

# STAT 992 Project Proposal

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Data:

Medicare Physician and Other Supplier NPI  
Aggregate table & Physician Referral Networks

# Features of Interest

- Provider Type: Internal Medicine, Family Practice, Nurse Practitioner, Cardiology, Psychiatry...
  - Zip-codes: geographic representations
  - Medicare Payment Amount
  - Patients Characteristics: age, gender, race, disease...
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- Network representations
  - Graph Properties
  - Clustering Techniques
  - Statistical Network Models
  - Connection with Medicare data

# Exploratory Analysis

Looking for valuable problems  
for future exploration

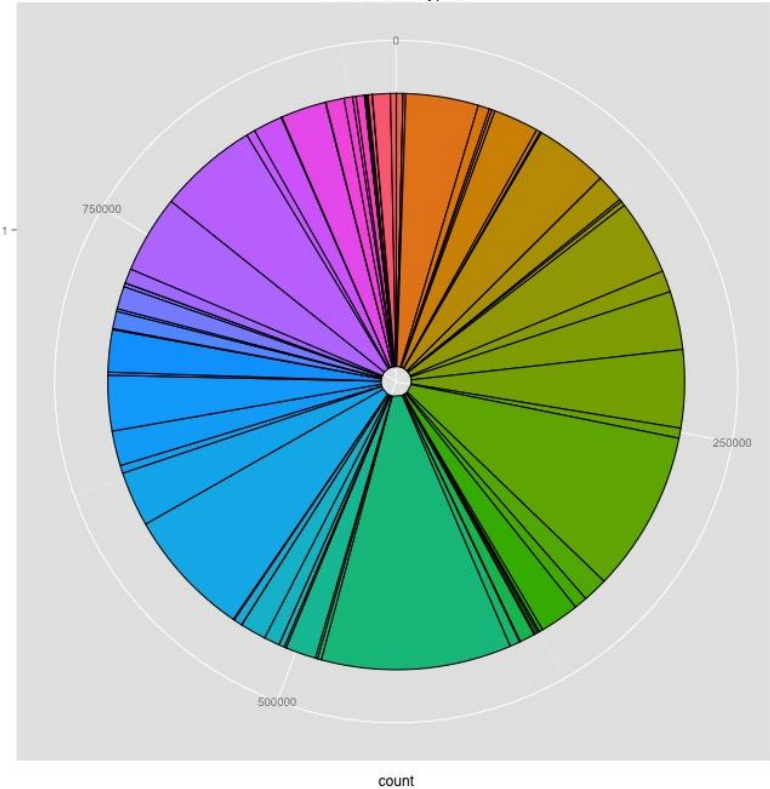
- Data Visualizations
  - Zip-code Analysis of the Network Clusters
  - Exploring Medicare Payments
  - Exploring Provider Types
-

# Top 10 highest Medicare Payment Provider Type

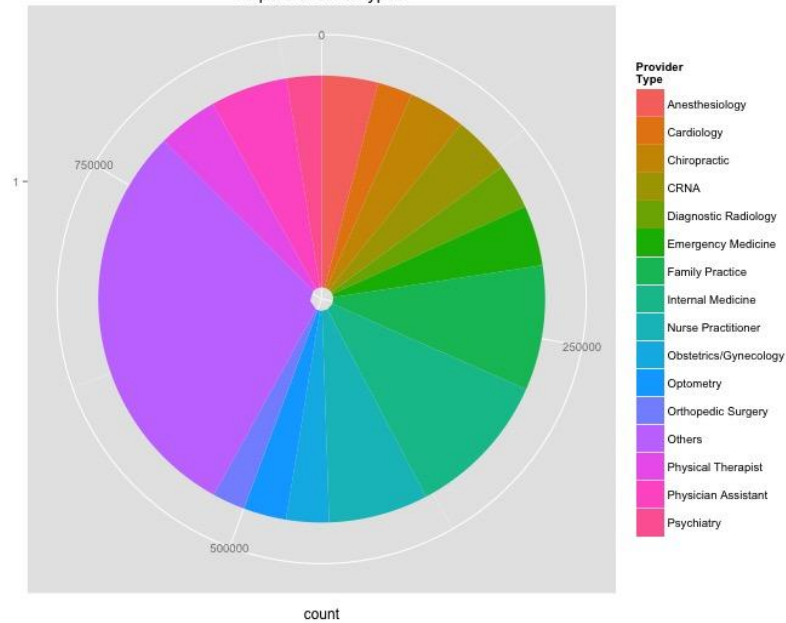
Cardiology	Ambulance Service Supplier	Cardiac Electrophysiology	Cardiac Surgery	Allergy/Immunology
219019.644	209516.273	200051.820	171564.990	63490.806
Addiction Medicine	Anesthesiology	All Other Suppliers	Anesthesiologist Assistants	Audiologist (billing independently)
50167.914	44109.187	18207.955	14645.075	7708.904

- 84 Different Provider Types
- Select top 15 most common types which accounts for almost 75% of all

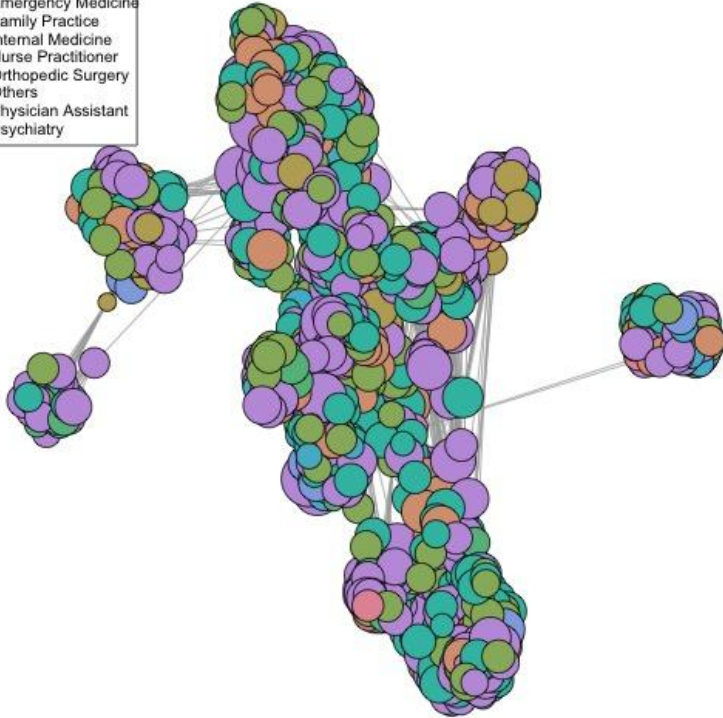
All Provider types



Top 15 & Other types



## Wisconsin(Core>10)

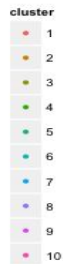
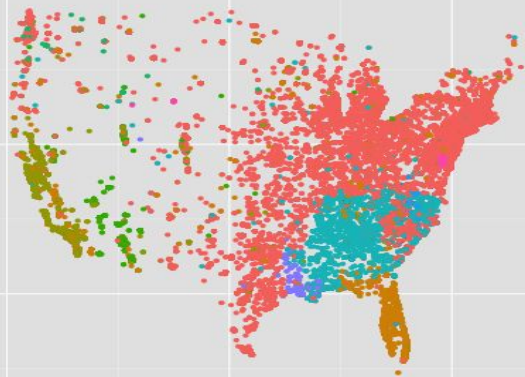


- Vertex size proportional to its Medicare Payment Amount
- Payment of family practice varies drastically

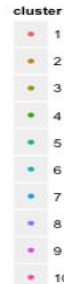
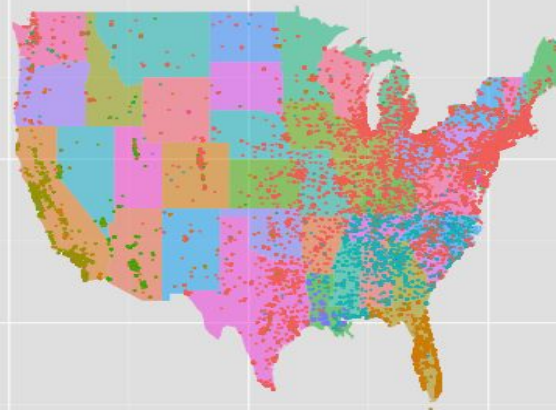


What do clusters look like  
geographically?





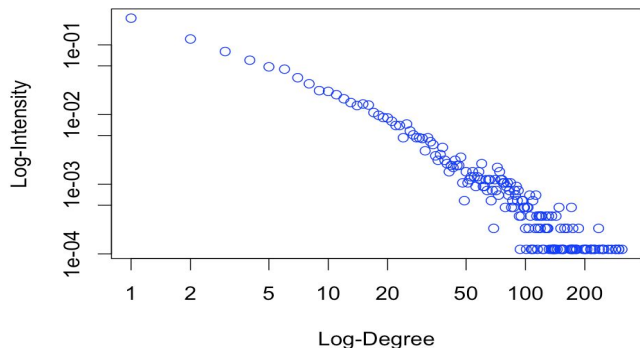
Observations in same cluster tend to locate geographically closer to each other.



"0.0001"  
· 0.0001

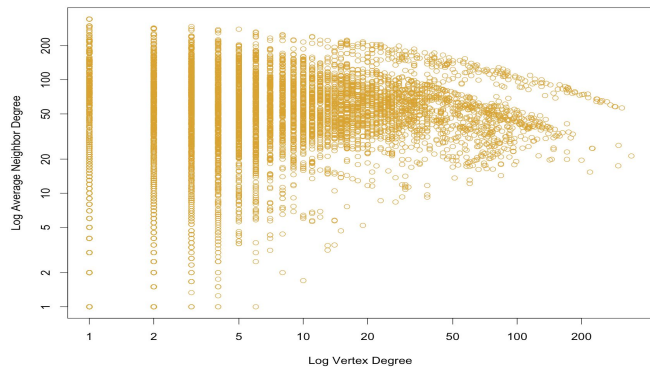
# Graph property: degree (Wisconsin as an example)

Log-Log Degree Distribution



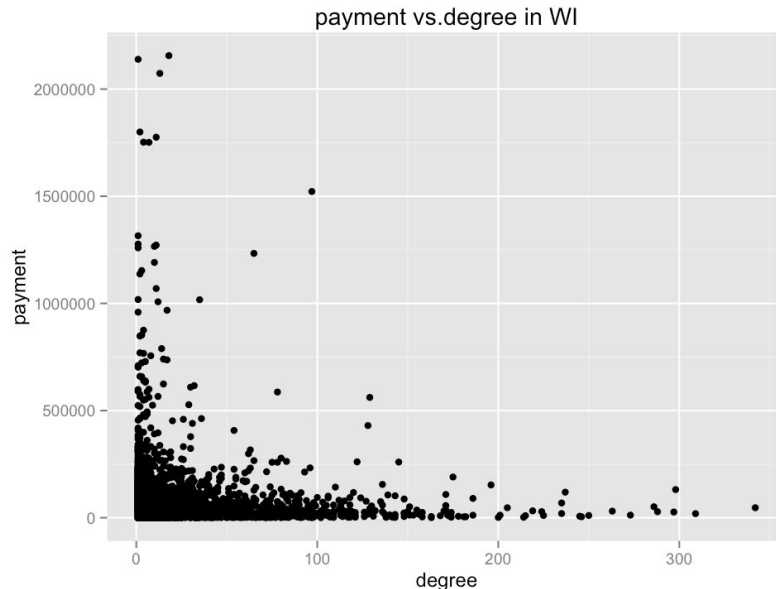
Fairly linear decay

Average neighbor degree versus vertex degree (log-log scale)



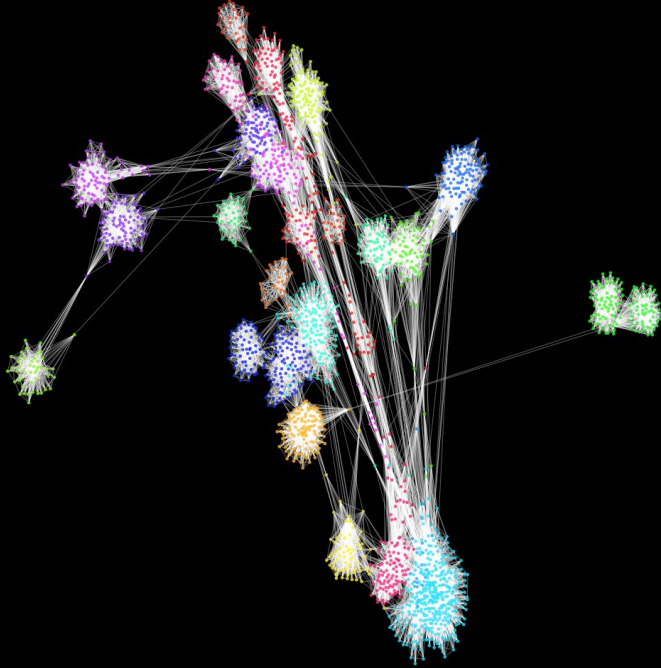
Vertices: higher degrees link with similar, lower degree link with both

Relationship with Total Medicare Payment Amount

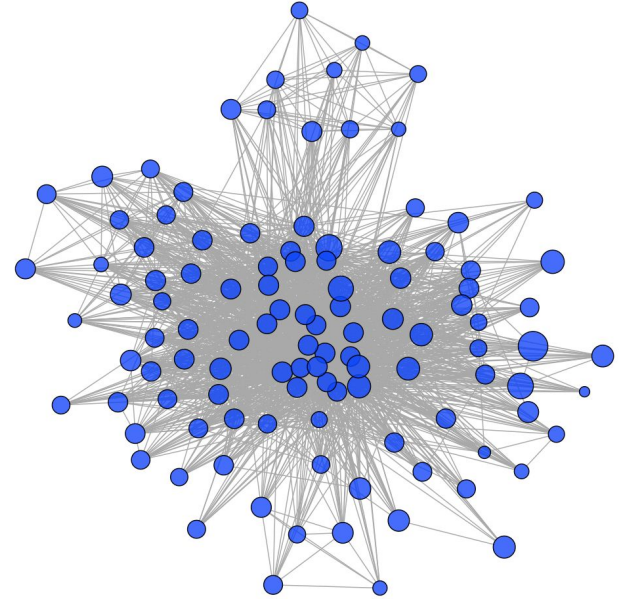


# Spectral Clustering

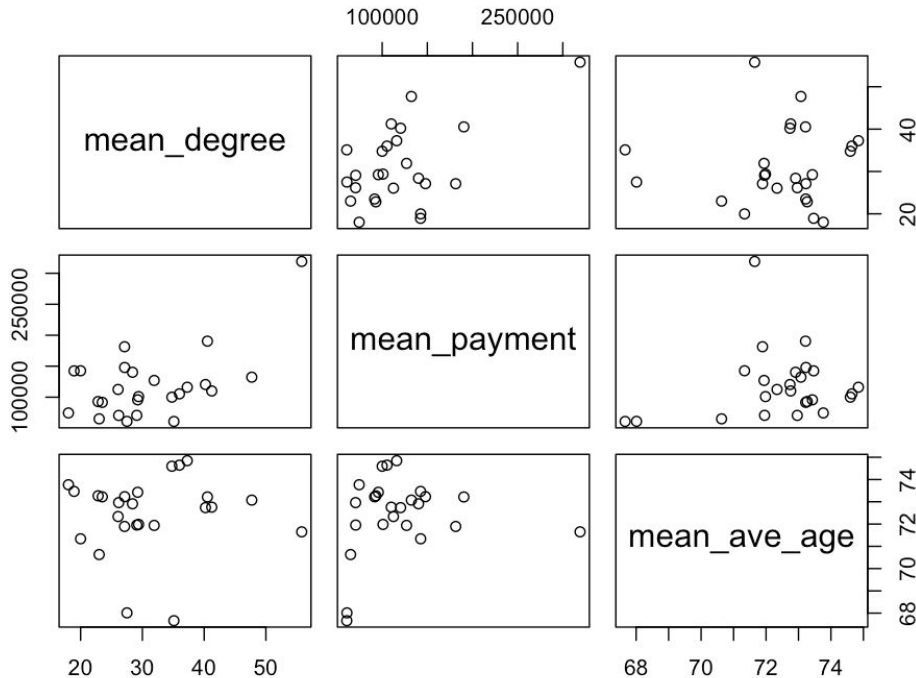
*Spectral Cluster within WI*



**Graph of one cluster within WI**



# Obtain summary measures of the networks in each cluster



y:mean_payment	Estimate	P-value
x:mean_degree	3223	0.00571

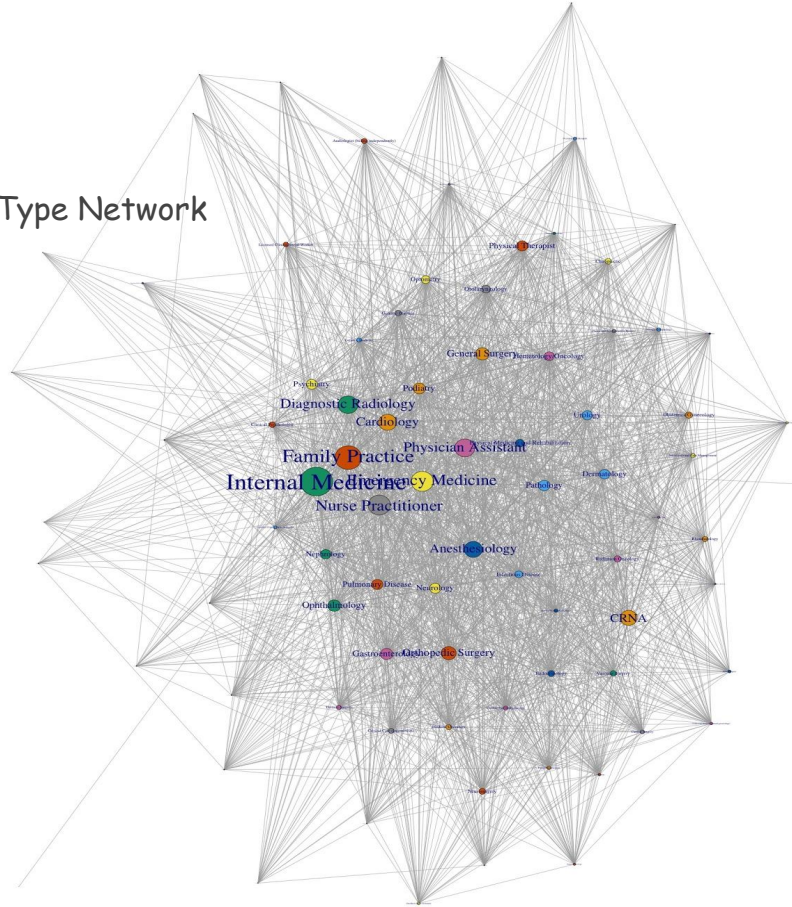
In the future:  
Larger area  
More variables  
Control provider type



# Visualizing the National Referral Network

Based on the Provider Type of Physicians

## Provider Type Network



- Our Goal: Clustering and Modelling
- The plot is quite busy. How could it be improved?
  - Ongoing: Weighted Edges
  - Cutting Thin Edges
  - Removing Unimportant Vertices

# By the end of the project, you may see...

- Better Visualizations
- Geographical Representation of Clusters
- Statistical Inference for Clusters
- Further Studies on Medicare Payments and Provider Types
- ... ..

