

HUDK 4050: CORE METHODS IN EDM

In the news

Forbes

The Classroom Connectivity Gap Is Closed. How Did That Happen?

'The online test preparation market will be the fastest-growing within Ed-tech'

THE TIMES OF INDIA

Forbes

Computer Vision Can Transform Education

A bipartisan group of senators wants to help you leave Facebook



Make Stack Overflow More Welcoming

We launched a new Code of Conduct in August that reinforces our commitment to mutual respect and kindness.

[Read the Code of Conduct](#)

We [improved flagging](#) so it's simpler to report comments that are abusive or unkind. We also introduced the [New Contributor Indicator](#) to make it easier to identify and respond to new users.



Events

Title	Date - Time	Location
Where on Earth is AI Headed?	10/25 - 2:00pm	Davis Auditorium
<u>Columbia Nano Day</u>	10/29	Schapiro CEPSR
<u>Race After Technology</u>	10/30 - 6:00pm	Online
<u>Robotics to Retrain & Restore Human Movements</u>	11/1 - 12:00pm	NWB Rm 1406
<u>The Color of Surveillance</u>	11/7	Georgetown University
<u>All Tech is Human: NYC</u>	11/9	ThoughtWorks
<u>Science Communication Workshop</u>	11/20 - 9:30am	Low Library

Anonymous Check In

bit.ly/HUDK4050-Checkin

Assessment

- One assignment due per week for the rest of the semester
- Ask question on Stack Overflow (pull requisition to /so-question)
- Final group project will be a video
- Rate project videos

Class 27 - Work Session: Assignment 8, Group Project (12/5/19)

Class 28 - Work Session: Assignment 8, Group Project (12/10/19)

Due: Assignment 7 - Diagnostic Metrics

Class 29 - Rate video presentations (12/12/19)

Class 30 - Rate video presentations (12/17/19)

🔔 EVERYTHING DUE - 12/19/19

Adaptive Systems



Adaptive

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

Adaptive Systems

The Netflix logo, consisting of the word "NETFLIX" in a bold, red, sans-serif font, is centered on a light gray rectangular background.The Amazon.com logo, featuring the text "amazon.com" in a black, sans-serif font with a registered trademark symbol, and a curved orange arrow underneath the word "amazon". It is centered on a white rectangular background.The Pandora logo, with the word "PANDORA" in a white, sans-serif font, is centered on a dark blue background with a bokeh effect of light blue and white circles.The last.fm logo, with the text "last.fm" in a red, lowercase, sans-serif font, is centered on a white background.The Hulu logo, with the word "hulu" in a green, lowercase, sans-serif font, is centered on a dark gray rectangular background.The LinkedIn logo, with the word "Linked" in a black, sans-serif font and "in" in white inside a blue square, followed by a registered trademark symbol, is centered on a white background.

Adaptive Engines



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



Principal Component Analysis

Grouping stuff

By Variables

ID	Var1	Var2	Var3
A			
B			
C			
D			

ID	Var2
A	
B	
C	
D	

Selection

ID	Var2+3
A	
B	
C	
D	

Extraction

By People

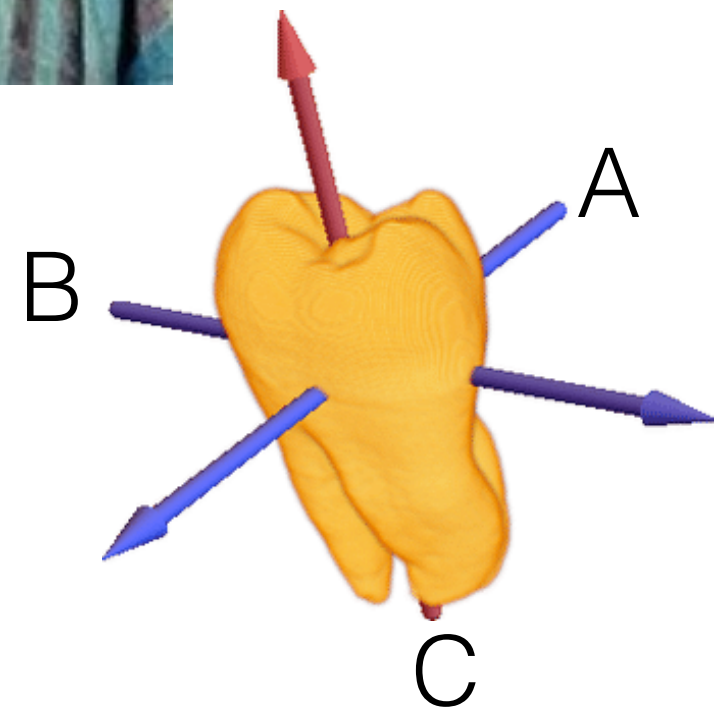


ID	Var1	Var2	Var3
A			
C			

ID	Var1	Var2	Var3
B			
D			

History

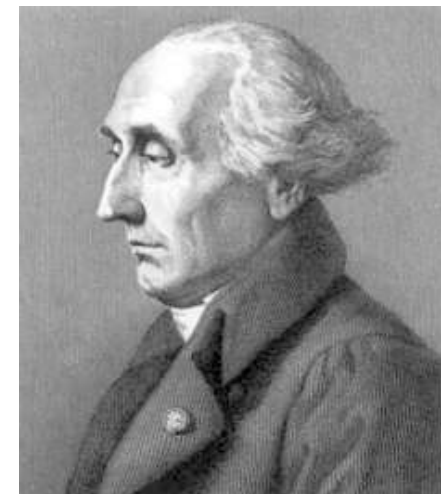
- Part of a set of issues called “Eigen Problems”
- Arose as a subset of phenomena related to differential equations (Your old buddy Euler, c.1750)
- Principal Axes



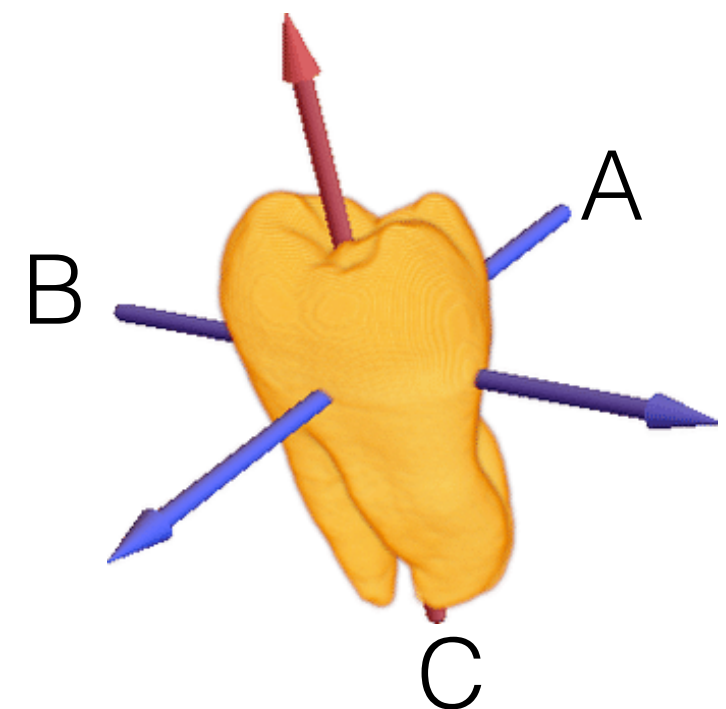
History

(Joseph-Louis Lagrange)

- Describe inertia as a matrix of measurements from the center of an object as it moves
- Principal axes = the lines through which you can describe the object, while maximizing the amount of variation maintained



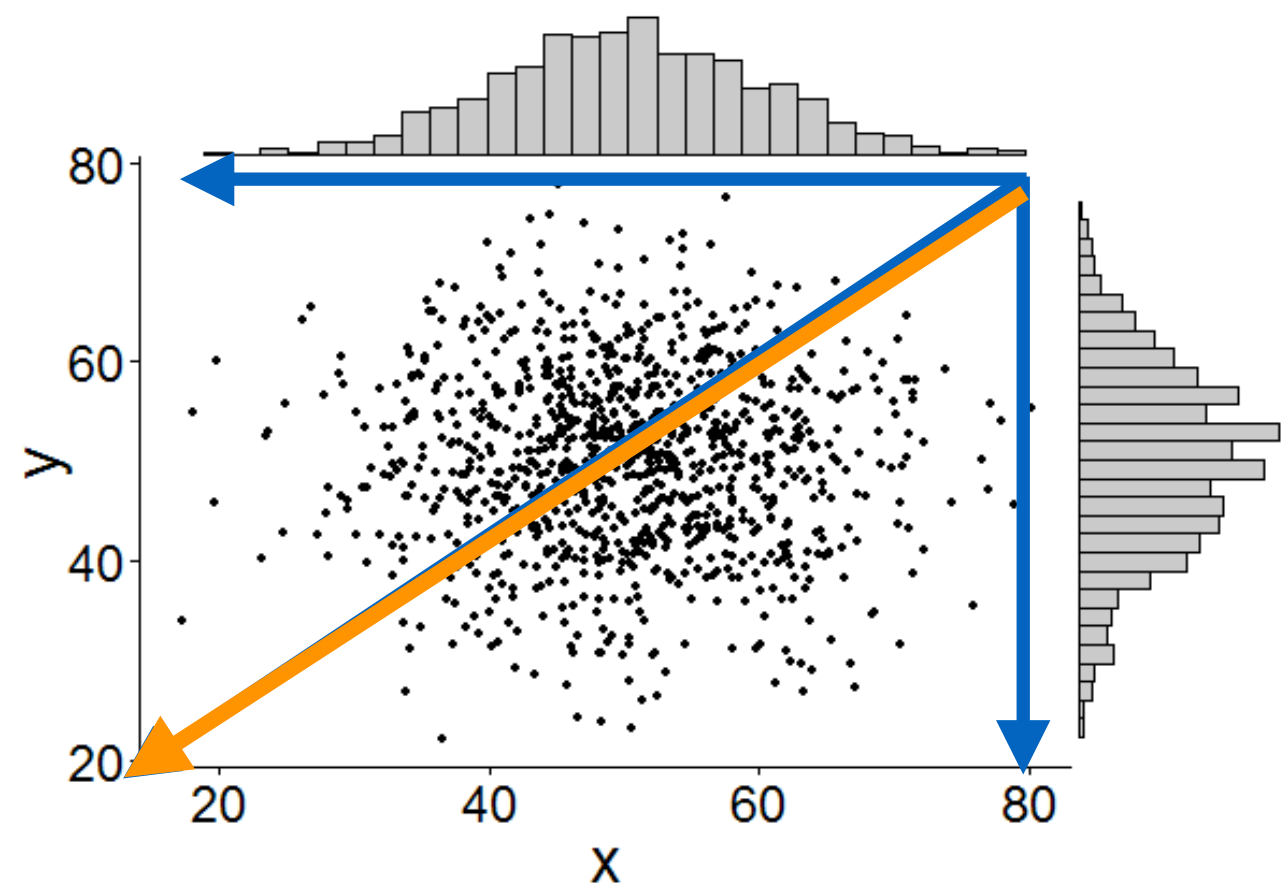
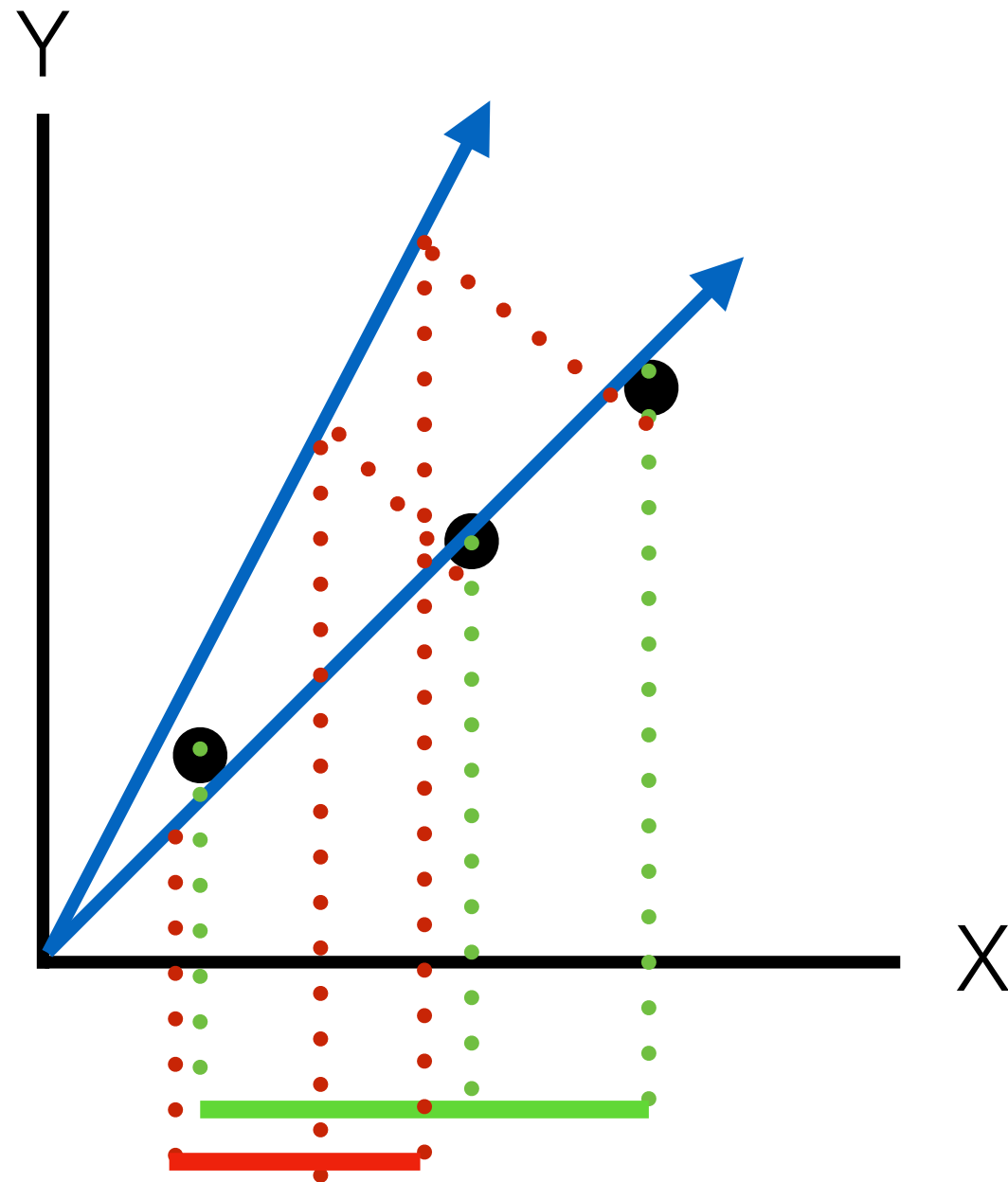
$$\begin{bmatrix} 1 & 2 & 3 \\ 4 & 5 & 6 \\ 7 & 8 & 9 \end{bmatrix}$$



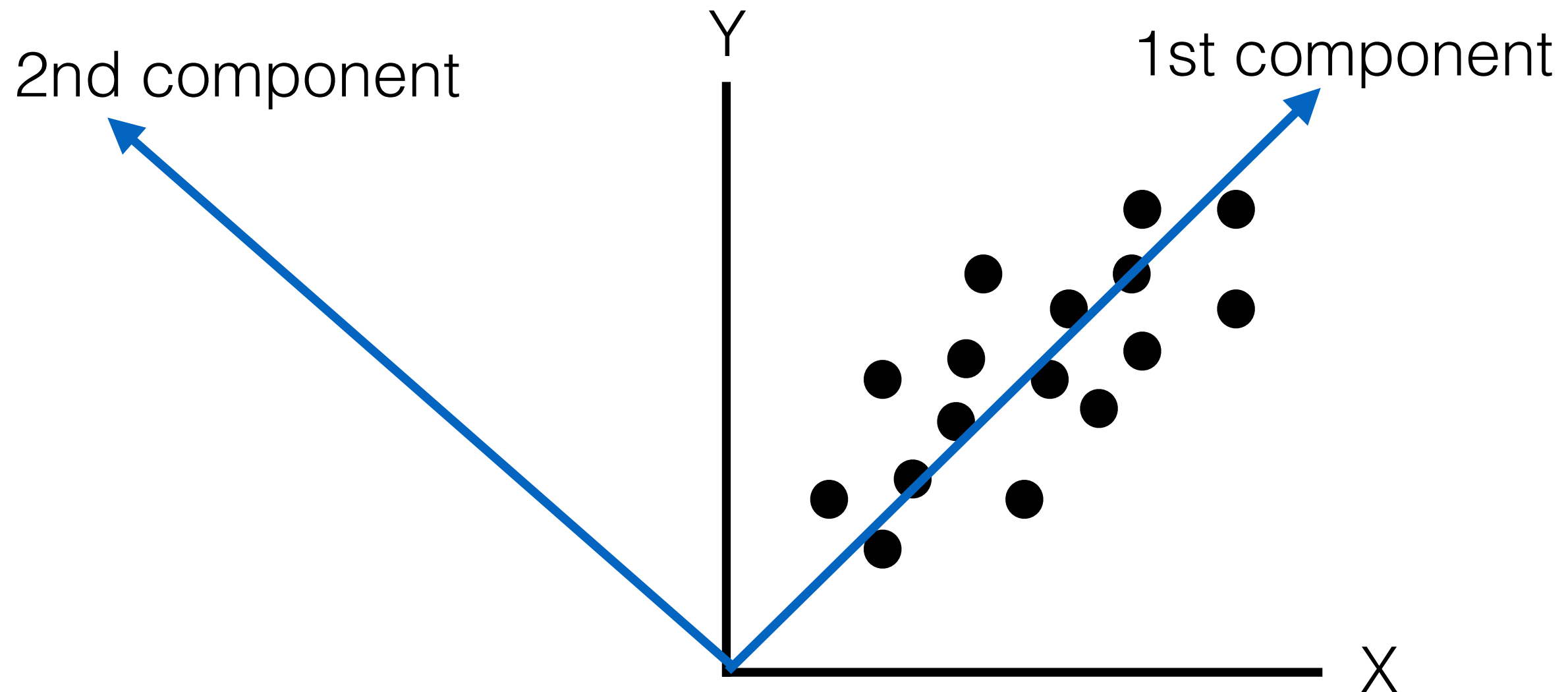
Yada, yada, yada...

Google

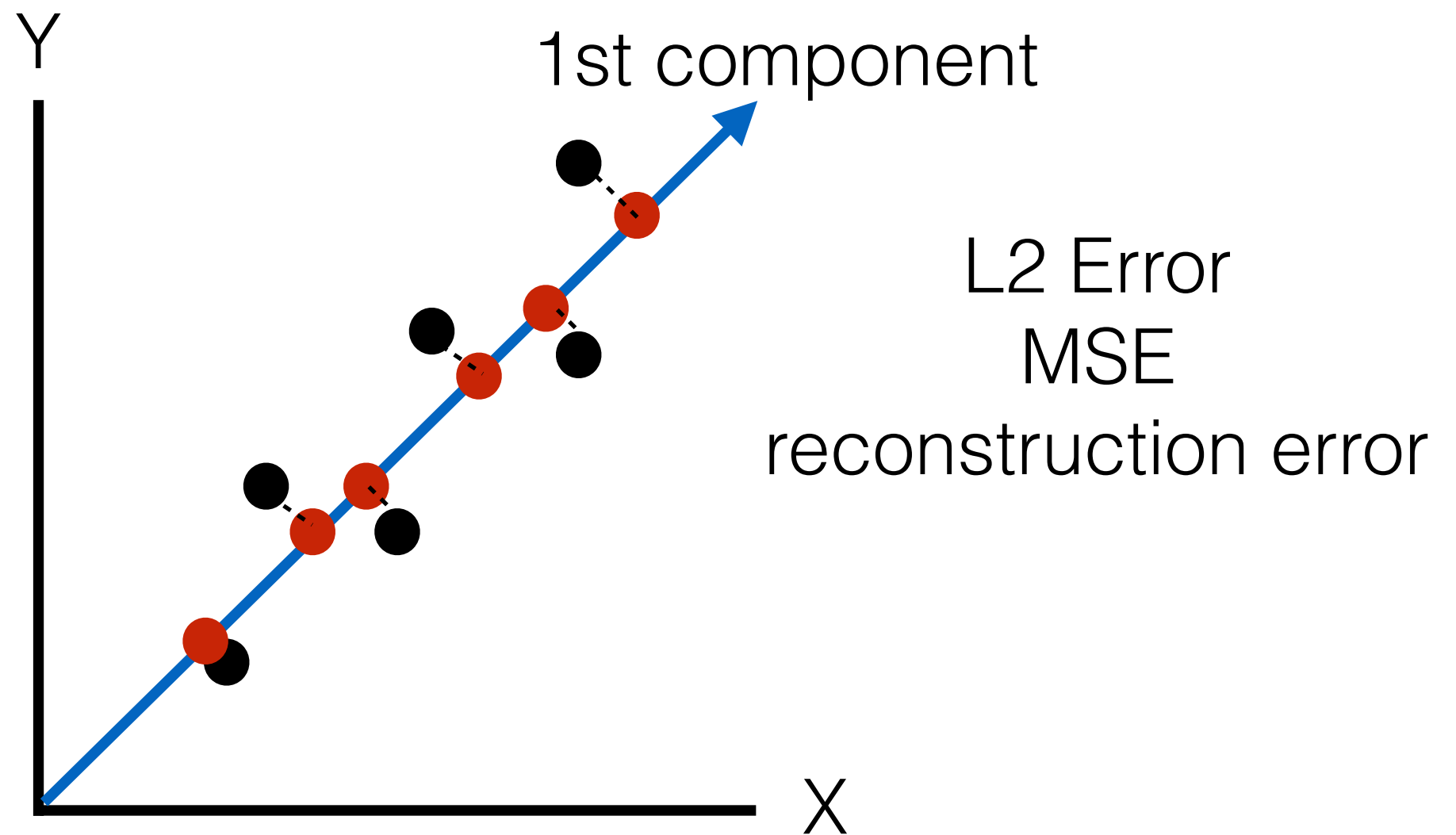
PCA is about Finding the Direction of Maximal Variance



Global Constraint: Orthogonal Components



- “Best” reconstruction of the data (because not really doing anything)
- But also true for linear reconstruction of the data



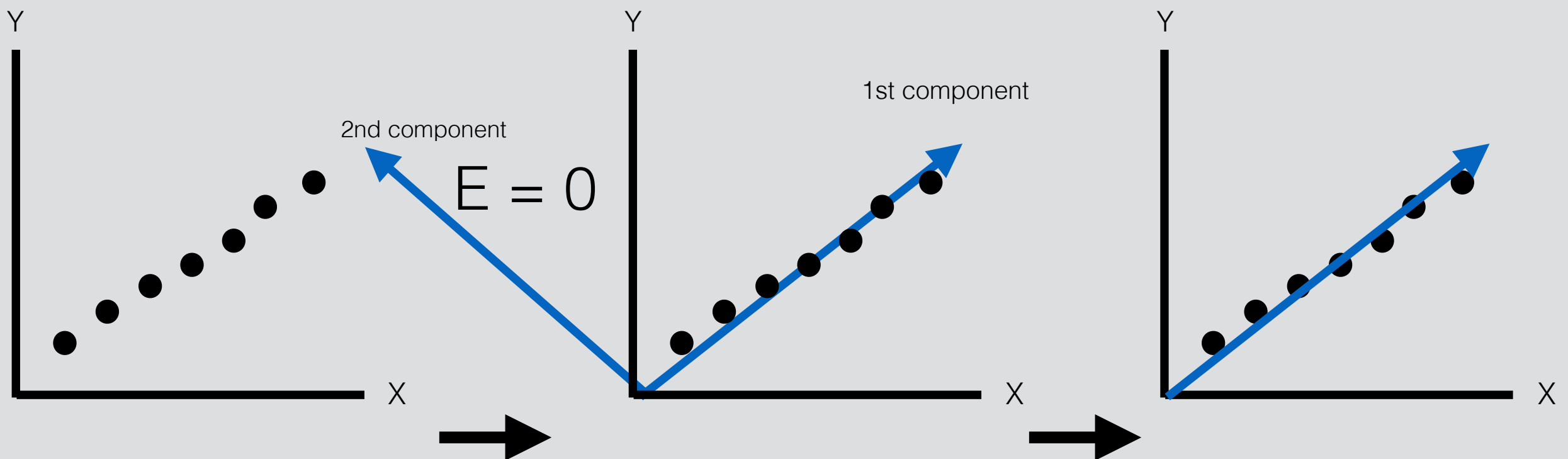
Component is a description of X & Y

Eigenvalues

- Every component has an associated eigenvalue
- Eigen- = “characteristic”
- Created when linear transformations are applied to a matrix
- Take away: the size of the eigenvalue is relative to how well the component maximizes variance

Feature Selection

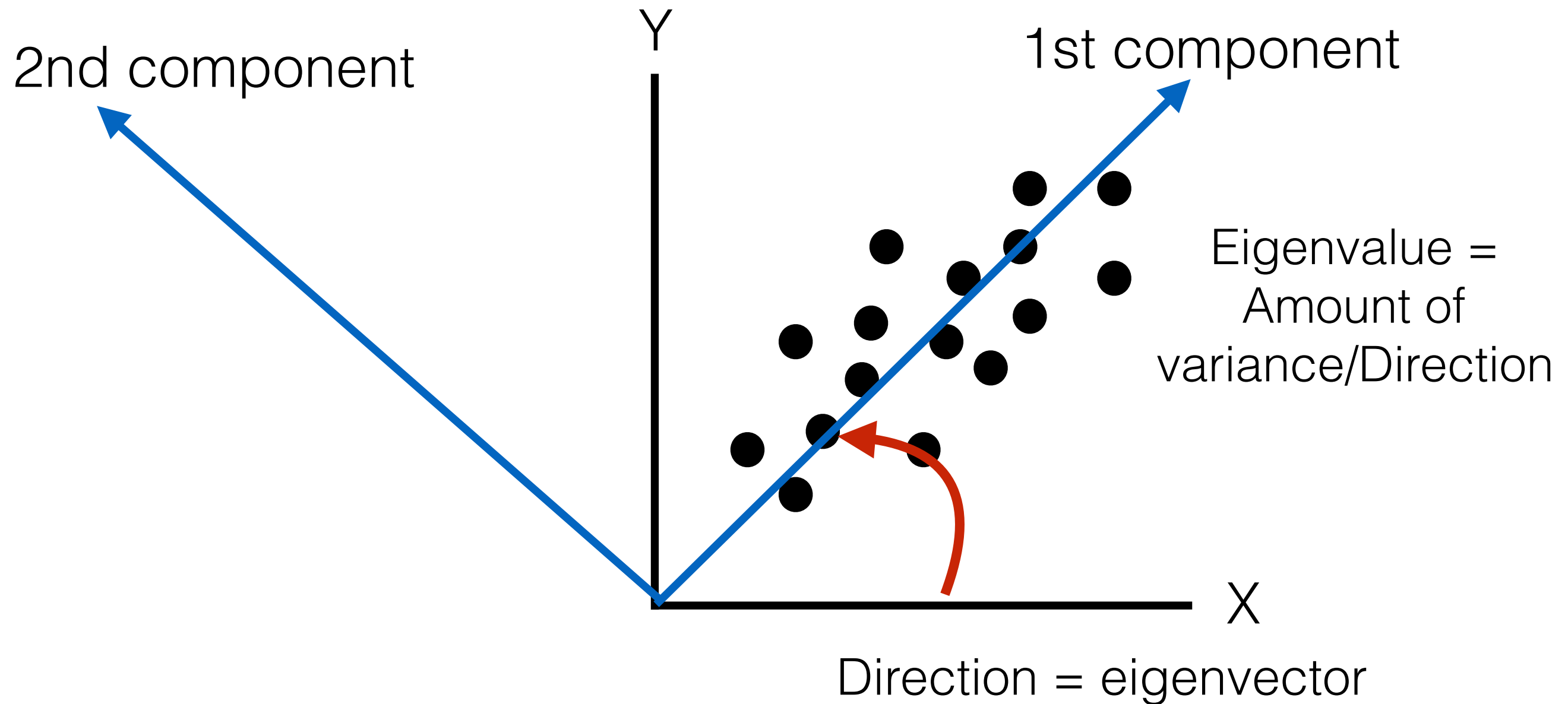
- If a component has an eigenvalue of zero = non-informative (will not effect reconstruction error)
- Therefore, we can delete it = reduce features



Questions?

[http://setosa.io/ev/
principal-component-
analysis/](http://setosa.io/ev/principal-component-analysis/)

Orthogonal Components



Eigenvectors

pca\$rotation

Eigenvectors

	PC1	PC2
V1	0.34	-1.6
V2	0.13	-0.07
V3	0.01	0.6
V4	0.02	1.5

Creating Composites

Because the eigenvectors represent the shift of each dimension, accounting for max variance, we can use these numbers to weight the construction of a composite.

$$\text{Composite1(PC1)} = (V1 \times E1) + (V2 \times E2) + (V3 \times E3) + (V4 \times E4)$$

HOWEVER: You must make substantive sense of the component!

Gotchas

- Data needs to be scaled
- Often centered so that the direction goes through zero
- Outliers have an outsized impact on your results
- Continuous variables (or binary but be careful)
- Linear relationships between variables (sometimes impractical)
- Better with larger samples (no real way to test though)
- Components will be uncorrelated!

[http://bit.ly/
HUDK405019PCA](http://bit.ly/HUDK405019PCA)