



# Social Capital

## in Online Communities

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PIKM 2008 Workshop (CIKM)

# Intro & Related Work

# Social Capital

- Concept popularized by Robert Putnam
  - ▶ Fosters reciprocity, coordination, collaboration, and communication
  - ▶ Researched by many others including Burt, Lin, Coleman, and Bourdieu
  - ▶ Bonding and bridging
- Social connections are beneficial
  - ▶ Individual and group
  - ▶ Ex. CEO Compensation, open source projects
- How to measure?

# Researchers and Related Work

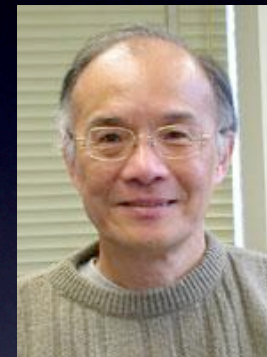
- Mark Granovetter
  - ▶ Strength of Weak Ties
  - ▶ Bridging is beneficial
  
- Ronald Burt
  - ▶ Brokerage and Closure
  - ▶ Structural Holes



# Researchers and Related Work

- Nan Lin

- ▶ Social Resources



- Robert Putnam

- ▶ Decline of Social Capital
- ▶ Bonding & Bridging
- ▶ Group membership analysis



# Factors of Social Capital

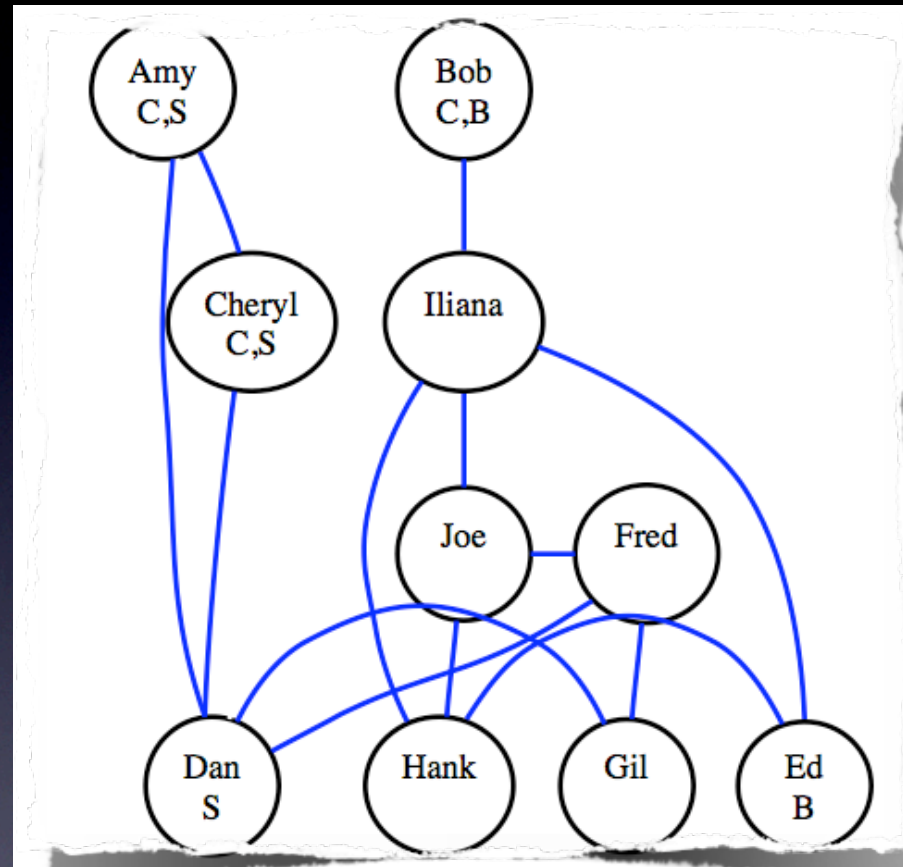
- **Relationships** (Burt, Granovetter)
  - ▶ context, strength
- **Individuals' attributes** (Putnam)
  - ▶ used to determine heterogeneity
- **Available social resources** (Lin, Bourdieu)
  - ▶ physical or symbolic

# Preliminary Work

# Types of Connections

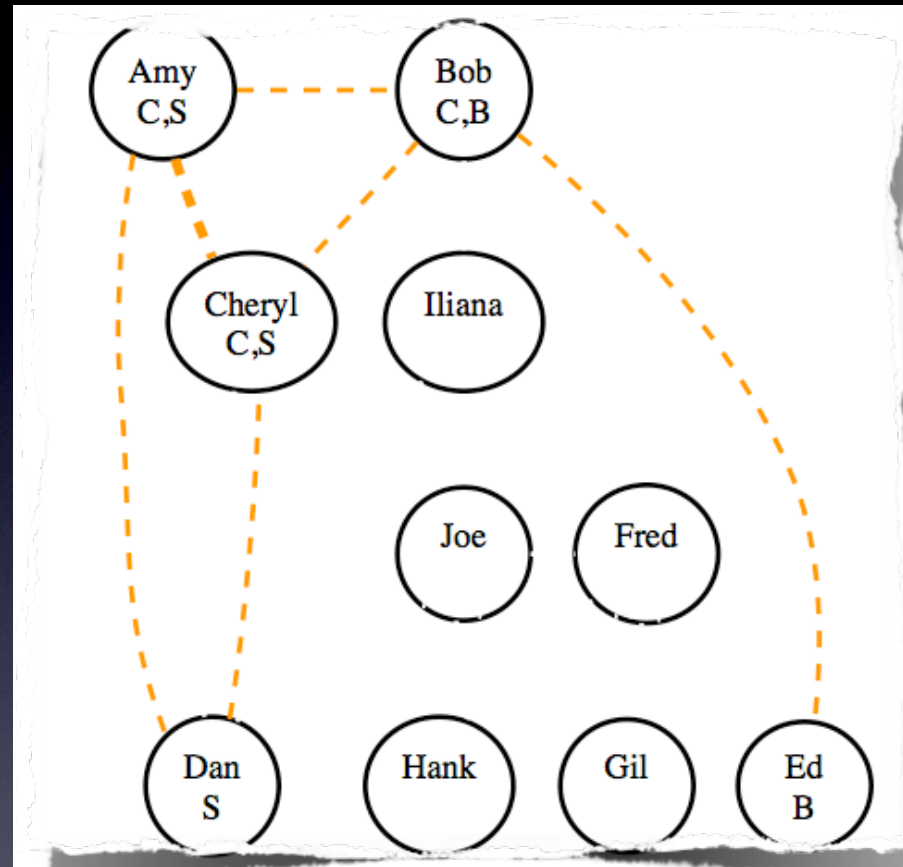
- Explicit Link
  - ▶ Direct knowledge, interaction, or communication
  - ▶ Ex. friends, web links, and club members
  - ▶ Explicit Social Networks (ESNs)
- Implicit Link
  - ▶ Inherent similarities or affinities
  - ▶ Ex. attributes, hobbies, interests, and background
  - ▶ Implicit Affinity Networks (IANs)

# ESN



**Explicit Social Network (ESN)**  
Links: Friends, Web Links, etc.

# IAN

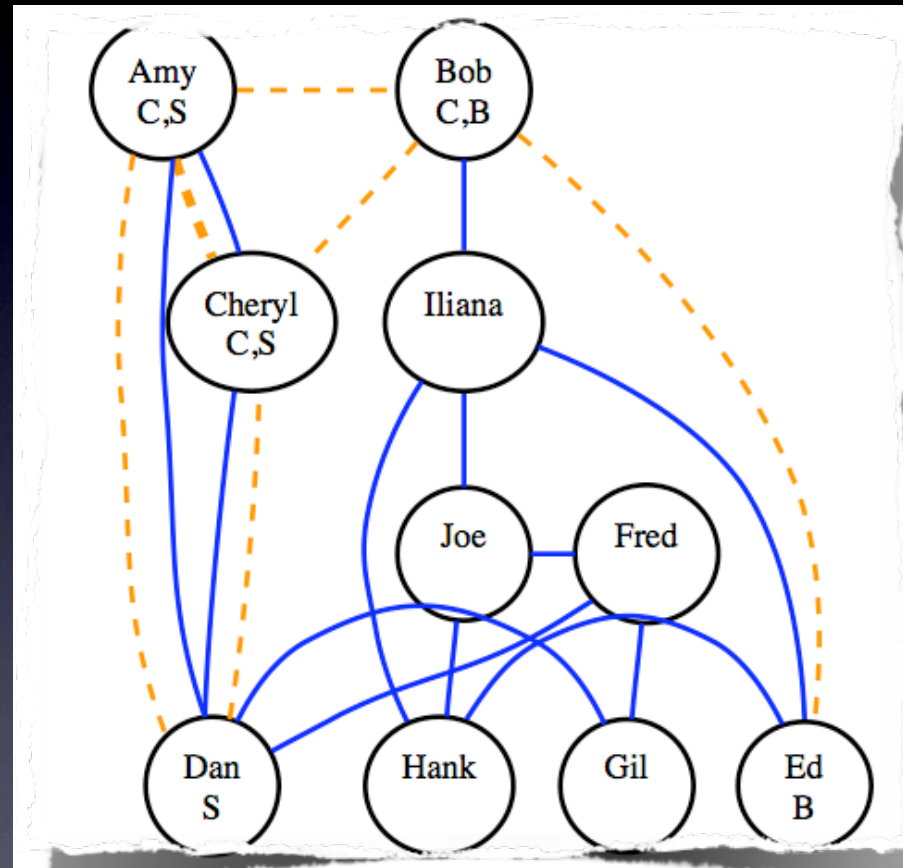


## Implicit Affinity Network (IAN)

Links: Affinities or inherent similarities

# Hybrid Network

## ESN overlaid with IAN



Applications: Medical, Political, Blogosphere, etc.

# Potential vs. Actual Social Capital

- Potential Social Capital (IAN)
- Actual Social Capital (ESN)
  - ▶ Accrues only when explicit links are present

		IAN Link	
		Yes	No
ESN Link	Yes	Actual Bonding	Actual Bridging
	No	Potential Bonding	Potential Bridging

# Bonding and Bridging Social Capital

- Individual

$$bonding(i, j) = s_{ij}^{IAN} s_{ij}^{ESN}$$

$$bridging(i, j) = (1 - s_{ij}^{IAN}) s_{ij}^{ESN}$$

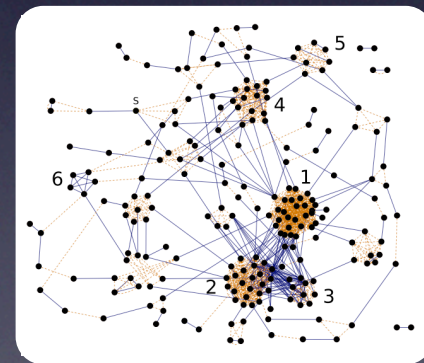
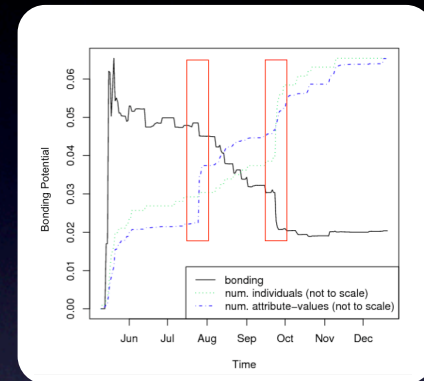
- Network

$$bonding = \frac{\sum_{i,j} bonding(i, j)}{\sum_{i,j} s_{ij}^{IAN}}$$

$$bridging = \frac{\sum_{i,j} bridging(i, j)}{\sum_{i,j} 1 - s_{ij}^{IAN}}$$

# Experiments

- IAN community (WITS)
  - ▶ New communities create bridging potential
- Blogosphere (AAAI Symposium)
  - ▶ Bloggers are connected by both implicit and explicit links
  - ▶ Identified opportunities for bridging and bonding



# Proposed Work

# Improve Node Evaluation

- Derive a formula to estimate the social capital of a particular individual
- Base formulation on:
  - ▶ **relationships**
  - ▶ **attributes**, and
  - ▶ ***social resources***

# Social Resources

- Material Goods
  - ▶ land, houses, car, and money
- Symbolic Goods
  - ▶ education, memberships in clubs, honorific degrees, nobility or organizational titles, family name, reputation, or fame

From: Lin 2001, Social Capital: A Theory of Social Structure and Action

# Identify Social Resources

- Identify a set of *measurable* social resources accessible within online communities

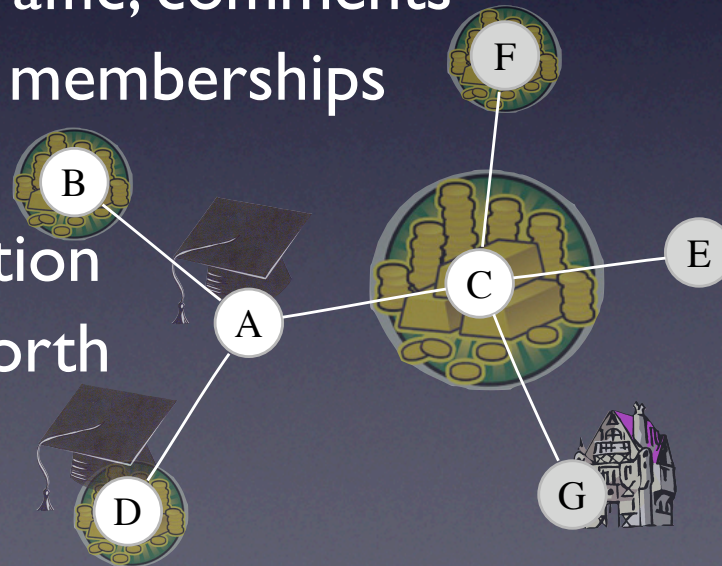
- Possibilities

- ▶ web traffic, comments

- ▶ group memberships

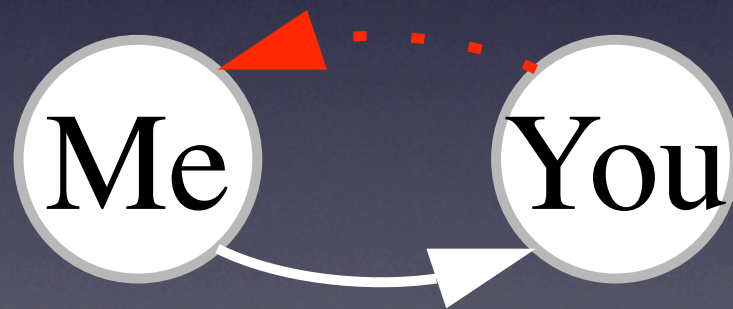
- ▶ education

- ▶ net worth



# Access Connecting Costs

- Reciprocal Connections
  - ▶ Connecting to You is relatively inexpensive
  - ▶ However, convincing You to connect to Me can be relatively expensive



# Validation

- Validate Proposed Models
  - ▶ Measure social capital using the proposed models for communities overtime
  - ▶ Compare measured social capital to existing social capital evidence

# Experiments

- Blogosphere
  - ▶ open community, free-form, explicit and implicit connections present, measurable
  - ▶ identifiable social resources (*hopefully*)
- Medical communities
  - ▶ increasingly common, implicit and explicit links available
  - ▶ beneficial for patient support groups

Conclusion

# Conclusion

- We have proposed to create a quantitative model for characterizing and providing decision support on how to maximize participation within social networks.
- Major challenges:
  - ▶ Identifying social resources
  - ▶ Validation

# Impact

- This research will be useful in answering important questions, such as:
  - ▶ Who should a newcomer to a community attempt to connect with?
  - ▶ How much social capital does each individual (or a group) have access to?
  - ▶ What social resources were mobilized within the community during the past month?
  - ▶ Which individuals tend to mobilize the most social resources?

# Questions & Comments

Ask me now:



Email or Call me:

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Extra Slides

# Network Extremes

- Fully connected explicitly and fully disconnected implicitly (all attributes are different)
  - ▶ Potential Bonding: 0    Actual Bonding: 0/0 ~ 0
  - ▶ Potential Bridging: 0    Actual Bridging: 1
- Fully disconnected explicitly and fully connected implicitly (all attributes are common)
  - ▶ Potential Bonding: 1    Actual Bonding: 0
  - ▶ Potential Bridging: 0    Actual Bridging: 0/0 ~ 0