### Social Network Analysis

2: Social relationships, relational data, and research designs

Federico Bianchi

Department of Social and Political Sciences - University of Milan

4 April, 2025

Network research

Mechanisms, processes, network

Research design

Socio-centric vs. ego-centric

Background

#### Network research

### Good models for good research

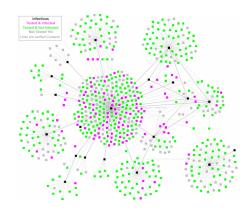
- Graph theory allows us to represent relationships between objects.
- Network science/research is the study of relational data (Brandes et al. 2013)
- ▶ In the social sciences we use it to model social relationships between social actors. Social networks are models of social relationships.
- Models are neither true nor false. They can be more or less useful as representations of what we aim to study.
- ▶ Beware of the assumptions!

#### Social ties



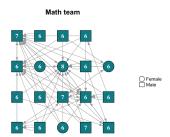
Friendship ties within a class of a Hungarian high school (Vit et al. 2024)

#### Social contacts



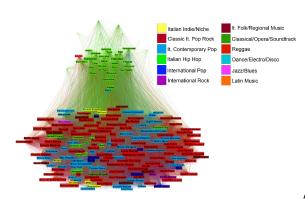
Contacts of a sample of tubercolosis-infected people in Southwest America, 2010 (Andre et al. 2007)

### Social perception



Nominations to represent a classroom (high school in Milan, 2019) in a math competition by gender (De Gioannis, Bianchi, and Squazzoni 2023)

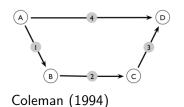
#### Social network?



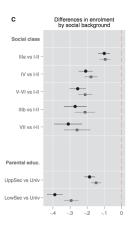
Airoldi (2021)

#### Mechanisms, processes, network

#### Social mechanisms

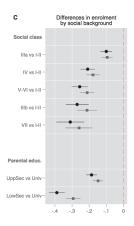


- Social network research doesn't commit to any particular paradigm
- Basic assumption: actors' intentionality
- Analytical approach to sociology: Explaining macro-level social phenomena through micro-level causal mechanisms (Hedström and Bearman 2009)
- Network analysis: testing relational processes implied by hypothetical causal mechanisms
- Mechanisms > relational processes (behaviour)



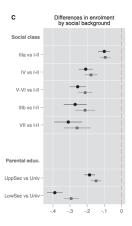
What mechanism (Barone, Triventi, and Assirelli 2018)?

fewer resources to finance tertiary education fees?



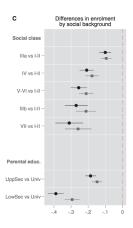
What mechanism (Barone, Triventi, and Assirelli 2018)?

- fewer resources to finance tertiary education fees?
- acquisition of high cultural capital perceived as less important?



# What mechanism (Barone, Triventi, and Assirelli 2018)?

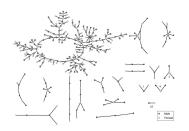
- fewer resources to finance tertiary education fees?
- acquisition of high cultural capital perceived as less important?
- ► higher risk aversion?



What mechanism (Barone, Triventi, and Assirelli 2018)?

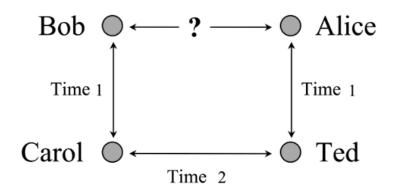
- fewer resources to finance tertiary education fees?
- acquisition of high cultural capital perceived as less important?
- ▶ higher risk aversion?
- lower-track secondary schools?

### Example 2

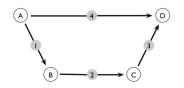


Romantic/sexual relationships in a US high school (Bearman, Moody, and Stovel 2004)

#### Example 2



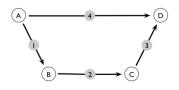
#### Social influence



Actors' relationships shape their opportunities to:

- interact with others
- access resources controlled by others (e.g., material goods, information), inc. being exposed to others' behaviour, opinions, beliefs, values (culture)

#### Social selection

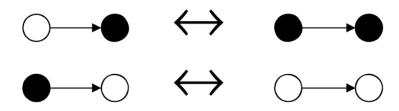


Actors choose interaction partners among those available according to the latters' and their own:

- beliefs
- desires
- preferences

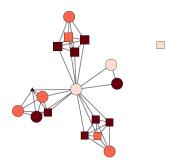
#### Research design

#### Network as explanans



- Social networks can be studied as predictors (X) of certain outcomes (Y)
- Estimating the effect of actors' social network positions  $(X_i)$  on other individual properties  $(Y_i)$

### Structure of older adults' relationships on cognitive decline



Bianchi et al. (2023)

- Research question: Does complexity of personal networks (X) mitigate older adults' cognitive decline (Y)?
- Mechanism: Interacting with people of different clusters implies behaving within different normative and cultural frames, which keeps the brain active and mitigates older adults' neurophysiological ageing
- Hypothesis: Negative effect of number of clusters on MMSE (Mini-Mental State Examination)

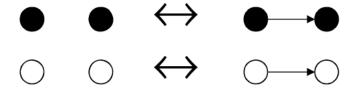
### Peers' influence on academic aspirations



Vit et al. (2024)

- Research question: Do high-school students adjust their academic aspirations to their school friends'?
- Mechanism: Teenagers are especially sensitive to peer pressure from their classmates, which pushes them towards conformity to avoid psychological stress and the risk of being ostracized, which then brings them to adapt their aspirations to their peers
- Hypothesis: Positive effect of average aspiration level in reading and maths of one's school friends on own aspirations over time

#### Networks as *outcomes*



- Social networks can be explained as outcomes (explanandum)
   (Y) of certain individual-level predictors (X)
- Estimating the effect of actors' properties (e.g., physical traits, beliefs, preferences, behaviour, etc.)  $(X_i)$  on their network position  $(Y_i)$

### Age and intergenerational contact

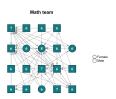




Vacca and Bianchi (2024)

- Research question: Does age increase the likelihood of intergenerational contacts?
- ▶ Mechanism: High mortality of same-age friends and acquaintances increase the relative degree of opportunities to physically interact with younger-generation individuals.
- ► Hypothesis: Positive effect of age on the proportion of younger contact partners in older adults' personal networks

### Gender and STEM ability attribution



De Gioannis, Bianchi, and Squazzoni (2023)

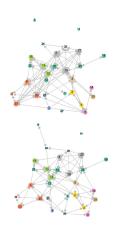
- Research question: Do high-school students underestimate females' abilities in science?
- Mechanism: Perception of social status based on unobservable skills is affected by stereotyped beliefs, which leads high-school students to underestimate females' abilities in science
- Hypothesis: Negative effect of being female on the net likelihood of being nominated as science expert, despite actual performance.



▶ Bianchi, Casnici, and Squazzoni (2018)



- Bianchi, Casnici, and Squazzoni (2018)
- ► Can support expectations emerge from professional collaboration relationships?



- ▶ Bianchi, Casnici, and Squazzoni (2018)
- ► Can support expectations emerge from professional collaboration relationships?
- Are networks predictors or outcomes? Is there anything as a purely structural process?



- ▶ Bianchi, Casnici, and Squazzoni (2018)
- ► Can support expectations emerge from professional collaboration relationships?
- Are networks predictors or outcomes? Is there anything as a purely structural process?
- Mechanism: Risky, informal economic exchange allows actors to learn each other' trustworthiness, which eventually generates expectations of receiving social support (Molm, Collett, and Schaefer 2007)

#### Socio-centric vs. ego-centric

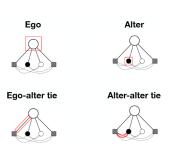
### Full-network design



Bianchi, Casnici, and Squazzoni (2018)

- Synonims: full-network or sociocentric design
- Studying the set of links among all pairs of nodes in a given set
- ► Problem: network boundaries!

### Ego-network design



Vacca and Bianchi (2024)

- Synonims: ego-centred or egocentric design or ego-network
- Ego-network (ego-net): the set of links that a focal actor has with a set of other actors
- An ego-network study is the study of the personal networks of a sample of egos

## (Difficult) decisions

- Research question: Do friends' gender-based stereotypes affect female secondary school students' decisions on university career paths?
- Ego-network or whole-network?

### Background

### Reading

Borgatti, Everett, and Johnson (2013), Ch. 1

Robins (2015), Ch. 3

Borgatti et al. (2009)

#### References I

Airoldi, Massimo. 2021. 'The Techno-Social Reproduction of Taste Boundaries on Digital Platforms: The Case of Music on YouTube'. *Poetics*, 101563.

https://doi.org/10.1016/j.poetic.2021.101563.

Andre, McKenzie, Kashef Ijaz, Jon D Tillinghast, Valdis E Krebs, Lois A Diem, Beverly Metchock, Theresa Crisp, and Peter D McElroy. 2007. 'Transmission Network Analysis to Complement Routine Tuberculosis Contact Investigations'. *American Journal of Public Health* 97 (3): 470–77.

https://doi.org/10.2105/AJPH.2005.071936.

#### References II

- Barone, Carlo, Moris Triventi, and Giulia Assirelli. 2018. 'Explaining Social Inequalities in Access to University: A Test of Rational Choice Mechanisms in Italy'. *European Sociological Review* 34 (5): 554–69. https://doi.org/10.1093/esr/jcy028.
- Bearman, Peter S., James Moody, and Katherine Stovel. 2004. 'Chains of Affection: The Structure of Adolescent Romantic and Sexual Networks'. *American Journal of Sociology* 110 (1): 44–91. https://doi.org/10.1086/386272.
- Bianchi, Federico, Niccolò Casnici, and Flaminio Squazzoni. 2018. 'Solidarity as a Byproduct of Professional Collaboration: Social Support and Trust in a Coworking Space'. *Social Networks* 54: 61–72. https://doi.org/10.1016/j.socnet.2017.12.002.

#### References III

- Bianchi, Federico, Matteo Piolatto, Alessandra and Marengoni, and Flaminio Squazzoni. 2023. 'Structure of Personal Networks and Cognitive Abilities: A Study on a Sample of Italian Older Adults'. Social Networks 74: 71–77.
- Borgatti, Stephen P., Martin G. Everett, and Jeffrey C. Johnson. 2013. *Analyzing Social Networks*. London: Sage.
- Borgatti, Stephen P., Ajay Mehra, Daniel J. Brass, and Giuseppe Labianca. 2009. 'Network Analysis in the Social Sciences'. *Science* 323 (5916): 892–95.
  - https://doi.org/10.1126/science.1165821.
- Brandes, Ulrik, Garry Robins, A. N. N. McCranie, and Stanley Wasserman. 2013. 'What Is Network Science?' *Network Science* 1 (1): 1–15. https://doi.org/10.1017/nws.2013.2.

#### References IV

- Coleman, James S. 1994. *Foundations of Social Theory*. Cambridge, MA: Harvard University Press.
- De Gioannis, Elena, Federico Bianchi, and Flaminio Squazzoni. 2023. 'Gender Stereotypes in the Classroom: Self and Peers' Ability Attribution Among High-School Students in Italy'. *Social Networks* 72: 44–51.
  - https://doi.org/10.1016/j.socnet.2022.09.001.
- Hedström, Peter, and Peter Bearman. 2009. 'What Is Analytical Sociology All about? An Introductory Essay'. In *The Oxford Handbook of Analytical Sociology*, edited by Peter Hedström and Peter Bearman. Oxford: Oxford University Press.

#### References V

- Molm, Linda D, Jessica L Collett, and David R Schaefer. 2007. 'Building Solidarity Through Generalized Exchange: A Theory of Reciprocity'. *American Journal of Sociology* 113 (1): 205–42. https://doi.org/10.1086/517900.
- Robins, Garry. 2015. Doing Social Network Research.

  Network-Based Research Design for Social Scientists. London: Sage.
- Vacca, Raffaele, and Federico Bianchi. 2024. 'Diversity, Integration, and Variability of Intergenerational Relationships in Old Age: New Insights from Personal Network Research'. *Social Science Research* 119: 102991.
  - https://doi.org/10.1016/j.ssresearch.2024.102991.

#### References VI

Vit, Eszter, Federico Bianchi, Marco Castellani, and Károly Takács. 2024. 'Friends Can Help to Aim High: Peer Influence and Selection Effects on Academic Ambitions and Achievement'. Journal of Early Adolescence.

https://doi.org/10.1177/02724316241273427.