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An EN can be described as "a set of nodes and a pattern of ties among such nodes", but this begs five questions.

Five questions:





Five questions:

I. What is a node?

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- I. What is a node?
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- 5. When is a network an EN, and not just a social network (SN)?

What is a node?

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I. Network Nodes

What is a node?

There are two main types of node in an EN:

What is a node?

There are two main types of node in an EN:

– human beings

-

What is a node?

There are two main types of node in an EN:

- human beings
- organisations

but possibly others:

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Need to specify how nodes relate to actors: is the link explicit and justified?

- a. aggregation common effects or common causes
- b. nodes proxy for unobserved actors.

Two questions about the "boundary specification problem:"

a.

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realist: look for evidence among the actors on who's in and out — Erickson's "snowball" sampling approach

Boundary Specification cont.

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- c. single type of actor, or two types? (One mode or two?) e.g. buyer or seller or possibly both?
- d. the "node specification" problem of death and birth e.g. firms are born, firms merge, firms exit

One- or Two-Mode Networks?

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e.g. traders on eBay can both buy and sell (one-mode), but most specialise. Nonetheless, the pattern of specialisation might be significant.

Q:

The Meaning of the Absence of a Tie?

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Moreover, what do inter-firm relations mean?

- another form of network tie?
 using reliance on networks to predict the location of the firm's boundaries, or
- something different from market integration? qualitative increase in commitment \rightarrow need a theory of the firm to analyse ENs.

 $3 + 4 + 5 \rightarrow$

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6. What manner of orientation among the nodes is meaningful such that it consitutes a structure that has causal implications for outcomes of interest?

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- and pattern: central to the analysis of ENs.

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EN: "any collection of actors (N > 2) that pursue repeated, enduring exchange relationships with one another and, at the same time, lack a legitimate organisational authority to arbitrate and resolve disputes that might arise during the exchange." self-organisation

Four Approaches to ENs

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- III. ENs as structures of mutual orientation (I and II are subsets of III)
- IV. Increasingly, the structures of inter-firm orientation designed to be orthogonal to market exchange. To meet needs unmet by market exchange (e.g. coopetition)

Not just a pretty picture?

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Two issues (Reagans et al. 2003):

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Do ENs have Causal Implications?

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Two issues (Reagans et al. 2003):

- I. unobserved heterogeneity, and
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 \rightarrow To argue that particular network position confers advantage, it's necessary to show, first, that any observed association between position and success does not reflect underlying differences in actor "type" or, second, that expectations of success did not determine the observed network pattern.

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Vertex Degree: k(v) = no. of vertices directly connected to vertex v

Clustering Coefficient: $C(v) = \frac{\text{Actual}}{\text{Total possible}}$ measures how well connected my neighbouring vertices are, where Actual = number of connections among my neighbouring vertices.

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Clustering Coefficient: $C(v) = \frac{\text{Actual}}{\text{Total possible}}$ measures how well connected my neighbouring vertices are, where Actual = number of connections among my neighbouring vertices. Distance L_{ij} = shortest path length between vertices *i* and *j* Characteristic Path Length of Graph G = L(G) = the average of L_{ij} for all *i*, *j* in graph *G*, *i* ≠ *j*.

Path length L(G) Clustering C(V)

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Small World Networks (SWN) are resiliant against random failures of vertices (nodes), but highly vulnerable to deliberate attacks on hubs (vertices of high degree k(v)).

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- You have knowledge of the system that you are studying
- You have a problem that naturally calls for a networkbased approach. Complex networks should not be the answer in search of the problem.
- You understand that just considering the topology of system interactions will not magically allow you to unify quantum mechanics and gravity, explain the origin of life, or elucidate the meaning of life.

Al Wilhite remarks ...

There seem to be two types of economic network studies.

First are the theoretical "games on networks" and "network evolution" studies that use highly abstract networks embedded with some sort of decision making criterion.

The second group includes empirical papers that zero in on a single network using volumes of data to map out that actual network's structure.

Wilhite & Fong (2009) lies somewhere in between. The theory part of the paper used abstract networks to simplify potential relationships which give suggestions as to what might happen. These relationships are then tested using data from actual organizations, but we do not map out the 400 networks of these organizations—that task is impossible.

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