## Big Education in the Era of Big Data

#### Irwin King

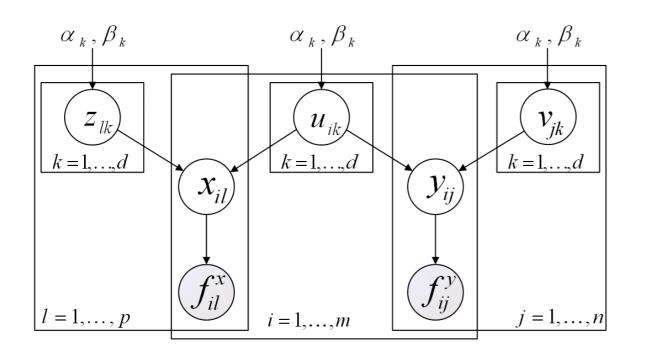
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#### Collective Probabilistic Factor Model



$$\mathcal{L}(U, V, Z; F^{x}, F^{y})$$

$$= \sum_{i=1}^{m} \sum_{l=1}^{p} (f_{il}^{x} \ln x_{il} - x_{il}) + \sum_{i=1}^{m} \sum_{j=1}^{n} (f_{ij}^{y} \ln y_{ij} - y_{ij})$$

$$+ \sum_{i=1}^{m} \sum_{k=1}^{d} ((\alpha_{k} - 1) \ln(u_{ik}/\beta_{k}) - u_{ik}/\beta_{k})$$

$$+ \sum_{j=1}^{n} \sum_{k=1}^{d} ((\alpha_{k} - 1) \ln(v_{jk}/\beta_{k}) - v_{jk}/\beta_{k})$$

$$+ \sum_{j=1}^{p} \sum_{k=1}^{d} ((\alpha_{k} - 1) \ln(z_{lk}/\beta_{k}) - z_{lk}/\beta_{k}) + \text{const.}$$

$$u_{ik} \leftarrow u_{ik} \frac{\sum_{j=1}^{n} (f_{ij}^{y} v_{jk}/y_{ij}) + \sum_{l=1}^{p} (f_{il}^{x} z_{lk}/x_{il}) + (\alpha_{k} - 1)/u_{ik}}{\sum_{j=1}^{n} v_{jk} + \sum_{l=1}^{p} z_{lk} + 1/\beta_{k}}$$

$$v_{jk} \leftarrow v_{jk} \frac{\sum_{i=1}^{m} (f_{ij}^{y} u_{ik}/y_{ij}) + (\alpha_{k} - 1)/v_{jk}}{\sum_{i=1}^{m} u_{ik} + 1/\beta_{k}}, \qquad u_{ik} \leftarrow u_{ik} \frac{\theta \sum_{j=1}^{n} (f_{ij}^{y} v_{jk}/y_{ij}) + (1-\theta) \sum_{l=1}^{p} (f_{il}^{x} z_{lk}/x_{il}) + (\alpha_{k} - 1)/u_{ik}}{\theta \sum_{j=1}^{n} v_{jk} + (1-\theta) \sum_{l=1}^{p} z_{lk} + 1/\beta_{k}}$$

$$z_{lk} \leftarrow z_{lk} \frac{\sum_{i=1}^{m} (f_{il}^{x} u_{ik}/x_{il}) + (\alpha_{k} - 1)/z_{lk}}{\sum_{i=1}^{m} u_{ik} + 1/\beta_{k}}.$$







#### **Our Education System**

Everybody is a genius. But if you judge a fish by its ability to climb a tree, it will live its whole life believing that it is stupid.

## Words of Wisdom

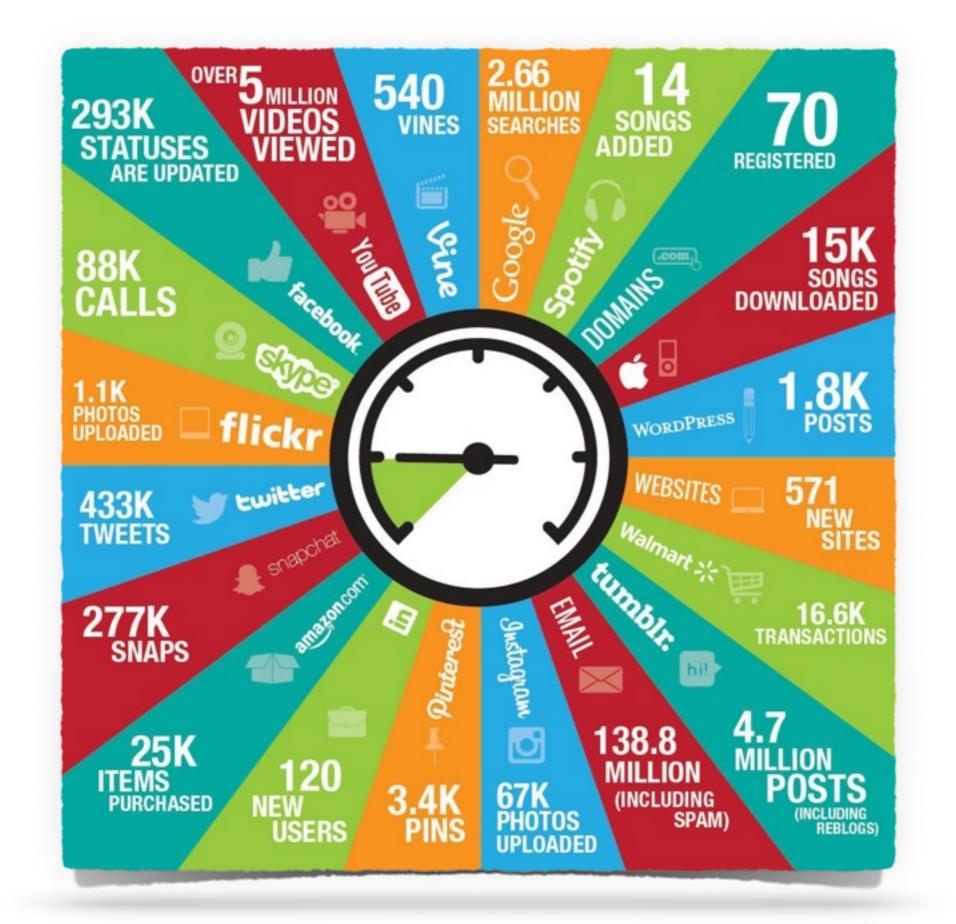
The **BEST** universities focus on **EDUCATION!** 

The **BETTER** universities focus on citation numbers and impact factors...

The GOOD universities focus on counting the number of publications...

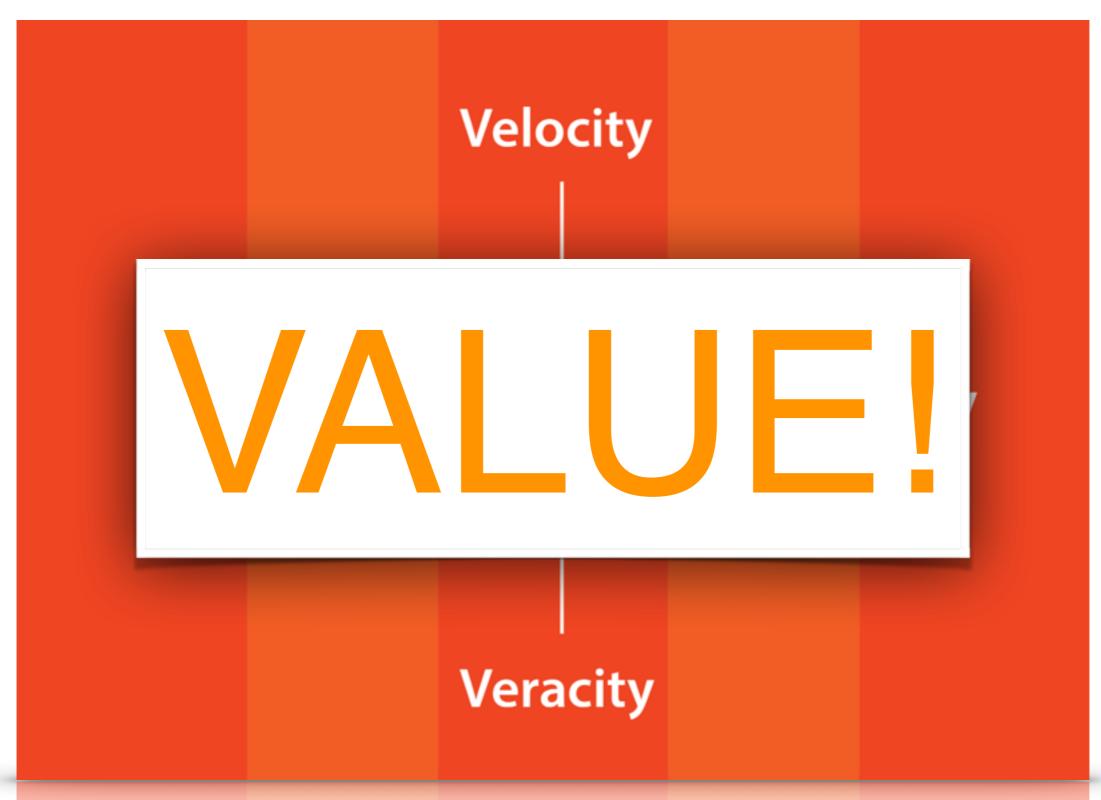














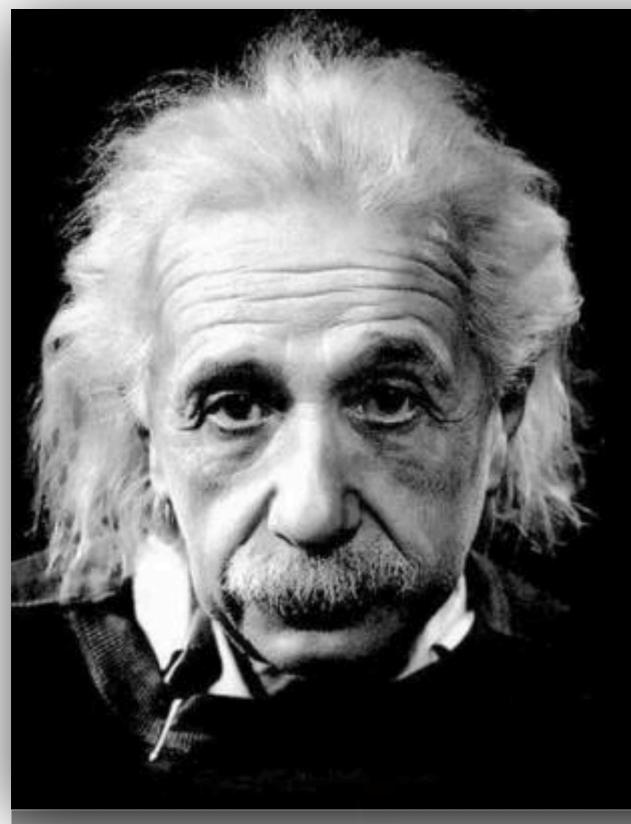


## Big Education on Lifelong Learning









Once you stop learning, you start dying...

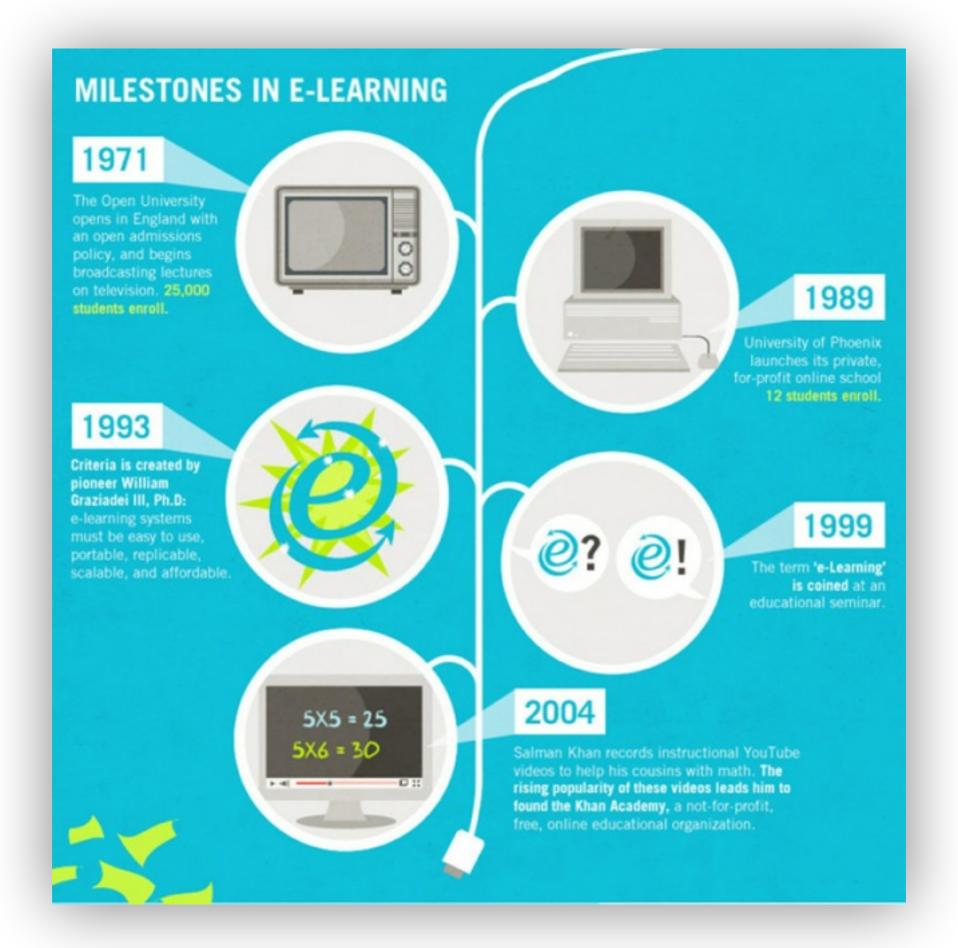
Albert Einstein





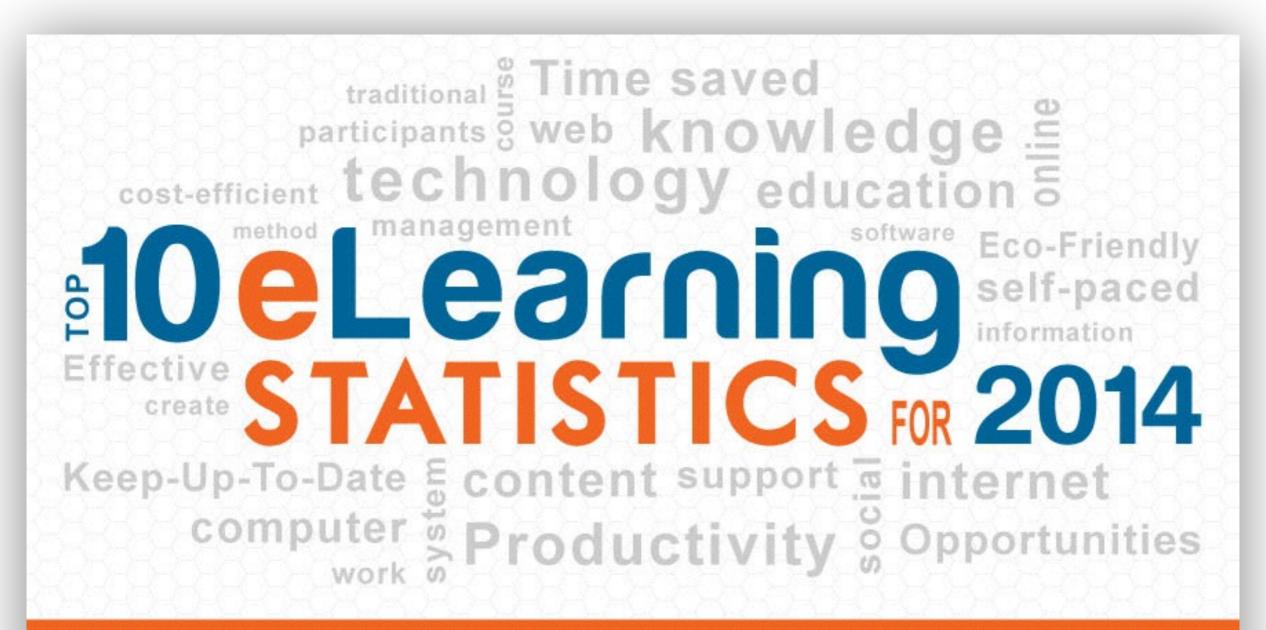








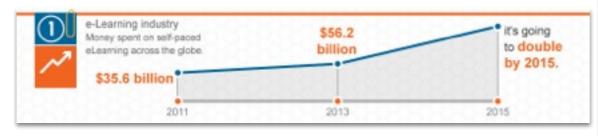


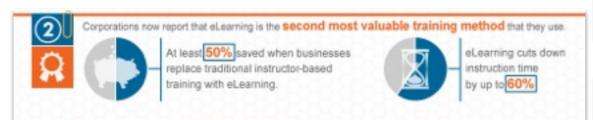


The rise in eLearning's popularity isn't showing any signs of slowing. In fact, judging by the following Top 10 eLearning statistics for 2014, the future of the eLearning Industry is brighter than ever:







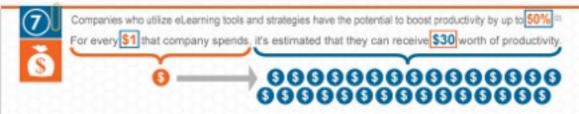


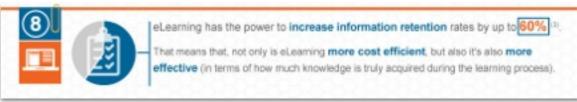


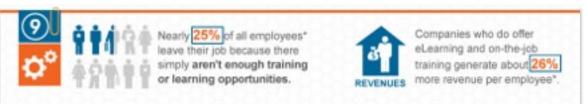


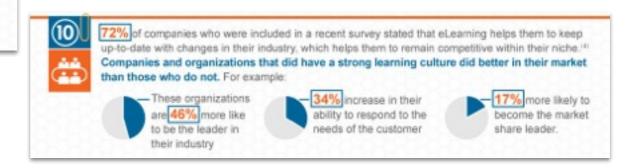




































The task of the modern educator is not to cut down jungles, but to irrigate deserts.

C.S. Lewis





## Trends in Big Education









Cost effectiveness

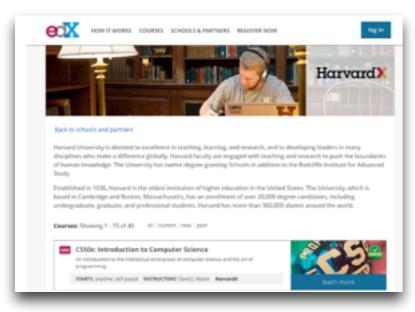




#### Multimodal Learning

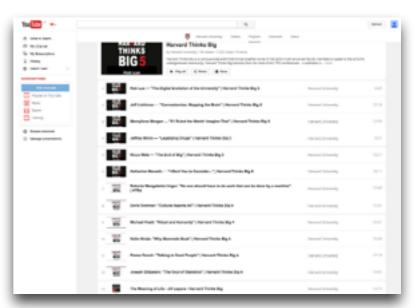


Harvard @ iTunes U

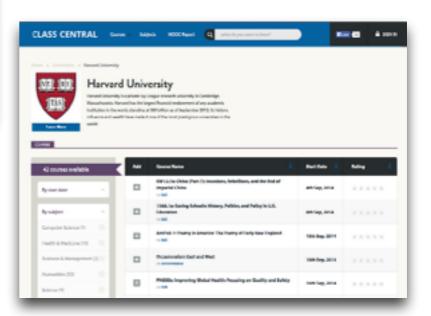


The state of the s

harvard.edu



Harvard @ YouTube



Harvard @ Class Central



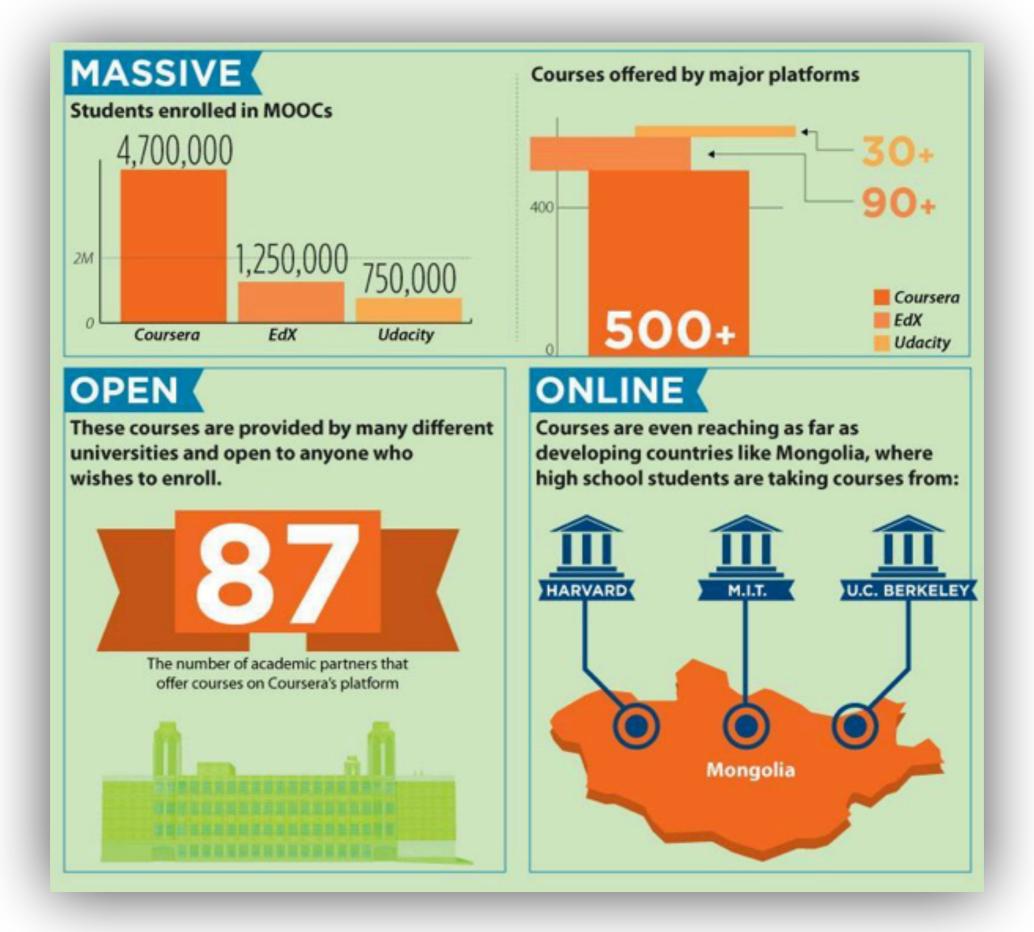
Harvard @ edX

## MOOC

## Massive Open Online Course





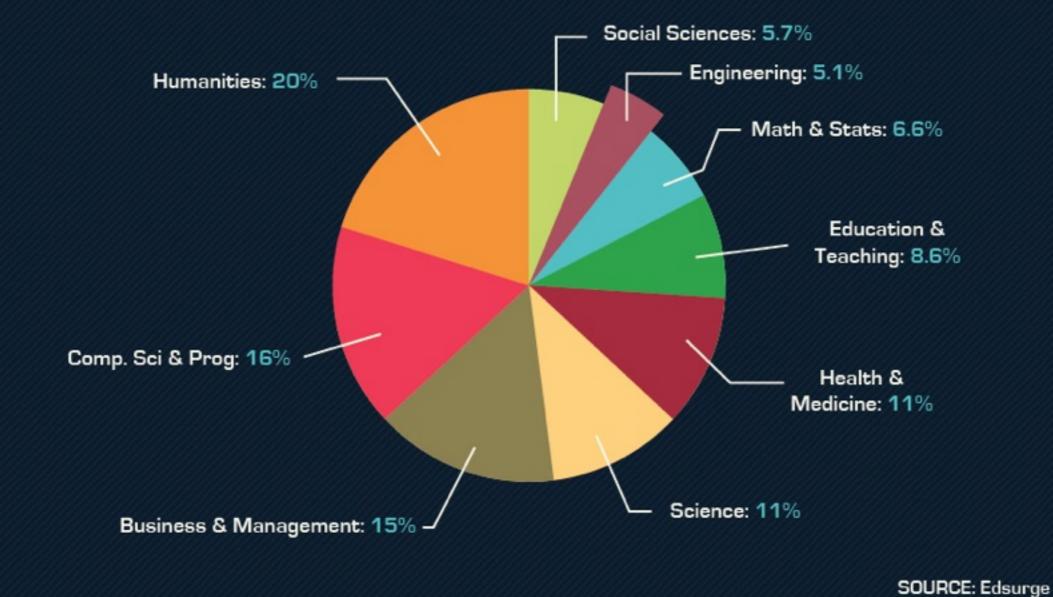






#### **Courses Offered**

#### 1200+ courses available





## Small Private Online Course (SPOC) with Degree

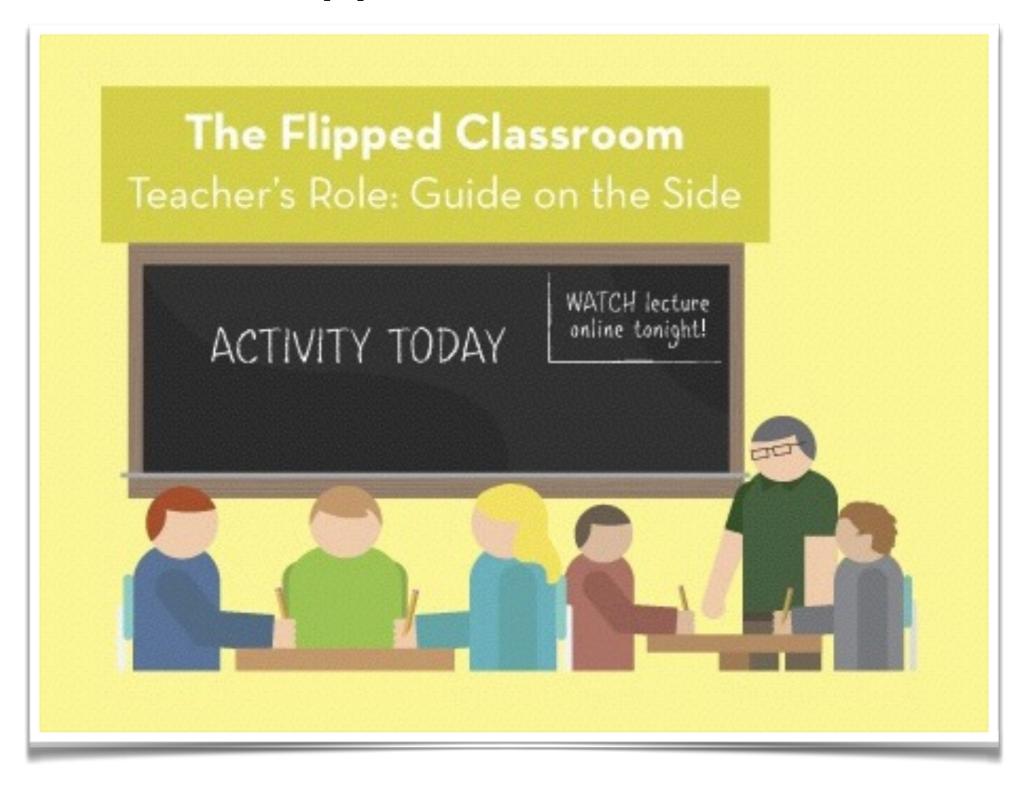








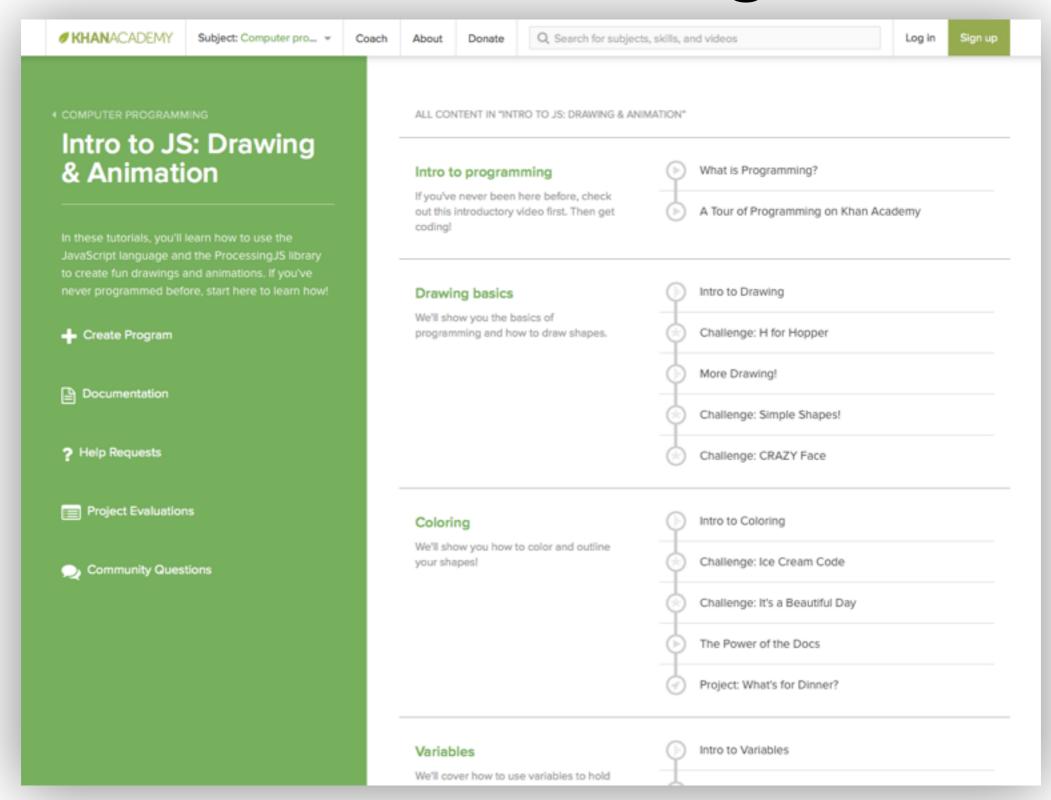
## Flipped Classroom







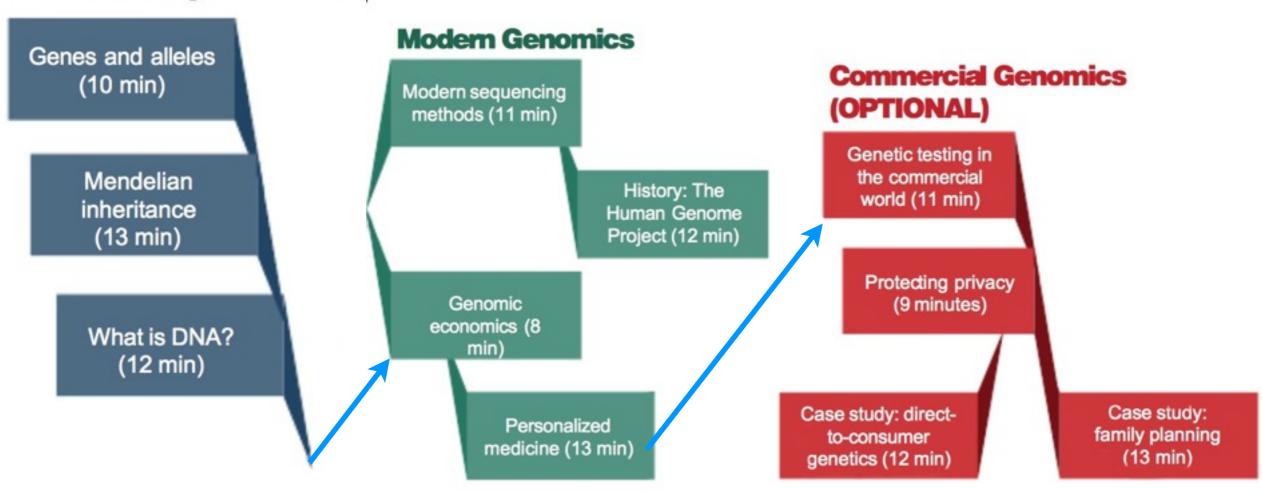
## Microlearning





## Personalized Learning

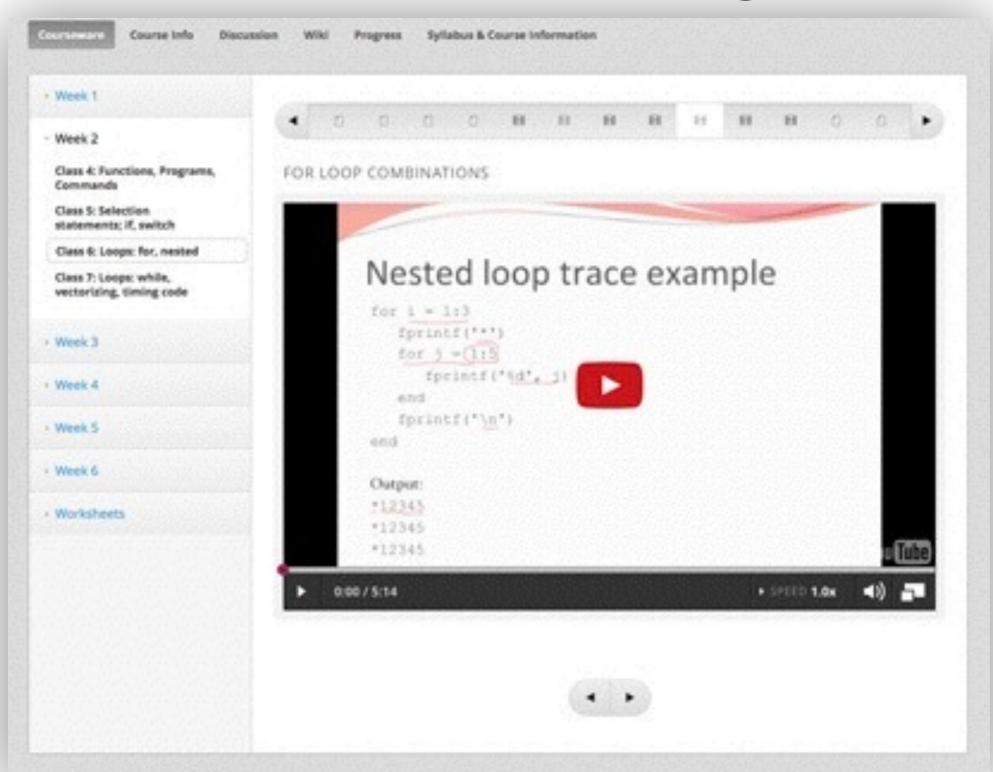
#### Basic Genetics Refresher (OPTIONAL)







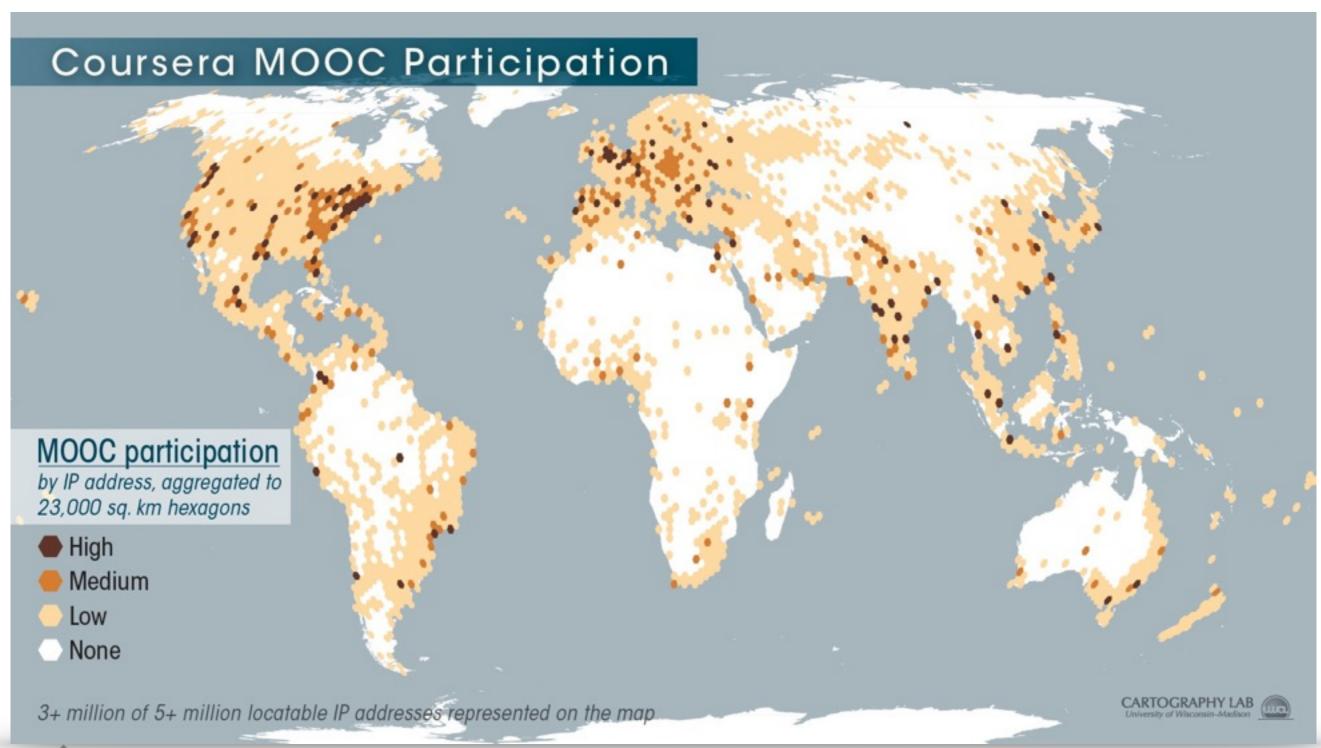
## Active Learning







## Peer Learning









## KEEP Education Cloud

- Educational resources to anyone, anytime, anywhere, on any device
- An education cloud platform to provide aggregated eLearning resources for teachers and students
- Big Data analytics for education
- Knowledge aggregation and technology integration!
- Multi-year, multi-discipline, and cross-institutional project with strong partners and alliances





### KEEP's Mission

- Promote eLearning and educational resources from content providers
- Support students and educators in teaching and learning through advanced analytics
- Provide administrators important information to assess, evaluate, make decision, and predict performances based on analytics
- Interface with developers to design and implement educational technologies



#### Some Partners and Alliances







UDACITY





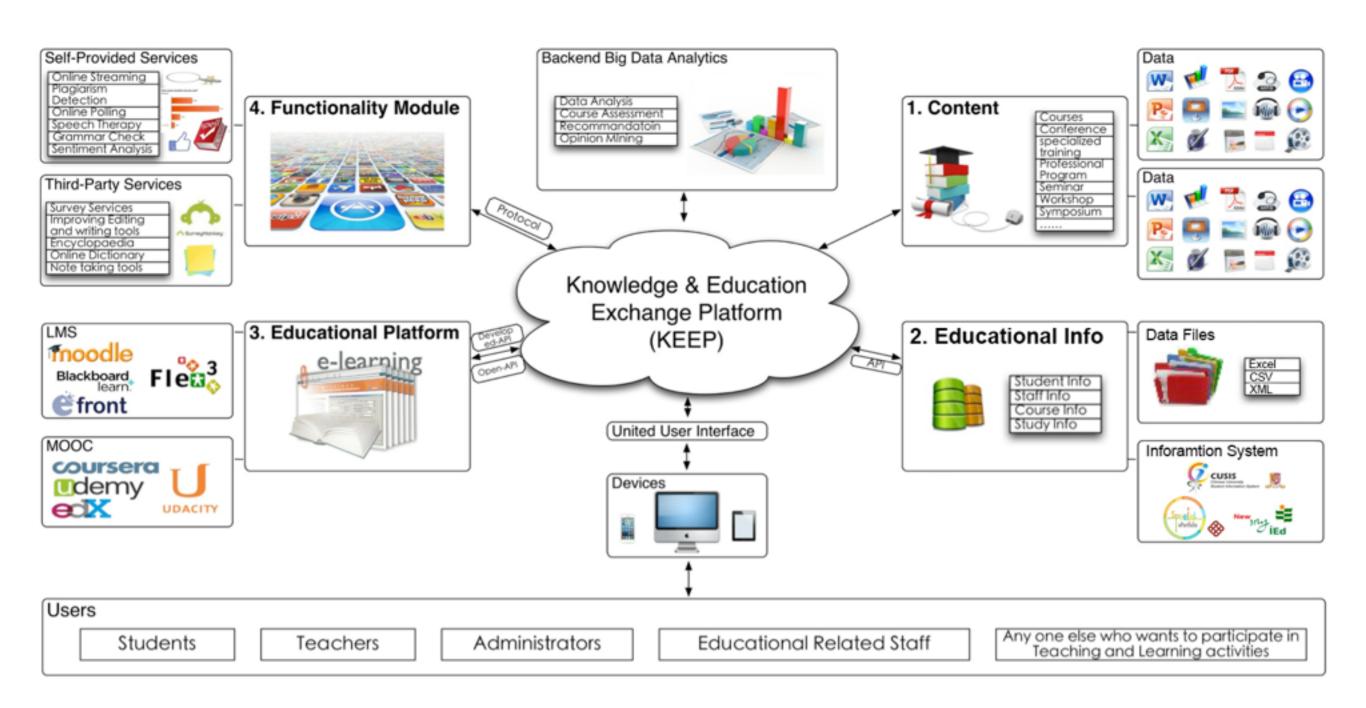








## The KEEP Education Cloud



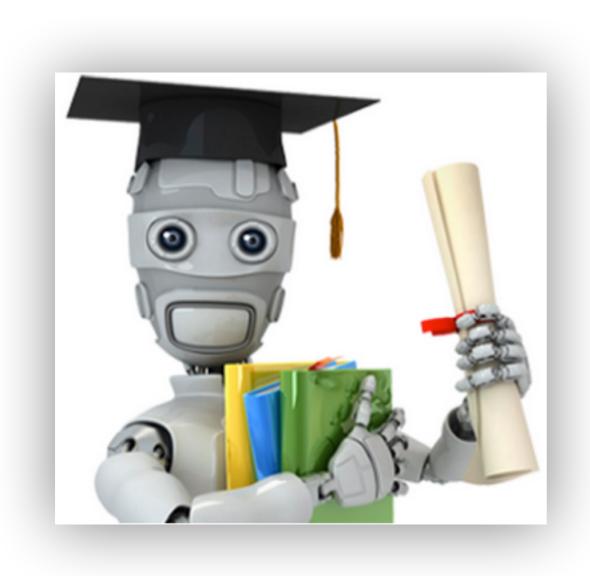


# Work in Progress & Future Works





## Natural Language Processing



- Text and semantic analysis
- Summarization
- Sentiment analysis
- Automated grading
- Q&A systems for classes





#### Recommendations

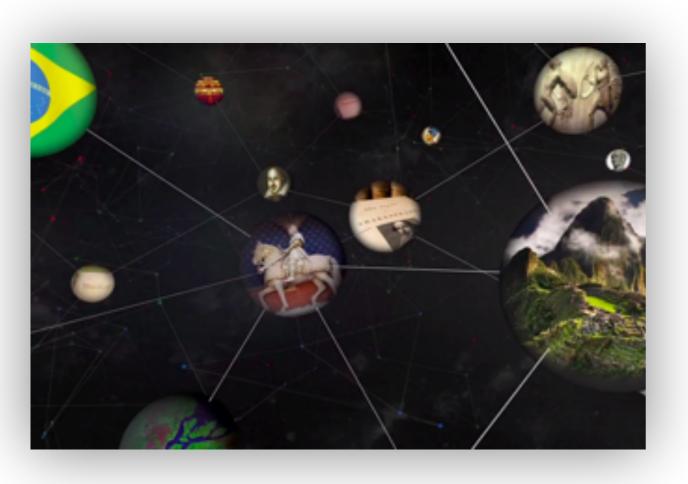


- Personalized learning
- Courses, tutors, peering learning partners, etc.
- Learning resources, time allocation, etc.
- Career planning





## Knowledge Map

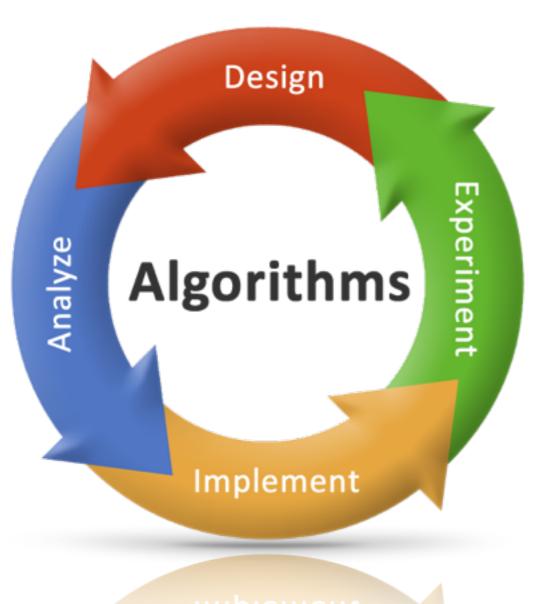


- Explore topics and concepts
- Track topic changes
- Make topic
   comparisons and
   inferences
- Better search on concepts





## Algorithms & Techniques



- Machine learning
- Data analytics
- Social computing
- Web intelligence
- Multimedia information processing

Implement





#### Get Involved









"I think you'll find that mine is bigger..."



## Concluding Remarks

- Be Inspired
  - Big Education is the focus!
- Be Informed
  - Big Data in Education is the VALUE proposition!
- Be Challenged
  - Use technologies to transform education in the Big Data Era!





## Q&A



