Student Modeling

Group 48

PES University, Electronic City

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Brief Outline

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Introduction

Algorithm

Status of Project 1 Introduction

- 2 Algorithm
- 3 Status of Project



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Introduction

Algorithm

Status of Project ■ **Domain:** Educational data mining, statistical learning



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Introduction

Algorithm

- Domain: Educational data mining, statistical learning
- What: An Intelligent Tutoring System (ITS)



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Introduction

Algorithm

- Domain: Educational data mining, statistical learning
- What: An Intelligent Tutoring System (ITS)
- How: Several algorithms proposed in literature, based on BKT



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Introduction

Algorithn

- Domain: Educational data mining, statistical learning
- What: An Intelligent Tutoring System (ITS)
- How: Several algorithms proposed in literature, based on BKT
- Data: 2009-10 Skill-builder ASSISTments data



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Introduction

Algorithn

- Domain: Educational data mining, statistical learning
- What: An Intelligent Tutoring System (ITS)
- How: Several algorithms proposed in literature, based on BKT
- Data: 2009-10 Skill-builder ASSISTments data
- Metrics: RMSE, MAE



Intelligent Tutoring Systems

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Status of Project

Adaptive teaching systems for elucidating concepts



Intelligent Tutoring Systems

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Algorithr

- Adaptive teaching systems for elucidating concepts
- Primarily based on Hidden Markov Models (HMMs)



Intelligent Tutoring Systems

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Introduction

Algorithm

- Adaptive teaching systems for elucidating concepts
- Primarily based on Hidden Markov Models (HMMs)
- Generated interest after Corbett & Anderson, 1994.



Bayesian Knowledge Tracing (BKT)

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Algorithm

Status of Proiect Proposed by Corbett & Anderson, 1994.



Bayesian Knowledge Tracing (BKT)

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Algorithm

- Proposed by Corbett & Anderson, 1994.
- Fundamentally, a two-state HMM-learned and unlearned.



Bayesian Knowledge Tracing (BKT)

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Algorithm

- Proposed by Corbett & Anderson, 1994.
- Fundamentally, a two-state HMM-learned and unlearned.
- Viterbi algorithm can be used to solve for the hidden state sequence.



BKT Extensions

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Algorithm

- Pardos and Heffernan, 2011. Incorporated problem difficulty.
- Yudelson et al., 2013. Incorporated student learning speed.
- Schultz and Arroyo, 2014. Combined BKT with HMM-IRT, called Knowledge and Affect Tracing (KAT) model.
- Lin and Chi, 2016. Added student response time directly into the model, creating the Intervention-BKT (I-BKT).
- Spaulding, Gordon, Brezeal, 2016. Used commercial affect-analysis tool called Affdex.



Why not Deep Neural Networks?

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Status of Proiect RNNs, LSTMs successfully applied (Piech et al., 2015; Lin and Chi, 2017)



Why not Deep Neural Networks?

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- RNNs, LSTMs successfully applied (Piech et al., 2015; Lin and Chi, 2017)
- Difficult to interpret!



Why not Deep Neural Networks?

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Algorithm

- RNNs, LSTMs successfully applied (Piech et al., 2015; Lin and Chi, 2017)
- Difficult to interpret!
- With HMMs, can identify "most likely" hidden state sequence, and can also find HMM parameters (EM algorithm)



So what are we doing?

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Status of Proiect Implement a web-based ITS solution



So what are we doing?

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Algorithm

- Implement a web-based ITS solution
- Individual models for each user



So what are we doing?

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Algorithm

- Implement a web-based ITS solution
- Individual models for each user
- Idea: start with simple models (single concept, basic BKT), go increasingly complex, hopefully implement KAT.



Technologies

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- Python + Flask back end
- MongoDB database, passwords hashed with bcrypt
- Authentication implemented with JSON Web Tokens (JWTs)
- Front end with Angular
- Code quality ensured with pycodestyle



Work completed

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Status of Project

User registration and login (back end and database)



Work completed

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- User registration and login (back end and database)
- Literature review, introduction



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Status of Project \blacksquare Analyze data, plan architecture, ≈ 3 weeks



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- \blacksquare Analyze data, plan architecture, \approx 3 weeks
- lacktriangle Implement basic BKT, pprox 3-4 weeks

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- \blacksquare Analyze data, plan architecture, ≈ 3 weeks
- $lue{}$ Implement basic BKT, pprox 3-4 weeks
- lacksquare Find metrics on the model, pprox 1 week

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- lacksquare Analyze data, plan architecture, pprox 3 weeks
- Implement basic BKT, \approx 3-4 weeks
- lacksquare Find metrics on the model, pprox 1 week
- lacktriangle Implement extensions and KAT (ideal) pprox 2-3 months



Thank you!

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Any questions?