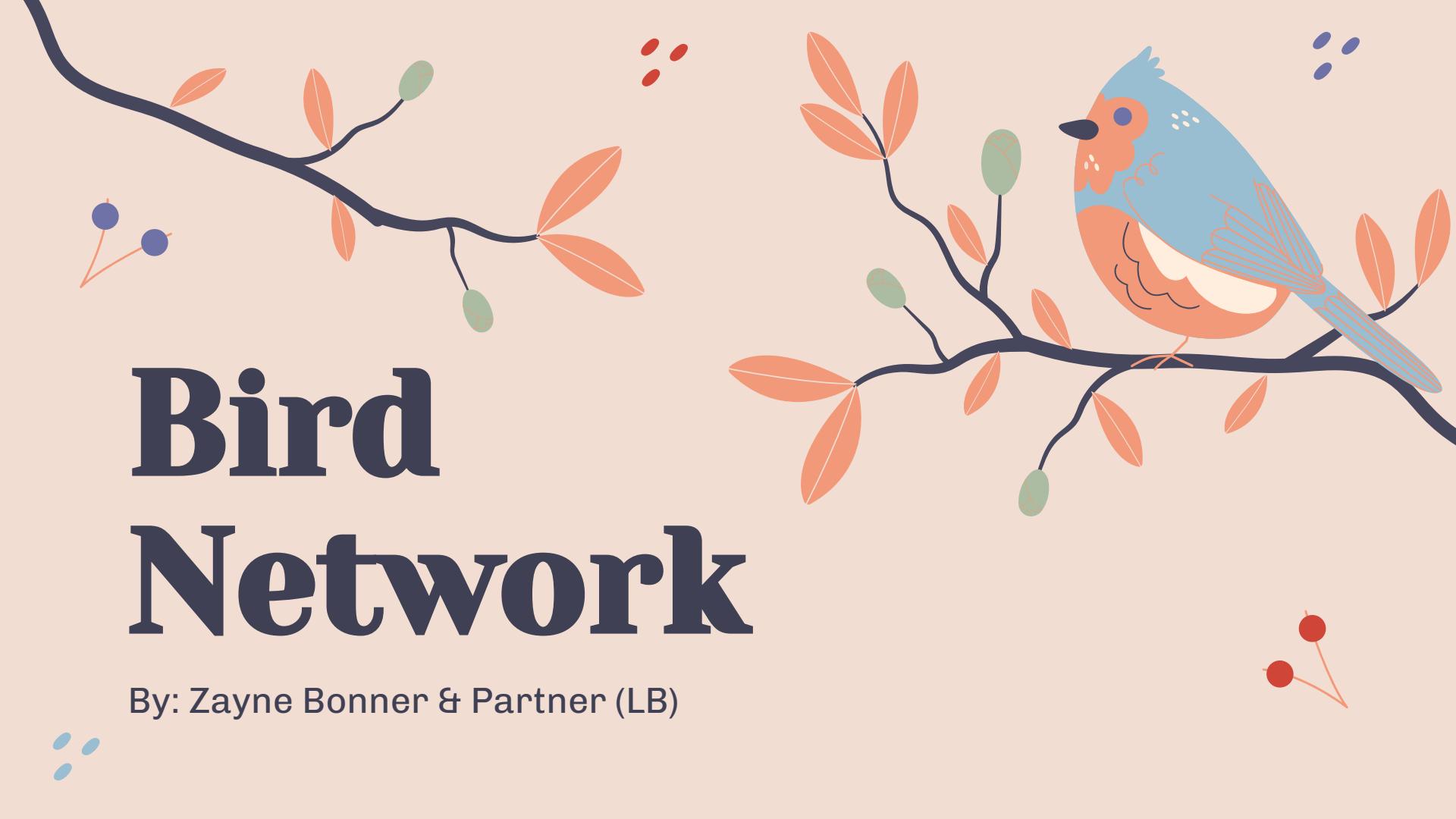


# Bird Network

By: Zayne Bonner & Partner (LB)





Here's a  
Little  
Refresher



# Our Subnetwork

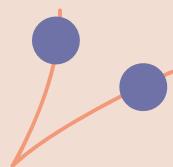
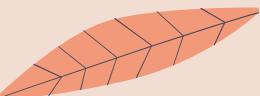
Birds that live in:

- Habitat: Open Ocean
- Region: All

108 Total Birds

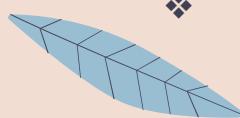
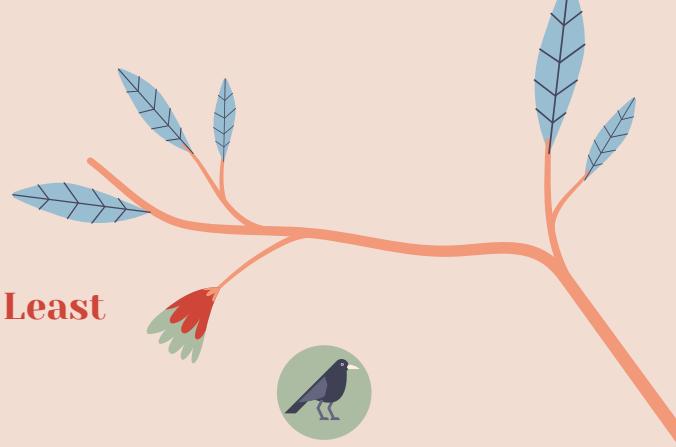
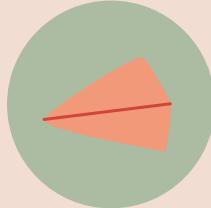
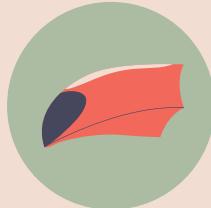
Nodes: Bird Species

Weighted Edges: Shared Traits



# Analyzed Traits

- ❖ **Conservation Status**
  - Endangered, Vulnerable, Near Threatened, and Least Concern
- ❖ Size
- ❖ Main Color
- ❖ Behavior
- ❖ Beak
- ❖ Feet
- ❖ Call Pattern
- ❖ Call Type
- ❖ Tail
- ❖ Wings
- ❖ Legs
- ❖ Flock



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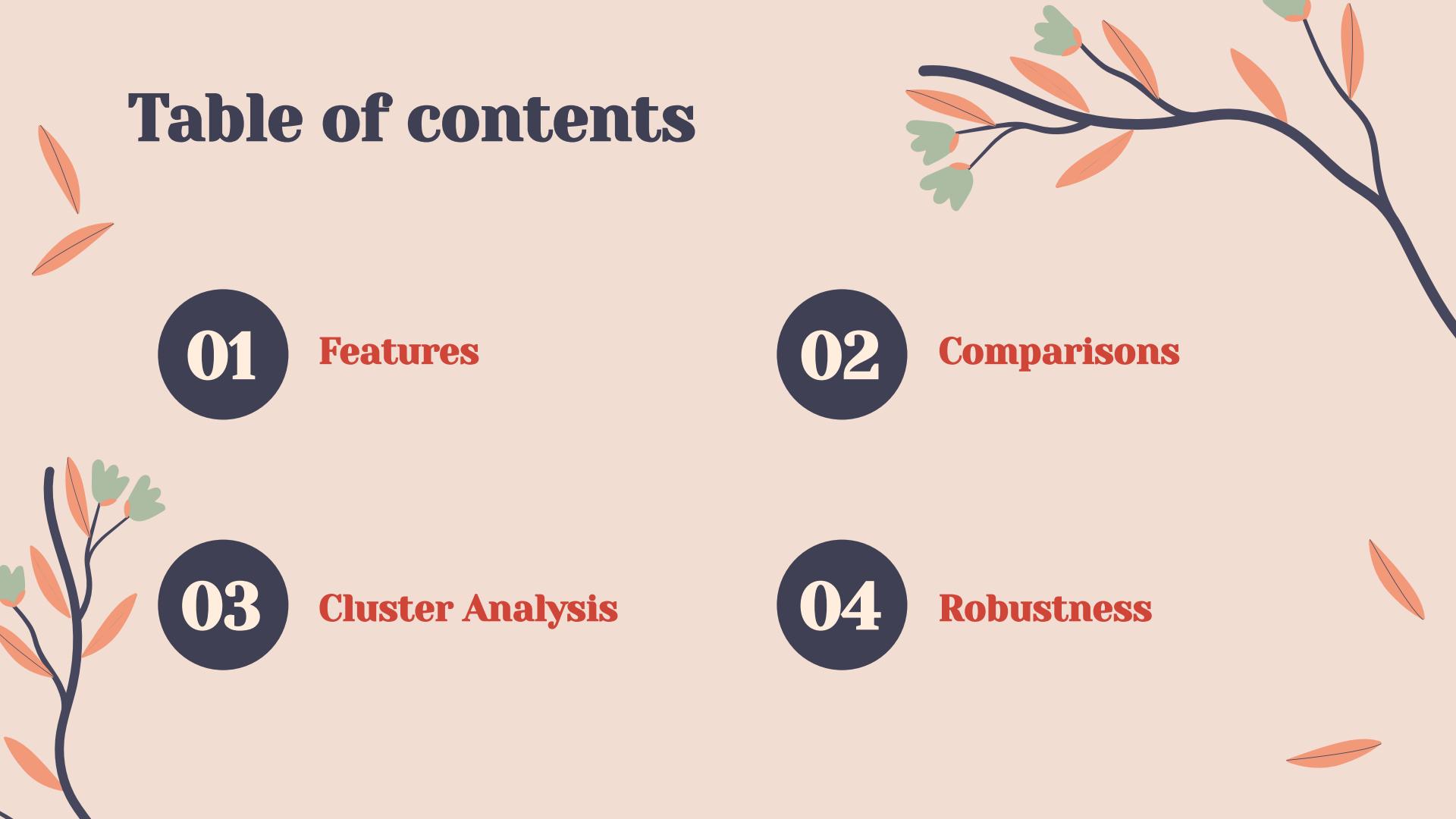
Comparisons

03

Cluster Analysis

04

Robustness





01

## Features

# Network Features



Average Degree: 29.741

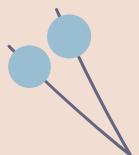
Average Weighted Degree: 404.778



Network Diameter: 4



Graph Density: 0.278



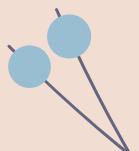
# Network Features



**Modularity: 0.263**

Resolution: 0.75

New Modularity: 0.144



**Average Clustering Coefficient: 0.609**



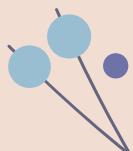
**Average Path Length:  
1.824**



# Betweenness Centrality

## Top 5 Birds:

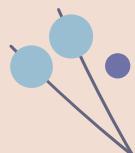
- Red Phalarope
  - Least Concern
- Pink-Footed Shearwater
  - Vulnerable
- White-tailed Tropicbird
  - Least Concern
- Cory's Shearwater
  - Least Concern
- Great Shearwater
  - Least Concern



# Closeness Centrality

## Top 5 Birds:

- Pink-footed Shearwater
  - Vulnerable
- Red Phalarope
  - Least Concern
- Steller's Eider
  - Vulnerable
- Leach's Storm-Petrel
  - Vulnerable
- Cory's Shearwater
  - Least Concern



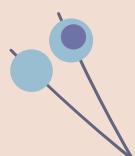
# Degree Centrality

## Top 5 Birds:

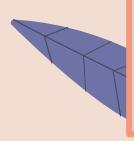
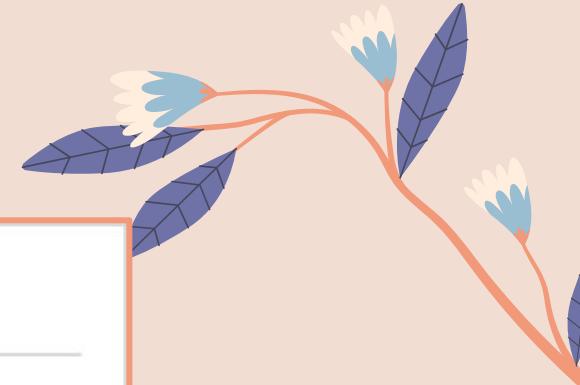
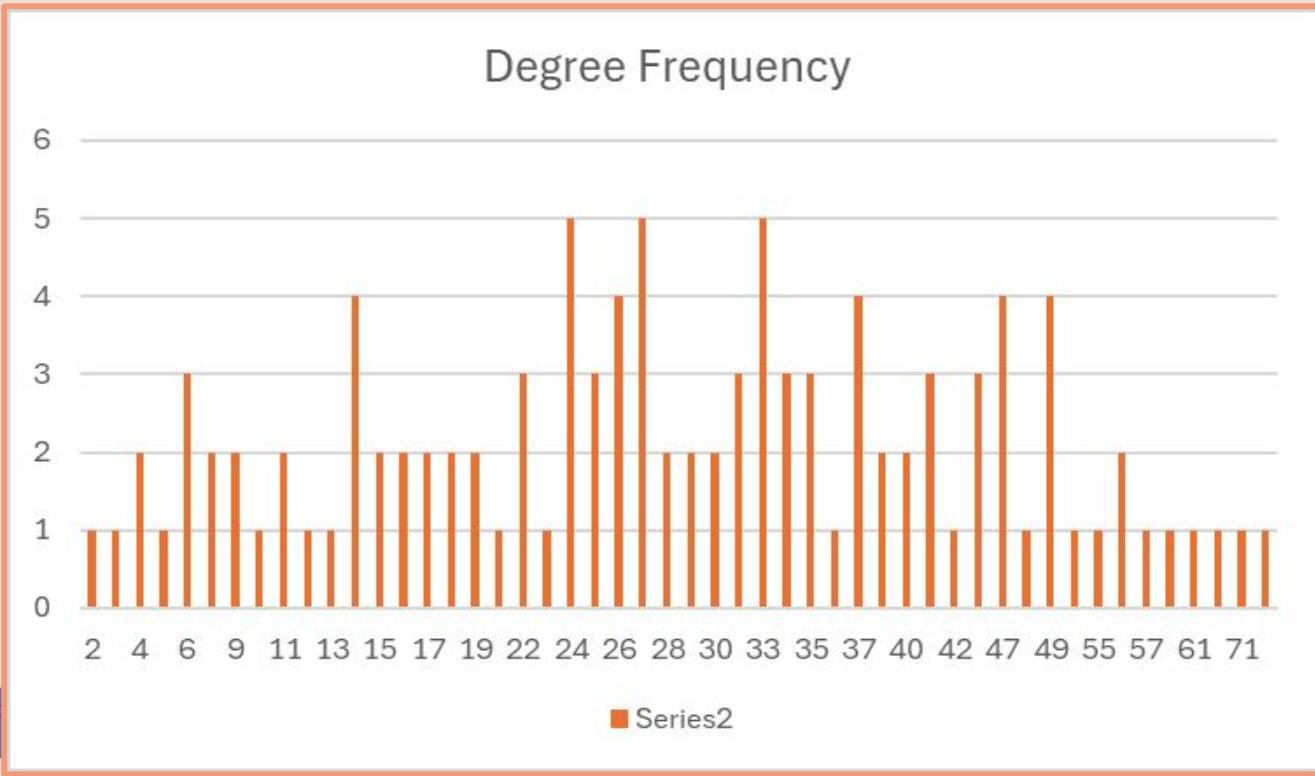
- Pink-footed Shearwater
  - Vulnerable
- Red Phalarope
  - Least Concern
- Steller's Eider
  - Vulnerable
- Leach's Storm-Petrel
  - Vulnerable
- Cory's Shearwater
  - Least Concern



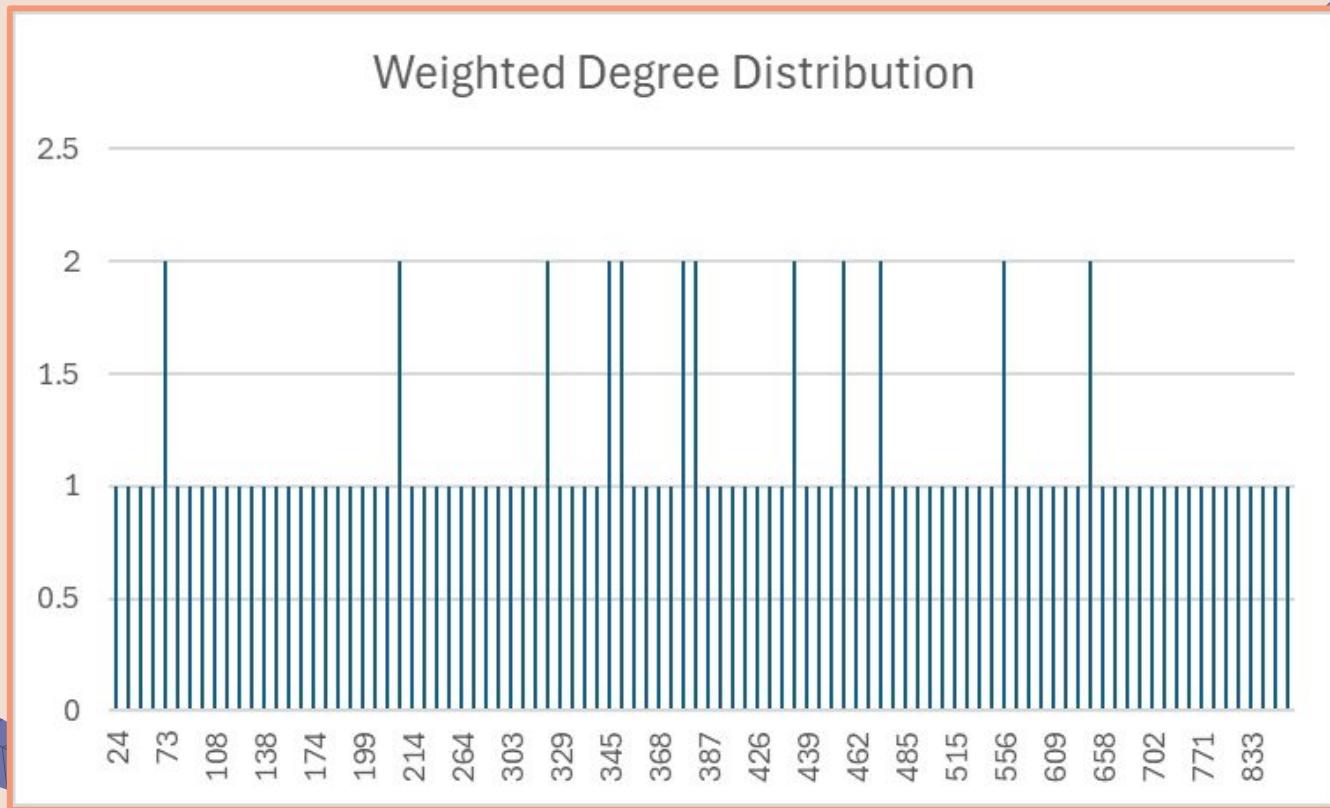
*Pink-footed Shearwater*



# Degree Frequency Chart



# Weighted Degree Frequency Chart

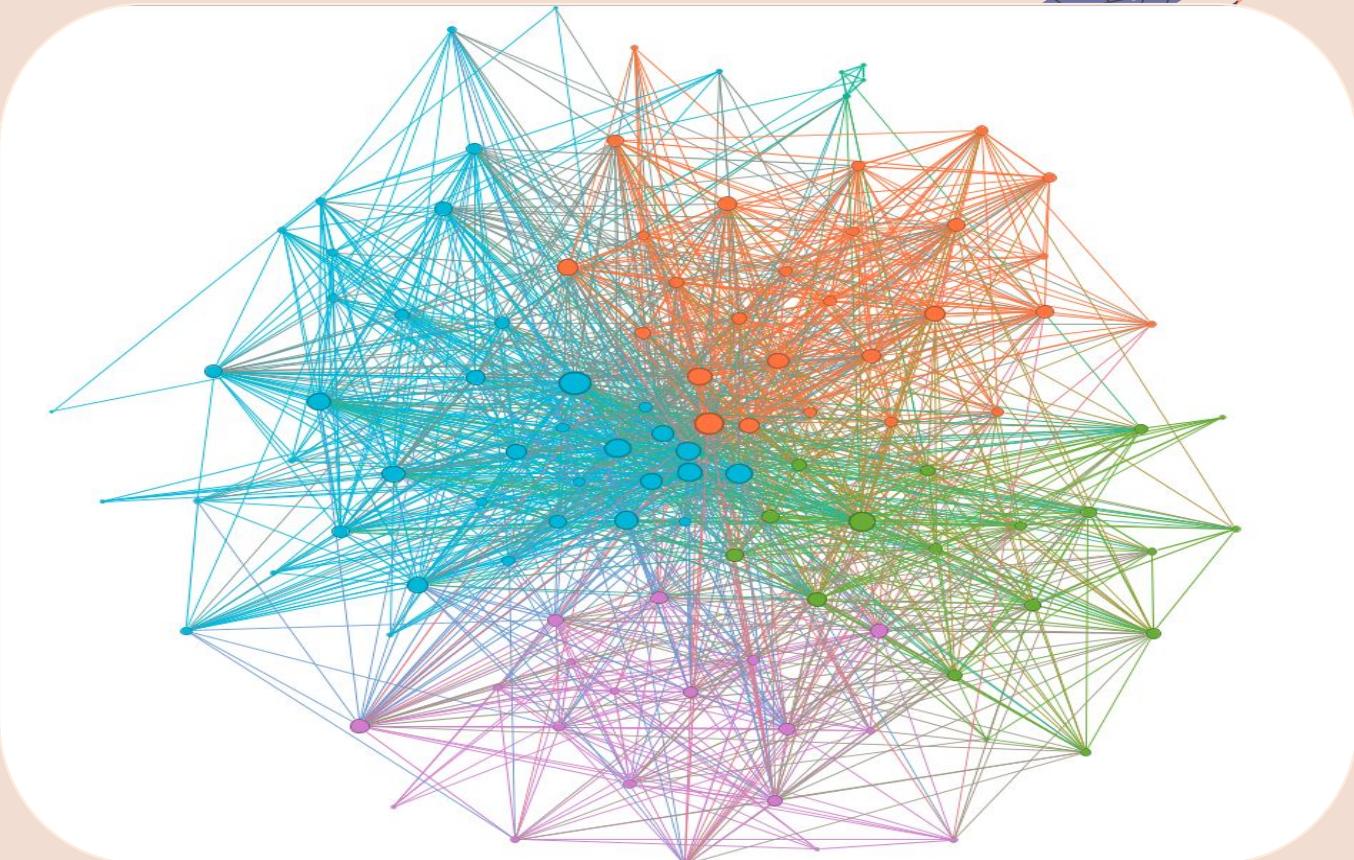




# 02

## Comparison s

# Our Network

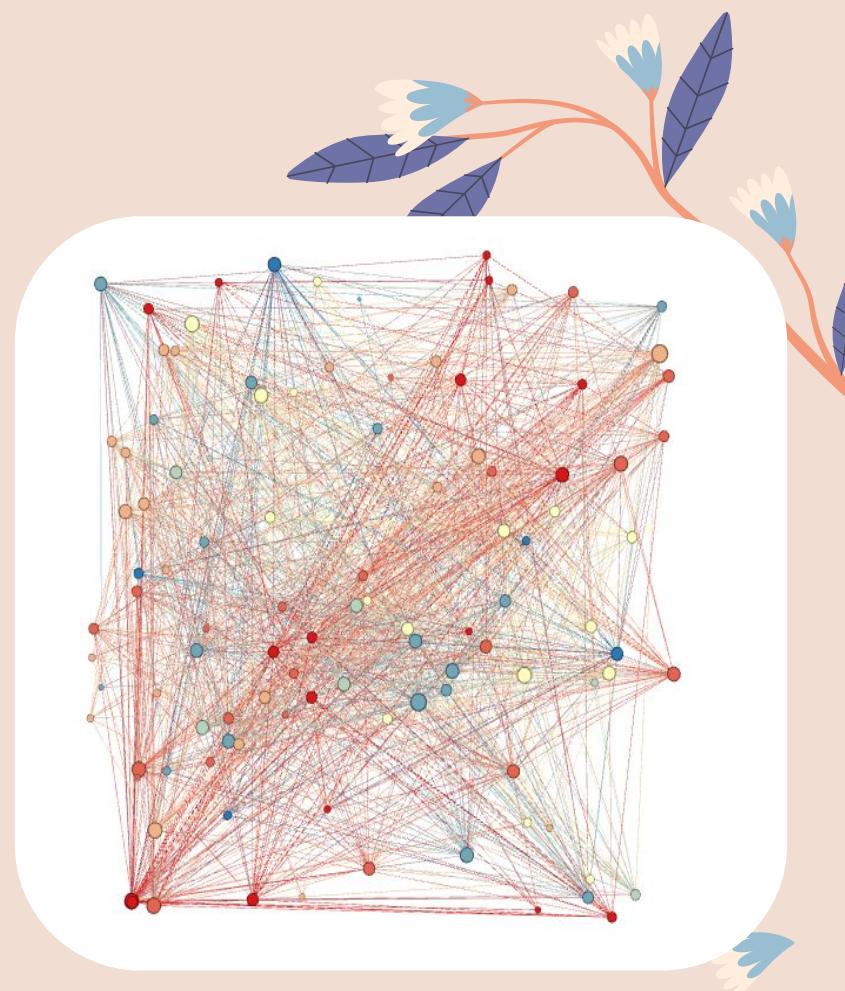


# Configuration Model

Density: 0.226

Average Clustering Coefficient: 0.313

Average Shortest Path: 1.828

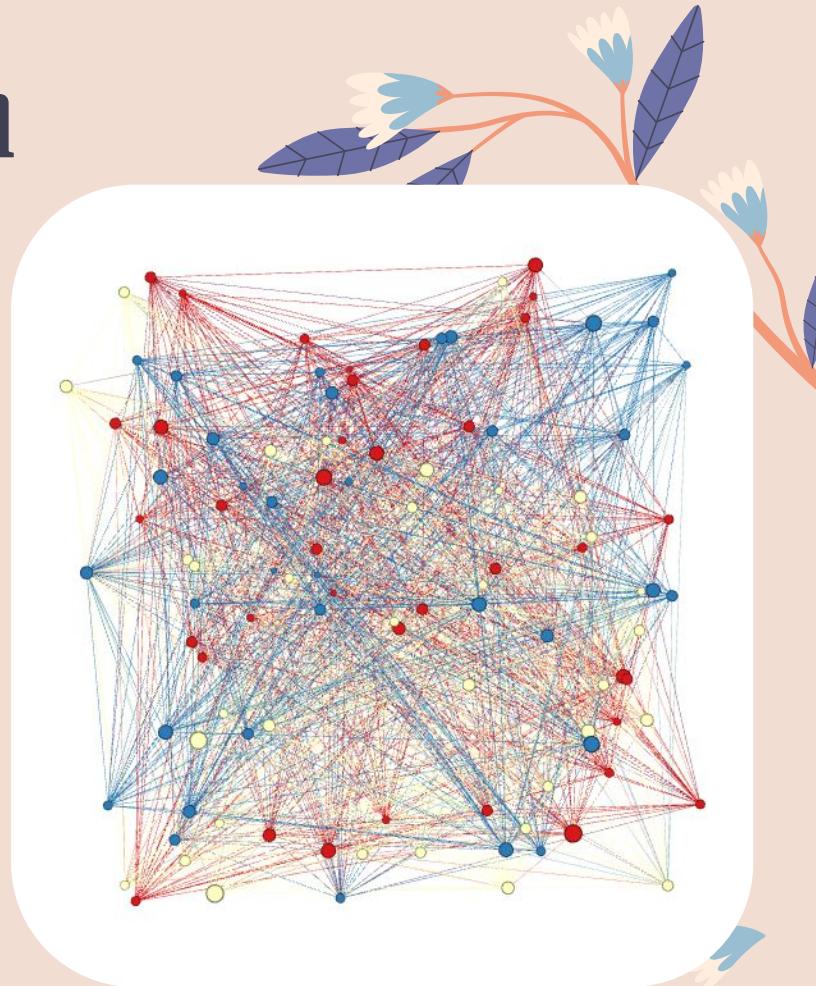


# Watts–Strogatz Model

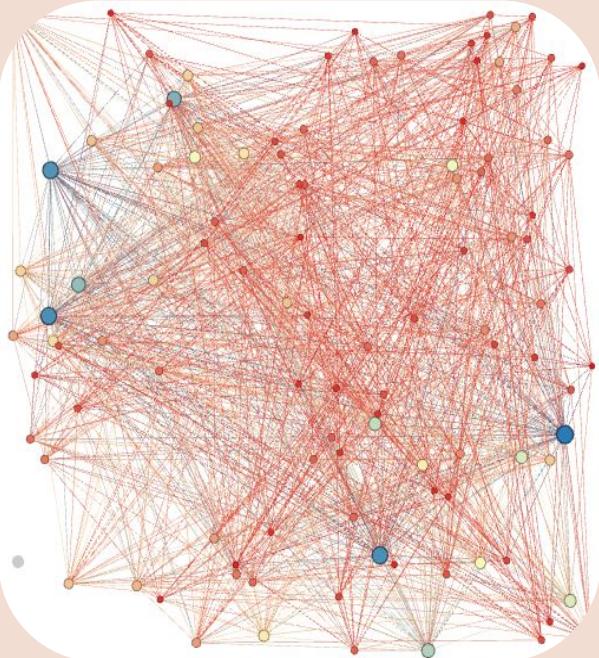
Density: 0.262

Average Clustering Coefficient: 0.550

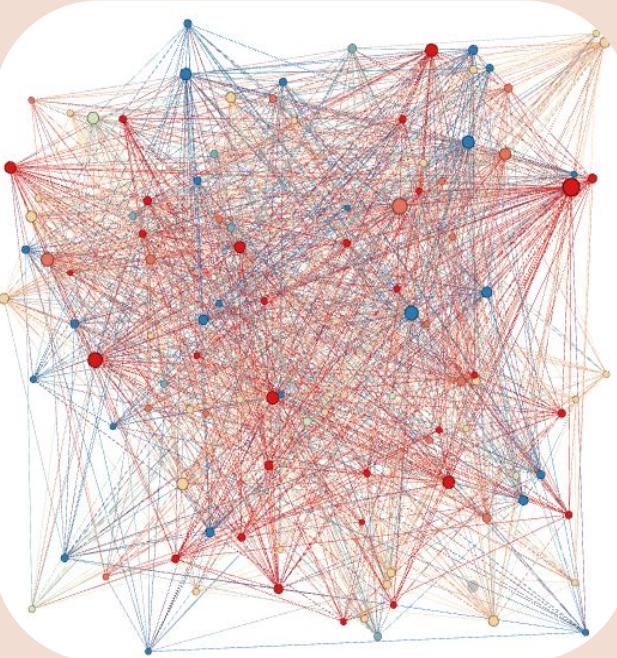
Average Shortest Path: 1.801



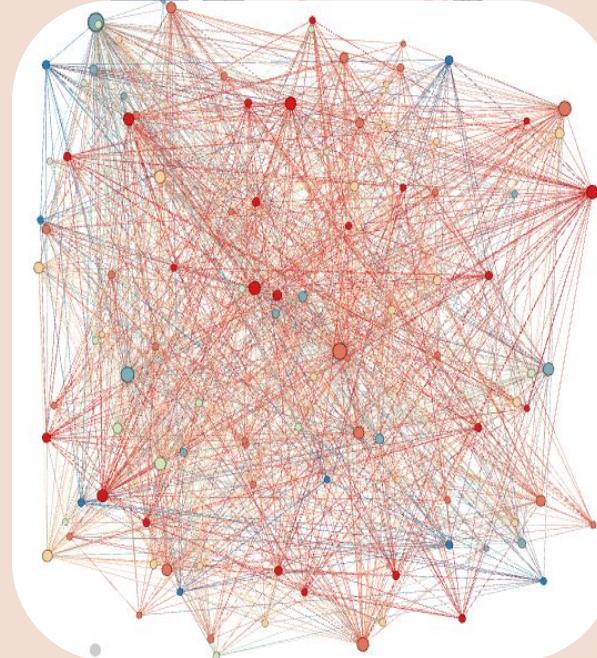
# Scale Free



**Density: 0.228**  
**Average Clustering Coefficient:**  
**0.323**  
**Average Shortest Path: 1.779**

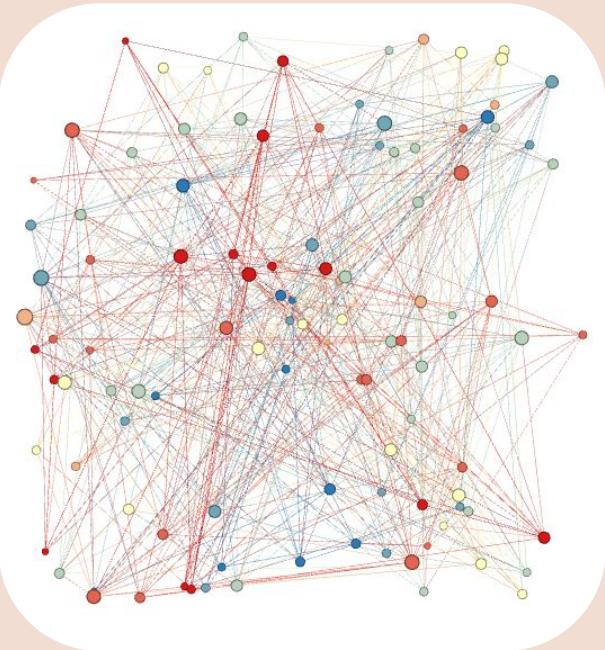


**Density: 0.228**  
**Average Clustering Coefficient:**  
**0.330**  
**Average Shortest Path: 1.779**

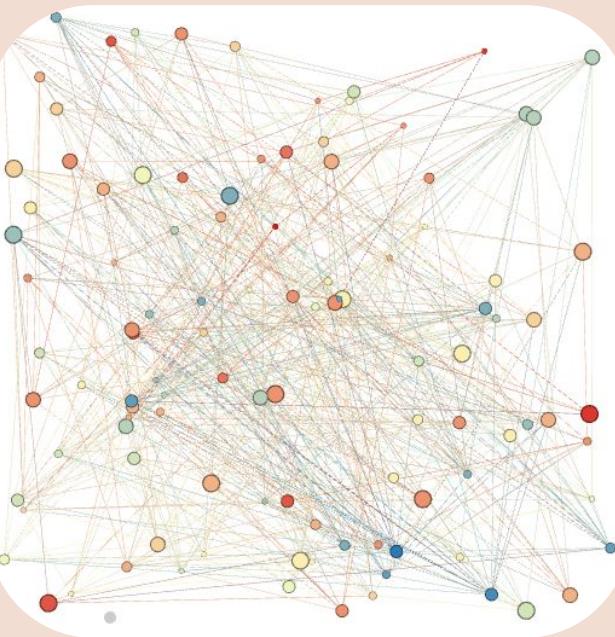


**Density: 0.228**  
**Average Clustering Coefficient:**  
**0.330**  
**Average Shortest Path: 1.779**

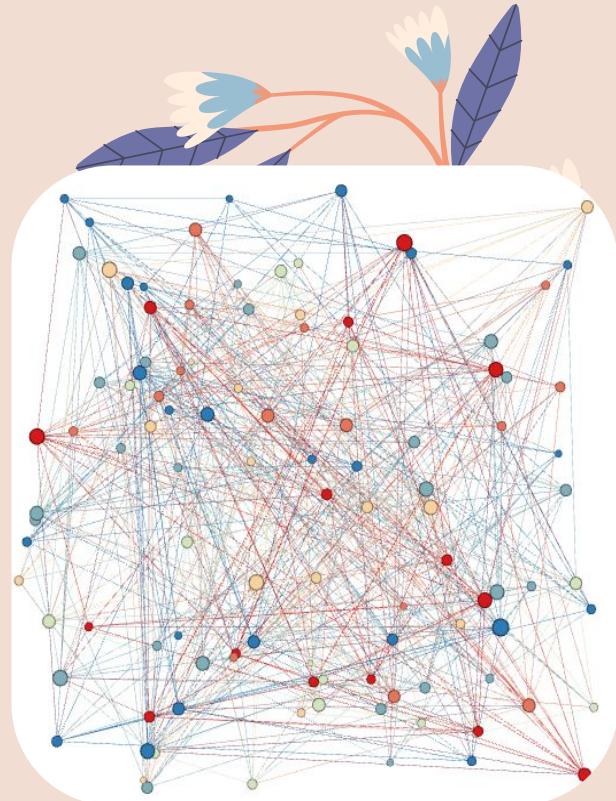
# Random Networks



Density: 0.102  
Average Clustering Coefficient:  
0.111  
Average Shortest Path: 2.19



Density: 0.102  
Average Clustering Coefficient:  
0.111  
Average Shortest Path: 2.191



Density: 0.102  
Average Clustering Coefficient:  
0.111  
Average Shortest Path: 2.191

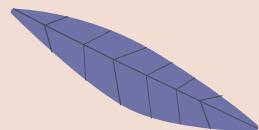
# Summary:

## Most Similar To:

- Watts-Strogatz Model
  - About the same clustering coefficient, average shortest path, and density
- Generated scale-free networks
  - About the same density and average shortest path

## Least Similar To:

- Generated random networks



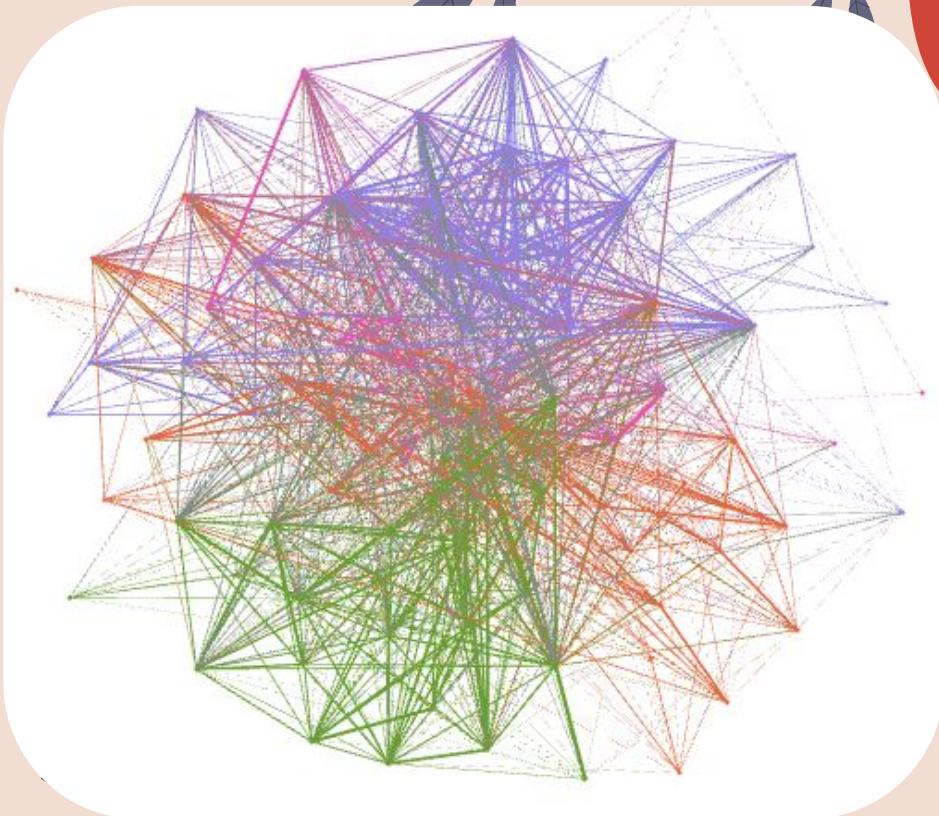


03

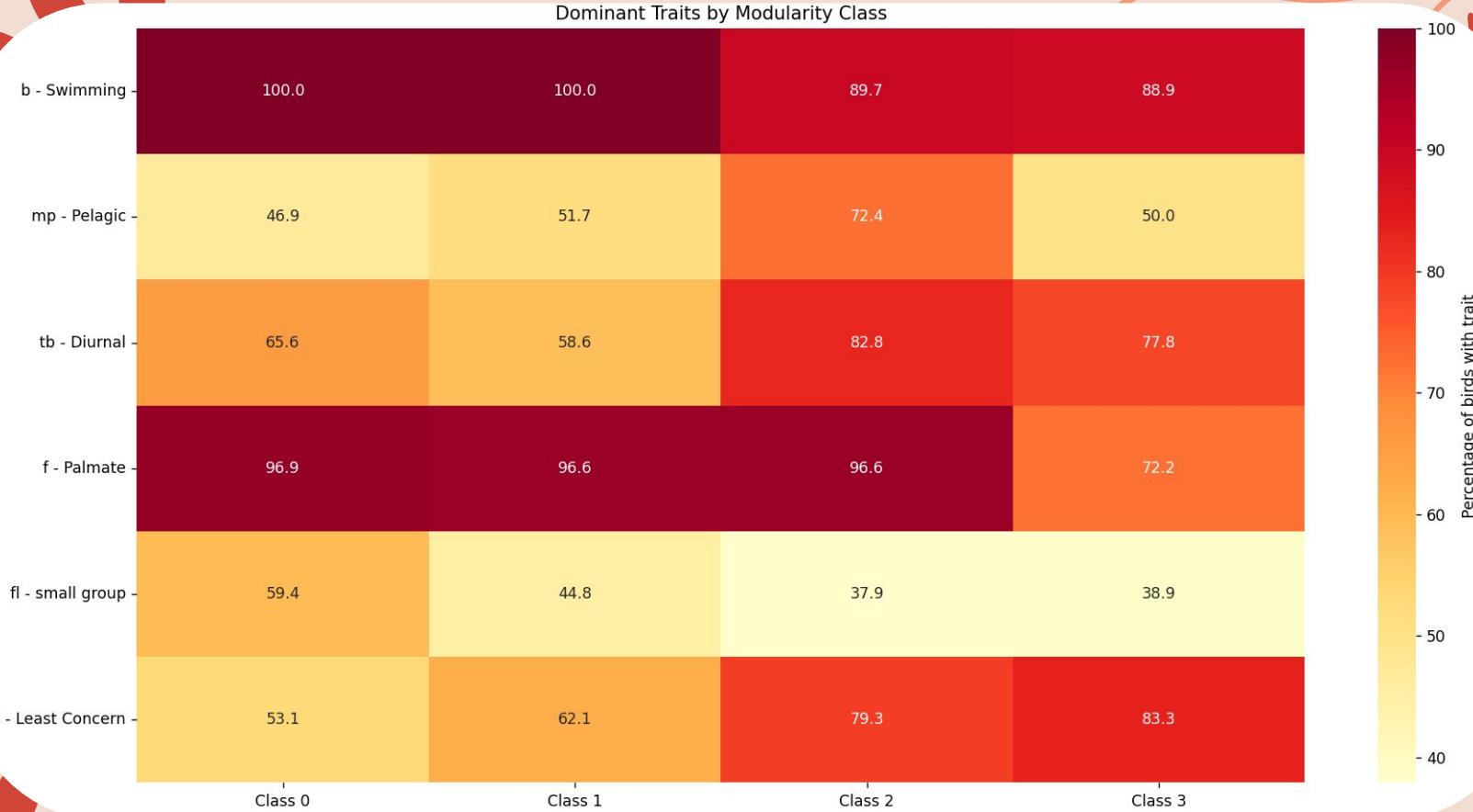
## Cluster Analysis

# Clustering from Gephi

**Number of Communities: 4**  
**Modularity: 0.27**



# Clustering from Gephi



# Info About Each Community (Modularity Class)

## Class 0:

- Number of Birds: 32
- Average Weighted Degree: 478.41
- Size: Crow
- Behavior: Swimming
- Beak-Type: Surface-picker
- Foot: Palmate
- Migration Pattern: Pelagic
- Time Behavior: Diurnal
- Plumage: Plain
- Leg Type: Short
- Wing Type: Pointed and Tapered
- Tail Type: Pointed
- Call pattern: flat
- Call Type: Raucous
- Flock: small group
- Conservation Status:
  - Around 50% least concern
  - Around 50% threatened

## Class 1:

- Number of Birds: 29
- Average Weighted Degree: 349.10
- Size: Robin
- Behavior: Swimming
- Beak-Type: Diving-specialist
- Foot: Palmate
- Migration Pattern: Migrant
- Time Behavior: Diurnal
- Plumage: Plain
- Leg Type: Short
- Wing Type: Pointed
- Tail Type: Short
- Call pattern: flat
- Call Type: Odd
- Flock: small group
- Conservation Status:
  - Around 60% least concern
  - Around 40% threatened

# Info About Each Community (Modularity Class)

## Class 2:

- Number of Birds: 29
- Average Weighted Degree: 467.28
- **Size:** Crow
- **Behavior:** Direct Flight
- Beak-Type: Surface-picker
- Foot: Palmate
- Migration Pattern: Migrant
- Time Behavior: Diurnal
- Plumage: Plain
- Leg Type: Medium-Length
- Wing Type: Tapered
- Tail Type: Square-tipped
- Call pattern: flat
- Call Type: Scream
- Flock: large group
- **Conservation Status:**
  - Around 80% Least Concern

## Class 3:

- Number of Birds: 18
- Average Weighted Degree: 262.89
- **Size:** Crane / Mallard
- **Behavior:** Swimming
- Beak-Type: Strainer
- Foot: totipalmate
- Migration Pattern: Pelagic
- Time Behavior: Diurnal
- Plumage: Plain
- Leg Type: Medium- Length
- Wing Type: Long
- Tail Type: Wedge-Shaped
- Call pattern: flat
- Call Type: Raucous
- Flock: Small and Large Group
- **Conservation Status:**
  - Around 83% Least Concern

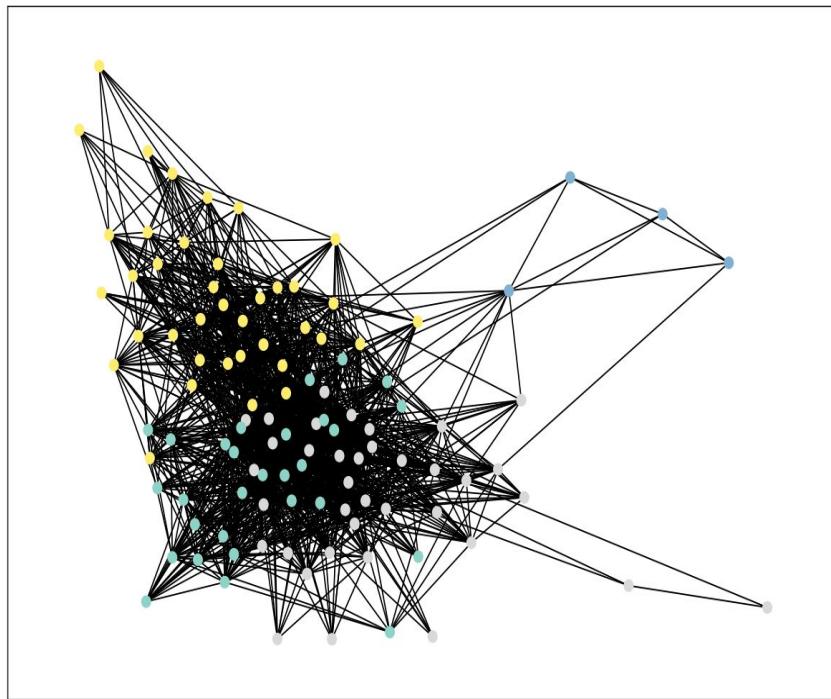
# Some Key Observations

Most common attributes of threatened birds:

- Size: Crow and Robin
- Behavior: Swimming
- Beak-Type: Surface-picker and diving-specialist
- Foot: Palmate (webbed)
- Migration Pattern: Migrant and pelagic (live in open ocean)
- Time Behavior: Diurnal
- Plumage: Plain
- Leg Type: Short and thin
- Wing Type: Pointed and tapered
- Tail Type: Pointed, short, and wedge-shaped
- Call pattern: Flat
- Call Type: Raucous and odd
- Flock: small group

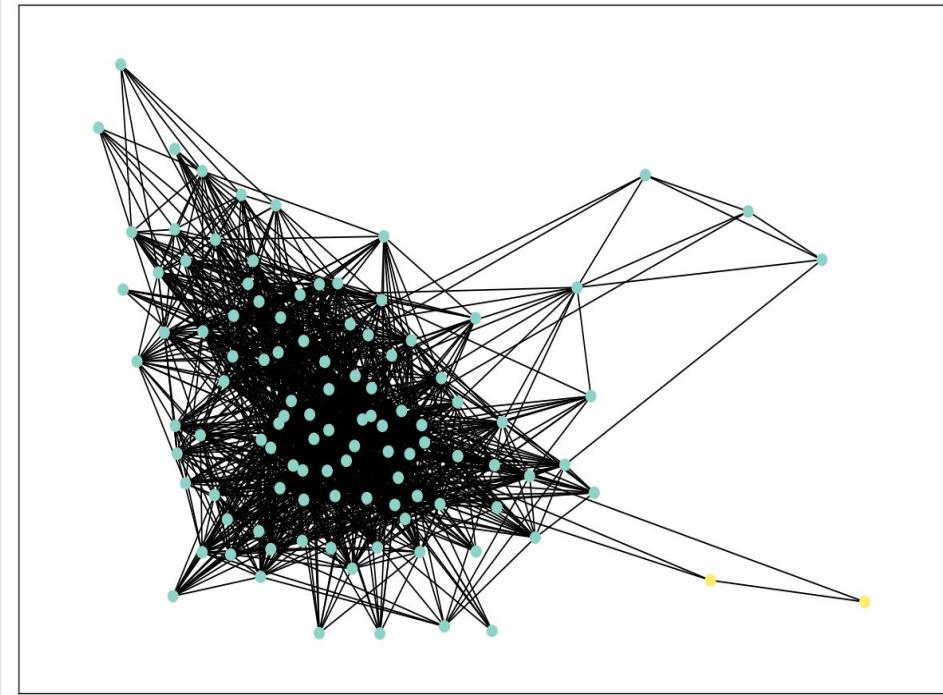
# Clustering using Louvain Model & Girvan-Newman Model

Louvain Communities



**Number of Communities: 4**  
**Modularity: 0.2577**

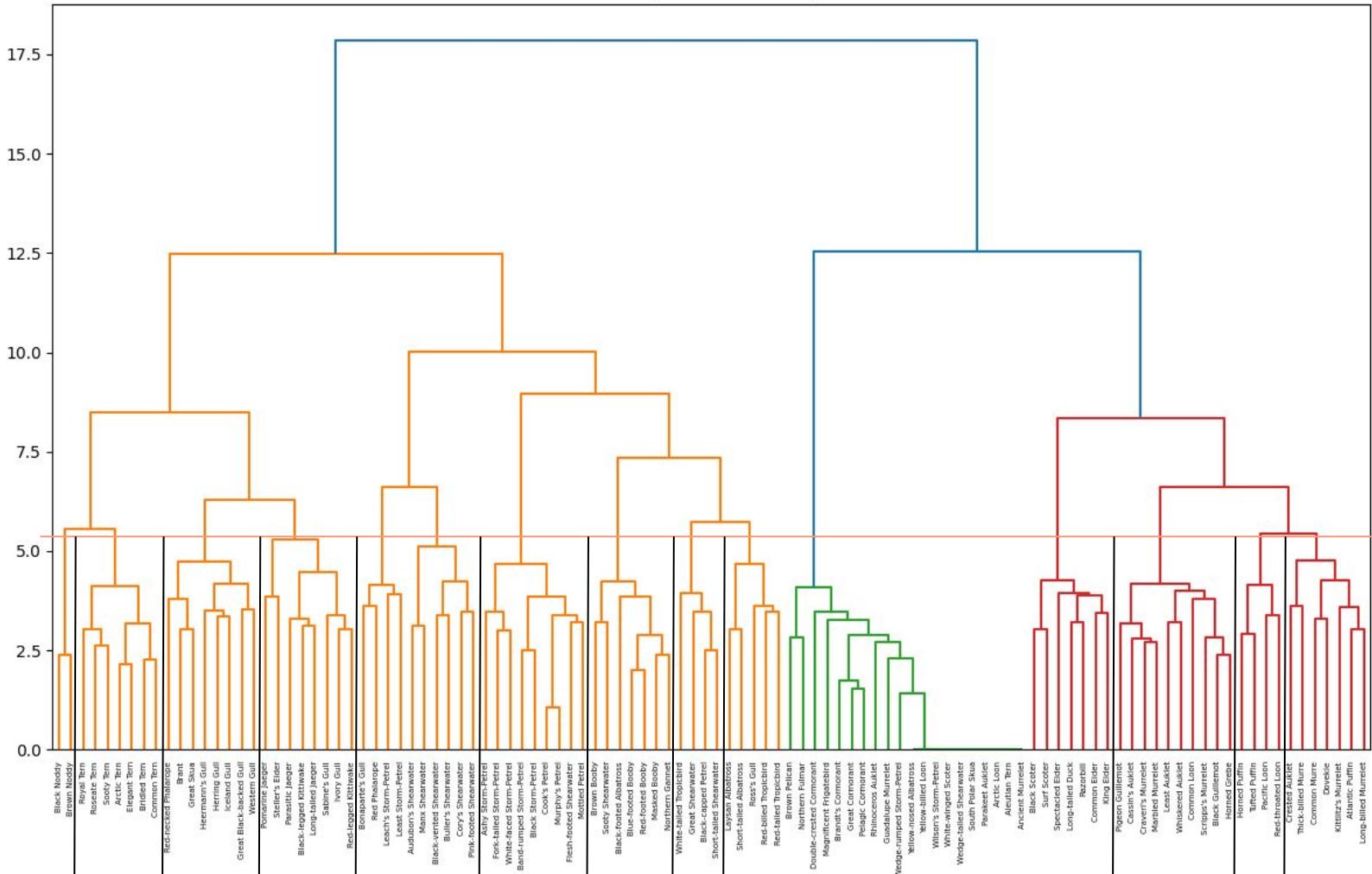
Girvan-Newman Communities



**Number of Communities: 2**  
**Modularity: 0.0012**

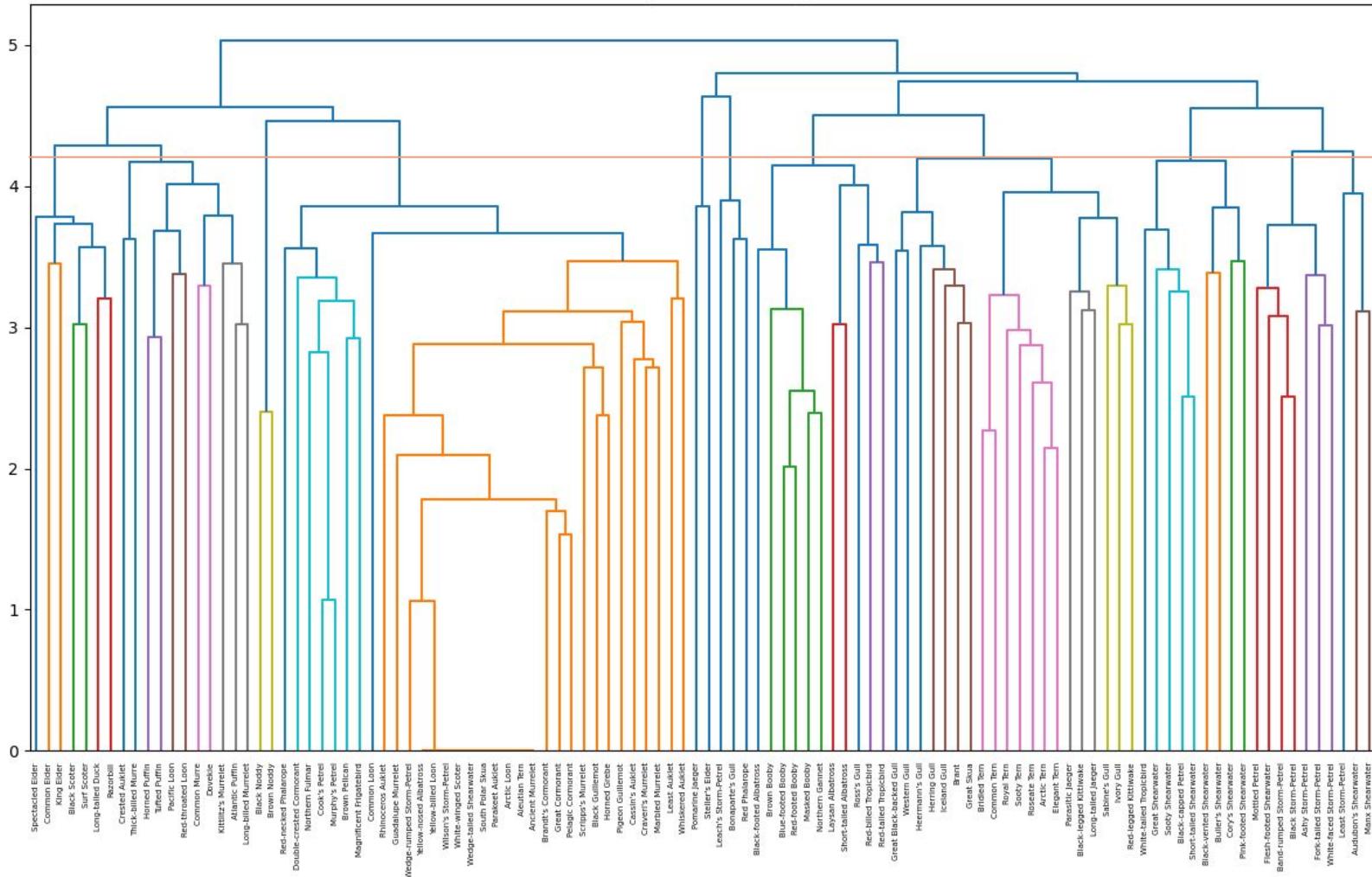
# Bird Species Clustering!

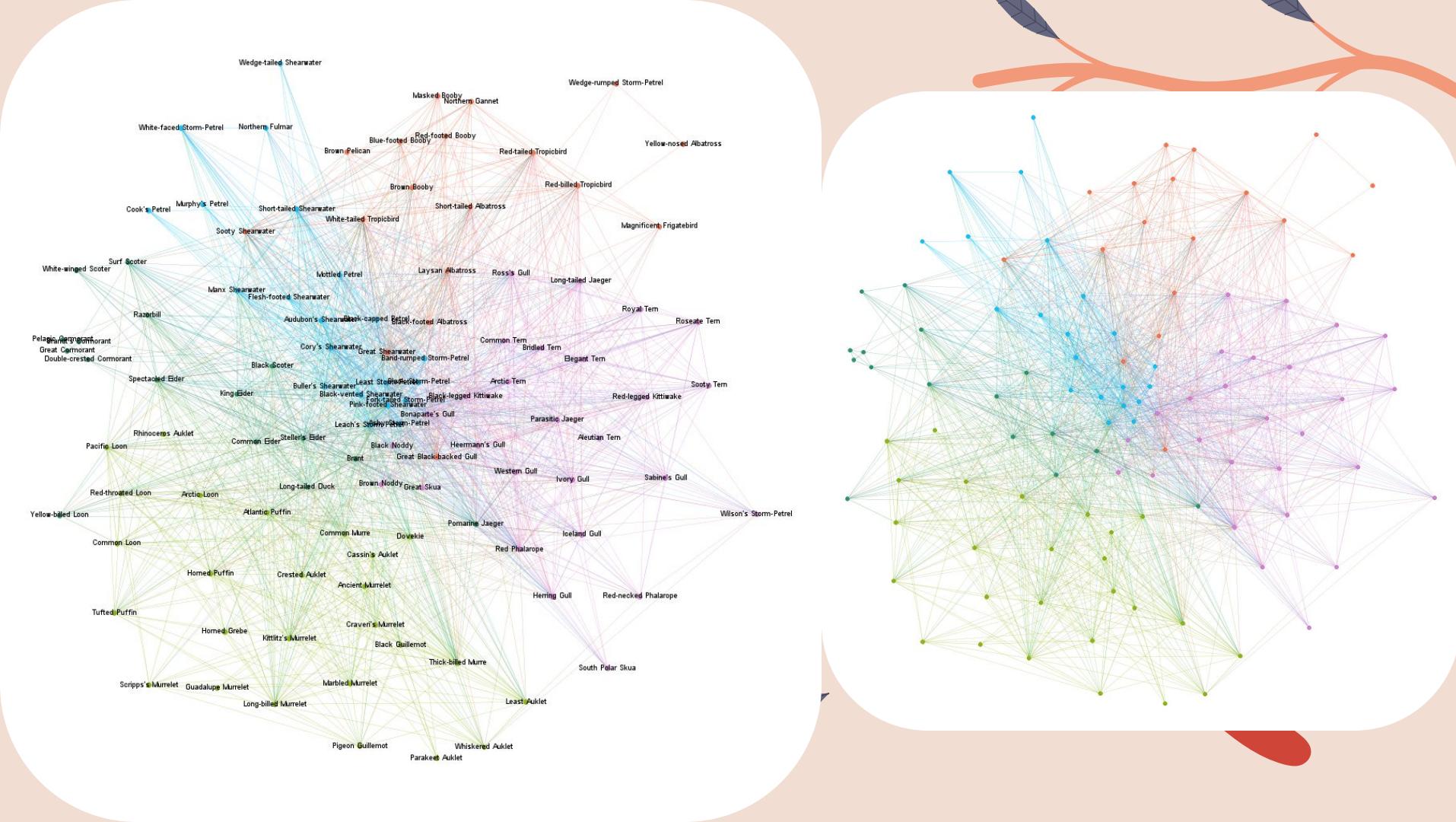
## Ward's Algorithm



# Bird Species Clustering!

Weighted  
average  
linkage







04

## Robustness

# Strictly Theoretical Network Science Approach

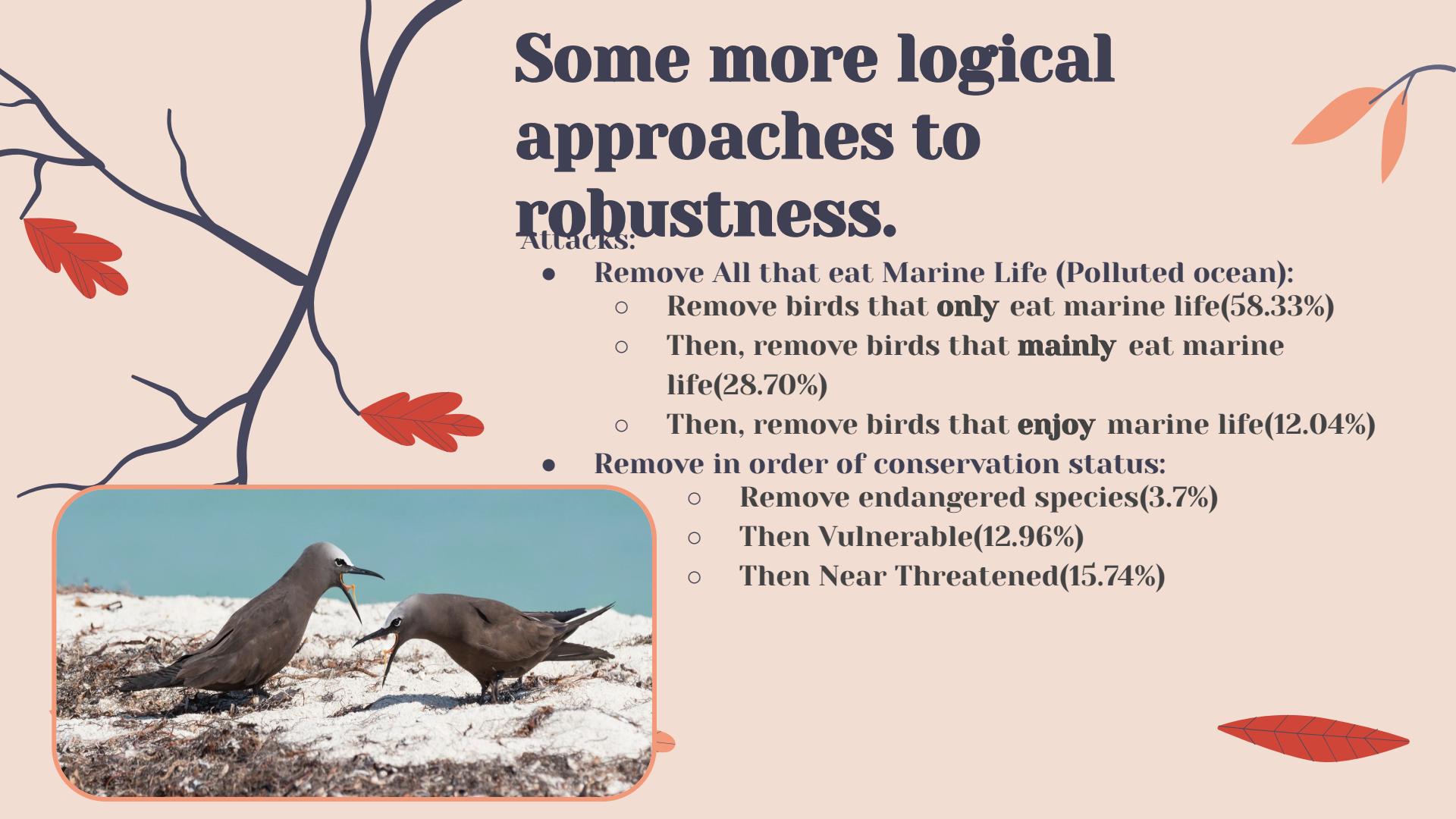


## Attacks:

- Remove 10 highest unweighted degree nodes at a time
- Remove 10 highest betweenness nodes at a time
- Remove 10 highest closeness nodes at a time

## Failures:

- Remove 10 random nodes at a time



# Some more logical approaches to robustness.

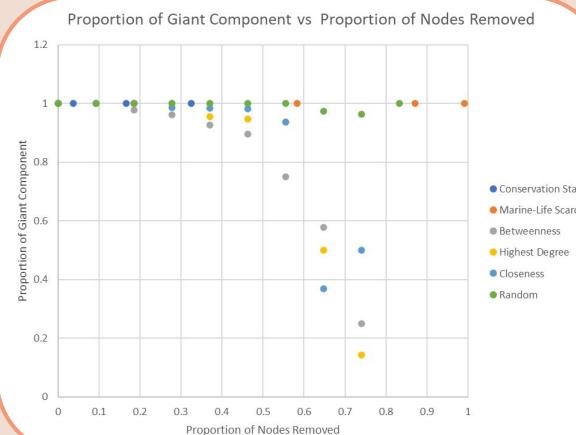
Attacks:

- Remove All that eat Marine Life (Polluted ocean):
  - Remove birds that **only** eat marine life(58.33%)
  - Then, remove birds that **mainly** eat marine life(28.70%)
  - Then, remove birds that **enjoy** marine life(12.04%)
- Remove in order of conservation status:
  - Remove endangered species(3.7%)
  - Then Vulnerable(12.96%)
  - Then Near Threatened(15.74%)

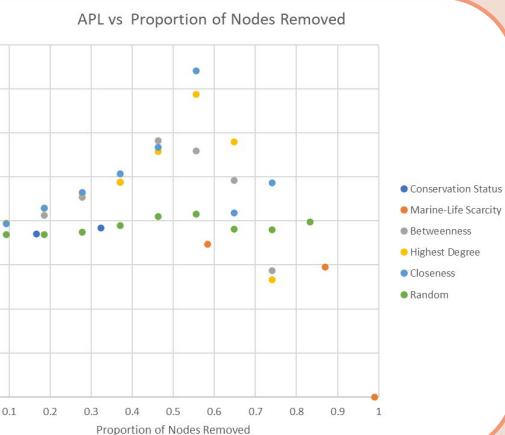


# Robustness Data

## Giant Component vs Nodes Removed

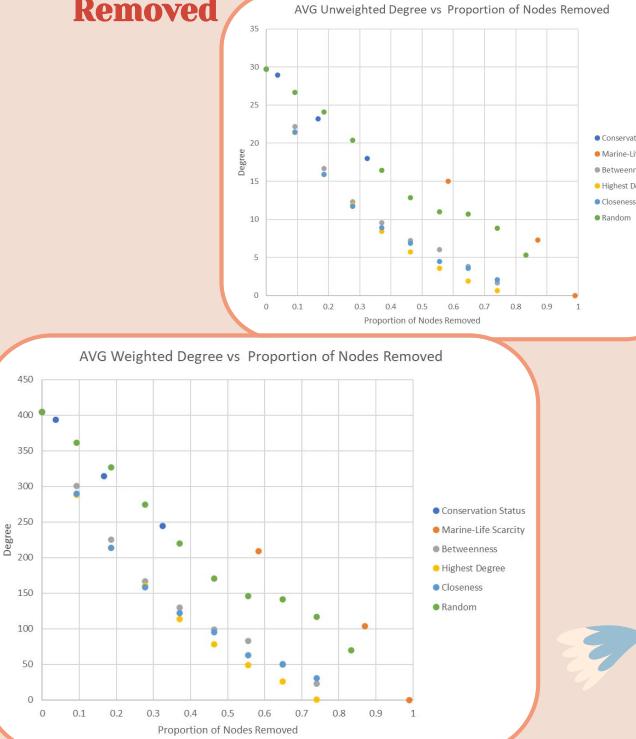


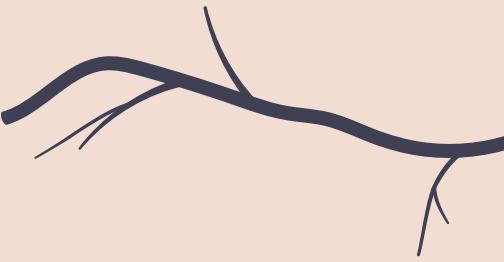
## APL vs Nodes Removed



At 65% nodes removed, closeness actually gets two giant components of an equal 14 node size

## AVG Degree vs Nodes Removed





# Some Conclusions...



**Any relation with  
conservation status  
and traits?**

**What type of graph is  
this?**

**Is it robust?**



What are the  
Important Nodes?  
Do the Clusters Make  
Sense?  
Is it representative  
of the Small World  
Property?  
Ultra-Small World  
Property?

