#### CMS/CS/EE 144

Networks: Structure & Economics

#### Administrivia

- 1) QUIZ TODAY
- 2) Rankmaniac is ending tomorrow!
- Rankmaniac reports due monday
   ...really, it's best to finish them as you do the project!
- 4) HW5 out on today (due in 2 weeks)
  ...short and easy. Get it done before pandemaniac!
- 5) Pandemaniac out next week ...much less "overhead" than rankmaniac
- 6) Don't forget to think about your project ideas!

### Today

Communities & Clusters:

Can you hear the shape of a network?

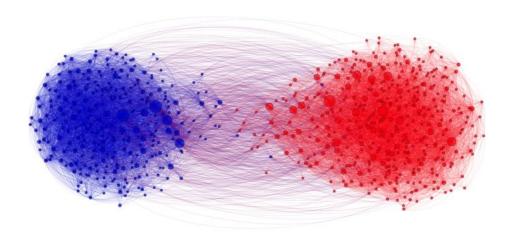
### We've danced around clustering the whole term

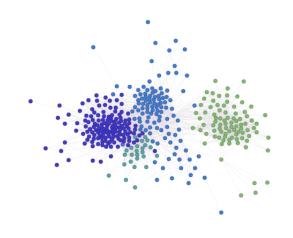
- ...it's one of our universal properties
- ...it lets you optimize pagerank computations
- ...it's crucial for information cascades
- ...it's been in lots of your blog posts

But, we still haven't given a satisfying definition of a "cluster"!

### Political blogs

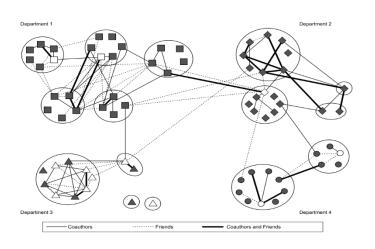
### My "ego" network on FB





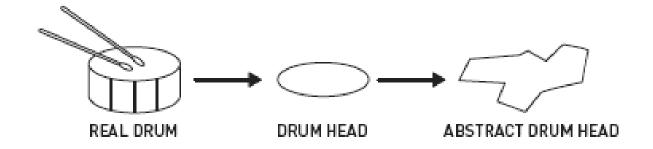
### Company org hierarchy

### Academic collaborations



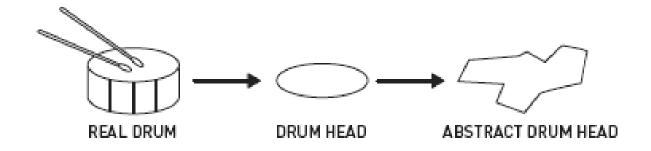
# What defines a "good" clustering, a.k.a. partitioning of a network?

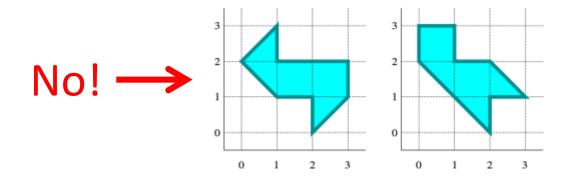
# Can you hear the shape of a drum? (Do the eigenvalues of the Laplacian uniquely determine the shape?)



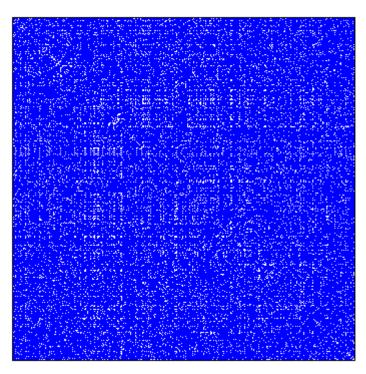
Frequencies of vibration  $\rightarrow$  eigenvalues of the Laplacian!

# Can you hear the shape of a drum? (Do the eigenvalues of the Laplacian uniquely determine the shape?)

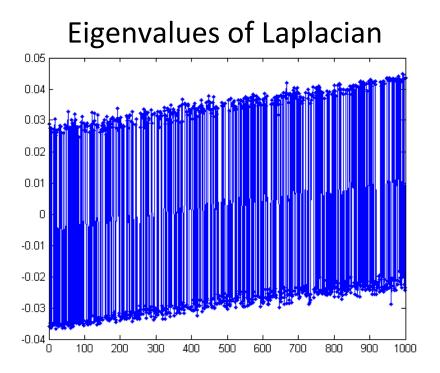




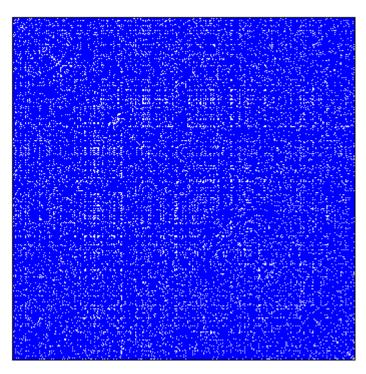
### Example:



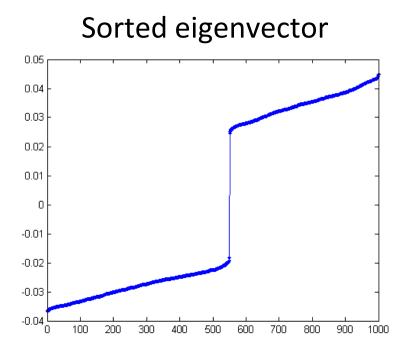
Adjacency matrix



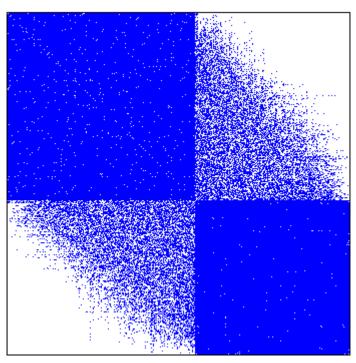
### Example:



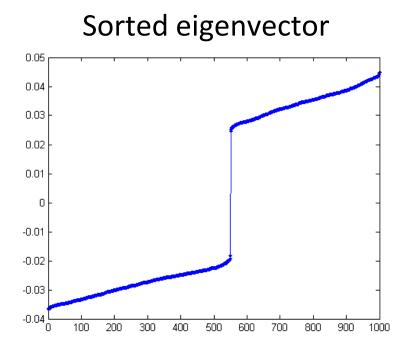
Adjacency matrix



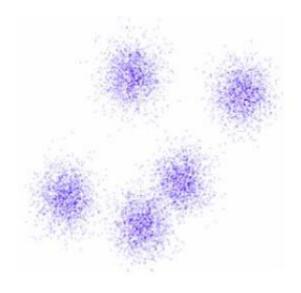
### Example:



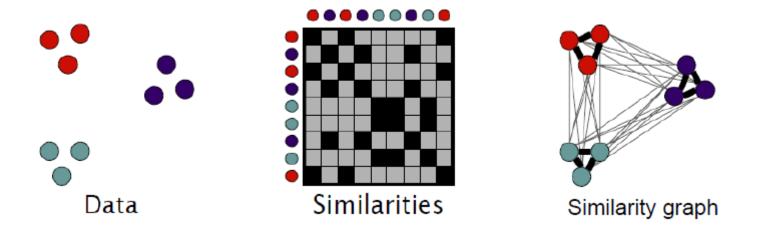
Sorted adjacency matrix



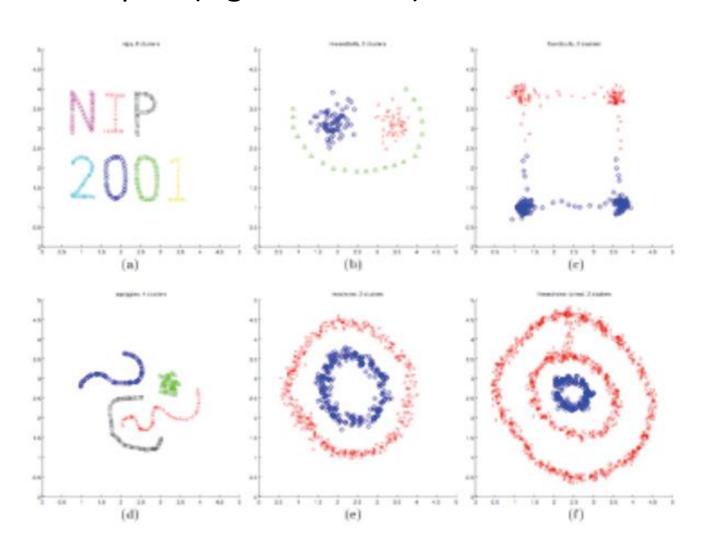
# This applies beyond graphs



### This applies beyond graphs



## Examples (Ng et al. 2001):



### Examples (Ng et al. 2001): k-means vs. spectral

