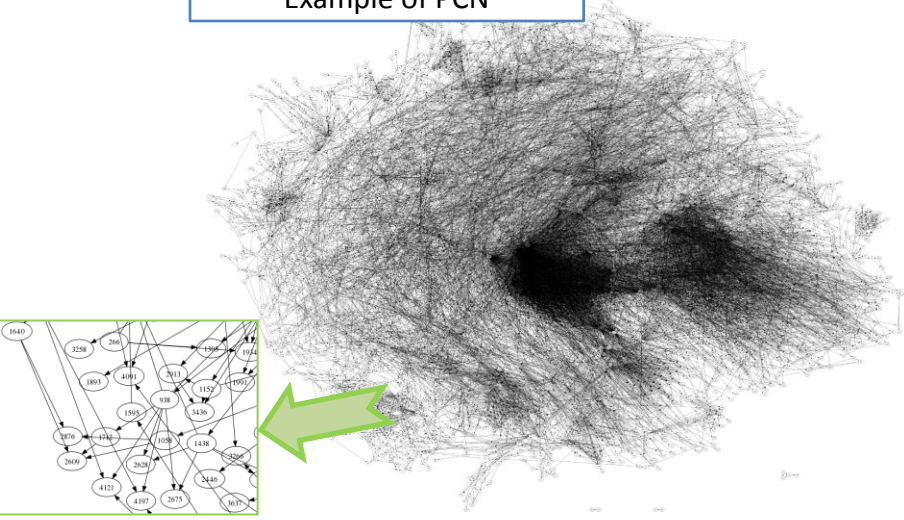


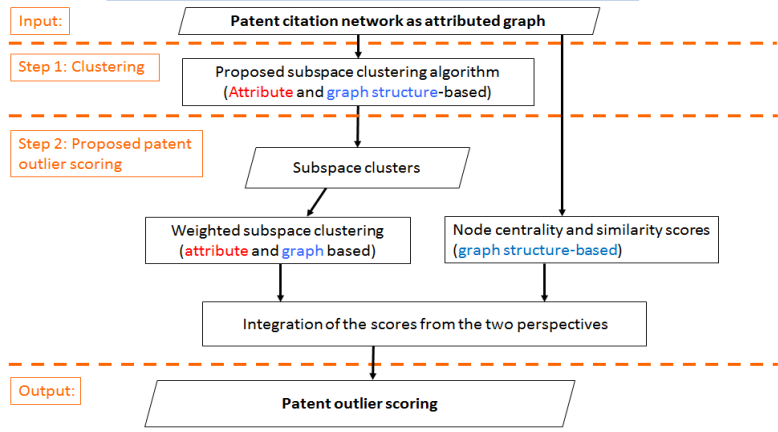
- Mine valuable information from complex network
  - Identify core technologies and identify new technology opportunities
  - Focus research and development investment and follow technological trends over time
- Patent citation networks (PCN) have specialized characteristics
  - Graph structure contains important citation relationship information
  - Nodes can be seen as individual objects described by carefully assigned multivariate attribute data
  - No existing approach for node outlier ranking in PCN that considers both graph structure and attribute data for patents

Example of PCN



- Objective
  - Outlier ranking method for patents in patent citation networks based on both graph structure data and patent attribute data

Flowchart of Outlier Scoring Method



Proposed integrated outlier function

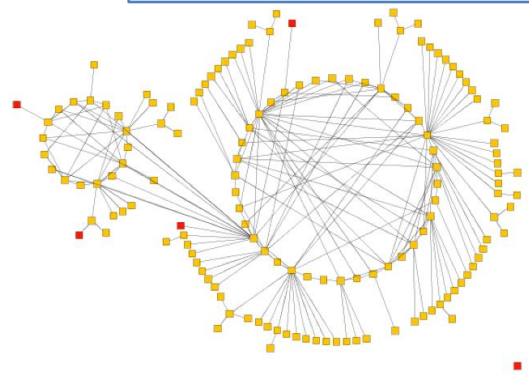
$$OS_I(o) = (w_C \times OS_C(o)) + (w_G \times OS_G(o))$$

$$= w_C \times \sum_{o \in (C_i, S_i)} w_i^o \left[ \alpha \times \left( \frac{|C_i|}{C_{max}} \right) + (1 - \alpha) \times \left( \frac{|S_i|}{S_{max}} \right) \right] + w_G \times \frac{c(o)}{c_{max}}$$

where  $OS_C(o) = \sum_{o \in (C_i, S_i)} w_i^o \left[ \alpha \times \left( \frac{|C_i|}{C_{max}} \right) + (1 - \alpha) \times \left( \frac{|S_i|}{S_{max}} \right) \right]$

$$OS_G(o) = \frac{c(o)}{c_{max}} \quad \text{where} \quad c(o) = \sum_{k=1}^N [A_{ok} + C_{ok}]$$

Experiment on a real-life PCN



| Outlier rank | Patent     |
|--------------|------------|
| 1            | US-6216183 |
| 2            | US-5930767 |
| 3            | US-6026193 |
| 4            | US-6038564 |
| 5            | US-6041412 |

- “Patent clustering and outlier ranking methodologies for attributed patent citation networks for technology opportunity discovery”, *IEEE Transactions on Engineering Management* (Under review)