

Tools for Education – A Personalized View

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Motivation

- Education increasingly takes place in larger and larger classes both in traditional classroom teaching and in MOOCs.
- Challenges:
 - heterogeneous student backgrounds and abilities
 - heterogeneous student styles of learning
- Personalization is important to maintain student engagement and reduce drop-outs.
- Education is a life-long pursuit beyond college....



My Agenda

- Use Machine Learning and Data Mining to create a personalized interactive environment for each student –
 One teacher for one student
- Personalized Remedial Materials
- Life-long Education/Personal Growth
- Study and Support Networks
- Incentivizing Collaborations



Goal: Identify students who need help (grade/performance prediction)

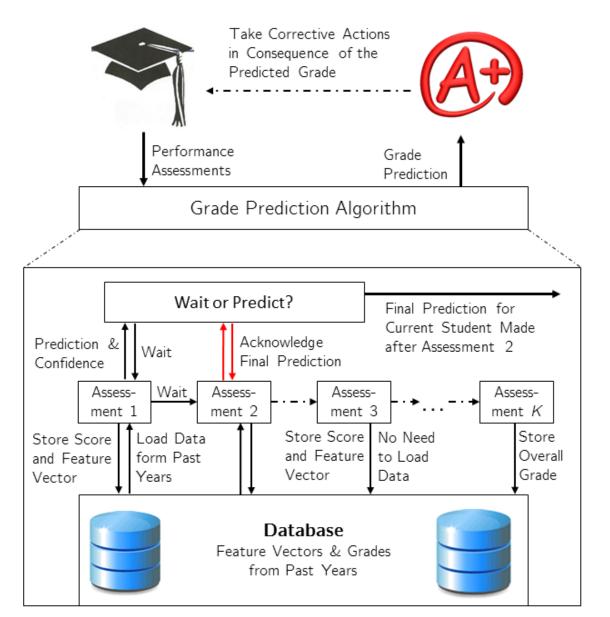
...as early as possible

...with predefined confidence

- Assumption: Early performance assessments (e.g. homeworks, quizzes) available
- Constraint: Only early class performance used
- Tested on: Digital Signal Processing (DSP) (Undergrad) Course
- Y. Meier, J. Xu, O. Atan, M. van der Schaar, "Personalized Grade Prediction:
- A Data Mining Approach," IEEE ICDM, 2015.
- Y. Meier, J. Xu, O. Atan, and M. van der Schaar, "Predicting Grades," to appear in *IEEE Transactions on Signal Processing*, 2015.



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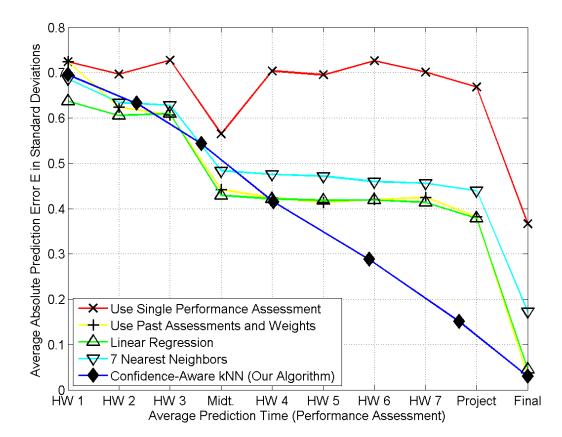
Performance

Benchmarks:

- Use single/few past assessments
- Linear regression
- k-Nearest Neighbors

Advantages:

- Personalized prediction (stopping)
- Confidence/guarantees
- Rescuing students
- More assessments early on can improve prediction
- Use data from past classes



Goal: Adapt the teaching methodology to

- maximize student performance/learning
- minimize student time/effort

Time Student iRead/solve Solve the Read/solve final exam q_{i,T_i} Feedback Feedback Answers $Context = x_i$ Final q_{i,T_i} leTutor exam Learning algorithm Decide to give final Select $q_{i,1}$ based on x_i final exam based on (x_i,\ldots,a_{i,T_i}) Select $q_{i,T}$ based on score estimates for $(x_i, q_i[T_i - 1], a_i[T_i - 1])$ x_i, q_i, a_i Context database



Staged

Bandits

Multi-Armed

C.Tekin, J. Braun and M. van der Schaar, "eTutor: Online Learning for Personalized Education," *ICASSP*, 2015

Ongoing

- Personalized Course Sequence Recommendation
- Life-long Education/Personal Growth
- Study and Support Networks
- Incentivizing Collaborations

Tools

- Novel Multi-Armed Bandit Algorithms
- Novel Clustering Methods
- Novel Game-Theoretic Methods (Repeated Matching, Network Formation, etc.)

Y. Xiao, F. Dörfler and M. van der Schaar, "Incentive Design in Peer Review: Rating and Repeated Endogenous Matching"

