# 

Big Data, Learning Analytics & The Information Age

### In the news

### newschoolsignite

A New, No-Strings Funding Opportunity for Ed Tech Startups Focused on Middle and High Schools



http://cdn.nmc.org/media/2016-nmc-horizon-report-he-EN.pdf

**How Data Can Protect You From Cognitive Bias** 

Join us for the latest DSC Webinar on March 15<sup>th</sup>, 2016





# Today

In the news 6:45 - 6:50

Quiz 6:50 - 7:00

Zotero reset 7:00 - 7:10

Zotero 7:10 - 7:20

Web traffic

7:20 - 7:30

Dimensionality

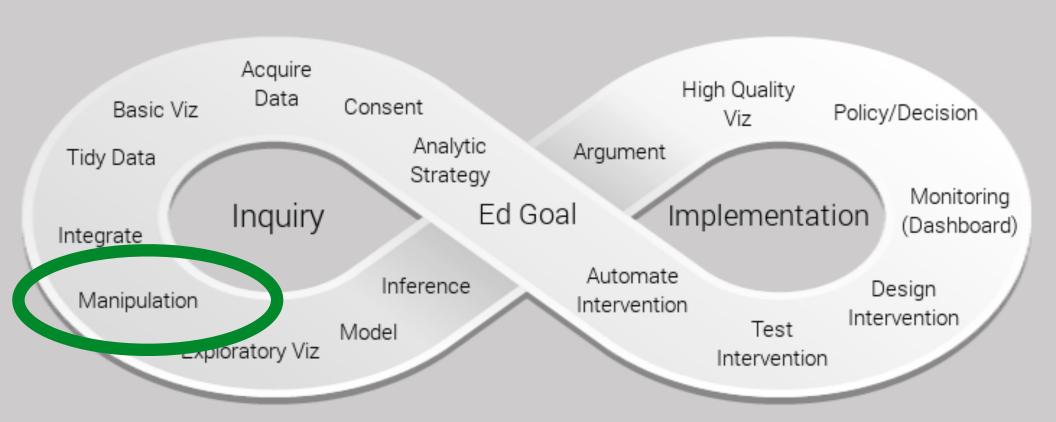
7:30 - 7:40

Twitter 7:40 - 8:10

Q & A

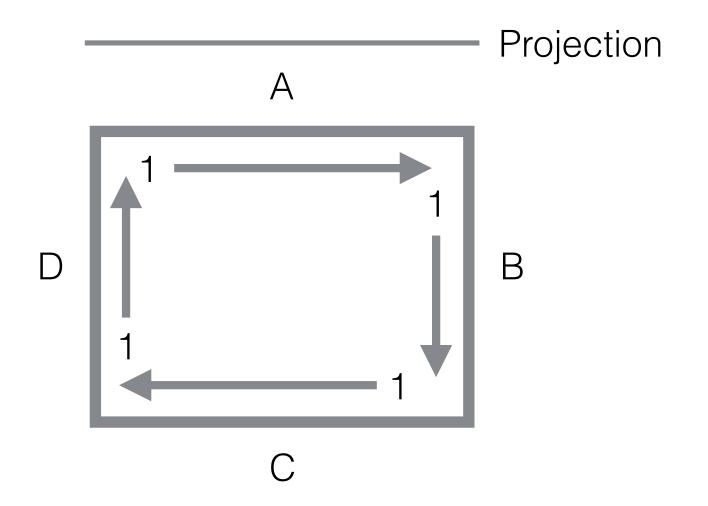
8:10 - 8:25

# Ed Data Science Cycle



# Quiz

# http://bit.ly/1SzEPC3



### Zotero

## Reset Library

- <u>Turn off auto sync:</u> -> preferences -> sync -> uncheck "Sync automatically"
- <u>Locate Zotero data file:</u> preferences -> advanced -> File & Folders -> Show data directory
- Close Zotero standalone or Firefox
- Delete the Zotero folder you located
- Go to Github data-science-in-ed/Tools -> Download Zip
- Unpack the folder
- Re-open Zotero and go to -> Import -> Locate the dse-references.df
- Now you should have a more manageable library

# Index your code!

- Create a new folder called "R code"
- Create a new "computer program" item
- Give it the title "Data tidying"
- Right/Control click on the item in the list
- Go to "add attachment" -> "attach stored copy of file" -> Locate your Assignment 3 R markdown document (EG assignment3.Rmd)
- Go back and fill in as many other descriptors as you can
- Repeat for your Twitter code and your Assignment 2 code

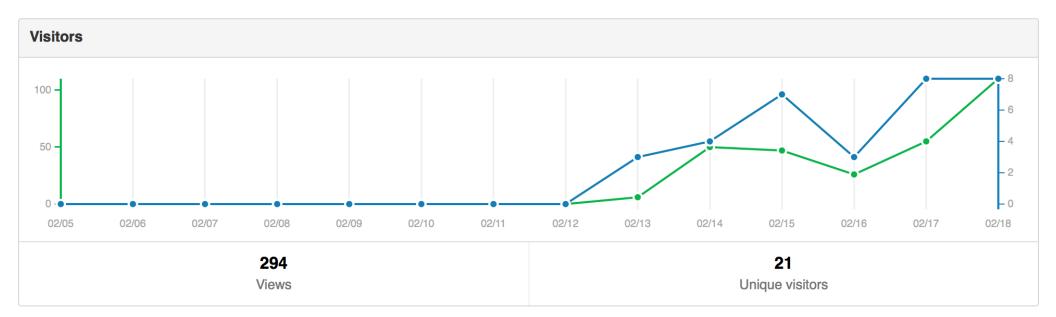
### Web Traffic

Can web traffic tell us anything useful?

### Assignment 2 Web Traffic



### Assignment 3 Web Traffic



# Personalization

"Uniformity is the curse of American schools...Individual instruction is the new ideal."

Charles Eliot, 1899

# Vocabulary

Individualization: learning goals are the same for all students, but students can progress through the material at different speeds.

**<u>Differentiation</u>**: learning goals are the same for all students, but the method or approach of instruction varies according to the preferences of each student.

<u>Personalization</u>: learning goals and content as well as the method and pace may all vary (so personalization encompasses differentiation and individualization).

# Adaptive

- Originally = <u>assistive</u>
- ~1990s = sequential estimate of aptitude (IRT)
- ~2012 = <u>a system that adapts the educational</u> environment according to students' learning needs
- Distinct from Intelligent Tutors in terms of methods employed

## Adaptive Systems

**NETFLIX** 





lost.fm





# Adaptive Engines















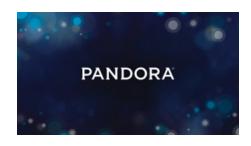
adapt courseware

# Recommender Systems

Collaborative filter: build a model from a user's past behavior + similar decisions made by other users



Content filter: utilize a series of discrete characteristics of an item in order to recommend additional items with similar properties



### Essential Problem

- Dimensionality Reduction
  - Feature selection: select a subset of dimensions
  - <u>Feature extraction</u>: transform lots of dimensions into fewer dimensions
- Why?
  - As a form of insight
  - Avoid "Curse of Dimensionality"

# Curse of Dimensionality

Sparsity: The more dimensions that we add, the more comparisons we are missing

	Stats	Cog Psy		
Amy	3	2		
Chen	2	2		
Asif	1	3		

Possible Combinations

# Curse of Dimensionality

Sparsity: The more dimensions that we add, the more comparisons we are missing

	Stats	Cog Psy	Socio- logy	Crit Theory	Wood- work	Data Sci	Music	Design
Amy	3	2	1	1	3	2	2	2
Chen	2	2	2	3	1	3	2	3
Asif	1	3	3	7	3	2	1	1

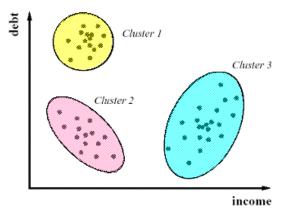
### How to distill features?

Mean, median, mode

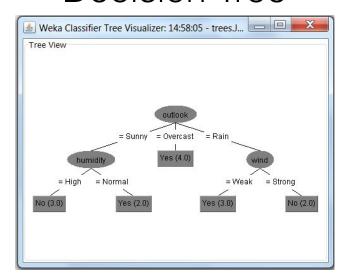
Principle Component Analysis



#### Cluster Analysis



**Decision Tree** 



### Correlations

- Pearson Correlation Coefficient (r)
- Measure of the strength and direction of association between two variables
- Need linear association
- Doesn't equal causation

$$r = \frac{n(\sum xy) - (\sum x)(\sum y)}{\sqrt{\left[n\sum x^2 - (\sum x)^2\right]\left[n\sum y^2 - (\sum y)^2\right]}}$$