

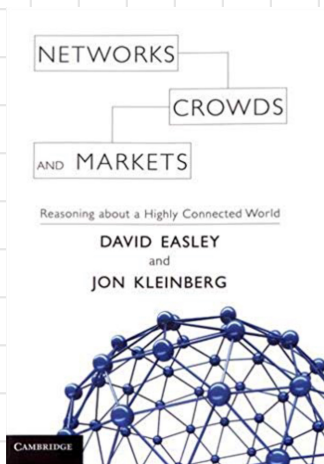
Lecture 4

Network Science

Strong and Weak
ties

Today's Topics

- Introduction
- Triadic Closure
- "The strength of weak ties"
- Tie Strength and Network Structure in Large Scale Data
- Tie Strength, Social Media, and Passive Engagement



Chapter 3

"Strong and Weak Ties"

From local to Global

Complexity

socio-psychological behavior



structural property
in the network

Grenovetter's hypothesis

Motivating Question

1960s - Granovetter's PhD

- 1 people found a job through a contact
- 2 "strength" of social contact had an impact on job-seeking

Surprisingly

acquaintances (weak ties)

were more useful

than "real friend"

(strong ties)

to receive fresher

information during job-seeking.

Grewenetter's hypothesis

Why?

G. proposed two different perspectives

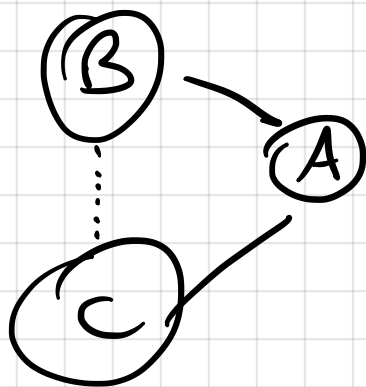
1. Structural persp.:
focus on how friendships
span across different
portions of your social
network

2. interpersonal : focus
on purely local
consequences that follow
from a friendship
(weak or strong)

Evolution of a Network in Time

We have also
nodes that join the network
and also leave the network.
and also links that
are formed (or deleted)
between two nodes

Rapoport, 1953



t : —
 $t + \epsilon$: ...

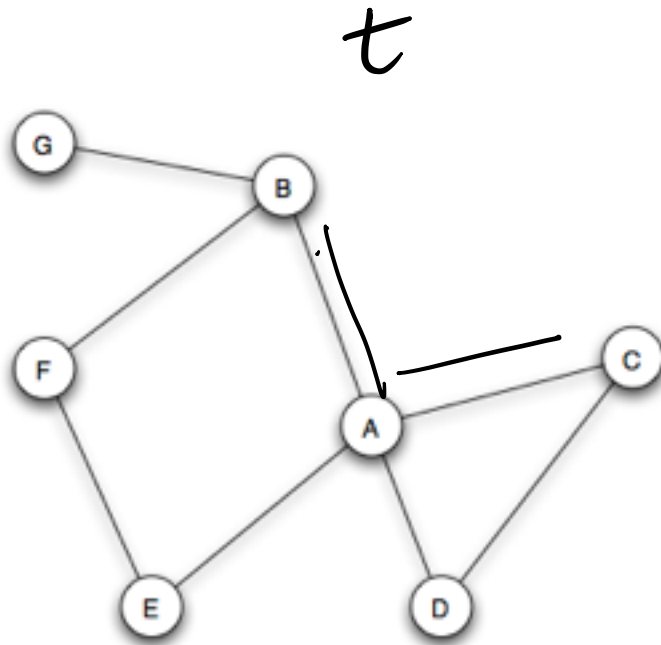
triadic closure

Triadic Closure

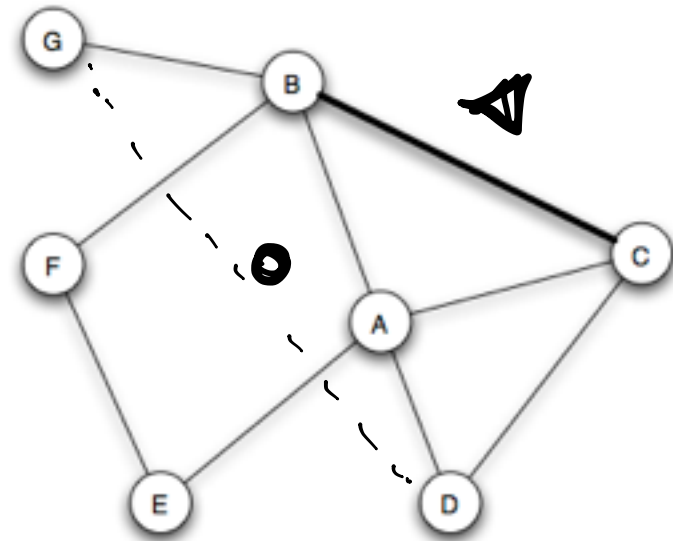
Δ is more likely than

o

$t + \epsilon$



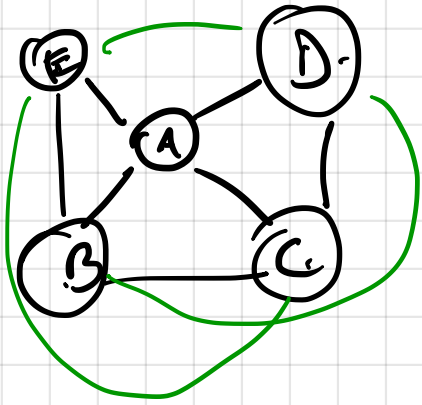
(a) Before B-C edge forms.



(b) After B-C edge forms.

Relation with the Clustering Coefficient (cc)

cc is a property of a node



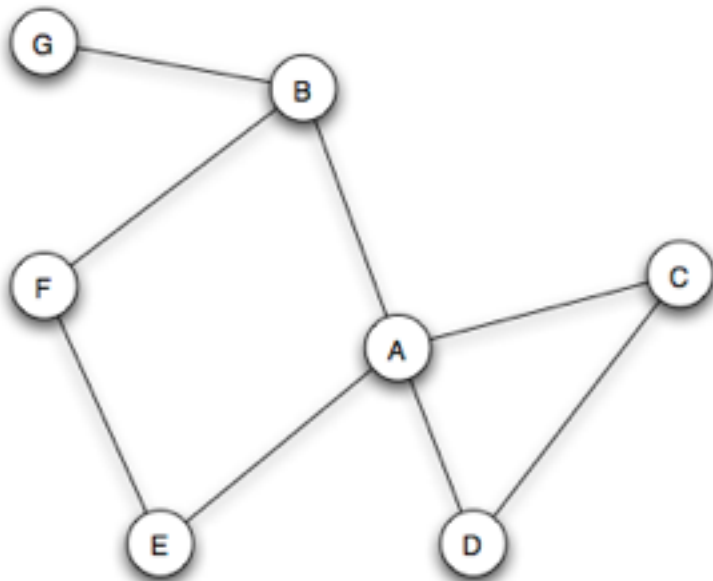
$$cc(A) = \frac{2 \cdot 3}{4 \cdot 3} = \frac{1}{2}$$

cc: the probability that friends of A are connected to each other

triadic closure is connected with the definition of c.c.

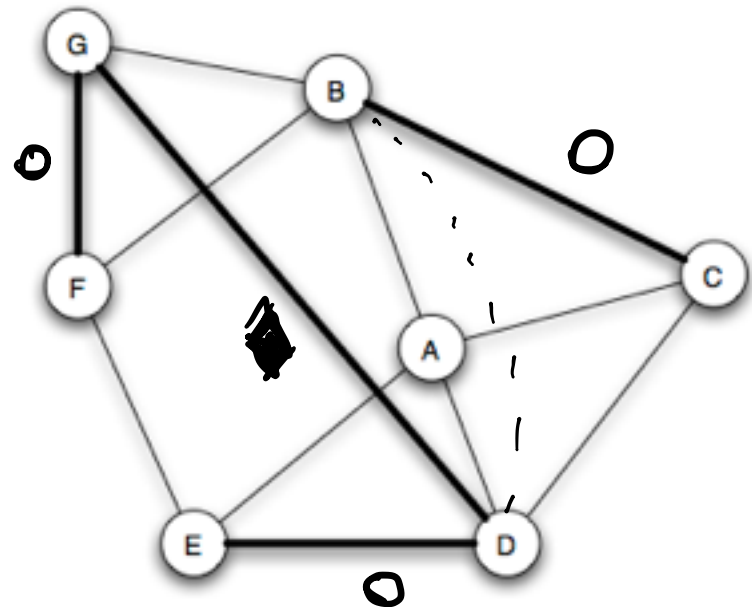
After a given span of time...

t



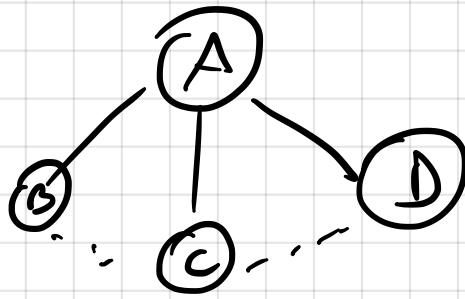
(a) Before new edges form.

$t + \epsilon$



(b) After new edges form.

Closing Triangles



the more strongly nodes
closure is operating in
the neighborhood of the
node, the higher the
c. c. will tend to be.

Side Note on clustering coefficient

high cc: extremely frequent in social network.

low cc: in a random graph

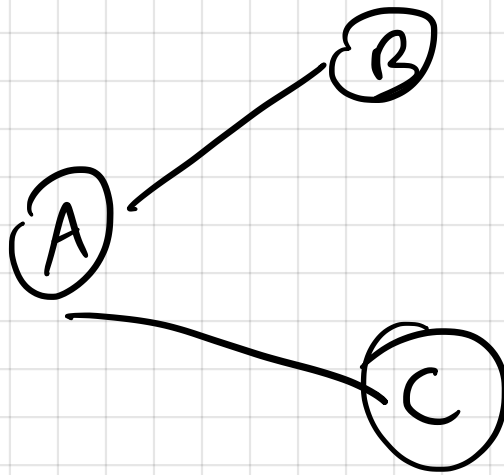
$$cc(G_R) \ll cc(G)$$

↑
"equivident" random version of G

↑
social network

Reasons for triadic Closure

Opportunity
Trusting
Incentive



Heider, 1958

Side note on "incentive"

a study on teenage girls found a correlation low C. C and suicide

the structure of social connections can be indicators for catastrophic events

Bealman and Jody, 2004

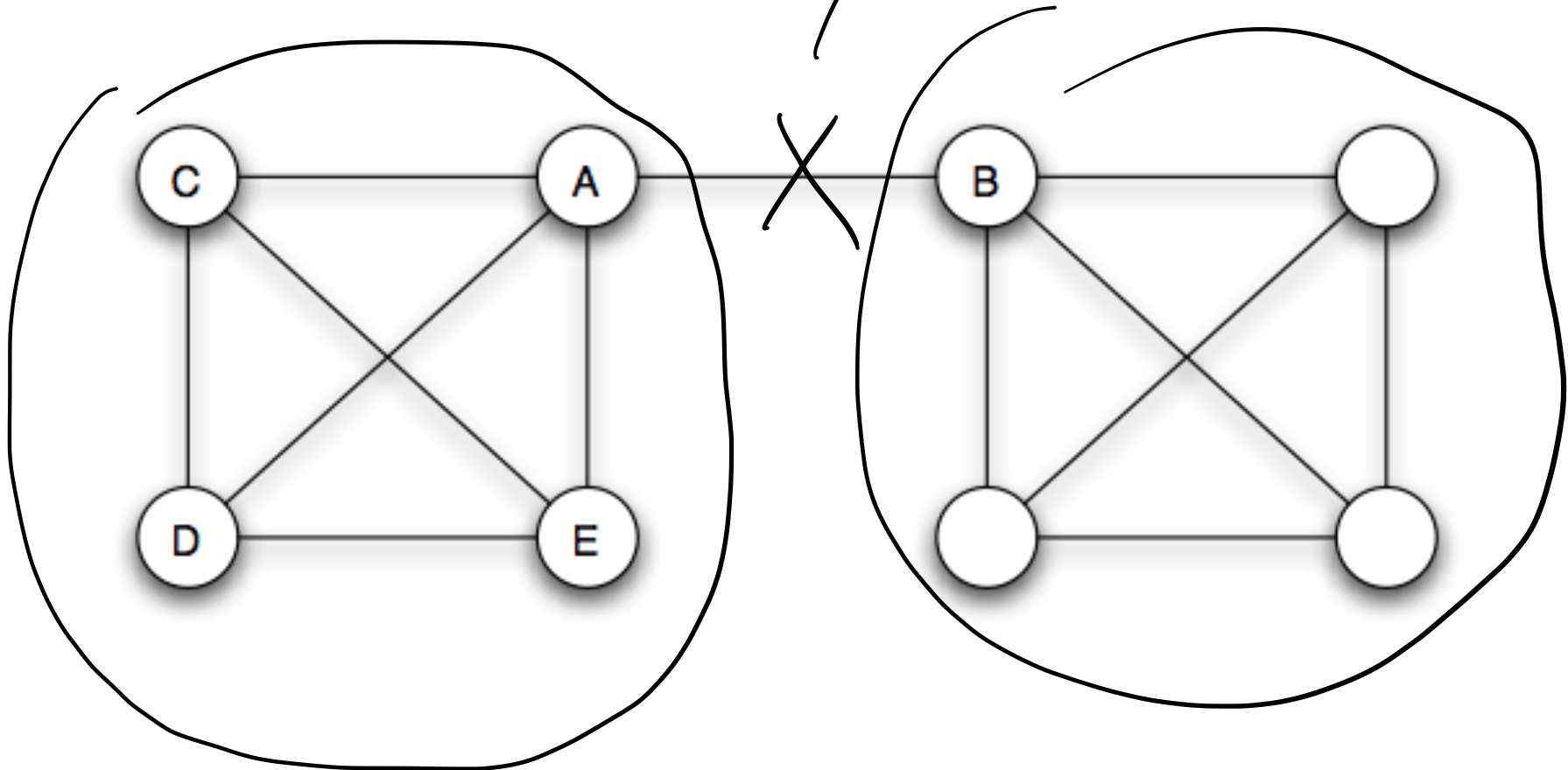
The Strength of Weak Ties

interpersonal ties resemble with
triadic closure

weak vs strong ties

weak ties have access
to information that
a node don't

Bridge



(Strong) definition of a bridge

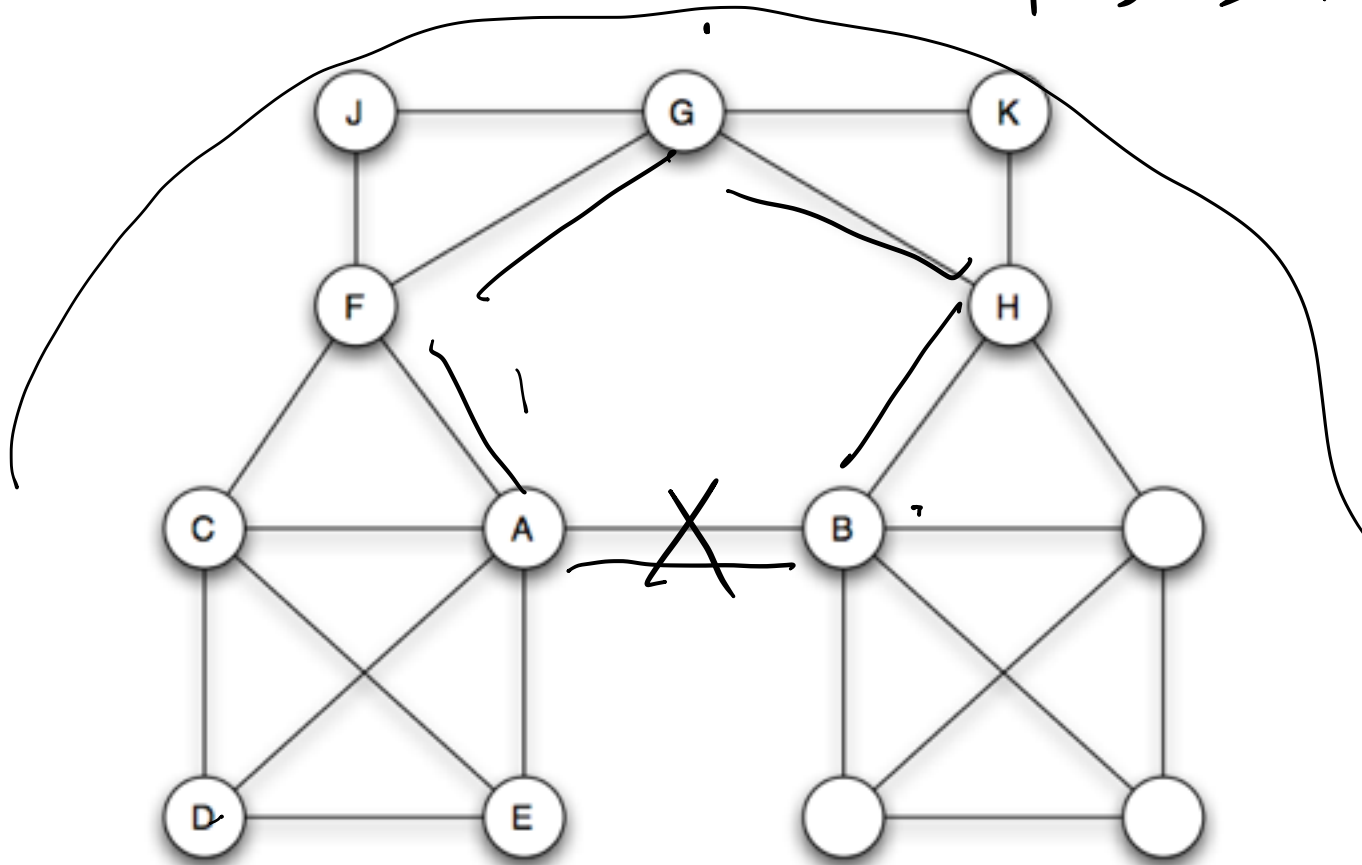
two nodes A B are connected by a bridge if deleting edge (A, B) the graph is divided in two different components

bridges are extremely rare in real world

$p(A, B)$
 $\rightarrow \text{length} = 1$

Longer paths

$p(A, B) \rightarrow l = 4$



Definition of a local bridge

if we remove edge (A, B)
it will take a
significantly longer path
to connect A and B.

"significantly" > 2

Span of a local bridge

Span : new distance between nodes A and B when (A, B) is removed

$$\text{Span}(A, B) = c$$

in the prev. ex.

The role of a local bridge

endpoints in a local bridge can receive fresher information because of their position.

- local bridge play roughly the same role of a bridge
- endpoints are likely to receive fresh information from the group they do not belong to.

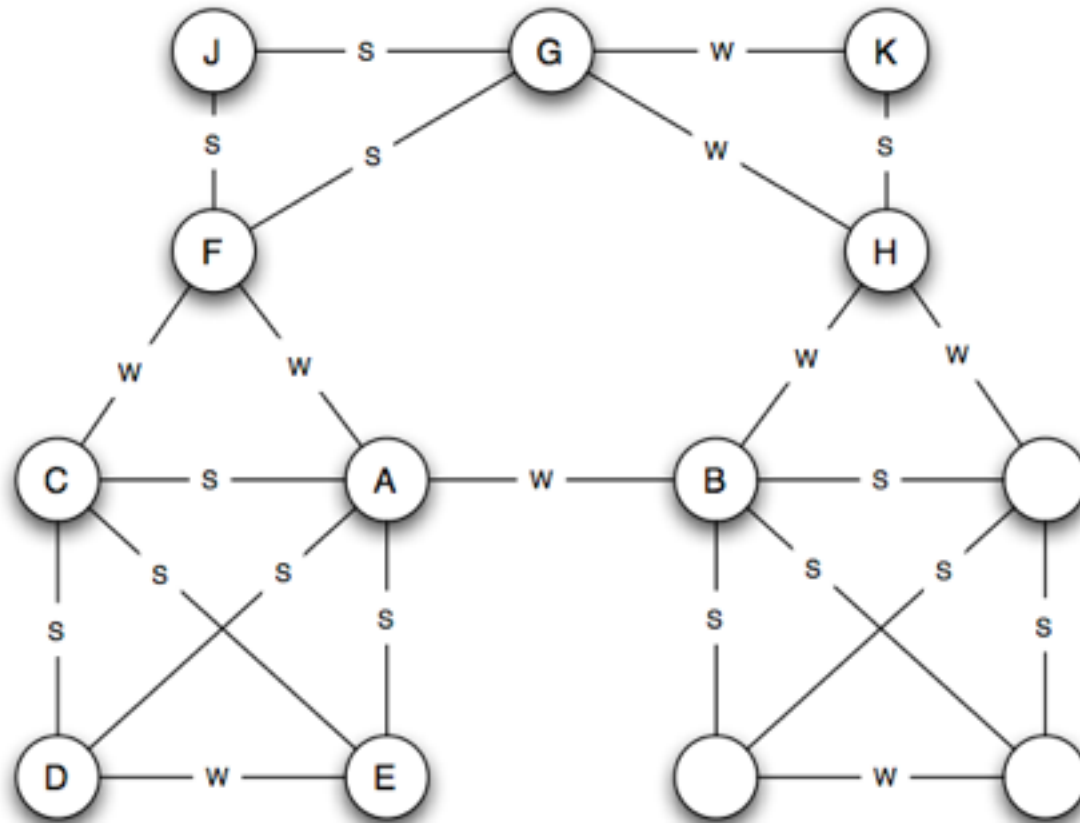
Different level of strength

Weak ties \rightarrow acquaintances

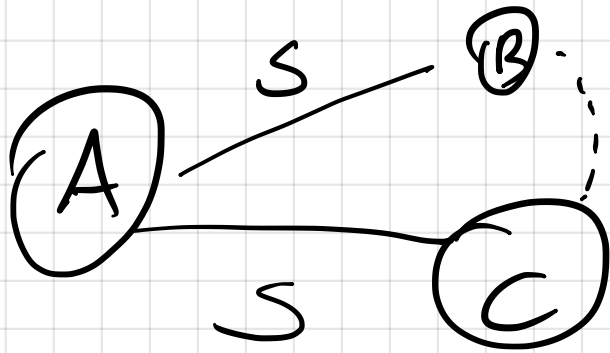
Strong ties \rightarrow friend

$\{w, s\}$: labels for edges

Strong and weak ties annotations



Triadic closure and strength of ties



"qualitative assumption"

Strong triadic Closure

more concrete

STC

property:

if A is connected to B

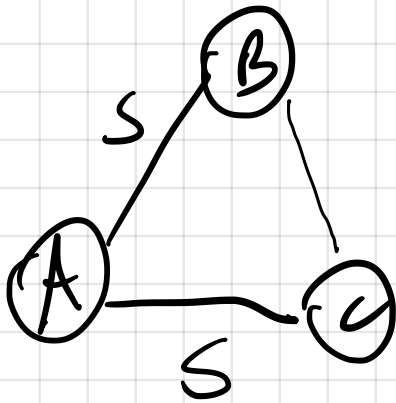
if $(A, C) \in L$

and

B and C

will be connected in

the future



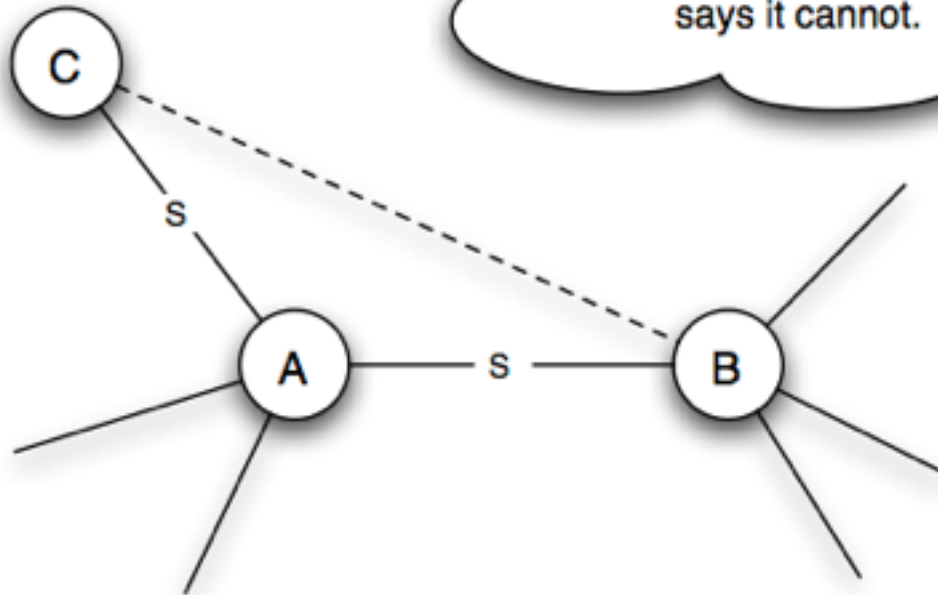
then

(A, B) , (A, C)
are both strong

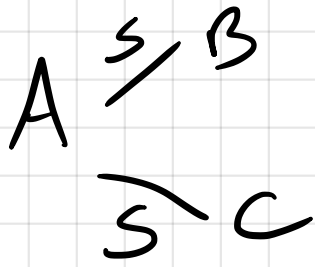
Local Bridges and Weak Ties

if a node A in a network satisfies the STC property and it is involved in at least two strong ties, then any local bridges it is involved in must be a weak tie

Strong Triadic Closure says the B-C edge must exist, but the definition of a local bridge says it cannot.

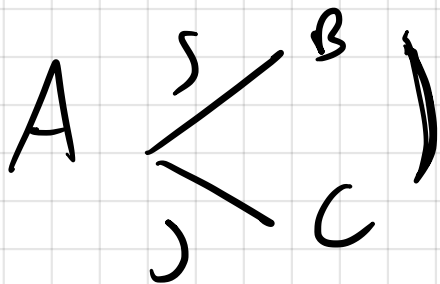


Proof by contradiction



(A, B) : is a bad bridge

if STC property holds

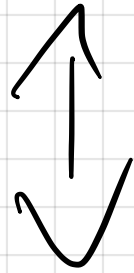
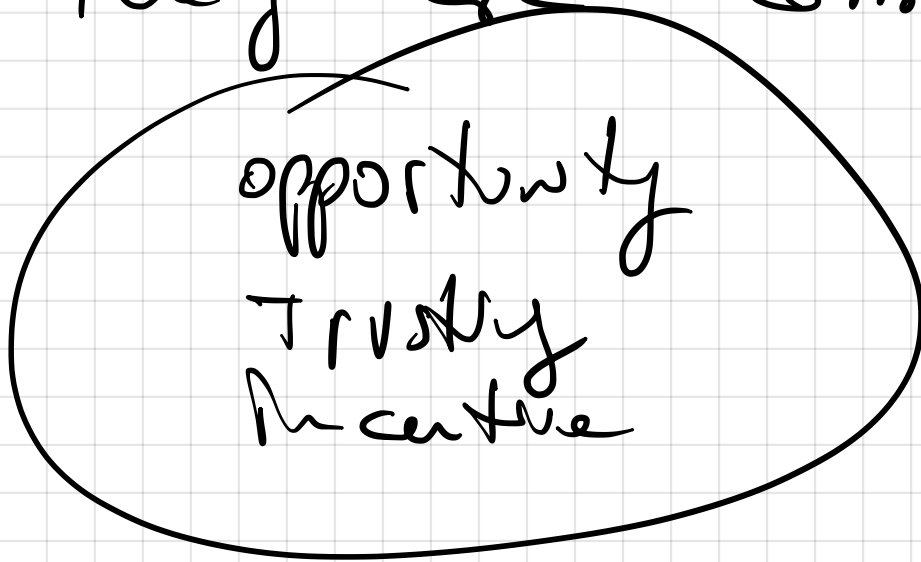


$\rightarrow (A, B)$ is not
a bad bridge

contradiction \square

Interpersonal and structural properties

they are connected



structural properties

STC property
STRONG

local
bridge
WEAK

Strong Triadic Closure property:
too STRONG?

real world is
not broken

However we want to
observe if good bridge
tend to be
weak too

Test or real Data

need to
validate

- large population
- with an appropriate measure to discriminate between local bridges and between weak and strong ties

Concrete framework

$$(w, s) = (0, 1)$$

we need different scales

$$\text{strength} \in [0, \infty)$$

Digital Communication network

"who talks to whom"
network

s \Leftrightarrow total time
spent in minutes

The case of cell-phone network

Finnish telecom company
20% market share

Omaelä et al 2007

• observation period:
18 week

• (A, B) = there was
a call
placed
by A to B

First observation

Giant Component
84% nodes

Generalizing the notions of weak ties and local bridges

$[0, \infty]$

no
cells plane

very
long
overlaps

↓ normal zone

$[0, 1]$

Neighborhood Overlap

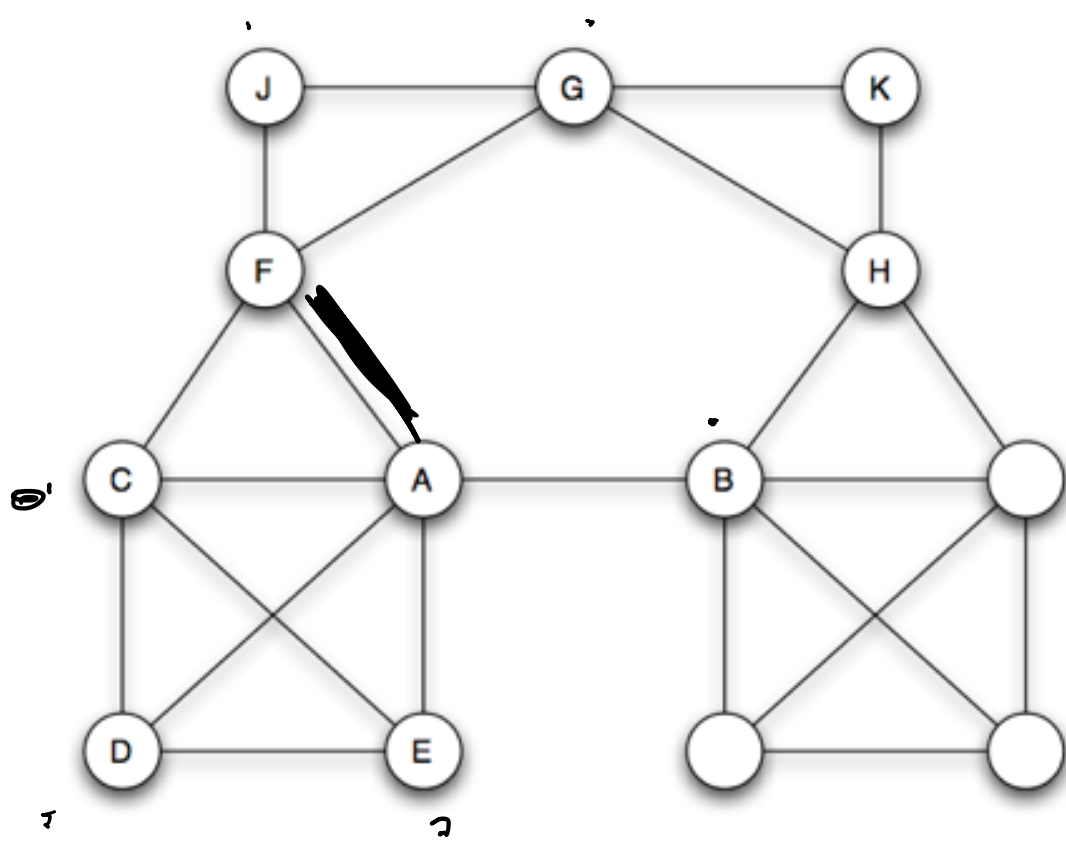
$N(A)$: Neighbors of A

$$O_{AB} = \frac{|N(A) \cap N(B)|}{|\{N(A) \cup N(B)\} \setminus \{A, B\}|}$$

O_{AB} : proxy for local bridge

$$Q_{AF} = \frac{1}{6}$$

Example

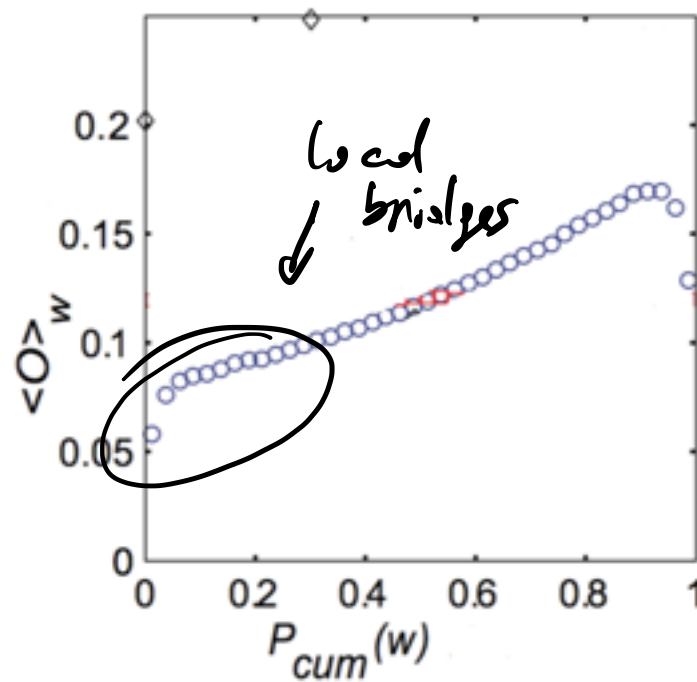


Key Feature

local bridge definition
is contained
in NO definition

$O_{AB} = \emptyset \Leftrightarrow (A, B)$
is a
local
bridge

Plotting neighborhood overlap



Indirect Analysis

Bunnell et al.

they started deleting edges

two ways

+ randomly

+ sorting by "strength"
and removing

weakest ties first

The second approach led to the **faster disconnection** of the whole network

Important!

this is just
a first step
to evaluate
sociological theories
to real world

Networks are important

to validate many
social theories
because they provide
a useful tool to deal
with big data

Tie Strength, Passive, Social Media Engagement

Social networking tools

(Facebook, Twitter, ...) help people maintain explicit information about their "social circles"

The strength of the ties can provide a useful perspective to better understand such circles formation

Case study: Facebook

where are the strong ties among a user's friends?

Tie Strength on Facebook

Weakest

All Friends



Maintained Relationships



"passive engagement"

One-way Communication



Mutual Communication



S

Merlow et al., 2009

Strongest

Take home message