 2004-2005
- Member, Tufts President Search Committee, 2010
- Member, Tufts Effectiveness in Administrative Management Project, 2013 (one of two faculty members appointed to this committee)

## Professional Service Activities:

**Associate Editorships:** *IEEE Transactions on Pattern Analysis and Machine Intelligence*, 1999 - 2002; *Journal of Artificial Intelligence Research*, 2002 - 2005; *Machine Learning*, 2004 - 2011; *Journal of Machine Learning Research*, 2008 - 2011.

**Journal Editorial Boards:** *Data Mining and Knowledge Discovery*, 2008-Present; *Journal of Machine Learning Research*, 2000 - 2008, 2011 - present; *Machine Learning*, 1997 - 2001, 2011 - present. *Journal of Artificial Intelligence Research*, 1999 - 2001.

**Conference/Workshop Organizer:** National Academy of Engineering's sixth Annual Symposium on Frontiers of Engineering, Irvine, CA September, 14-16, 2000; VISSEC/DMSEC Workshop held in conjunction with CCS, Washington DC, 2005 (Co-Chair); Snowbird, 2012; Meaningful Use of Complex Medical Data, 2013, 2014 (Co-Chair).

**Tutorial Chair:** The Eleventh International Conference on Knowledge Discovery and Data Mining, 2005.

**Senior Program Committee Member:** IEEE Conference on Computer Vision and Pattern Recognition, 1999; International Conference on Machine Learning, 2005, 2008, 2009, 2010, 2011; European Conference on Machine Learning, 2005, 2012, 2013; National Conference on Artificial Intelligence (AAAI), 2007, 2010, 2013; International Conference on Knowledge Discovery and Databases, 2006, 2009, 2010, 2012, 2013; International Health Informatics Symposium, 2011; ICHI 2013.

**Conference Program Committees:** International Conference on Machine Learning, 1996, 1997, 1998, 2000, 2002, 2003, 2007, 2008; National Conference on Artificial Intelligence, 1996, 1998, 1999, 2000, 2008; International Conference on Knowledge Discovery and Data Mining, 1997, 1998, 2003, 2004, 2007, 2008; European Conference on Machine Learning, 2007, 2010; Annual ACM SIGIR Conference 2008; KDD 2012 Workshop on Health Informatics.

## Diversity Outreach:

- Member of the Committee on the Status of Women in Computing Research (CRA-W), 2002-2013. Activities included: Editor of "Expanding the Research Pipeline," *Computing Research News*, 2002-2005; Fundraising Co-Chair (with Lori Clarke and Carla Ellis), 2005-2008; Co-Chair (with Kathleen Fisher), 2008-2011.
- Speaker/Panelist/Mentor at: CRA-W Academic Careers Workshops, 1996, 1999, 2005; CRA-W Graduate Cohort Workshop 2004, 2006, 2011, 2013; Grace Hopper Conference, 2012, 2015.
- Faculty Advisor, Women in Computer Science, Tufts University, 2012-2014.

## Courses Taught:

Undergraduate:

1. Introduction to Computer Security, Fall 2002, Fall 2003, Spring 2005, Spring 2006
2. Information Extraction, Retrieval and Security, Fall 2000
3. Discrete Math for Computer Engineers, Spring 1995, Fall 2001

4. Introduction to Artificial Intelligence, Spring 1996, Spring 1997

Undergraduate/Graduate:

1. Introduction to Machine Learning, Fall 2007, Fall 2009, Fall 2011, Fall 2012, Fall 2013, Spring 2014
2. Research in Machine Learning, Spring 2012

Graduate:

1. Graduate-Level Machine Learning and Data Mining, Fall 1995, Spring 1997, Spring 1999, Spring 2001, Spring 2003, Fall 2004, Fall 2006
2. Graduate-Level Artificial Intelligence, Fall 1996, Fall 1997, Fall 1998, Fall 1999
3. Interdisciplinary Research in Computer Science, Chemistry and Biology, Fall 2006, Fall 2007, Spring 2008 (with David Walt, Chemistry, Tufts University)
4. Machine Learning for Predictive Medicine – co-listed with the medical school, Spring 2011 (with Chris Schmid, Sackler School of Graduate Biomedical Sciences, Tufts University).

**Ph.D. Thesis Supervision Completed:**

1. Craig Codrington, (co-chair Prof. M. Tenorio) May 1997, “Image Segmentation: A Competitive Approach,” currently a researcher in the Physics Department, Purdue University.
2. Terran Lane, August, 2000, “Machine Learning Techniques for the Computer Security Domain of Anomaly Detection,” previously a tenured Associate Professor, University of New Mexico, now at Google, Cambridge.
3. Jennifer Dy, May 2001, “Feature Selection for Unsupervised Learning Applied to Content-Based Image Retrieval,” currently a tenured Associate Professor, Northeastern University.
4. Xiaoli Fern Zhang, July 2005, “High Dimensional Data Clustering and Correlation Pattern Analysis,” currently a tenured Associate Professor, Oregon State.
5. James Early, July 2005, “Behavioral Authentication for Computer Security,” currently an Assistant Professor, SUNY, Oswego.
6. Serdar Cabuk, December 2006, “Network Covert Channels: Design, Analysis, Detection, and Elimination,” currently Director, IT Risk and Assurance at EY, London, UK.
7. Maja Pusara, (co-chair Gene Spafford) June 2007, “An Examination of User Behavior for Re-Authentication,” currently a consultant at Ab Initio.
8. D. Sculley, August 2008, “Advances in Online Learning-Based Spam Filtering,” currently a Software Engineer at Google, Cambridge MA (leading a group of ML researchers at Google).
9. Rachel Lomasky, February 2010, “Active Acquisition of Informative Training Data,” currently an Analytics Director at Opera Solutions.
10. Umma Rebbapragada, July 2010, “Strategic Targeting of Outliers for Expert Review,” currently a Research Scientist, Jet Propulsion Laboratory.



11. Byron Wallace, June 2012, “Machine Learning in Health Informatics: Making Better use of Domain Experts,” currently an Assistant Professor, School of Information, University of Texas at Austin. Selected as *the Runner-Up for the 2013 ACM SIGKDD Doctoral Dissertation Award*.
12. Jingjing Liu, May 2014, “Clustering with Domain Knowledge,” Facebook.
13. Bilal Ahmed, May 2015, “Decrypting Cryptogenic Epilepsy: Machine Learning Methods for Detecting Cortical Malformations,” Metromile

#### **Ph.D. Thesis Students Currently Being Supervised:**

Yijun Zhao (expected May 2017).

#### **Journal Articles:**

1. Draper, B., Brodley, C. E., and Utgoff, P. E., “Goal-directed classification using linear machine decision trees,” *IEEE Transactions on Pattern Analysis and Machine Intelligence (PAMI)*, 16 (9), pp. 888-893, 1994.
2. Brodley, C. E. and Utgoff, P. E., “Multivariate decision trees,” *Machine Learning*, vol. 19, pp. 45-77, 1995.
3. Brodley, C. E., “Automatic bias selection for classifier construction,” *Machine Learning*, vol. 20, pp. 63-94, 1995.
4. Brodley, C. E. and Smyth, P., “Applying classification algorithms in practice,” *Statistics and Computing*, vol. 7, pp. 45-56, 1997.
5. Friedl, M. and Brodley, C. E., “Decision tree classification of land cover from remotely sensed data,” *Remote Sensing of Environment*, 61 (3), pp. 399-409, 1997.
6. Friedl, M., Brodley, C. E., and Strahler, A., “Maximizing land cover classification accuracies produced by decision trees at continental to global scales,” *IEEE Transactions on Geoscience and Remote Sensing*, 37 (2), pp. 969-977, 1999.
7. Shyu, C., Brodley, C. E., Kak, A., Kosaka, A., Aisen, A. and Broderick, L., “ASSERT, A physician-in-the-loop content-based image retrieval system for HRCT image databases,” *Computer Vision and Image Understanding*, vol. 74, pp. 111-132, 1999.
8. Brodley, C. E. and Friedl, M., “Identifying mislabeled training data,” *Journal of Artificial Intelligence Research*, vol. 11, pp. 131-167, 1999.
9. Lane, T. and Brodley, C. E., “Temporal sequence learning and data reduction for anomaly detection,” *ACM Transactions on Computer Security*, 2 (3), pp 295-331, 1999.
10. Bradford, J. P. and Brodley, C. E., “The effect of instance-space partition on significance,” *Machine Learning*, 42, pp 269-286, 2001.
11. Stough, T. M. and Brodley, C. E., “Focusing attention on objects of interest using multiple matched filters,” *IEEE Transactions on Image Processing*, 10 (3), pp. 419-426, 2001.
12. Shyu, C. R., Kak, A., Brodley, C. E., and Broderick, L., “Using human perceptual categories for content-based retrieval from a medical image database,” *Computer Vision and Image Understanding*, vol. 88, pp. 119-151, 2002.

13. MacArthur, S. Brodley C. E., and Broderick, L., "Interactive content-based image retrieval using relevance feedback," *Computer Vision and Image Understanding*, vol. 88, pp. 55-75, 2002.
14. Dy, J., Brodley, C. E., Kak, A., Broderick, L. S., and Aisen, A. M., "Unsupervised feature selection applied to content-based image retrieval of lung images," *IEEE Transactions on Pattern Recognition and Machine Intelligence*, vol. 25, pp. 373-378, 2003.
15. Aisen, A. M. Broderick, L. S., Winer-Muram, H., Brodley, C. E., Kak, A. C., Pavlopoulou C., Dy, J., and Marchiori, A., "Automated storage and retrieval of medical images to assist diagnosis: Implementation and preliminary assessment," *Radiology*, 228 (1), pp. 265-270, 2003.
16. Lane, T. and Brodley, C. E., "An empirical study of two approaches to sequence learning for anomaly detection," *Machine Learning*, 51(1), pp. 73-107, 2003.
17. Dy, J. and Brodley, C. E., "Feature selection for unsupervised learning," *Journal of Machine Learning Research*, vol. 5, pp. 845-889, 2004.
18. Ozdoganoglu, H., Jalote, A., Vijaykumar, T. N., Brodley, C. E., and Kuperman, B. A., "Smash-Guard: A hardware solution to prevent security attacks on the function return address," *IEEE Transactions on Computers*, 55 (10), pp. 1271-1285, 2006.
19. Rebbapragada, U., Protopapas, P., Brodley, C. E., and Alcock, C. "Finding Anomalies in Periodic Time Series," *Machine Learning*, 74 (3), pp. 281-313, 2009.
20. Scabuk, C., Brodley, C. E. and Shields, C., "IP Covert Channel Detection," *ACM Transactions on Information and Systems Security (TISSEC)*, 12 (4), pp. 1-29, 2009.
21. Preston, D., Protopapas, P., and Brodley, C. E., "Discovering arbitrary events types in time series," *Statistical Analysis and Data Mining*, 2 (5), pp. 396-411, 2010.
22. Wallace, B., Trikalinos, T., Lau, J., Brodley, C., Schmid, C. "Semi-automated screening of biomedical citations for systematic reviews," *BMC Bioinformatics*, 11 (55), 2010.
23. Whitaker, R. D., Pember, S., Wallace, B. C., Brodley, C. E., Walt, D. R., "Single cell time resolved quorum responses reveal dependence on cell density and configuration," *Journal of Biological Chemistry*, vol. 286, pp. 21623-21632, 2011.
24. Noto, K., Slomin, D., and Brodley C. E., "FRaC: A feature-modeling approach for semi-supervised and unsupervised anomaly detection," *Data Mining and Knowledge Discovery*, 25 (1), pp. 109-133, 2011.
25. Wallace, B., Small, K., Brodley, C. E., Lau, J., Schmid, C., Bertram, Li., Lill, C., Cohen, J. and Trikalinos, T. "Towards modernizing the systematic review pipeline: Efficient updating via data mining," *Genetics in Medicine*, vol. 14, pp 663-669, 2012.
26. Liu, J., Healy, B., Chitnis, T., Brodley, C. E., "Finding homogeneous groups of multiple sclerosis patients by removing physician subjectivity via constraint-based clustering," *AI and Medicine*, 2015.
27. Priesol, A. J., Cao, M., Brodley, C. E., Lewis, R. F., "Clinical vestibular testing assessed with machine learning algorithms," *JAMA Otolaryngology-Head & Neck Surgery*, 2015.
28. Ahmed, B., Thesen, T., Barah, G., Carlson, C., Kuzniecky, R., Doyle, W., Blackmon, K., Devinsky, O., and Brodley, C. E., "Cortical feature analysis and machine learning improves detection of MRI-negative focal cortical dysplasia," *Science Direct, Epilepsy & Behavior*, 2015.

29. Ahmed, B., Thesen, T., Blackmon, K., Kuzniecky, R., Devinsky, O., and Brodley, C. E., “Decrypting “cryptogenic” epilepsy: Semi-supervised Hierarchical Conditional Random Fields for detecting cortical lesions in MRI-negative patients, *The Journal of Machine Learning Research*, Special topic issue on learning from electronic health data, 17(1), pp. 3885-3914, 2016.
30. Zhao, Y., Healy, B., Rotstein, D., Brodley, C. E., and Chitnis, T. “Exploration of machine learning techniques in predicting multiple sclerosis disease course,” accepted to appear *PLOS One*

#### Articles under Review:

1. Brodley, C. E., Liu, J., Khardon, R., Preston, D. Sulla-Menashe, D., and Friedl, M., “Refining class structure via class-level constraint-based clustering,” submitted to *Machine Learning*.

#### Magazine Articles:

1. Brodley, C. E., Lane, T., and Stough, T., “Knowledge discovery and data mining,” *American Scientist*, 87 (1), pp. 54-61, 1999, (Invited article).
2. Kohavi, R., Brodley, C. E., Frasca, B., Mason, L., and Zheng, Z., “KDD-Cup 2000: Organizers’ report,” *SIGKDD Explorations*, 2 (2) pp. 86-98, 2000.
3. Bajcsy, R., et al. (one of 24 authors), “Cyber Defense Technology Networking and Evaluation,” *Communications of the ACM*, 47 (3), pp. 58-61, 2004.
4. Kuperman, B., Brodley, C. E., Ozdoganoglu, H., Vijaykumar, T.N. and Jalote, A., “Detection and prevention of stack buffer overflow attacks,” *Communications of the ACM*, 48 (11), pp. 51-56, 2005.
5. Pollack, M.E., et al., (one of 26 authors) “Computing: Report leaps geographical barriers but stumbles over gender,” Correspondance, *Nature*, vol. 44, 2006.
6. Brodley, C. E., Rebbapragada, U., Small, K., and Wallace, B., “Challenges and opportunities in applied machine learning,” *AI Magazine*, 33 (1), pp. 11-24, 2012.

#### Book Chapters:

1. Brodley, C. E. and Utgoff, P. E., “Dynamic recursive model class selection for classifier construction,” In Cheeseman and Oldford (Eds.), *Selecting Models from Data*, pp. 329-338, Springer-Verlag, 1994. (A preliminary version appeared in *The Proceedings of the Fourth International AI and Statistics Workshop*.)
2. Brodley, C. E. and Clouse, J., “Machine Learning,” In the *Encyclopedia of Computer Science and Technology*, vol. 41 (A. Kent and J. G. Williams, eds.), Marcel Dekker, New York, 1999, pp. 137-146.
3. Early, J. P. and Brodley, C. E. “Behavioral features for network anomaly detection,” in M. Maloof, (Ed.) *Machine Learning and Data Mining for Computer Security: Methods and Applications*, Springer, 2005, pp. 107-124.

### Conference Proceedings and Presentations: Full Paper Reviewed:

1. Utgoff, P. E. and Brodley, C. E., "An incremental method for finding multivariate splits in decision trees," *The Seventh Conference on Machine Learning*, June, 1990, Austin, TX, pp. 58-65.
2. Brodley, C. E., "Addressing the selective superiority problem: Automatic algorithm/model class selection," *The Tenth International Conference on Machine Learning*, June, 1993, Amherst, MA, pp. 17-24. (Note: one of 5% accepted for plenary session presentation.)
3. Brodley, C. E., "Automatic selection of split criterion during tree growing based on node location," *The Twelfth International Conference on Machine Learning*, July, 1995, Tahoe City, CA, pp. 73-80.
4. Brodley, C. E. and Friedl, M. A., "Identifying and eliminating mislabeled training instances," *The Thirteenth National Conference on Artificial Intelligence*. August 4-8, 1996, Portland, OR, pp. 799-805.
5. Stough, T. and Brodley, C. E., "Image feature reduction through spoiling: Its application to multiple matched filters for focus of attention," *The Third International Conference on Knowledge Discovery and Data Mining*, August, 1997, Newport Beach, CA, pp. 255-258.
6. Lane, T. and Brodley, C. E., "An application of machine learning to anomaly detection," *The Twentieth Annual National Information Systems Security Conference*, October, 1997, Washington, DC, pp. 366-380.
7. Moss, J. E., Utgoff, P., Cavazos, J., Precup, D., Stefanovic, D., Brodley, C. E., and Scheeff, D., "Learning to schedule straight-line code," *Neural Information Processing Systems*, December 1997, Denver, CO, pp. 929-935.
8. Bradford, J. P., Kunz, C., Kohavi, R., Brunk, C., and Brodley, C. E., "Pruning decision trees with misclassification costs," *The Tenth European Conference on Machine Learning*, April, 1998, Chemnitz, Germany, pp. 131-136.
9. Lane, T. and Brodley, C. E., "Approaches to online learning and concept drift for user identification in computer security," *The Fourth International Conference on Knowledge Discovery and Data Mining*, August, 1998, New York, NY, pp. 259-263.
10. Lane, T. and Brodley, C. E., "Temporal sequence learning and data reduction for anomaly detection" *The Fifth ACM Conference on Computer and Communications Security*, November, 1998, San Francisco, CA, pp. 150-158.
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#### **Conference Proceedings and Presentations: Abstract Reviewed:**

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6. Preston, D., Protopapas, P., and Brodley, C. E., "Event discovery in astronomical time series," *Astronomical Data Analysis Software and Systems (ADASS)* conference, 2008, Quebec City.
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5. Brodley, C. E. and Lane, T., "Creating and exploiting diversity," *AAAI-96 Workshop: Integrating Multiple Learned Models for Improving and Scaling Machine Learning Algorithms*, Portland, OR, August 3, 1996.
6. Lane T. and Brodley C. E., "Sequence matching and learning in anomaly detection for computer security," *AAAI-97 Workshop: AI Approaches to Fraud Detection and Risk Management*, Providence, RI, July 31, 1997.



7. Shyu, C., Brodley, C. E., Kak, A., Kosaka, A., Aisen, A., and Broderick, L., "Local versus global features for content-based image retrieval", in the *Proceedings of the IEEE Workshop on Content-Based Access of Image/Video Library* held in conjunction with CVPR98, Santa Barbara, CA, June 21, 1998.
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13. Pavlopoulou, C., Kak, A. and Brodley, C. E., "Applications of Semisupervised and Active Learning to Interactive Contour Delineation," *Proc. ICML-EDDS Workshop on the Continuum from Labeled to Unlabeled Data*, August 2003.
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15. Lomasky, R., Brodley, C. E., Bencic, S., Aernecke, M., and Walt, D., "Guiding class selection for an artificial nose," *NIPS Workshop: Testing of Deployable Learning and Decision Systems* 2007.
16. Wallace, B., Dahabreh, I., Moran, K., Brodley, C. E., and Trikalinos, T. Active literature discovery for scoping evidence reviews: How many needles are there? *KDD 2013 - Workshop on Data Mining for Healthcare (DMH)*, 2013.
17. Ahmed, B., Thesen, T., Blackmon, K., Kuzniecky, R., Carlson, C., Quinn, B., Doyle, W., French, J., Devinsky, O., and Brodley, C. E., "Machine learning for detection of MRI-elusive epileptogenic lesions: A surface-based MRI morphometric approach," *SDM Workshop: Data Mining for Medicine and Healthcare*, Philadelphia, PA, April 2014.

#### **Recent Invited Lectures:**

1. "Covert Timing Channels over IP" given at:
  - Trust Seminar Series, University of CA, Berkeley, February 2007
  - Google, Mountain View, February 2007

- ITA Software, Cambridge MA, February 2007
  - University of Massachusetts, Lowell, February, 2008
  - University of Virginia, Charlotte, April 2008
2. “Generating and Recognizing High-Quality Training Data for Supervised Learning” given at:
    - Stern School of Business, New York University, February 2008
    - CFA, Harvard University, March 2008
    - Northeastern University, March 2008
    - Tufts University Medical School, September 2009
  3. “Challenges in the Practical Application of Supervised Learning” given at:
    - AI Seminar, Cornell University, September 2009
    - Intelligence Seminar, Carnegie Mellon University, November 2009
    - School of Informatics and Computing Colloquium, Indiana University, February 2010
    - Computer Science Colloquia, Purdue University, February 2010
    - Image and Video Computing Group, Boston University, March 2010
    - CDSP Research Workshop, Communications and Digital Signal Processing Center, Northeastern University, March 2010
    - Computer Science Colloquia, University of Massachusetts at Boston, March 2010
    - Computer Science Colloquia, University of Alberta, Edmonton, Alberta, April 2010
    - Operations Research Center Seminar, MIT, February, 2011
    - Draper Laboratory, November 2011
  4. “Removing Confounding Factors via Constraint-Based Clustering: An Application to Finding Homogeneous Groups of Multiple Sclerosis Patients” given at:
    - IMS/ASA Spring Research Conference, June 2012
    - Meaningful Use of Complex Medical Data, August 2012
    - Lincoln Lab, May 2013
  5. “Class Imbalance and Noisy Training Data: Detecting FCD in MRI-Negative Epileptic Patients via Machine Learning,” Meaningful Use of Complex Medical Data, August 2013
  6. “Redefining Class Definitions using Constraint-Based Clustering and its Application to Landcover Classification and the AAAI 2014 Keywords,” given at:
    - AI Colloquia University of Texas at Austin, April 2014
    - Data Science Day, Tufts University, May 2014
    - Google, Cambridge, MA, May 2014
    - New England Machine Learning Day, May 2014
    - Microsoft Research – Redmond, November 2014
  7. “Challenges and Opportunities of Applied Machine Learning given at:
    - Distinguished Lecture Series, George Mason University, October 2015.

- 50/50 Lecture Series, University of Massachusetts at Lowell, March 2015.
- Computer Science Colliquia, Smith College, December 2015.

8. “Human-in-the-loop Machine Learning” given at:

- New York City, CTO meeting, March 2016.
- Meetup HQ, Summer 2016.
- Boston, CTO meeting, September 2016.