# USING NETWORKX TO 'VISUALIZE' CANADA'S LOW-CARBON ENERGY TRANSITIONS

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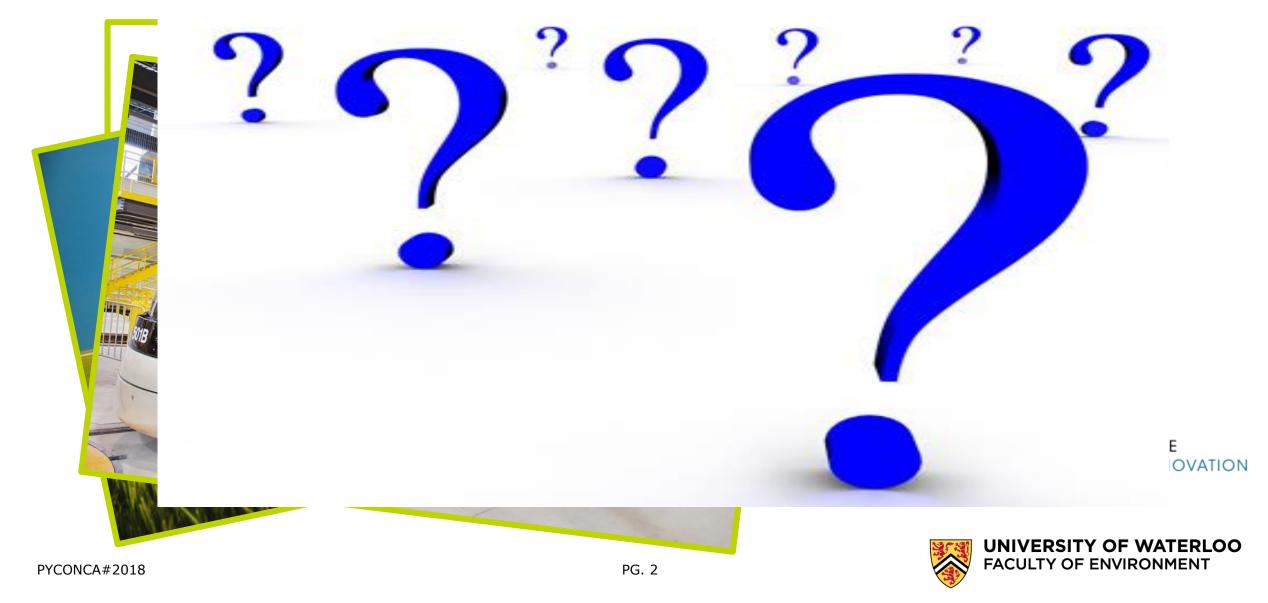




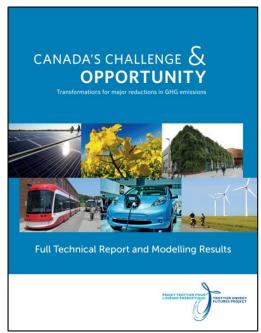


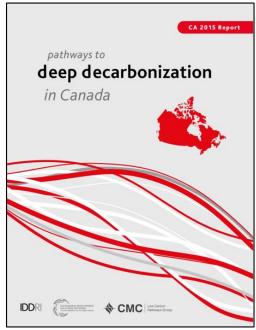


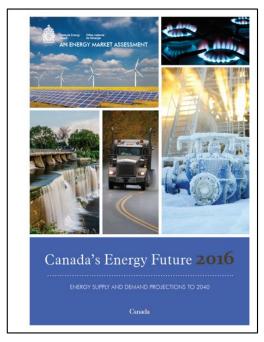
# WHAT IS "LOW-CARBON ENERGY TRANSITION?"

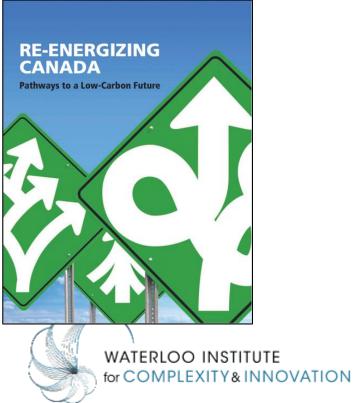


## FOUR ENERGY FUTURES REPORTS





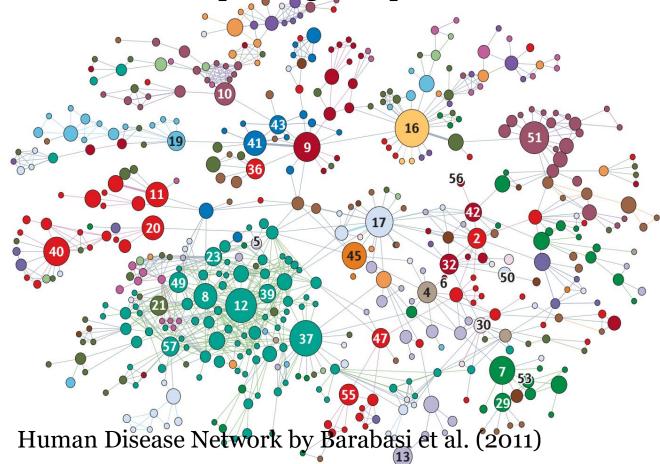






#### **ANALYTICAL STEPS**

Network analysis is ideal for 'unpacking' this problem





#### **ANALYTICAL STEPS**

• The analysis is implemented using NetworkX ...

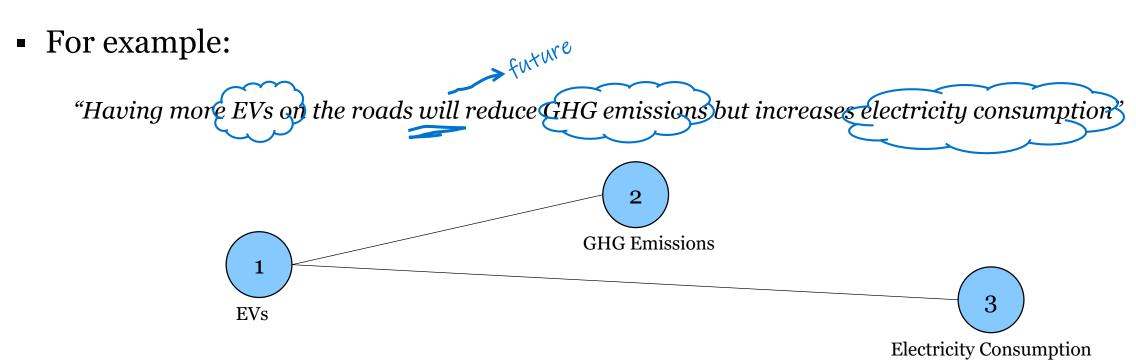
```
In [2]: import networkx as nx
import community
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
%matplotlib inline
from matplotlib.patches import Polygon
```





#### **CREATING NODES AND EDGES**

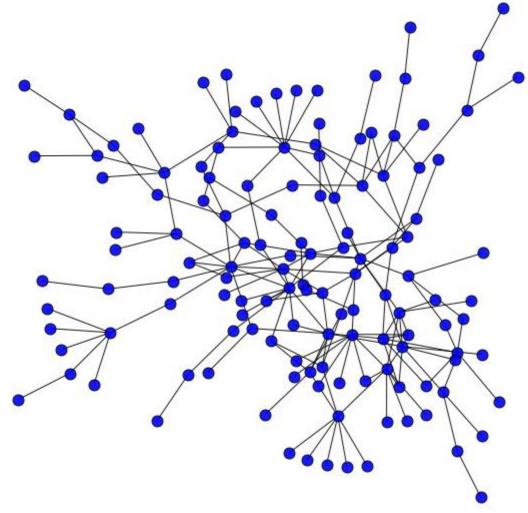
- Create a dataset from scratch...
- Read the reports line-by-line and extract statements...





HARMONIZING FOUR CANADIAN ENERGY FUTURES: A MULTI-STUDY

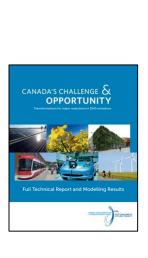
**NETWORK** 

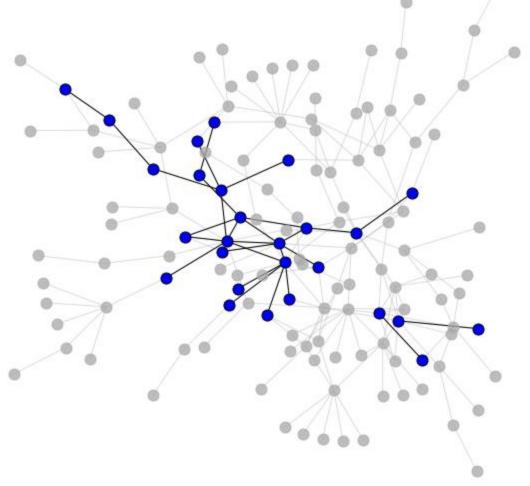






# **MULTI-STUDY NETWORK OF FOUR CANADIAN ENERGY FUTURES**

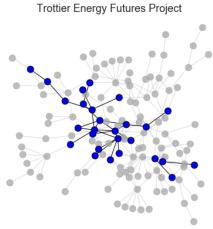




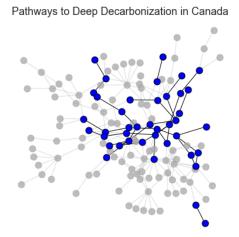


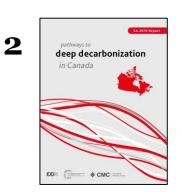


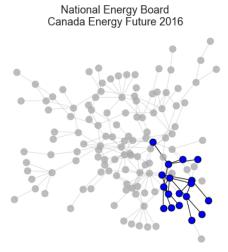
## **EXAMINE DIFFERENT PERSPECTIVES OF ENERGY FUTURES**

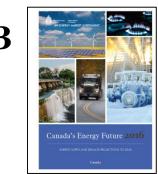


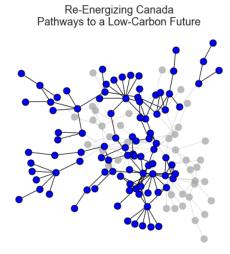


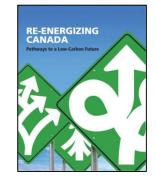






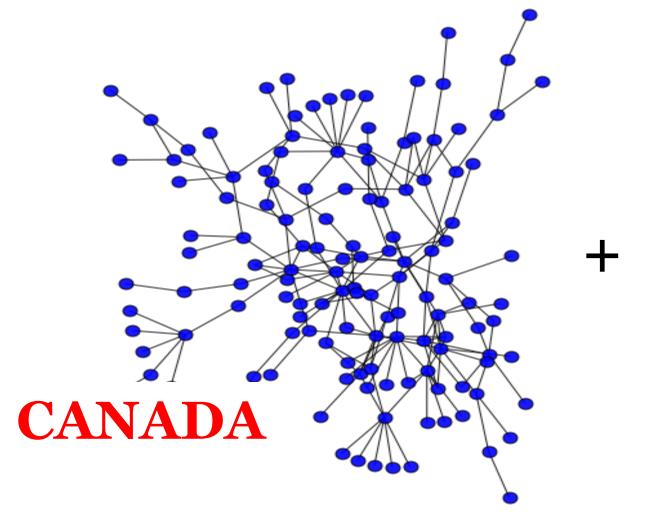


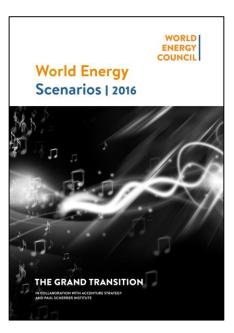






## **EXAMINE CROSS-SCALE CANADA/GLOBAL INTERACTIONS**

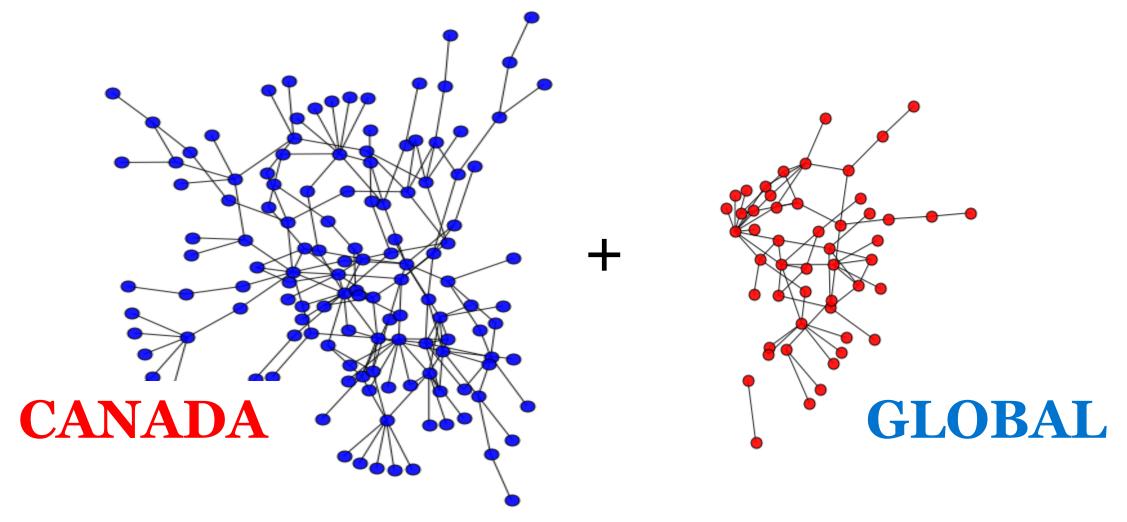






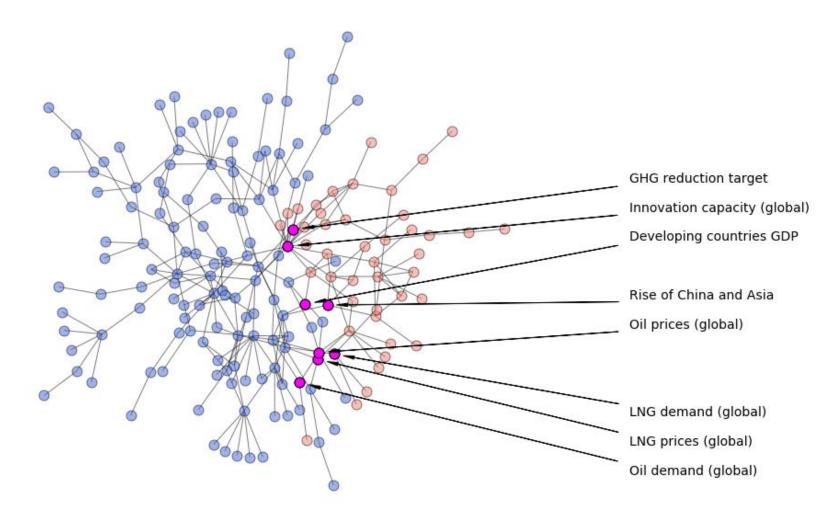


# **EXAMINE CROSS-SCALE CANADA/GLOBAL INTERACTIONS**





#### **EXAMINE CROSS-SCALE CANADA/GLOBAL INTERACTIONS**





## **COMMUNITY DETECTION**

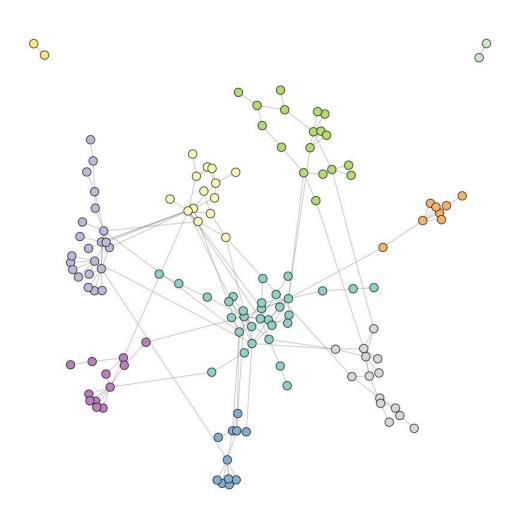
- Understand a network at a modular level
- Nodes under the same community are well-connected to each other whereas nodes from different communities are sparsely connected
- Louvain method (Blondel et al., 2008) # pip install python-louvain (Do not use pip install community)

```
In [35]: partition_ca = community.best_partition(GSE4, randomize=False)
```





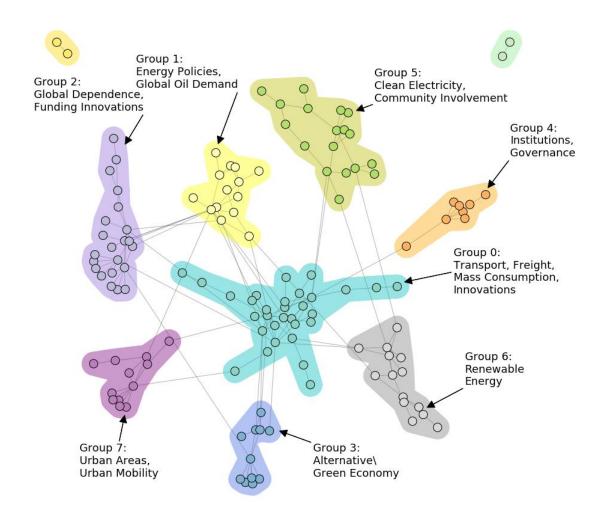
# **COMMUNITY DETECTION FOR CANADA ENERGY FUTURES**







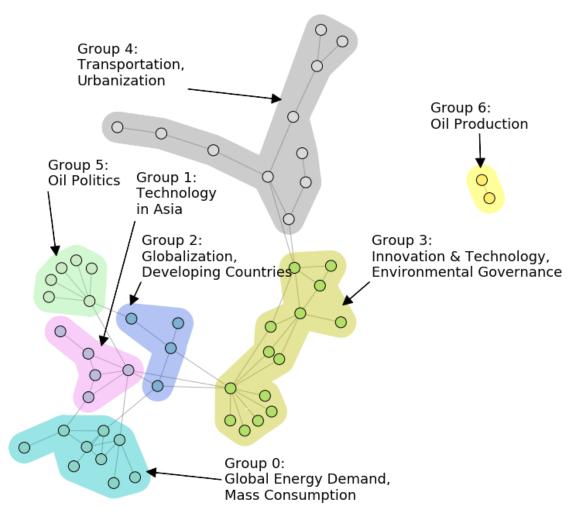
## **COMMUNITY DETECTION FOR CANADA ENERGY FUTURES**







## **COMMUNITY DETECTION FOR GLOBAL ENERGY FUTURES**







## **TAKE AWAY**

- Introduce wider analytical perspective
- Examine different perspectives of each study
- Examine interactions across scales
- Reveal modular structure of the network





#### **ACKNOWLEDGMENT**

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- Complete analytical steps posted at Github
  - https://github.com/judekurn/energy-futures
- Follow me on twitter @JudeHKurniawan

Thank You



