

When Do Networks Create Value?

Bridging Social Capital and Structural Holes

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Outline

Networks and
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Creation

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Session 3
Wrap Up

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Network Theories across the Various Weeks of SMM638

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Network theory	2	3	4	5	6	7	9	10
Value creation		•	•					
Coordination				•				
Network change					•	•	•	•
Contagion						•		•

The Leading Question

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When do networks create value?

Groups of Network Theories

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Underlying model	Social capital	Social homogeneity
Network flow	Capitalization (value creation)	Contagion
Network architecture	Coordination	Adaptation (network change)

Source is [1, page 47]

Theories on Networks and Value Creation

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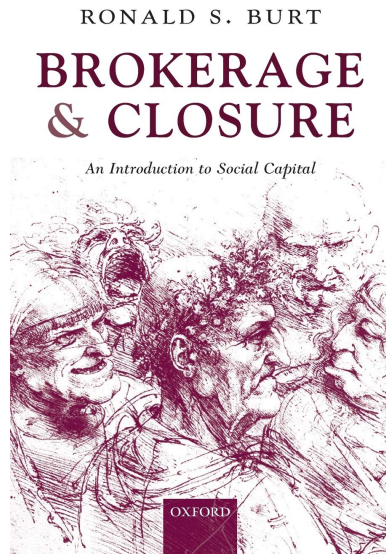
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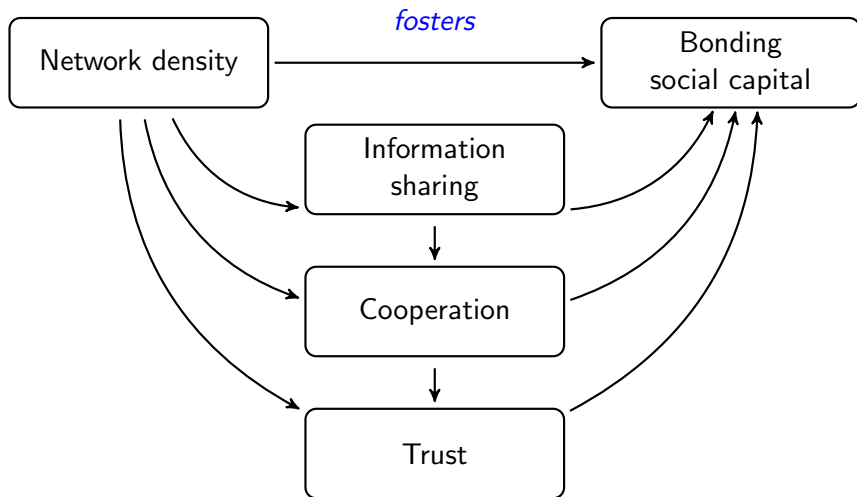
References

Mainly, the various theories on the influence of networks on value creation can be grouped into two categories:

- **Bridging** social capital theories, whose key tenet is that sparse networks bring value to individuals and groups by facilitating fresh courses of action and new ideas — a process called **network brokerage**
- **Bonding** social capital theories, whose key tenet is that dense networks bring value to individuals and groups by fostering cooperation and trust — a process called **network closure**



What Is the Outcome of Dense Networks?



Density Metrics

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!! Pay attention !!

There is no single metric capturing the concept of network density

In practice, we use complementary metrics such as

- Average degree
- Degree distribution
- Connectedness
- Clustering coefficient

Average Degree

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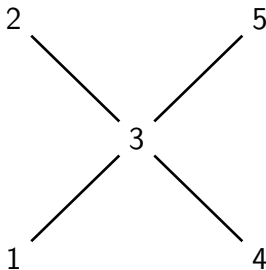
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'Average Degree' is the mean number of connections per node in a network

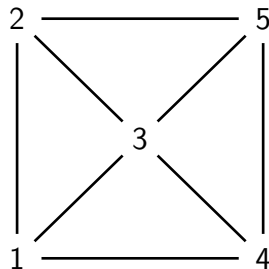
$$\langle k \rangle = \frac{1}{N} \sum_{i=1}^N k_i$$

A — a 'star'



$$\langle k \rangle = \frac{4}{5}$$

B — a 'dense' network



$$\langle k \rangle = \frac{16}{5}$$

Degree Distribution

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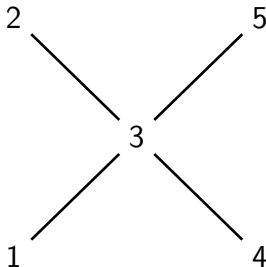
‘Degree Distribution’ is the distribution of the nodes across unique degree levels. Oftentimes, it is calculated to provide the probability that a randomly selected node in the network has degree k

$$\sum_{k=1}^{\infty} p_k = 1$$

hence

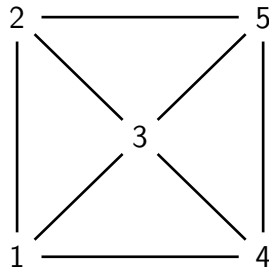
$$p_k = \frac{N_k}{N}$$

A — a ‘star’



k	$Pr(k)$
1	0.8
4	0.2

B — a ‘dense’ network



k	$Pr(k)$
3	0.8
4	0.2

Connectedness

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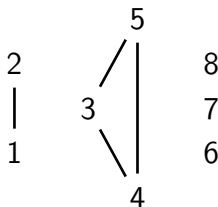
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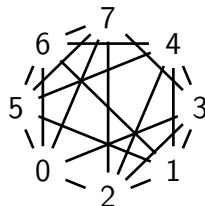
In an undirected network nodes i and j are connected if there is a path between them. They are disconnected if such a path does not exist, in which case we have $d_{ij} = \infty$

A —
a disconnected network



The graph has two connected components (1-2 and 4-5-6), but it lacks overall connectivity. For example, there is not path between nodes 1 and 6.

B —
a connected network



This graph is connected. Although some nodes are not directly connected (e.g., 4-7), an indirect path exists between them (e.g., 4-6-7).

Clustering Coefficient

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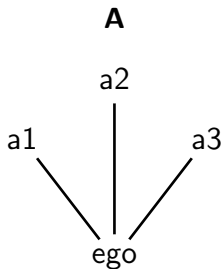
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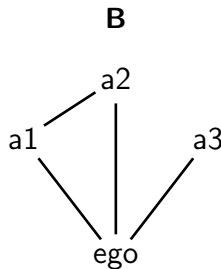
The clustering coefficient captures the degree to which the neighbors of a given node link to each other. For a node i with degree k_i the local clustering coefficient is defined as

$$C_i = \frac{2L_i}{k_i(k_i - 1)}$$

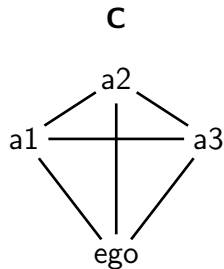
where L_i represents the number of links between the k_i neighbors of node i



$$C_{ego} = \frac{0}{3}$$



$$C_{ego} = \frac{1}{3}$$



$$C_{ego} = \frac{3}{3}$$

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Density Metrics

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- [1] John Scott and Peter J Carrington. *The SAGE Handbook of Social Network Analysis*. SAGE publications, 2011.