

# Data



Center for Public Health  
Systems Science

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# Goals

- Understand the kind of information network analysis handles and how it can be displayed
- Learn how to decide who is in the network
- Learn how to collect network data
- Exploring various network data tasks in R



# Network Data Structures

What kinds of data need to be in network objects?



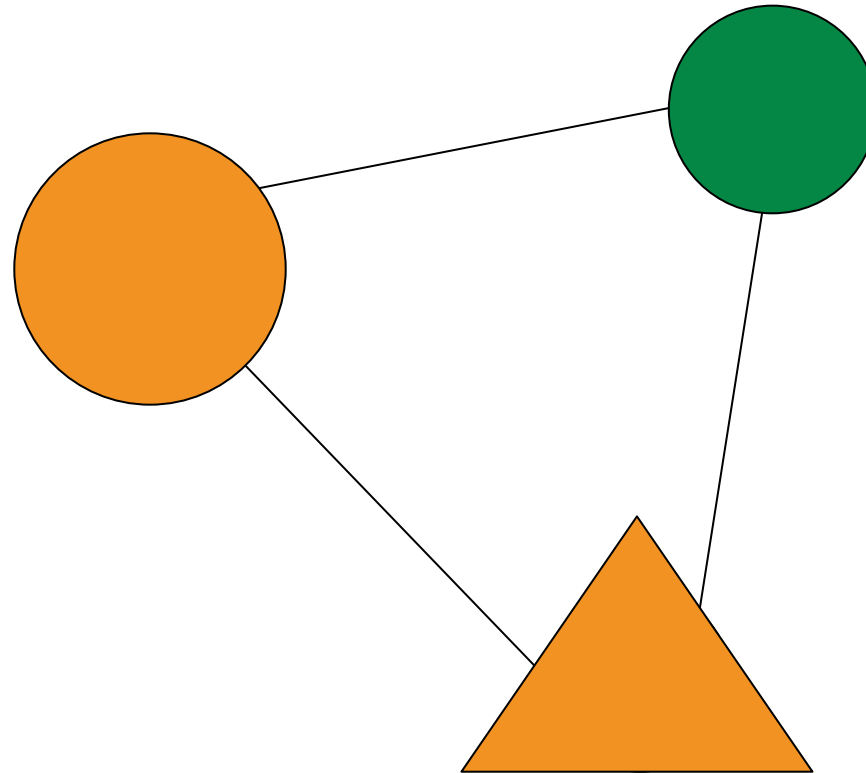
# Types of information in network data

Type	Description	Required?
Nodes	List of nodes in network, along with node names	Required
Ties	List of ties in the network	Required
Node attributes	Node characteristics	Optional
Tie attributes	Tie characteristics	Optional
Meta-data	Other information about the entire network	Depends



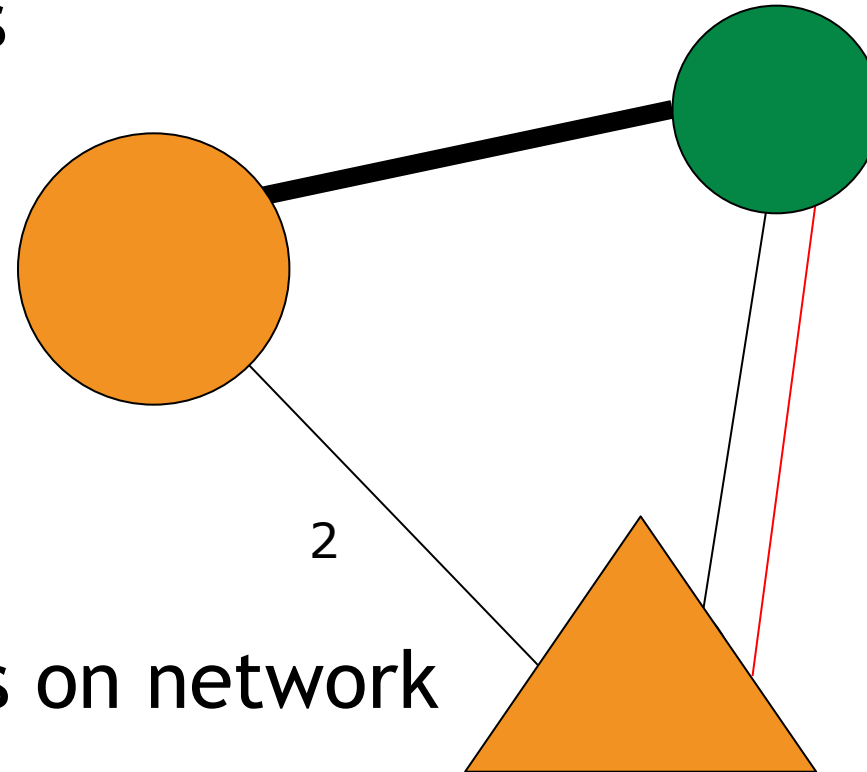
# Node Attributes

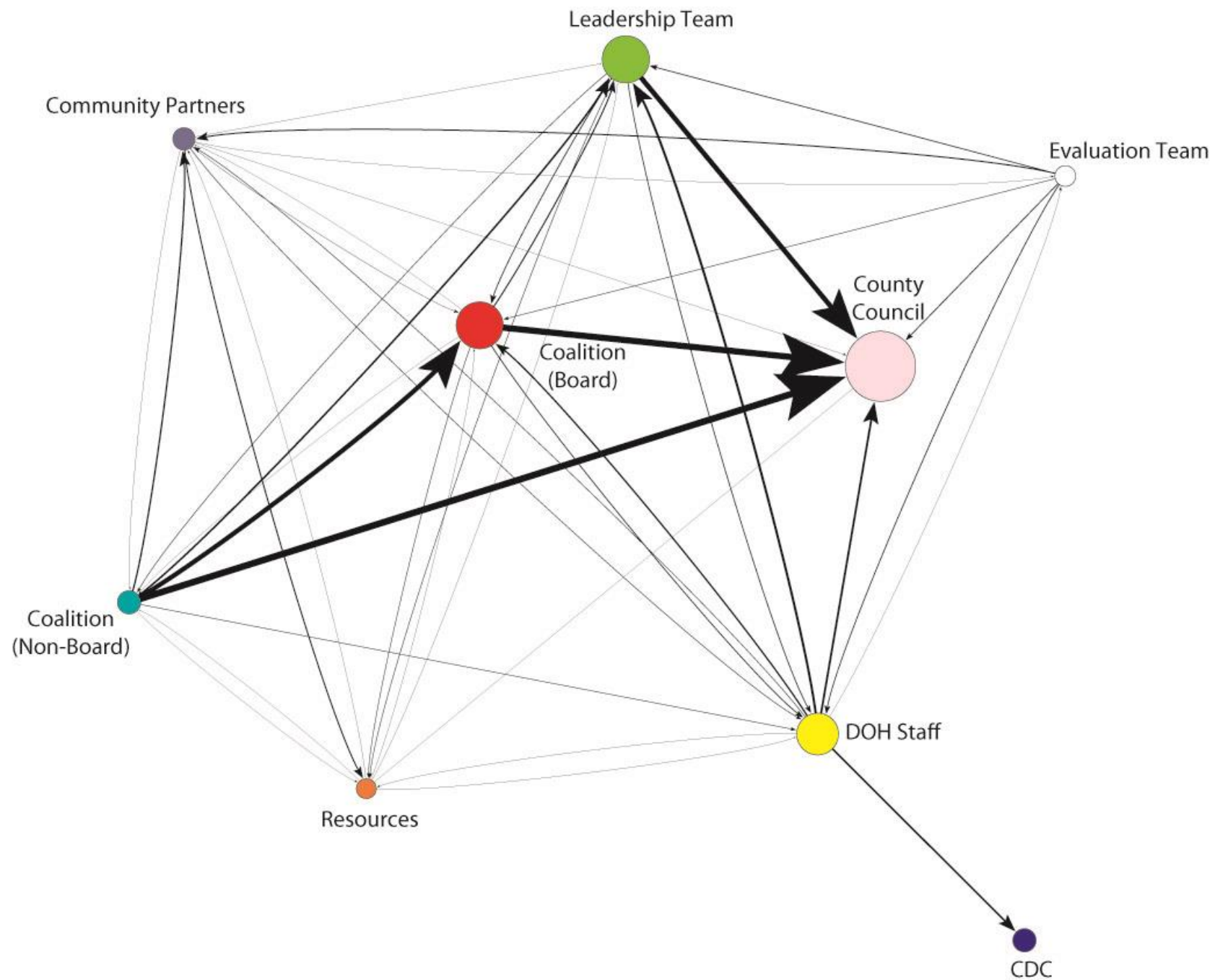
- Categorical - color & shape
- Continuous - size



# Link Attributes

- Multiple relationships (multiplexity)
  - Multiple lines
  - Color optional
- Valued relationships
  - Number
  - Line thickness
- Visualization depends on network size





# Network data collection

Network delineation, boundary specification, data collection modes





# Boundary Specification Goals

- Determine who is in the network = population of interest
  - “2012 ISSH attendees”
  - “St. Louis tobacco control partners”
- Try to measure everyone
  - High response rate more critical than in other kinds of research
- Including key actors is more important than the size of the network



# Approaches

- Realist (internal) - network members could identify themselves and each other (i.e. club membership)
- Nominalist (external) - determined by external criteria, possibly researcher-defined (citation networks)
- Laumann criteria
  - Positional - formal membership
  - Reputational - knowledgeable person names members
  - Event - participation in certain activities
  - Relational - contact with others in the network



# Example

## National Networks Identification

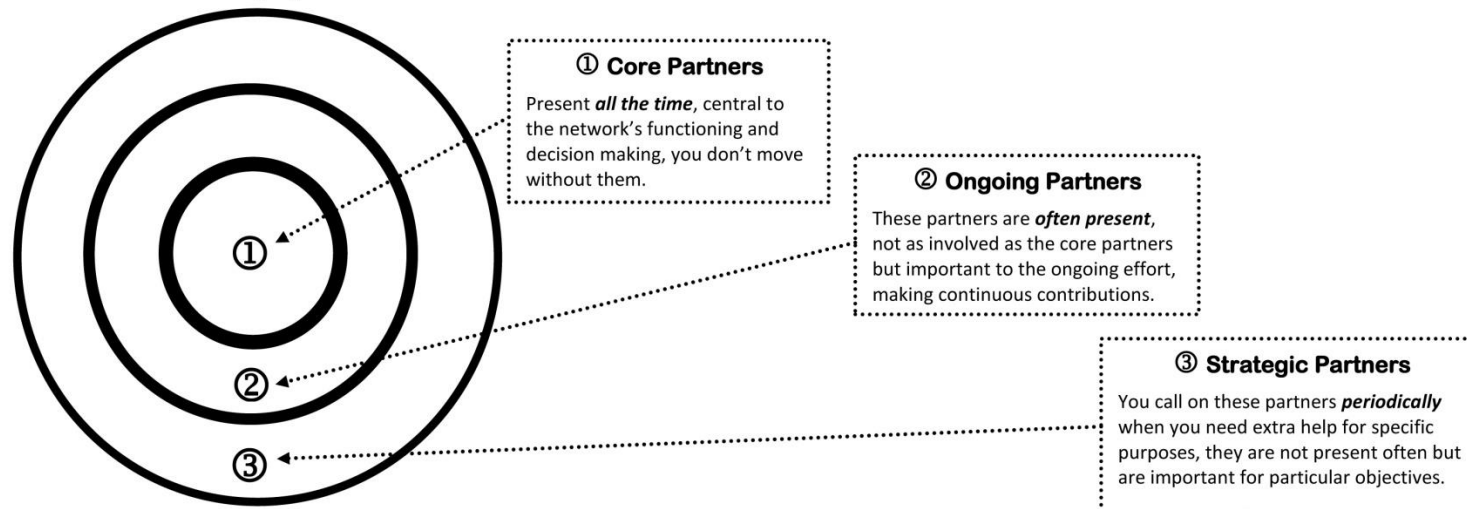
Goal: To collect an initial list of people who will participate in our web survey evaluation of partners working together to achieve common goals in tobacco control for the [specify population].

Definition: The core, ongoing, and strategic network is a partnership of critical agencies that are leading efforts in commercial tobacco control among the [specify network].

Identification criteria: The core, ongoing, and strategic network includes any critical organizations or individuals within your network who you have had direct contact with *in the last 12 months*, and meet *any* of the following criteria:

- Has provided input for strategic planning on tobacco control for the Network,
- Has conducted program and/or policy efforts in tobacco control at the national, regional, or local levels,
- Has helped enhance the ability of the Network to perform its activities and achieve its goals for tobacco control

The figure below may help you think of the variety of partners in your network. Please think of the partners you have in each category, and include them on the form that follows if they meet the above criteria. Don't worry if you have trouble sorting a partner into one category or the other – it is more important to have a qualified partner included somewhere than it is to have them “correctly” sorted. Please list only one individual per organization. Please provide phone and email information for all partners. This is very important, as that will enable us to contact each individual. Feel free to include multiple phone numbers or email addresses for each.



\*Adapted from the Center for Managing Chronic Disease at the University of Michigan



# Roster vs. Free Recall

- Roster: respondent given entire list of network members to answer questions about



- Example roster screening question
  - All network actors appear
  - “No” responses do not appear in later questions

Are you aware of the following individuals' work regarding tobacco control?

	Yes	No
Marty Dannenfelser, ACF	<input type="checkbox"/>	<input type="checkbox"/>
Anne Linehan, ACF	<input type="checkbox"/>	<input type="checkbox"/>
Harriett Bennett, AHRQ	<input type="checkbox"/>	<input type="checkbox"/>
Elizabeth (Beth) Edgerton, AHRQ	<input type="checkbox"/>	<input type="checkbox"/>
Ernstene (Tina) Murray, AHRQ	<input type="checkbox"/>	<input type="checkbox"/>
Christine Williams, AHRQ	<input type="checkbox"/>	<input type="checkbox"/>
Rosemarie Henson, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Corinne Husten, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Laura Kann, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Paula Kocher, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Brick Lancaster, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Ann Malarcher, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Jeffrey (Jeff) McKenna, CDC	<input type="checkbox"/>	<input type="checkbox"/>
David E. Nelson, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Terry Pechacek, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Patricia Richter, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Charlotte Schoenborn, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Michael Schooley, CDC	<input type="checkbox"/>	<input type="checkbox"/>
Dana Shelton, CDC	<input type="checkbox"/>	<input type="checkbox"/>
James (Jim) Coan, CMS	<input type="checkbox"/>	<input type="checkbox"/>
Jyme Schafer, CMS	<input type="checkbox"/>	<input type="checkbox"/>
Steve Galson, FDA	<input type="checkbox"/>	<input type="checkbox"/>



# Roster vs. Free Recall

- Roster: respondent given entire list of network members to answer questions about
- Free recall: respondent asked to identify network members
  - Name generator questions used to elicit a set of network members
    - “Who are the 10 people most important to the completion of grant activities?”
    - “Who are the 10 people you work with most on grant activities?”
    - “Who are your 5 closest friends?”
  - Common to use multiple name generators to ensure adequate coverage
  - Caution: be *very* clear in your instructions



# Example free recall name generator question

In this section, we want to find out who you feel is most important to the completion of the CPPW activities.

The major CPPW activities are:

- Youth media campaign,
- Strengthening the County smokefree workplace ordinance,
- Strengthening ordinances in targeted municipalities,
- Strengthening K-12 and/or higher education policies,
- Augmenting required signage to include a graphic warning,
- Auditing tobacco retailers for compliance with FDA and County regulations,
- Increasing use of the Missouri Quitline, and
- Increasing workplace and/or general cessation provision.

Please identify up to 15 people who you think are the *most important to the successful completion* of the above CPPW activities. (Do not include those receiving interventions. In order for your information to be useful, you *must* include the names of *individual people* in the spaces for First and Last Name. Please include only one name per space.)

Important: 1

First Name

John

Last Name

Smith

Organization

DOH



# Snowball Sampling

- Use free recall name generators w/ starting set of actors
- New names get recruited and asked the same name generator questions
- Repeat the process until some natural or imposed limit is reached. Sometimes the same actors are nominated after a certain amount of time → “natural” network has been identified.
- May want to add new members only if they’ve been mentioned more than once.
- Be realistic with workload estimates





# Network data sources

Where can you find or obtain network data?



# Archival/ Secondary

- Web of Science/Elsevier
- Administrative sources
- Listserv posts
- Emails
  - Enron
  - (<https://www.gregorybufithis.com/2019/04/04/text-analytics-the-enron-data-set-and-andrew-fastow-get-a-new-role/>)
- Facebook, any social media



# Collect your own

- Interviews
  - Telephone
  - In-person
- Surveys
  - Internet/web based
  - Paper
- Observation



# Example node attribute questions

- Keep consistent with level of analysis
  - Individuals
  - Organizations

**How long have you been employed at your agency?**

☐ *less than 1 year*

☐ *1-5 years*

☐ *6-10 years*

☐ *11-15 years*

☐ *16 or more years*

**How long have you been in your current position?**

☐ *less than 1 year*

☐ *1-5 years*

☐ *6-10 years*

☐ *11-15 years*

☐ *16 or more years*

**How long has your work included a focus on tobacco?**

☐ *I do not work in tobacco*

☐ *less than 1 year*

☐ *1-5 years*

☐ *6-10 years*

☐ *11-15 years*

☐ *16 or more years*



# Interview/Survey question formats

- Free vs. fixed choice
  - Free: no limit on nomination (“How much time do you spend with each of your best friends?”)
  - Fixed choice: specific or upper limit (“How much time do you spend with your 3 best friends?”)
- Ratings vs. rankings: name interpreter (item used to measure relational characteristics between actors)
  - Rating - score for each network member
  - Ranking - rank or sort each network member



# Example name interpreter question

Which response best describes your current level of collaboration (within the last 12 months) between you and the following partners?

	Do not work together	Share information only	Work together informally	Work as a formal team	Work as a formal team on multiple projects
Person 1 - Organization 1	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Person 3 - Organization 1	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Person 4 - Organization 1	<input type="radio"/>	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Person 6 - Organization 2	<input type="radio"/>	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
Person 8 - Organization 2	<input type="radio"/>	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>



# Example multiple relations question

For the people you named earlier, what types of CPPW activities have you worked together on? (Check all that apply.)

	Youth Media Campaign	Smokefree County Ordinance	Smokefree Municipality Ordinances	K-12/ Higher Ed Policies	Retailer Graphic Warning Ordinance	Promotional Item/ Discounted Product Ban Ordinance	Missouri Quitline	Workplace Policies/ Cessation	None of these
John Smith -- Centers for Disease Control and Prevention	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="radio"/>
Jen Thompson -- St Louis County Department of Health	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="radio"/>
Sean Jones -- Clear Channel Radio	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="radio"/>
Janet Shelton -- St Louis Post Dispatch	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="radio"/>



# Content types

Type	Examples
Filter/Recognition/Name Generator	Are you aware of this person's work in tobacco control?
	Name 15 people who you work with on your CDC grant.
Relationship Strength	Contact (Daily, Monthly, Weekly)
	Level of collaboration (Share Information, Informal Partnership, Formal Partnership)
Evaluative (good/bad)	How satisfied are you with the quality of communication you have with each of your partners?
	What barriers have you experienced in your work with each of your partners? (Time, Capacity, Politics)
Flow	Which of the following clinics do you refer patients to?
	Which of the following agencies do you receive funding from?





# Participant burden

- Each question gets asked for each actor in the network
- True load = # of actors answered for X # of questions

Actor	Q1	Q2	Q3	Q4
Person 1	1	2	3	4
Person 2	2	4	6	8
Person 3	3	6	9	12
Person 4	4	8	12	16
Person 5	5	10	15	20
...				
Person 100	100	200	300	400



# Measurement quality

- Accuracy higher for stable/long-term characteristics
- Individuals as representatives of organizations
- Reliability higher w/ closer relationships and when ratings/rankings done for all network members
- Roster format more reliable than free recall



# Online (network specific)

Tool	URL
PARTNER Tool	<a href="http://www.partnertool.net/">http://www.partnertool.net/</a>
C-IKNOW	<a href="http://ciknow.northwestern.edu/">http://ciknow.northwestern.edu/</a>
ONA	<a href="https://www.s2.onasurveys.com/">https://www.s2.onasurveys.com/</a>
FirmNet Online	<a href="http://www.firmnetonline.com/">http://www.firmnetonline.com/</a>
Network Genie	<a href="https://secure.networkgenie.com">https://secure.networkgenie.com</a>



# Online (non-network specific)

Tool	URL
Survey Monkey	<a href="http://www.surveymonkey.com/">http://www.surveymonkey.com/</a>
REDCap	<a href="http://project-redcap.org/">http://project-redcap.org/</a>
Snap	<a href="http://www.snapsurveys.com/">http://www.snapsurveys.com/</a>
Qualtrics	<a href="http://www.qualtrics.com/">http://www.qualtrics.com/</a>
Roster Example	<a href="http://sswwustl.qualtrics.com/SE/?SID=SV_3wm7g5nIWDOVIGg">http://sswwustl.qualtrics.com/SE/?SID=SV_3wm7g5nIWDOVIGg</a>
Free Recall/Name Generator Example	<a href="http://sswwustl.qualtrics.com/SE/?SID=SV_5vin0B5WbqmegtK">http://sswwustl.qualtrics.com/SE/?SID=SV_5vin0B5WbqmegtK</a>

