

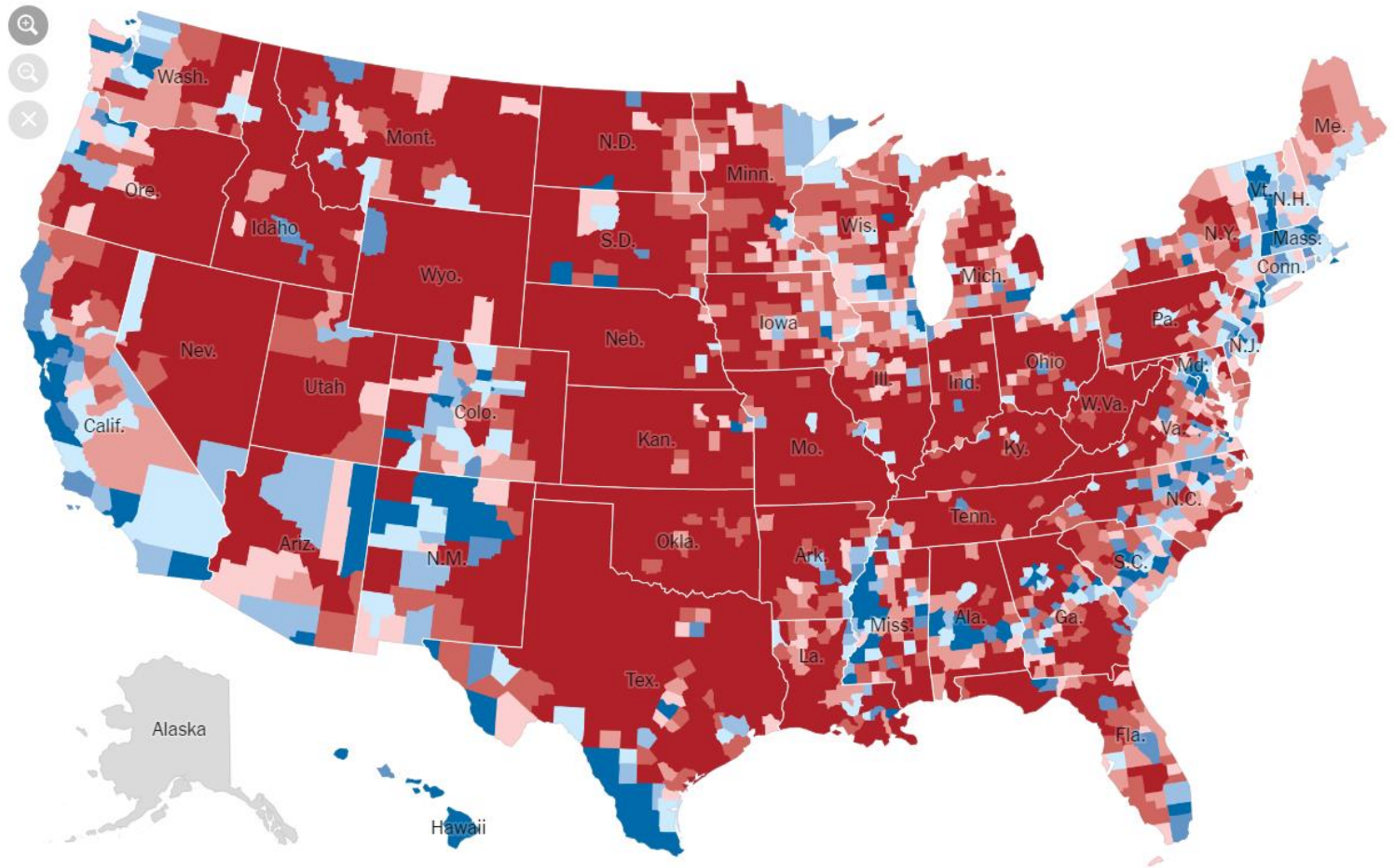
# Machine Learning applied to Planetary Sciences

PTYS 595B/495B

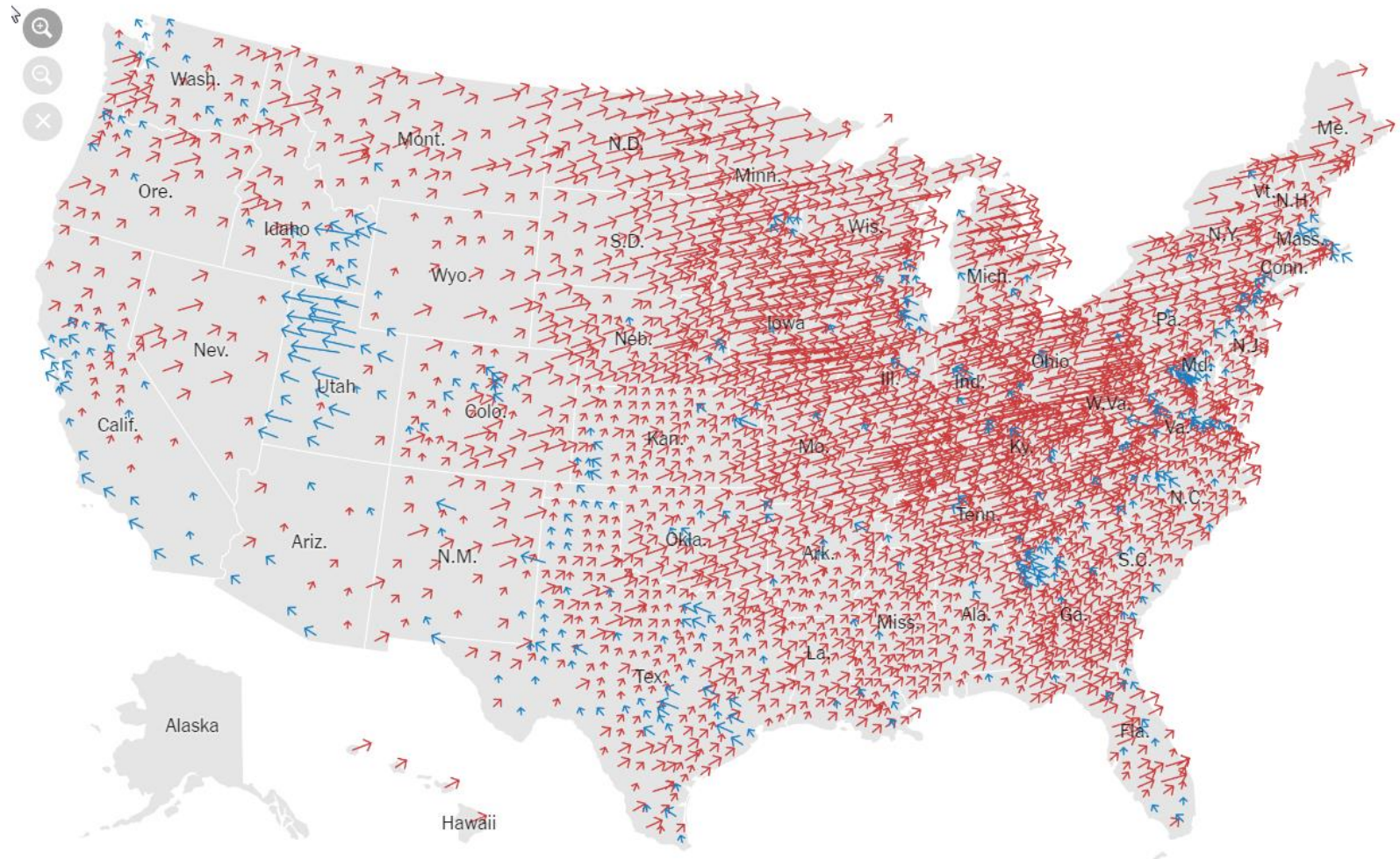
Leon Palafox

<https://leonpalafox.github.io/MLClass/>

# Group Activity



# Group Activity



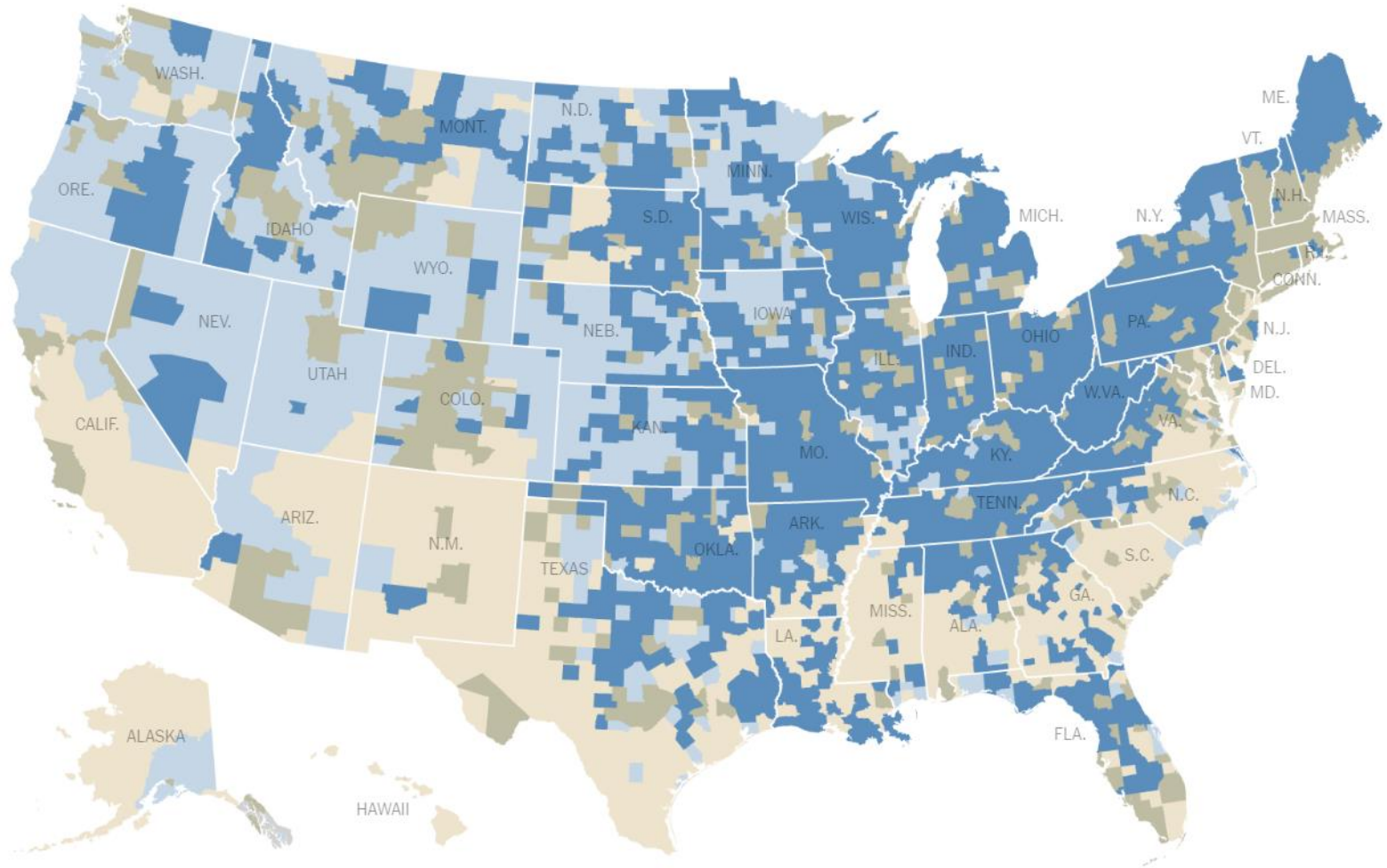


# Group Activity

## Largest voter group by county

Based on the turnout in 2012 by race and education

■ White, no college   ■ White, some college   ■ White, college degree   ■ Minority



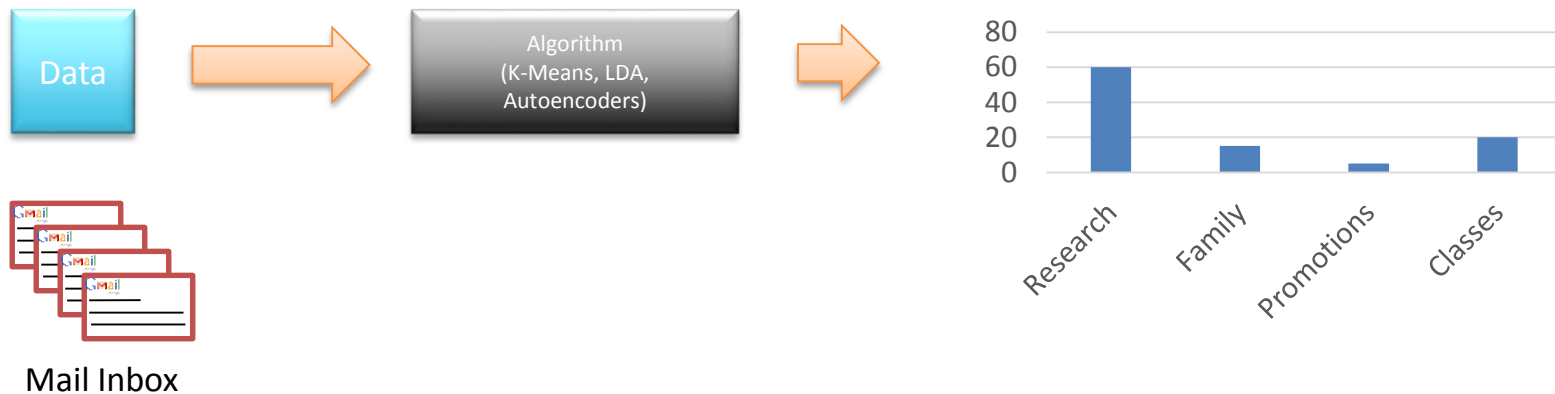
# Knowledge discovery

- We don't need labels to discover patterns.
- Data organizes itself(closeness)
- Most algorithms just figure out that organization.

# Manifolds and Data

- <http://cs.stanford.edu/people/karpathy/tsnejs/>  
L
- In a manifold data points that are close share characteristics.
- Closeness is defined based on the features
  - Pixels
  - Words
  - Data

# Unsupervised Learning



The set of elements that describe a single datum are called features, in this case, the features are the words in the e-mails.

Each topic (clusters) will have features that will characterize them.

**Research:** Mars, Proposal, DTM, HiRISE, Machine Learning, Deep Nets, Bayesian

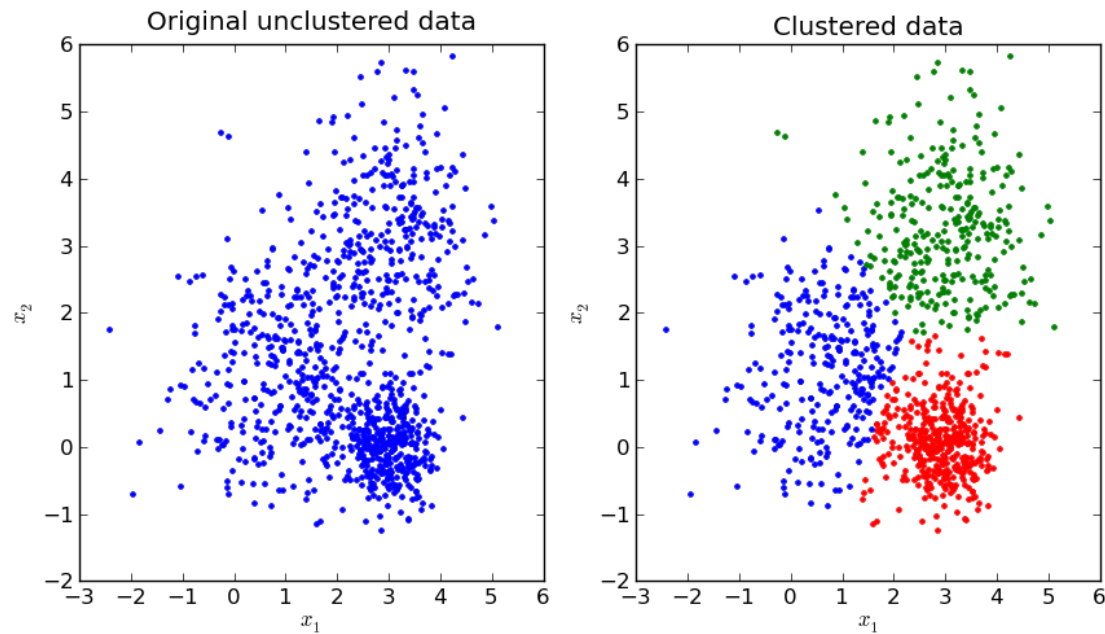
**Family:** Mom, House, Mexico

**Promotions:** Computer, PS4, Cheap, Amazon, Deal

**Classes:** Grades, Homework, Questions, Office Time

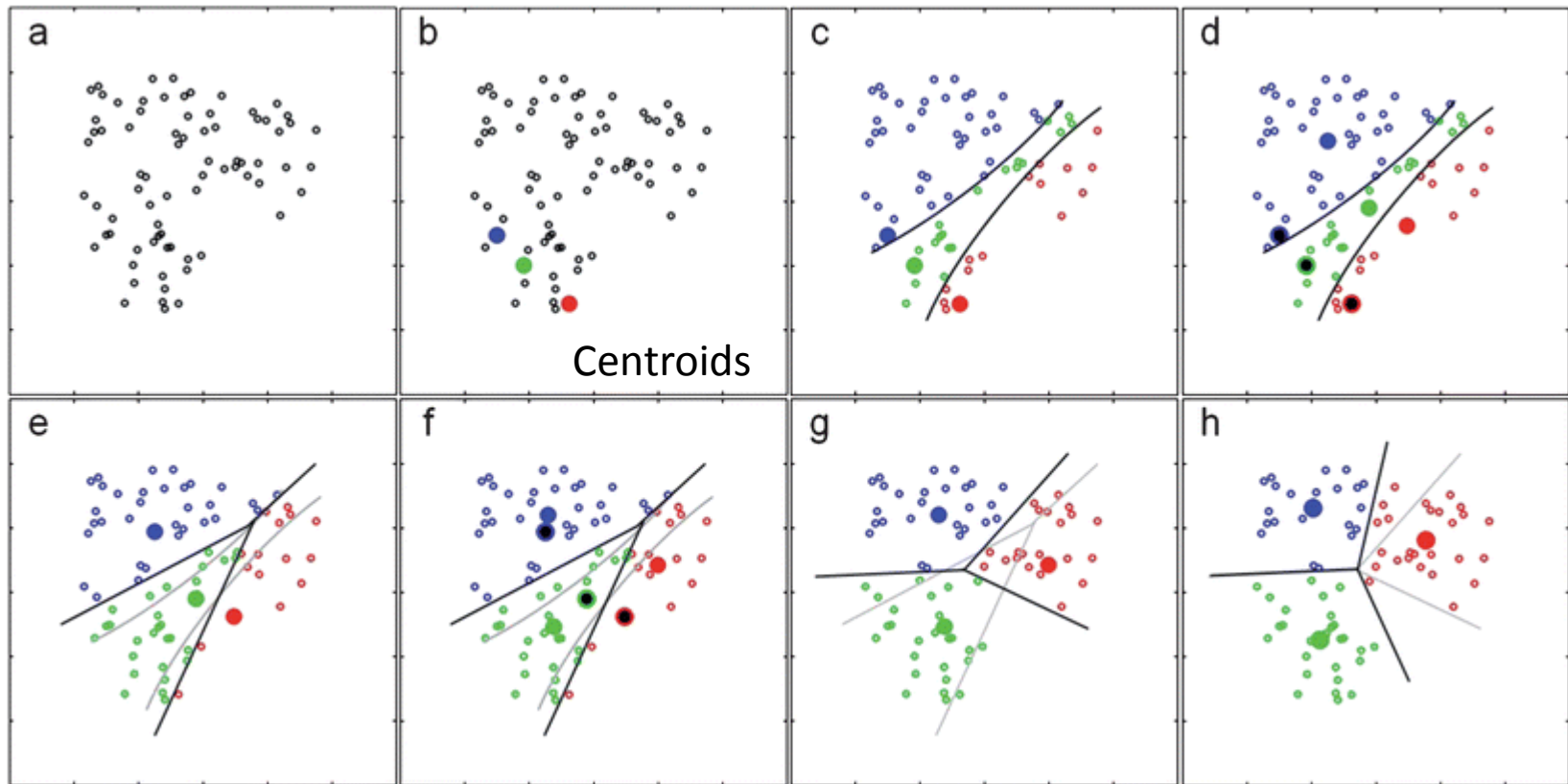
# K-Means

- <http://kluster.j38.net/>





# K-Means



# Applications to Geology



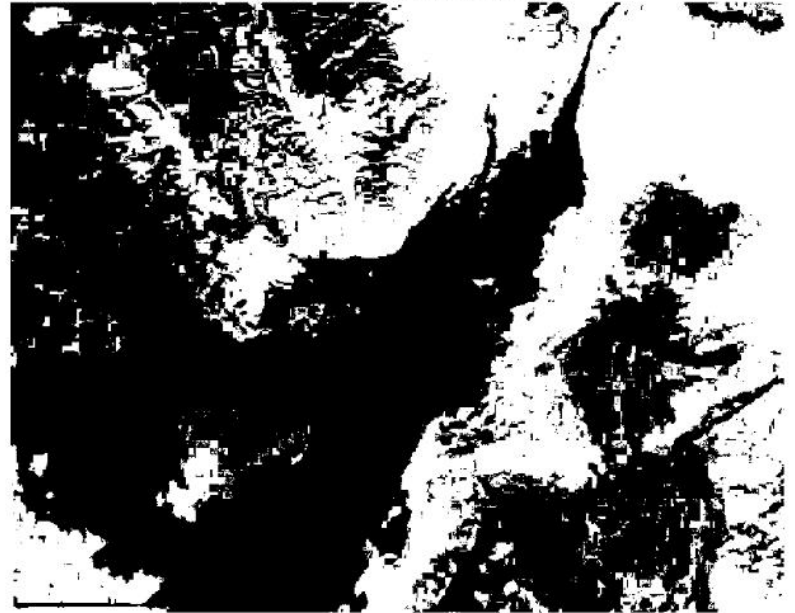
Scale Bar: 6.22 mi

# Applications to Geology

Zuni-Bandera Volcanic Field



image labeled by cluster index, 2 clusters

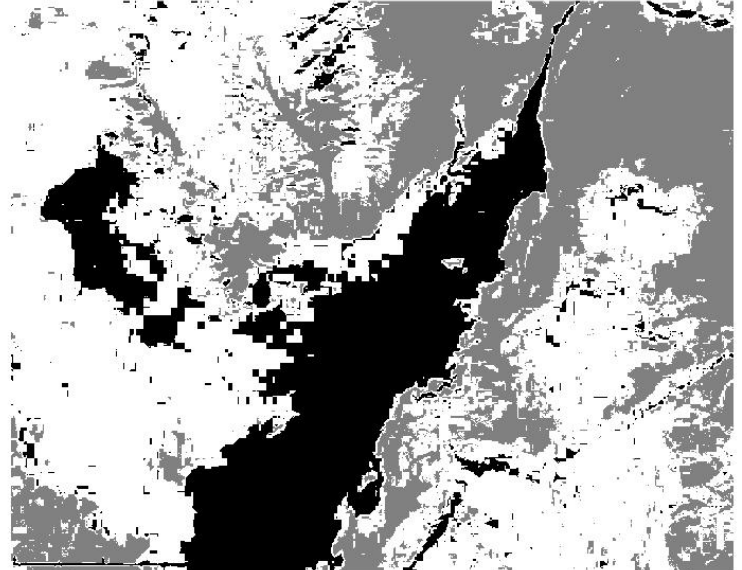


# Applications to Geology

Zuni-Bandera Volcanic Field



image labeled by cluster index, 3 clusters



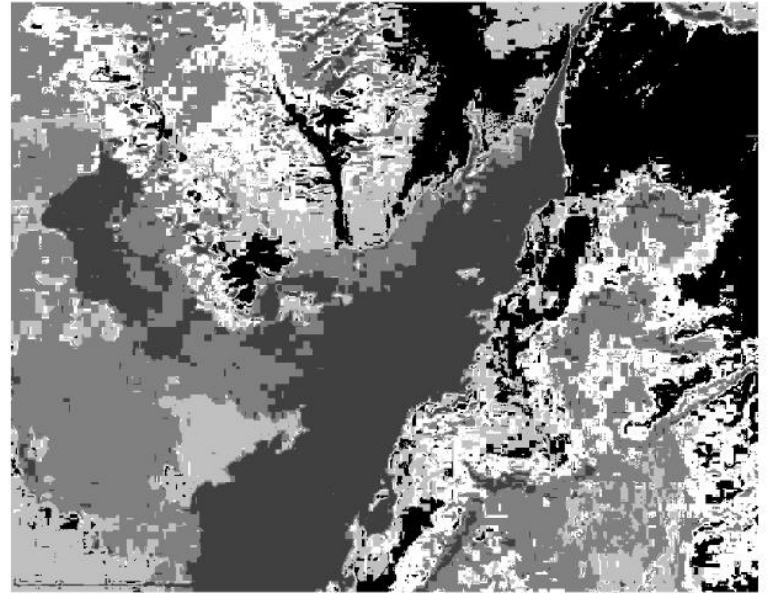


# Applications to Geology

Zuni-Bandera Volcanic Field



image labeled by cluster index, 5 clusters



# Applications to Geology

Lava Flow in Hawaii

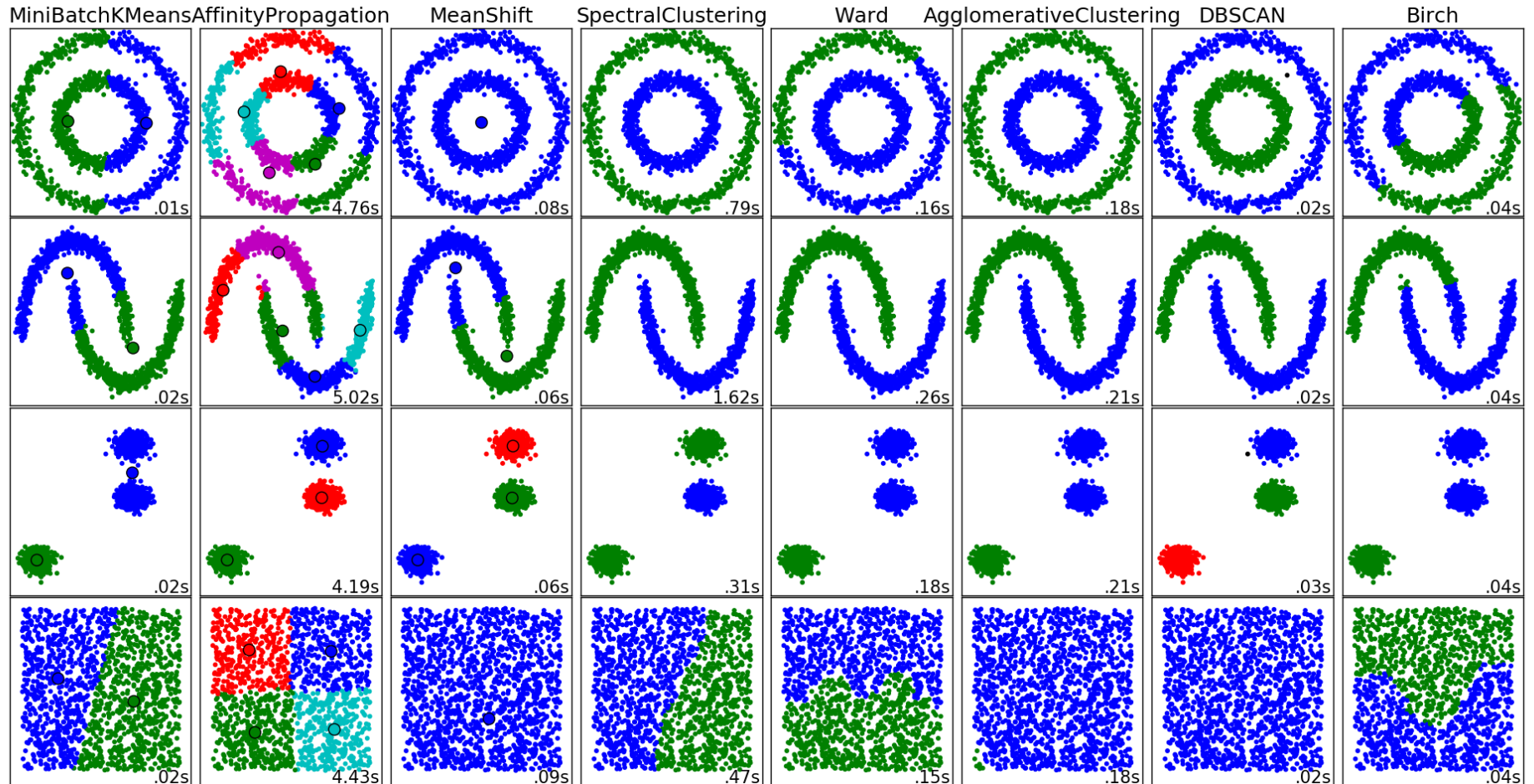


image labeled by cluster index, 4 clusters

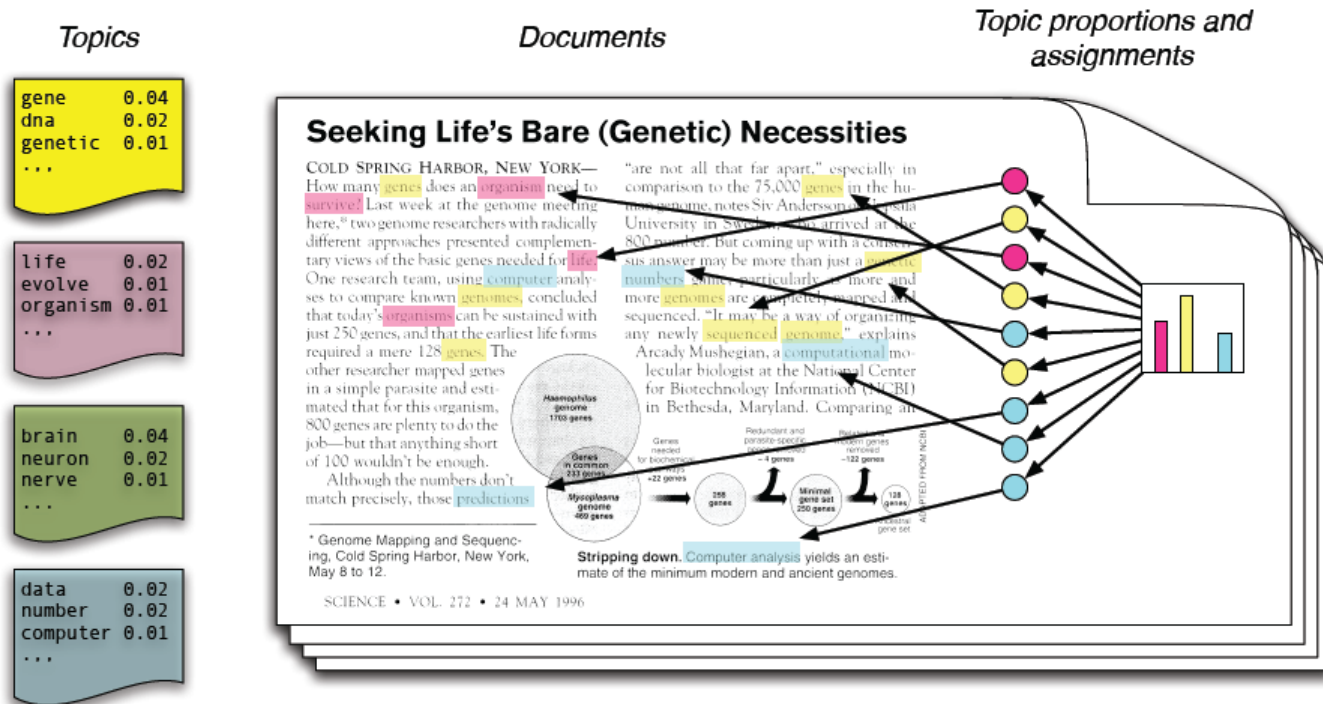




# Other Clustering Techniques



# Latent Dirichlet Allocation (LDA)

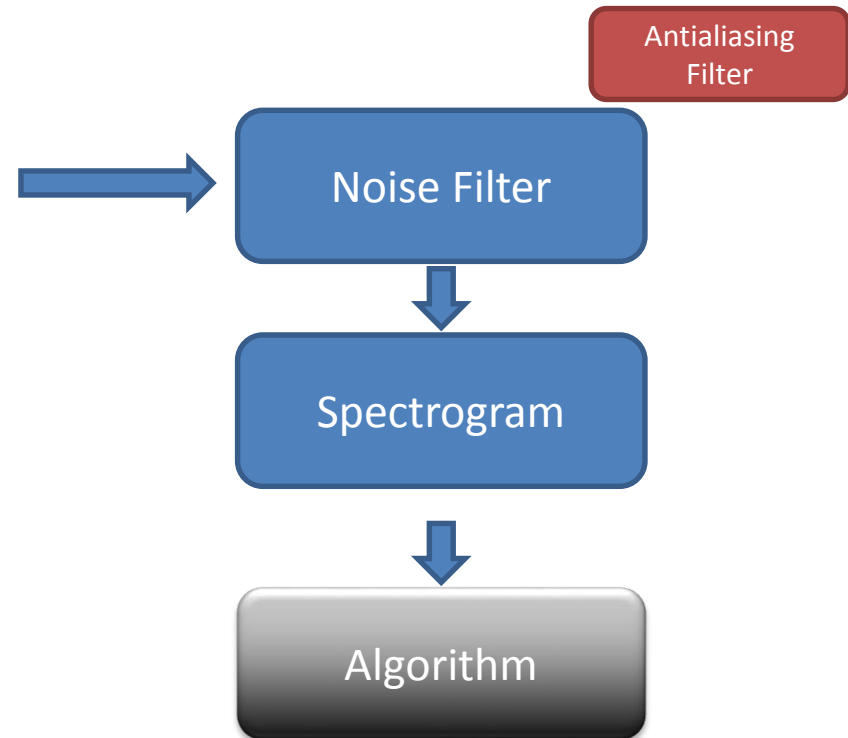
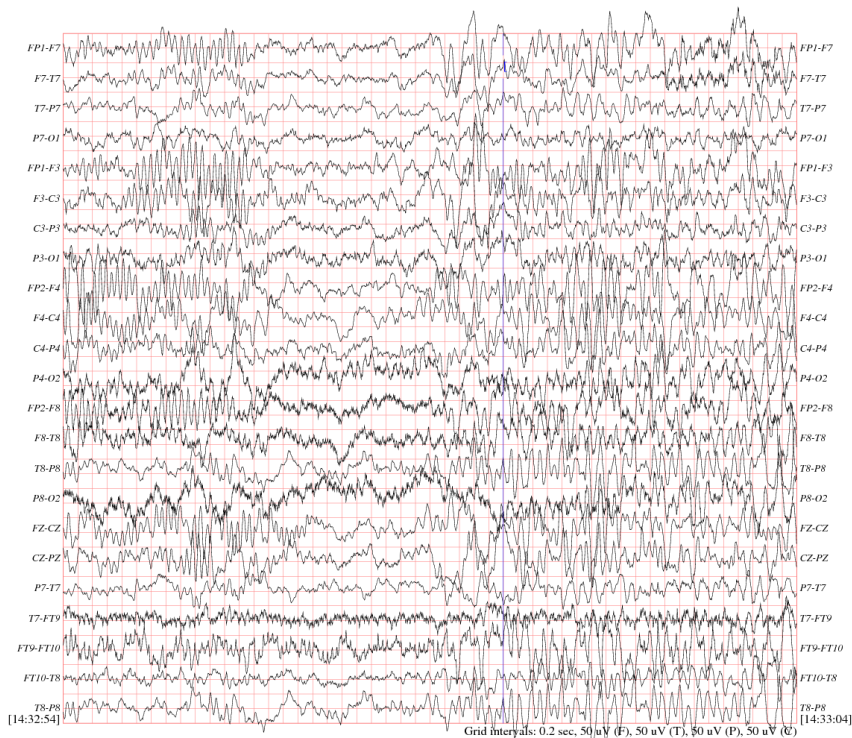


<https://www.lpl.arizona.edu/~leomp/lplpapers2014/lpl2014lda5Topics.html>

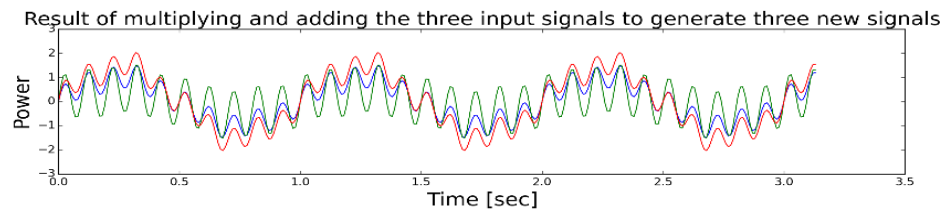
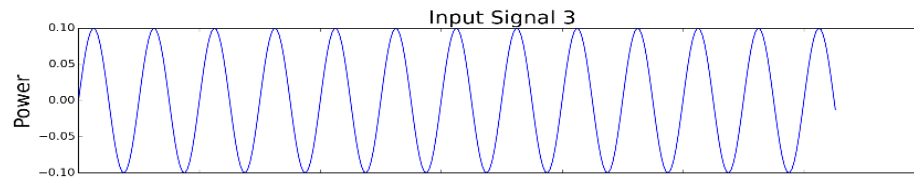
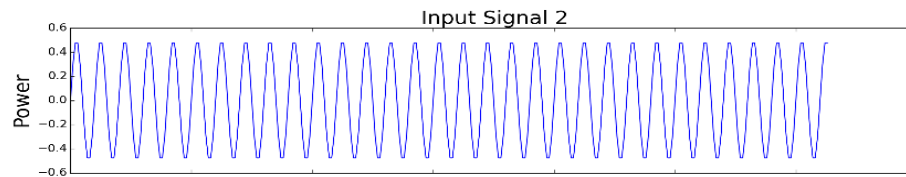
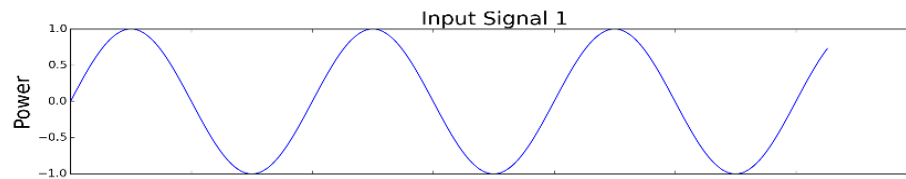
<https://www.lpl.arizona.edu/~leomp/HiRISE/HiRISELDA5Topics.html>

# Preprocessing Data

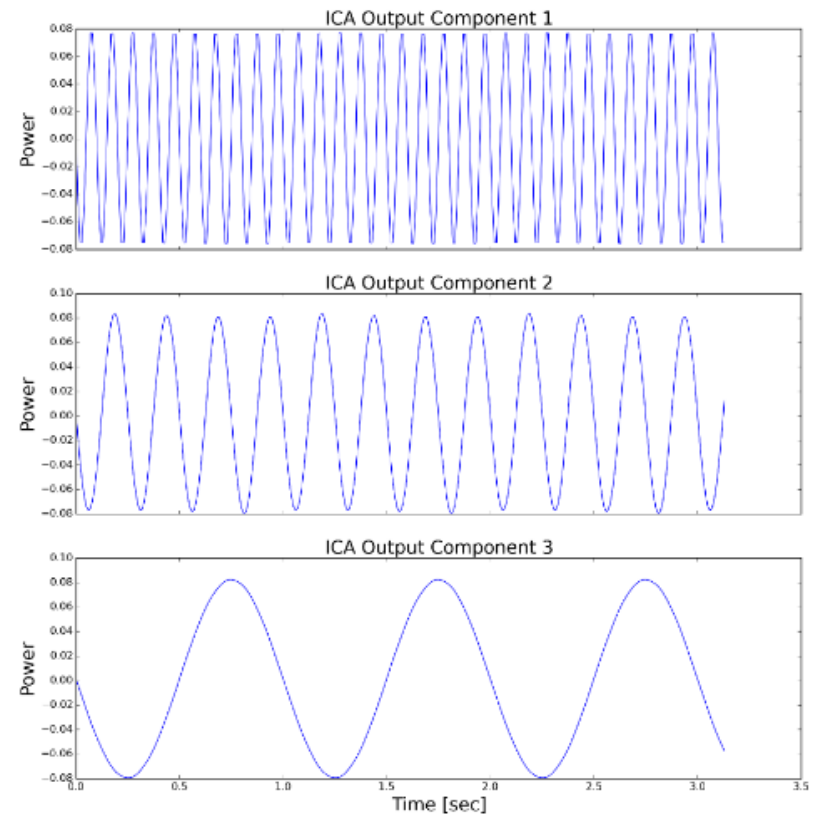
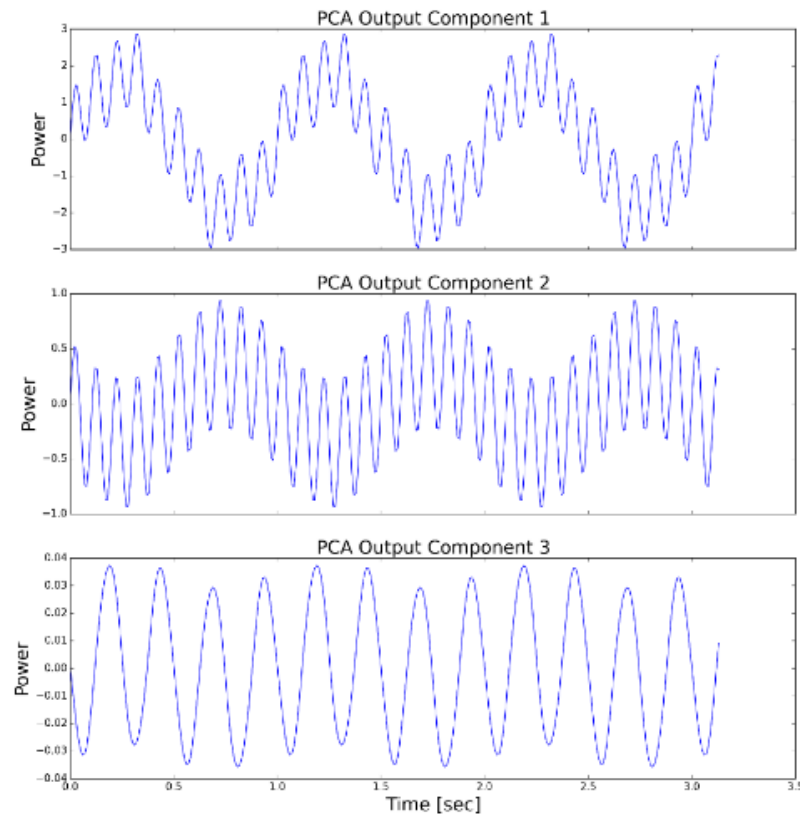
- It's a pain, but is needed



# Data Decomposition



# Data Decomposition



# Independent Component Analysis

First centered Olivetti faces



Independent components - FastICA - Train time 2.5s

