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# Network Dynamics & Vulnerability

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CRJ 523  
Network Criminology

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# Learning Goals

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- ❖ Understand an explanation of structural diversity in illicit networks.
- ❖ Revisit **degree** and **degree centralization**.
- ❖ Understand the differences between **error/attack** and **homogenous/inhomogeneous** in networks.
- ❖ Understand **security/efficiency tradeoff**.

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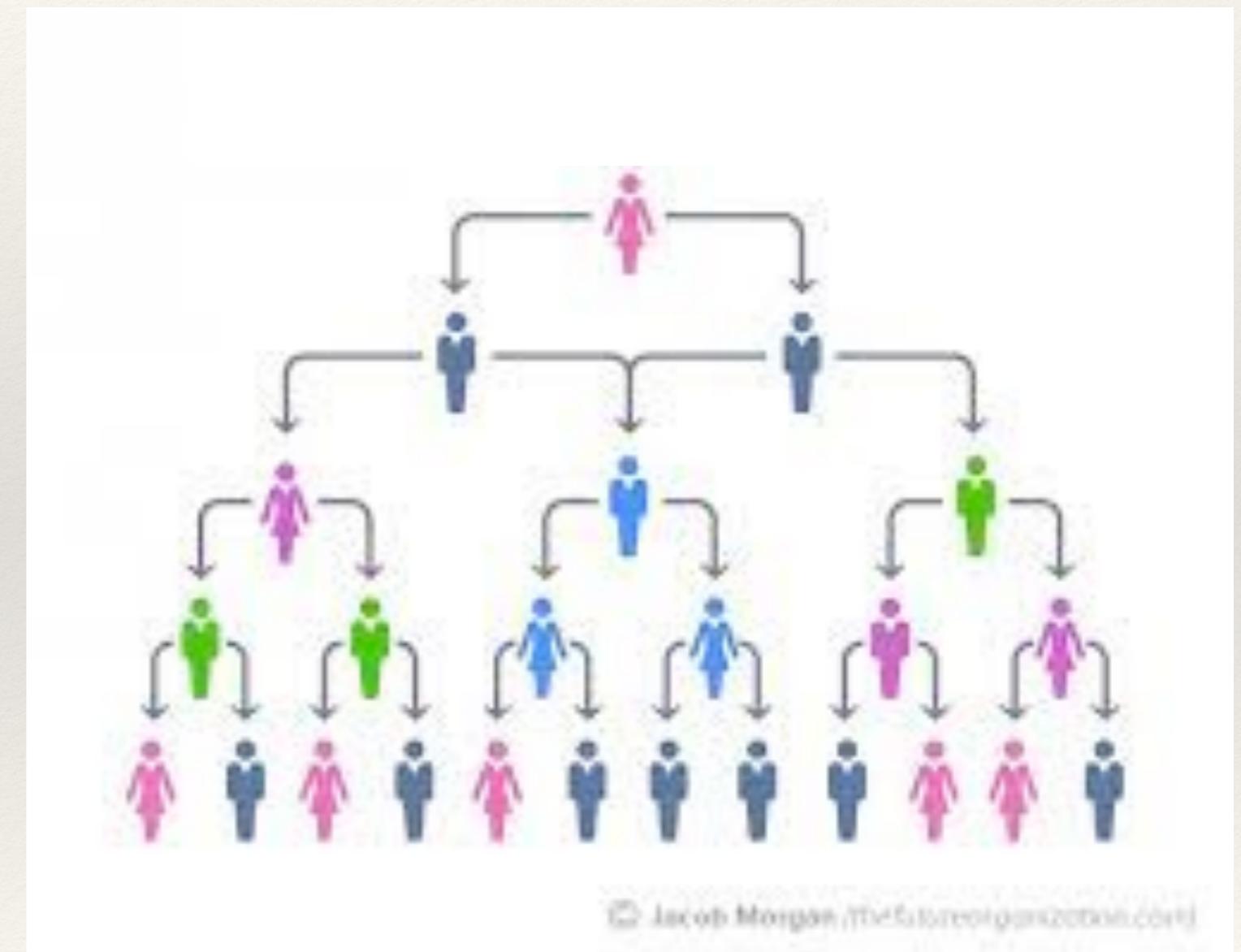
# Illicit Networks

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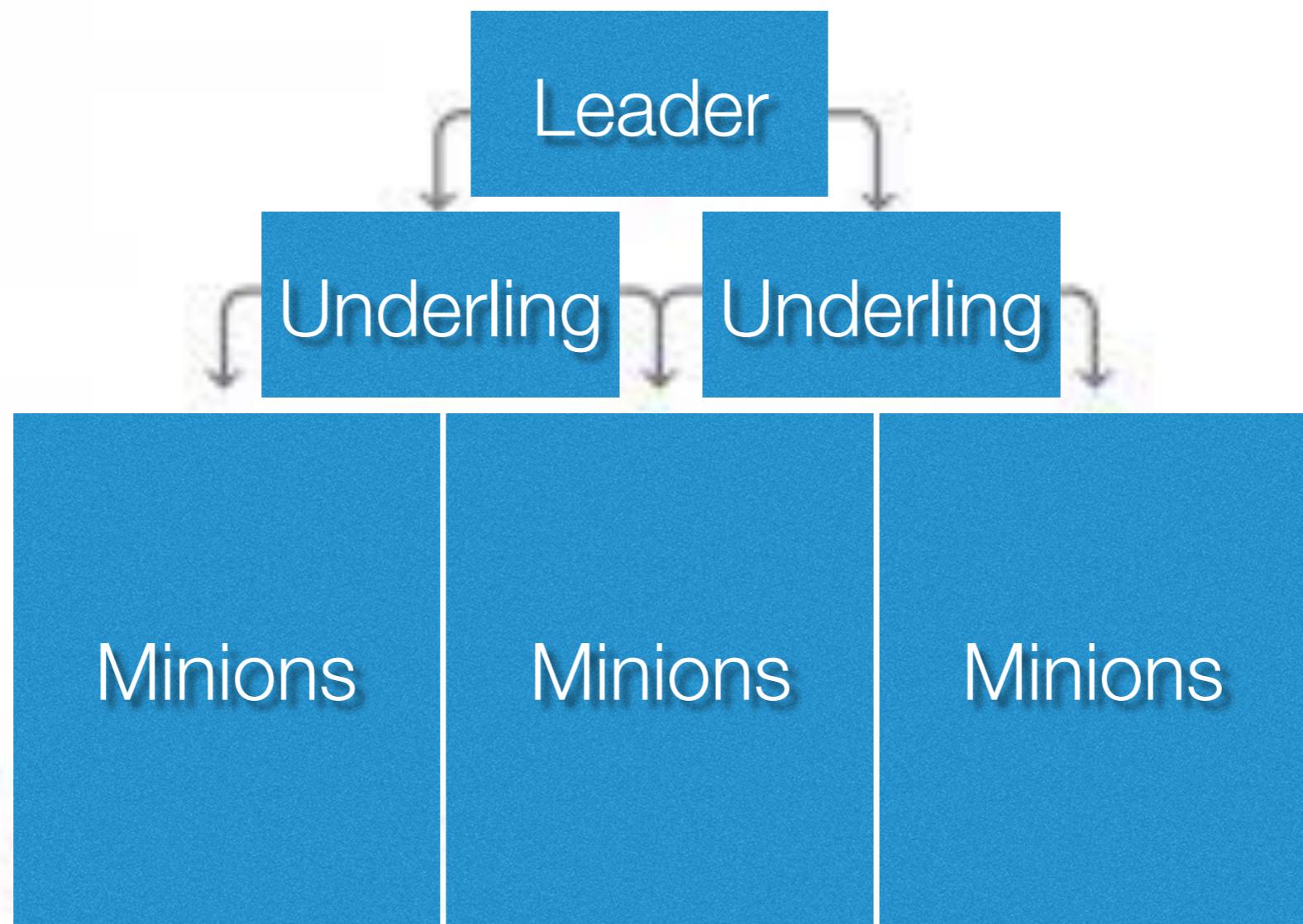
- ❖ Think about groups like gangs, terrorist organizations, rogue religions sects, etc...
  - ❖ Groups in which activity violates law or norms and there is organized activity to prevent the behavior.
    - ❖ **Illicit networks**
- ❖ A natural question: *how are they organized?*

# Illicit Networks

- ❖ Classical sociological theory (e.g. Georg Simmel) and contemporary “common sense” accounts tend to emphasize a hierarchical structure.



# Illicit Networks



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# Illicit Networks

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- ❖ Erickson (1981)
  - ❖ *Actually...it depends!*
  - ❖ Empirically there is **variation** in the organization of illicit groups.
  - ❖ Some are **hierarchical**, whereas some are **decentralized**.
  - ❖ Question: why do “secret societies” vary in their organizational structure?

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# Illicit Networks

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- ❖ Erickson (1981)
  - ❖ **Secret Societies**
    - ❖ “persisting pattern of relationships which directly or indirectly links the participants in related secret activities” (p. 189)
      - ❖ Activities involve risk (“secret”)
      - ❖ Ties are durable (“society”)
    - ❖ Risk makes the behavior of individuals in these settings *different* than other organizations.

# Illicit Networks

- ❖ Example:
  - ❖ You buy a wicked awesome skeletor toy from the store, only to find it is broken!
  - ❖ *What can you do about it?*



# Illicit Networks

- ❖ Example:
  - ❖ You buy a wicked awesome bag of crack, only to find it is baby formula!
  - ❖ *What can you do about it?*



# Illicit Networks

- ❖ Example:
  - ❖ You ask your friend to join your basket weaving group, and they tell a bunch of people you are into basket weaving!
  - ❖ *Do you care?*



# Illicit Networks

- ❖ Example:

- ❖ You tell your friend your basket weaving group has committed several murders, and they tell a bunch of people you are into murdering people (and basket weaving)!
  - ❖ *Do you care?*



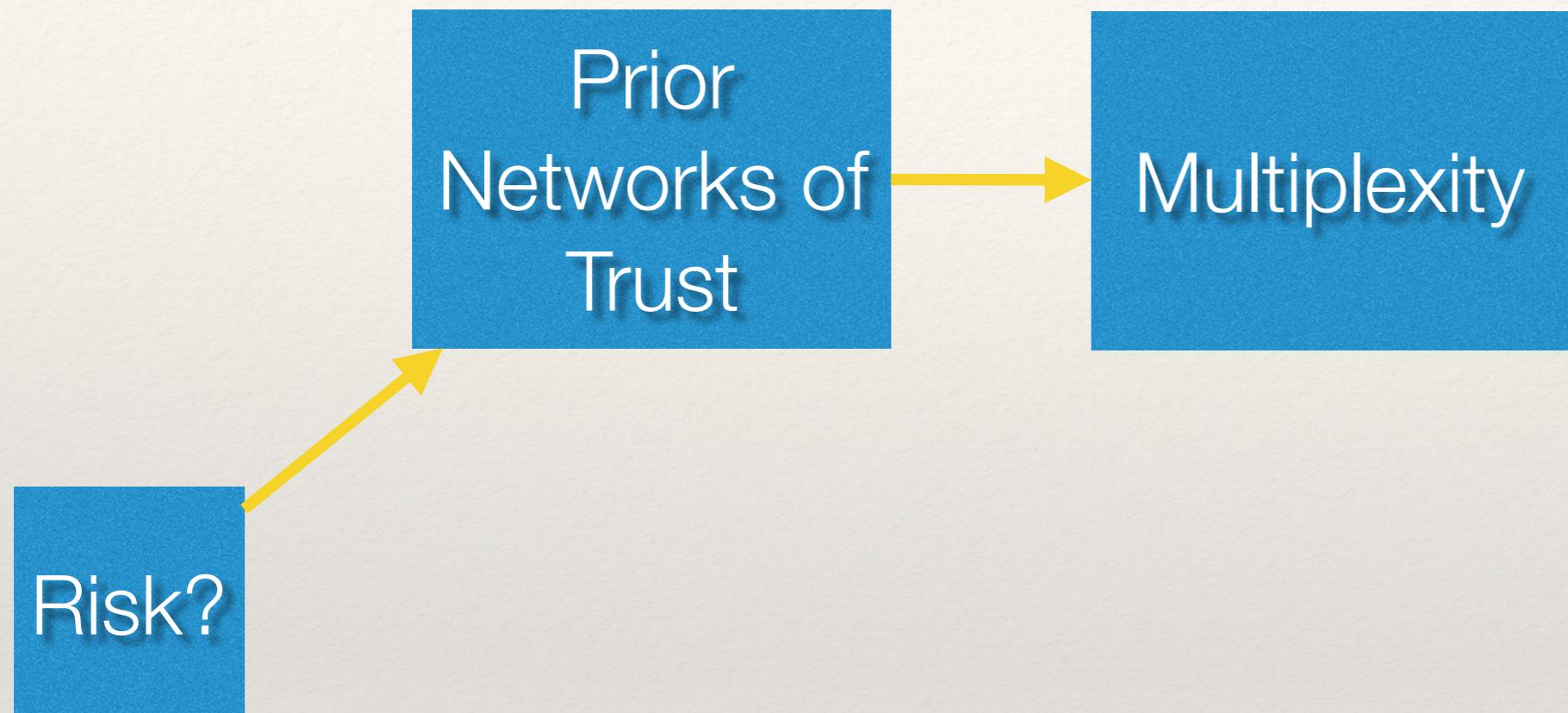
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# Illicit Networks

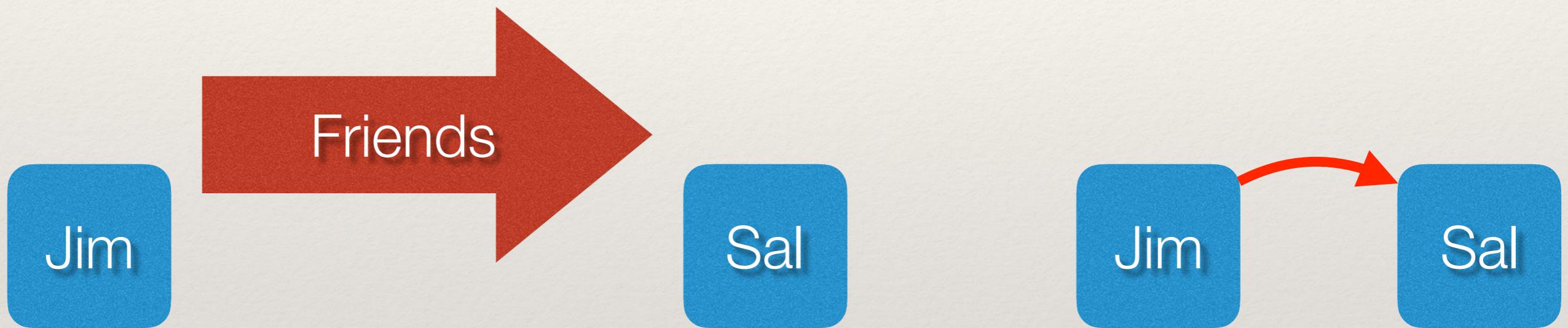
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- ❖ Erickson (1981)
  - ❖ Proposes a “theory of networks”
    - ❖ The presence of **risk** creates variation in the structure of groups.
    - ❖ Explained by:
      - ❖ Prior trust networks (multiplexity via entrainment)
      - ❖ Locus of control of recruitment
      - ❖ Command of resources

# Explaining Network Structure



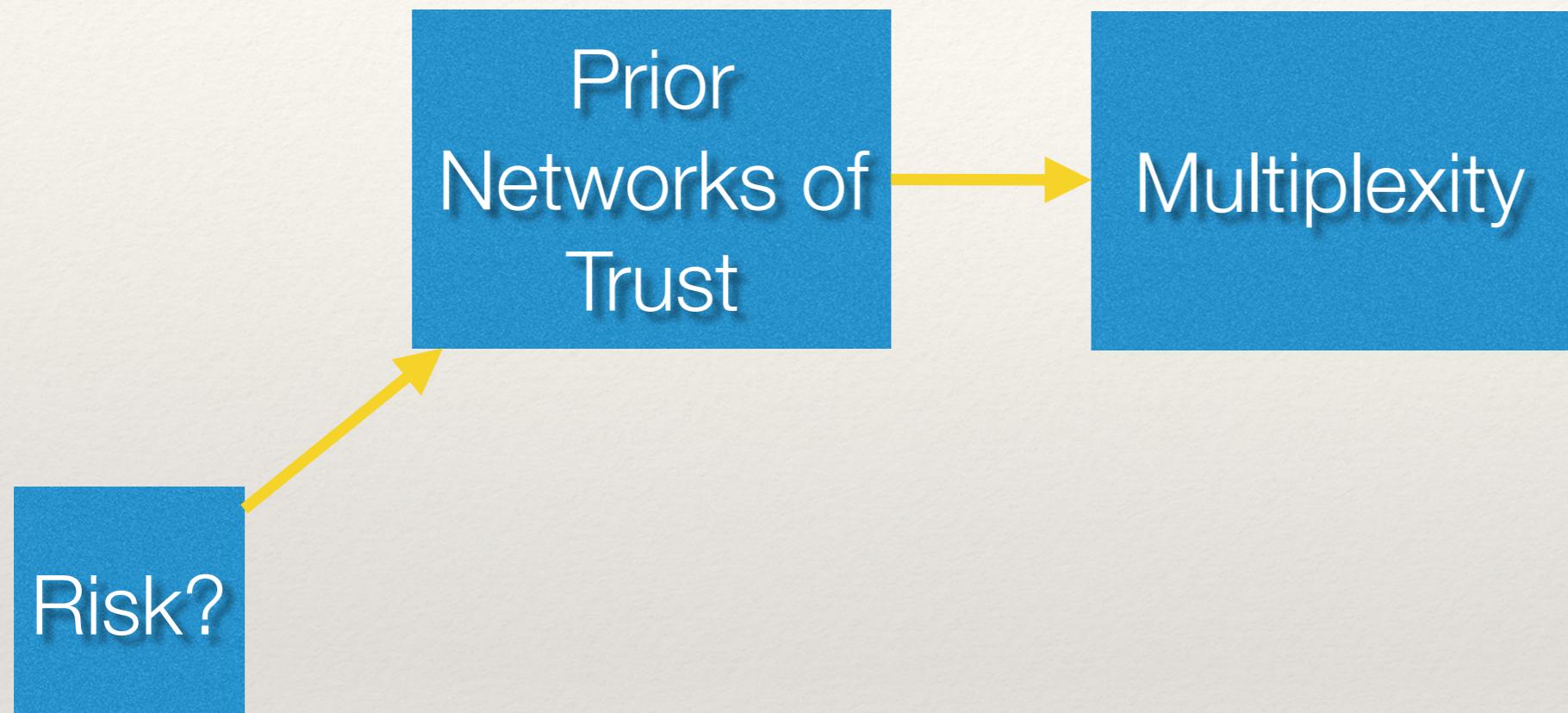
# Entrainment



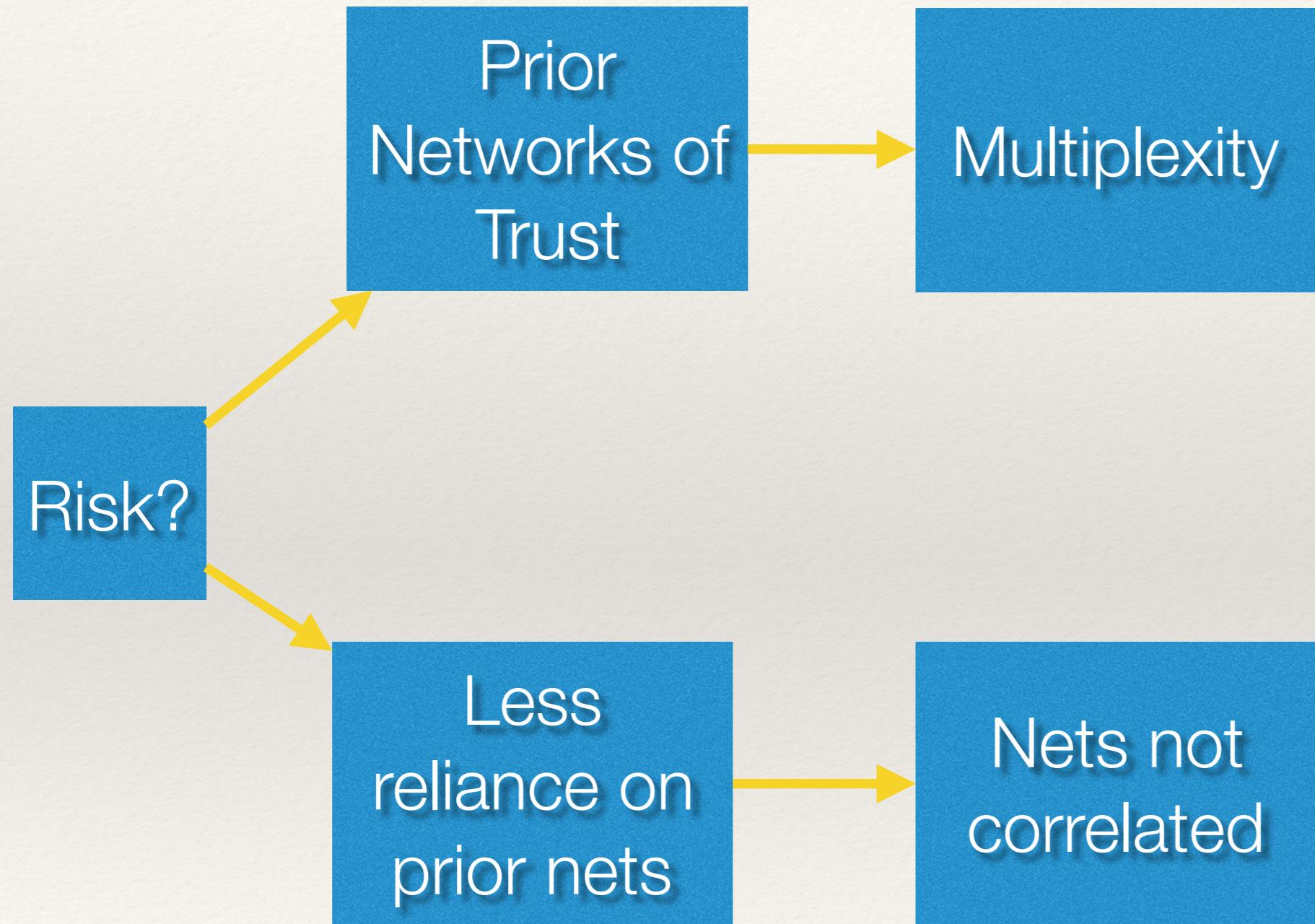
# Entrainment



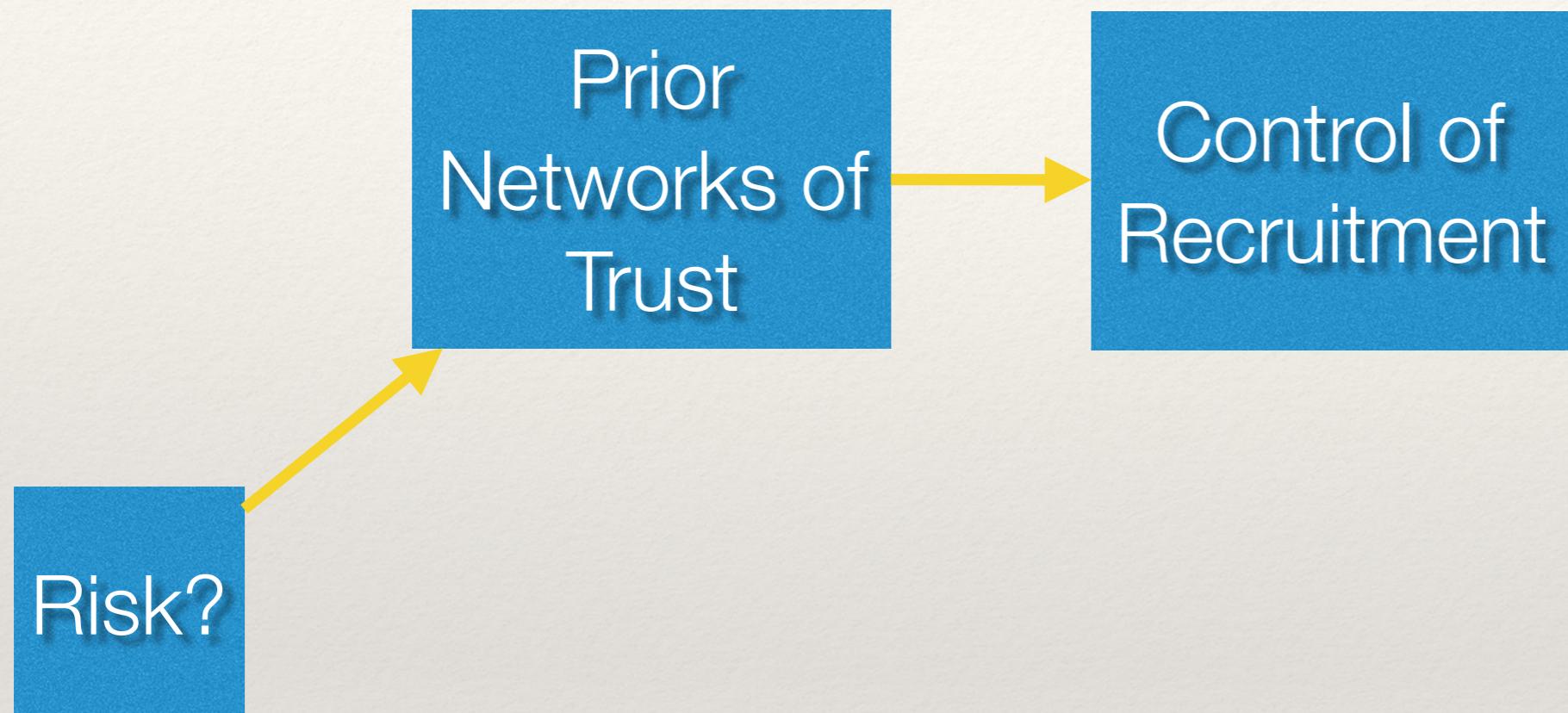
# Explaining Network Structure



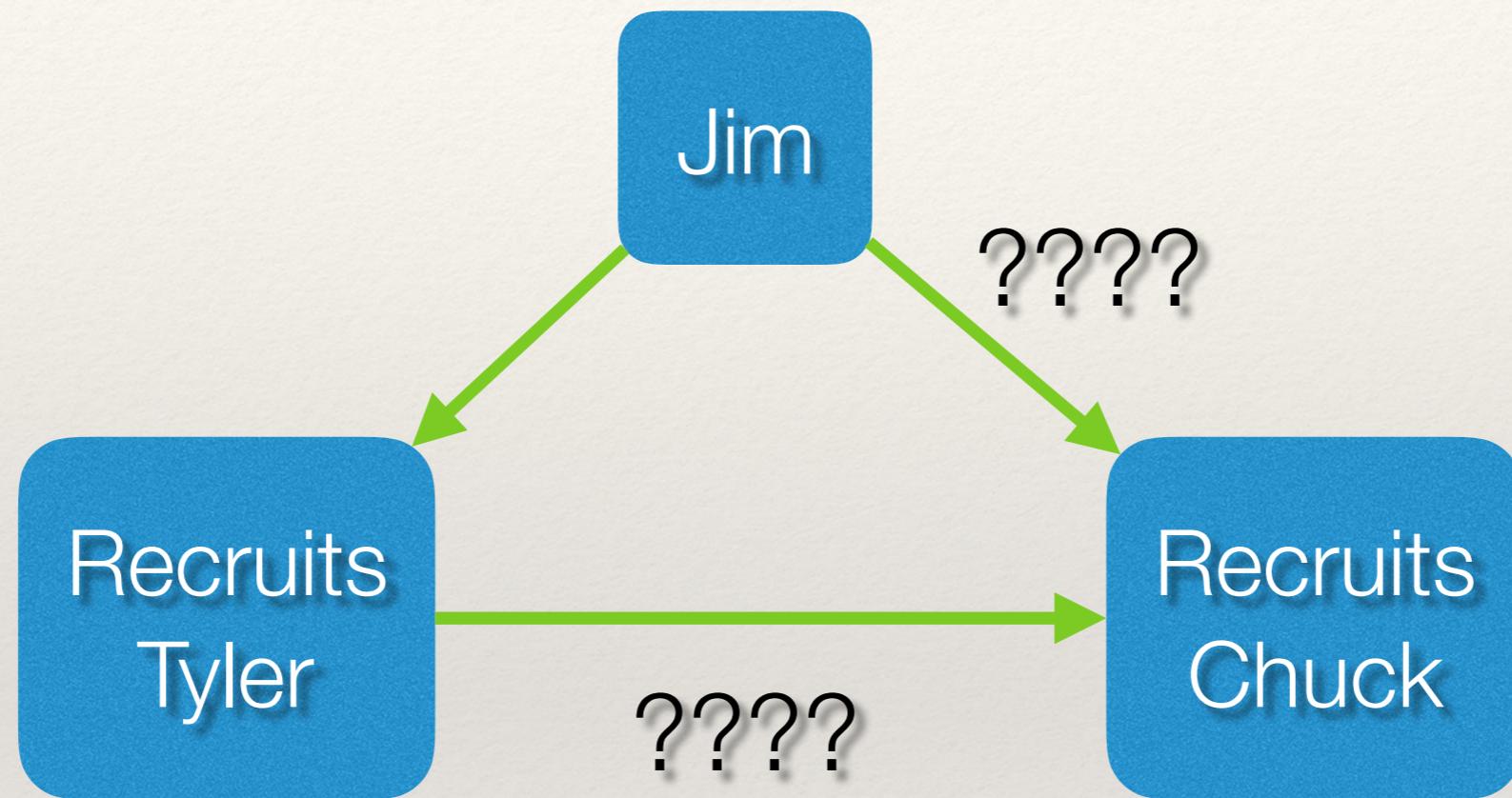
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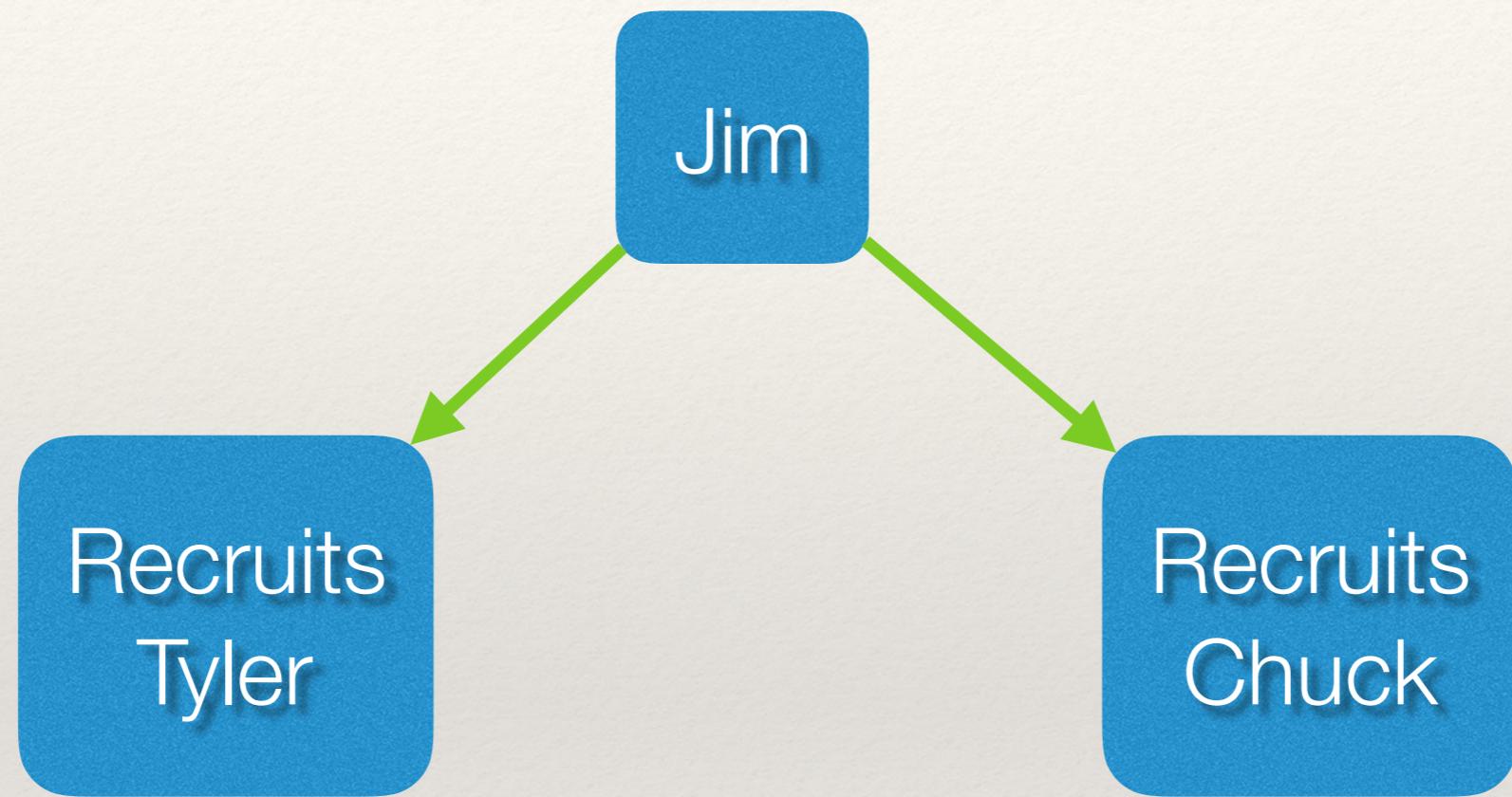
# Explaining Network Structure



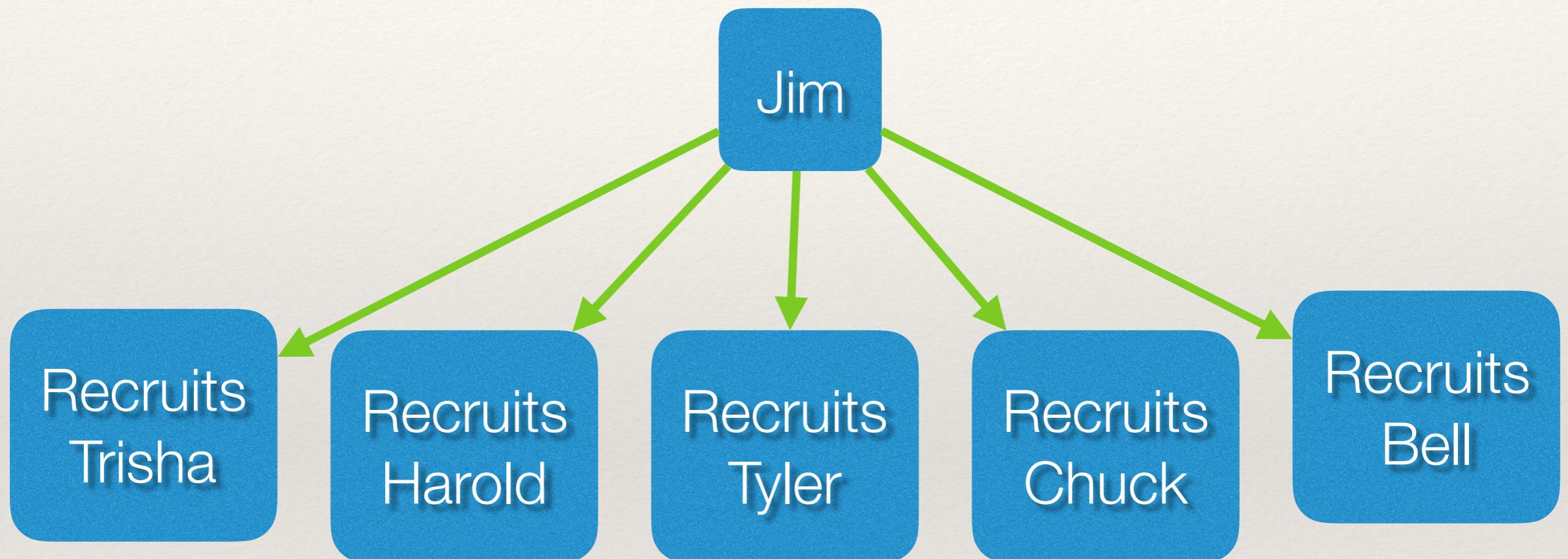
# Illicit Networks



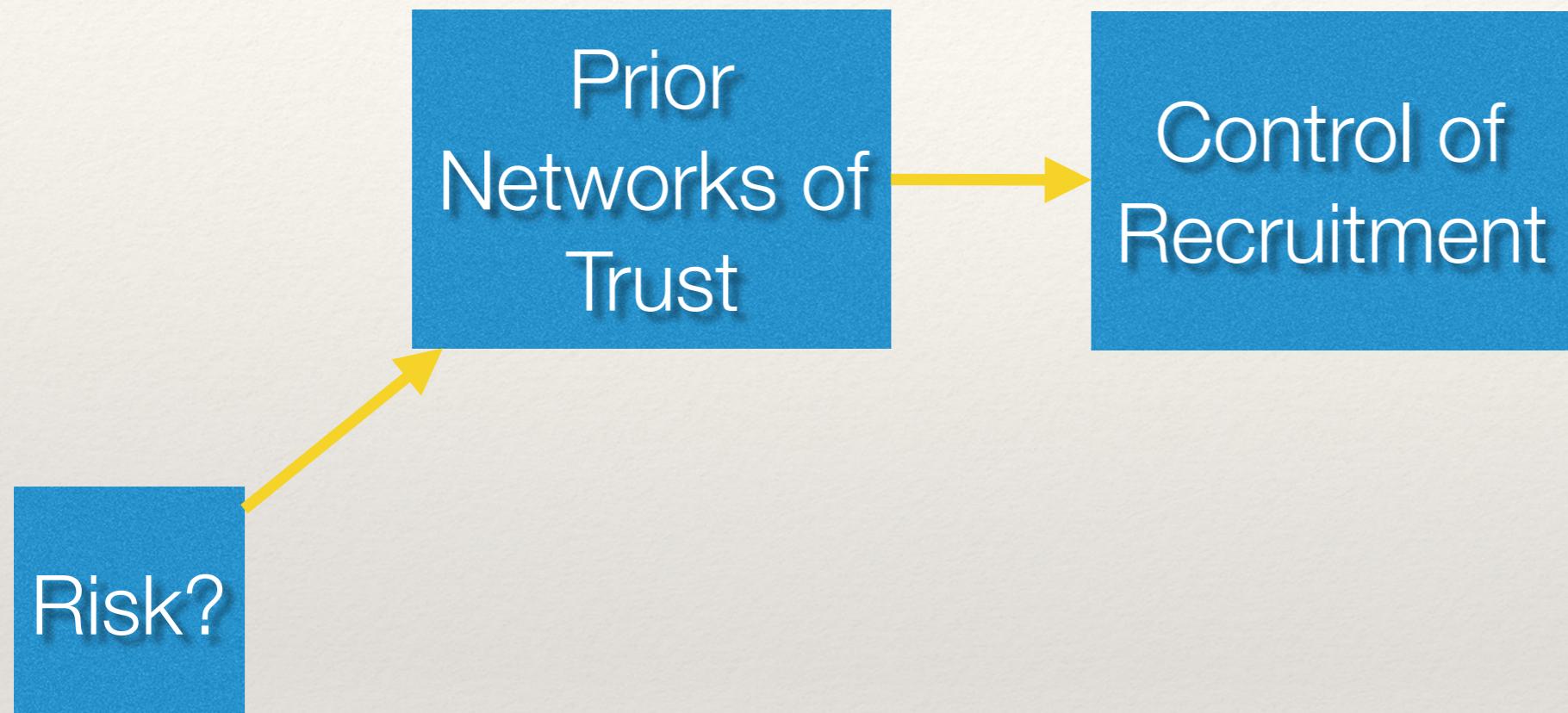
# Illicit Networks



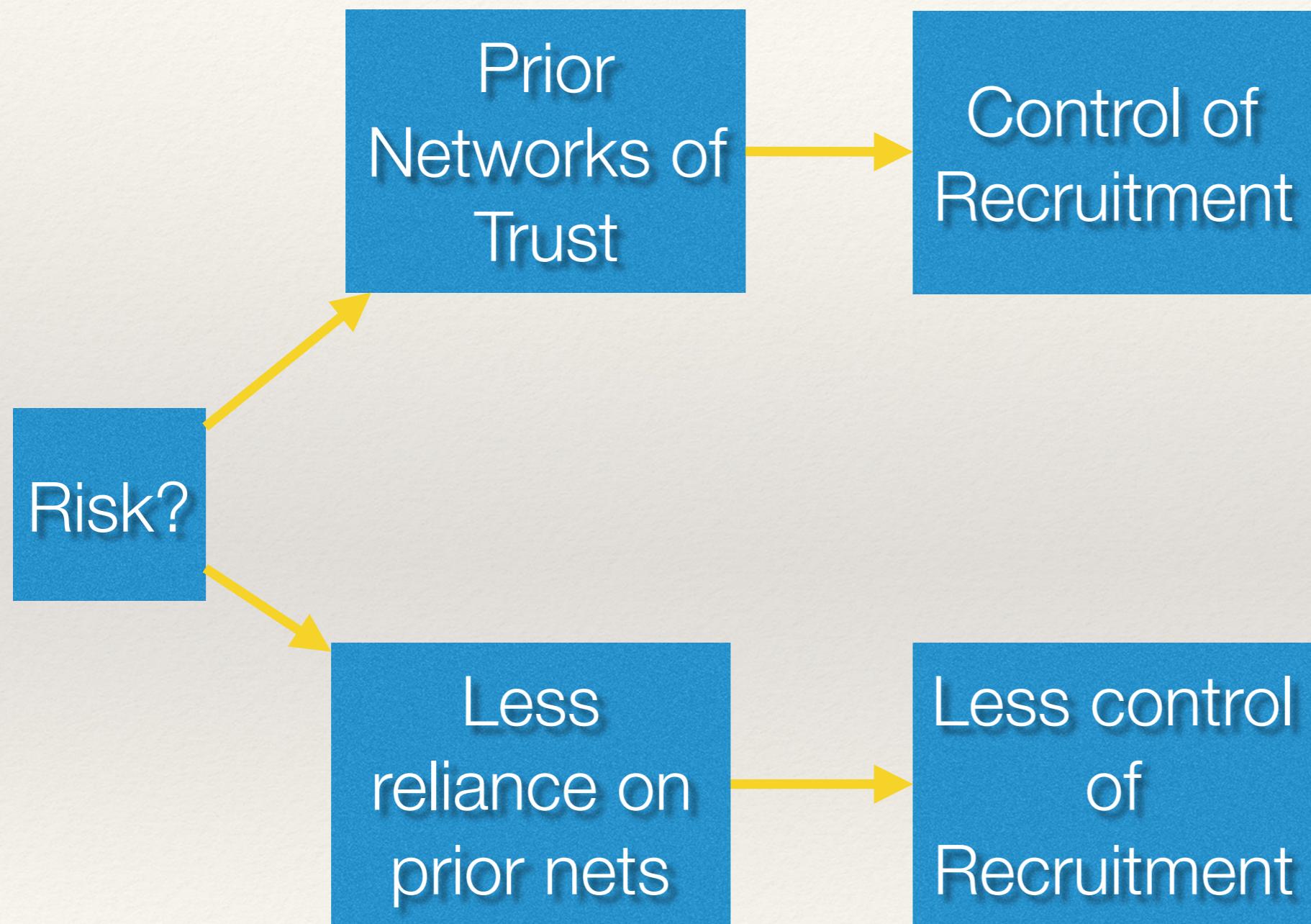
# Hierarchical (Centralized) Structure



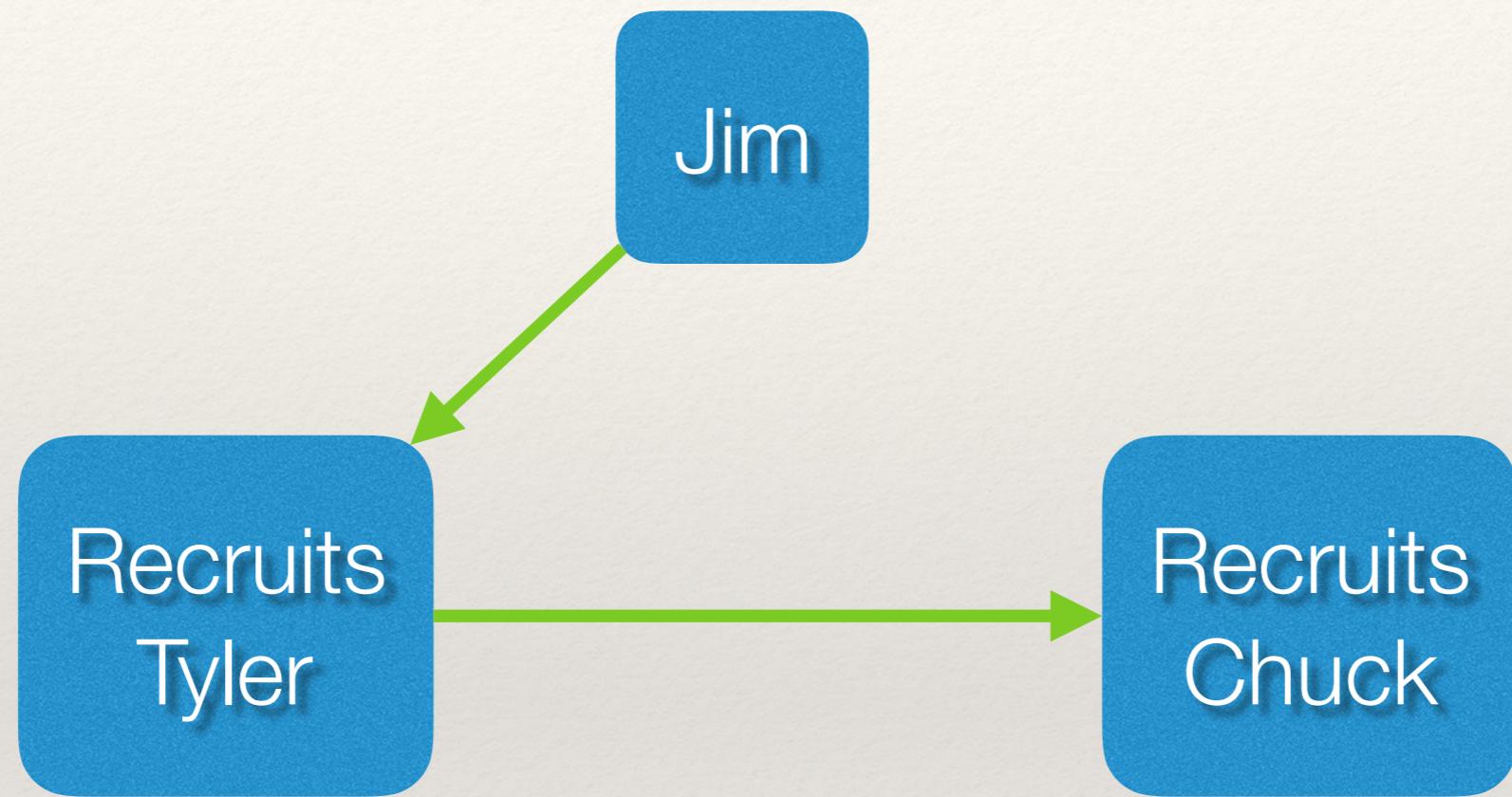
# Explaining Network Structure



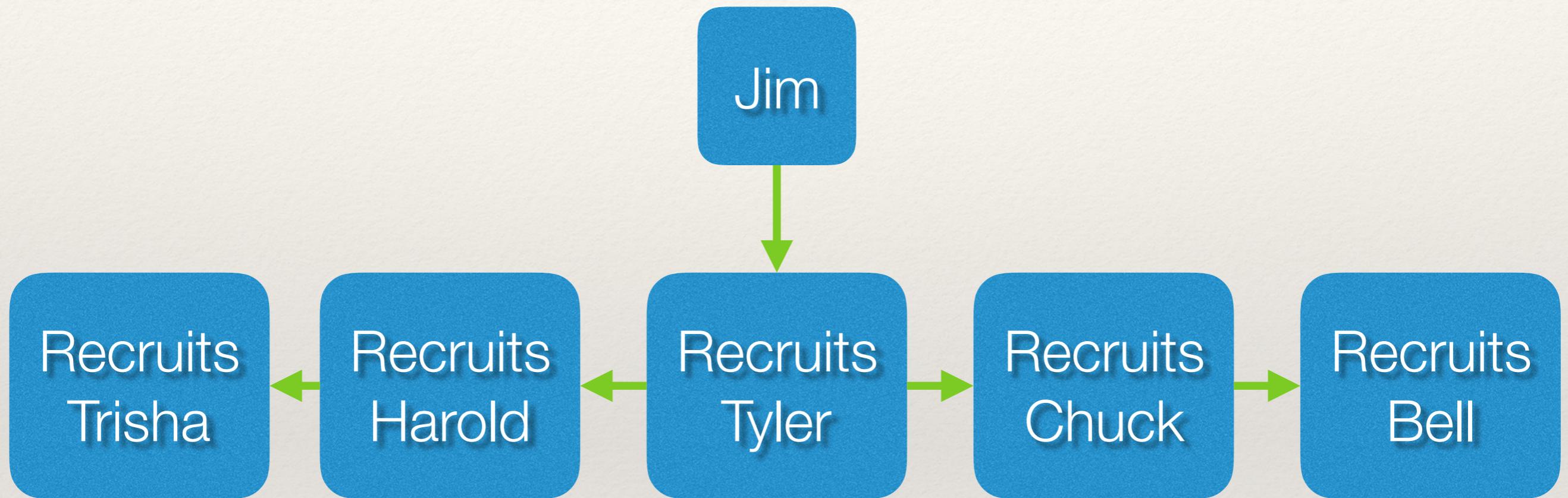
# Explaining Network Structure



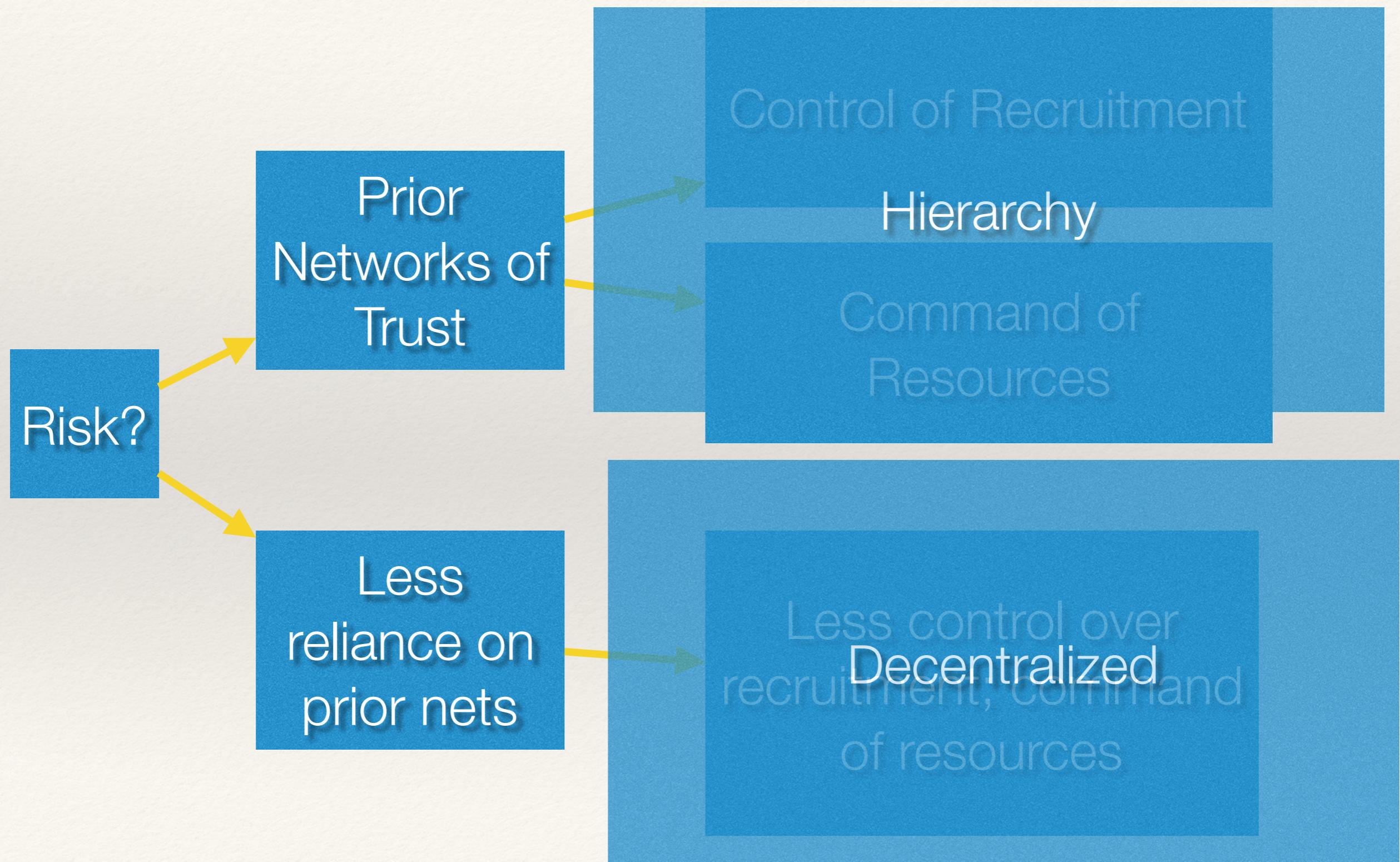
# Illicit Networks



# Decentralized Structure



# Explaining Network Structure



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# Illicit Networks

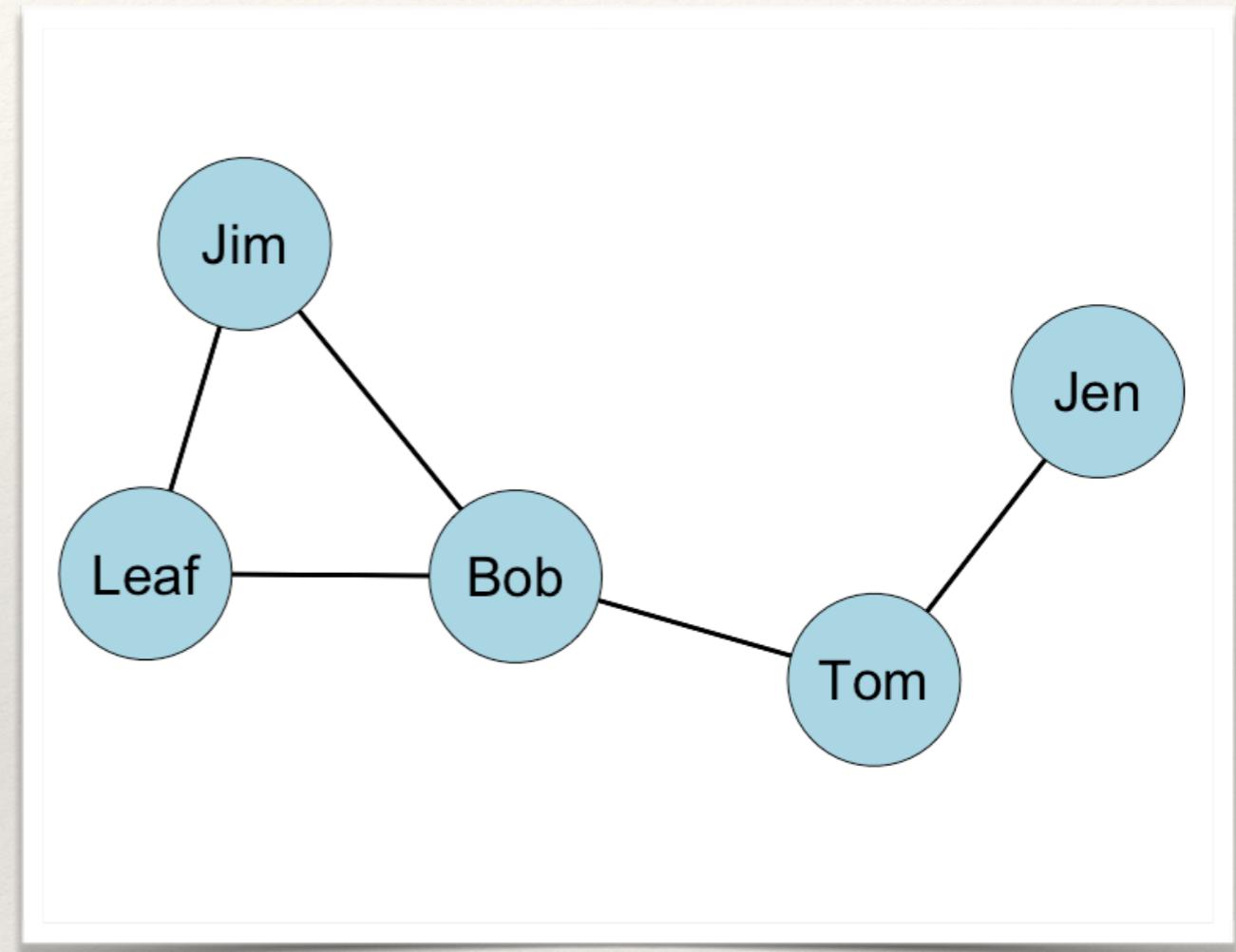
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- ❖ Erickson (1981)
  - ❖ Hierarchy then has reciprocal effects:
    - ❖ Increased control of recruitment
    - ❖ Increased command of resources
    - ❖ *Thereby making the network more hierarchical.*

Remember Degree Centrality?

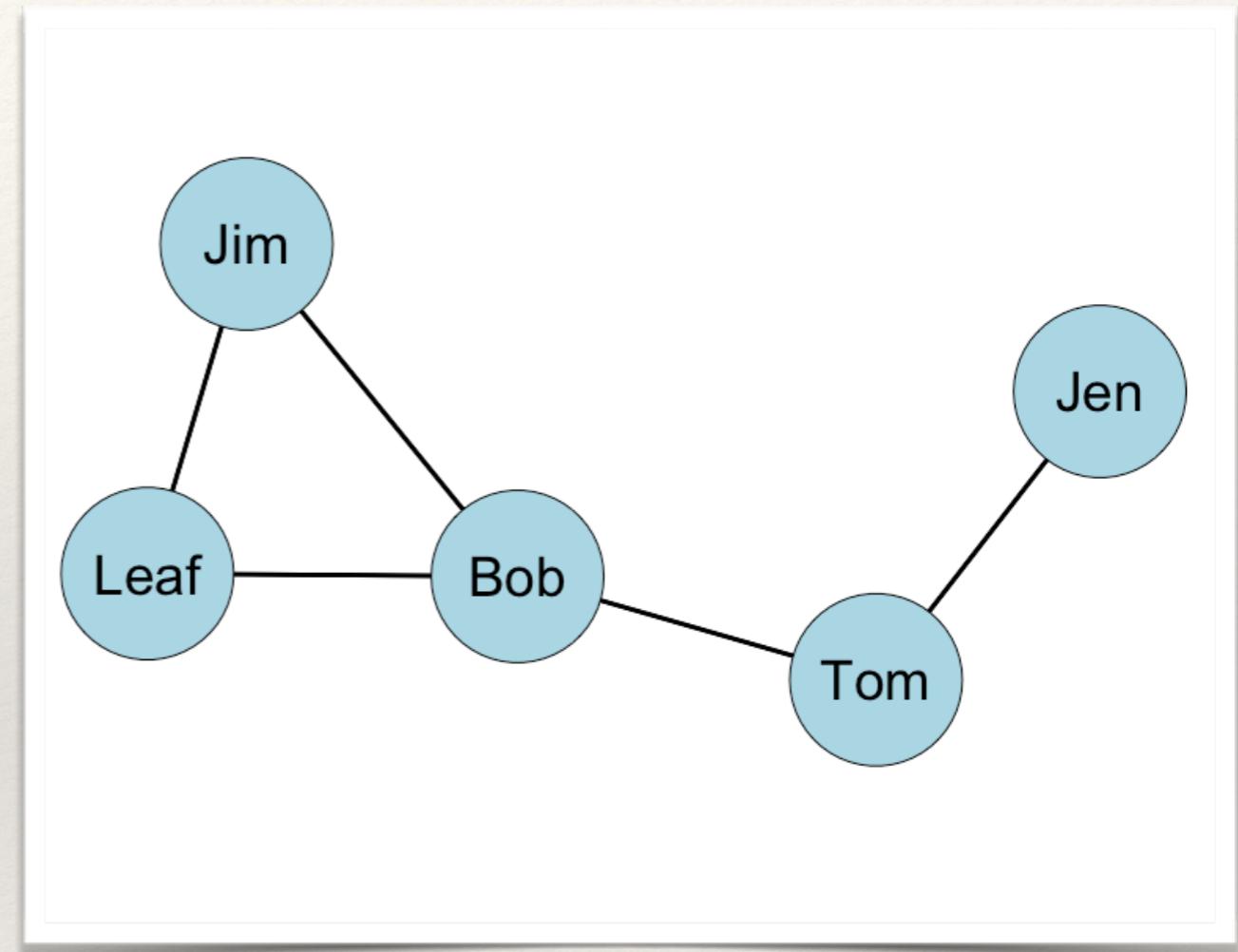
# Degree

- ❖ In an undirected binary graph, *degree* measures the extent to which a node connects to all other nodes in a social network.



# Degree

- ❖ In an undirected binary graph, *degree* measures the extent to which a node connects to all other nodes in a social network.



*What is the degree for each node in this graph?*

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# Degree

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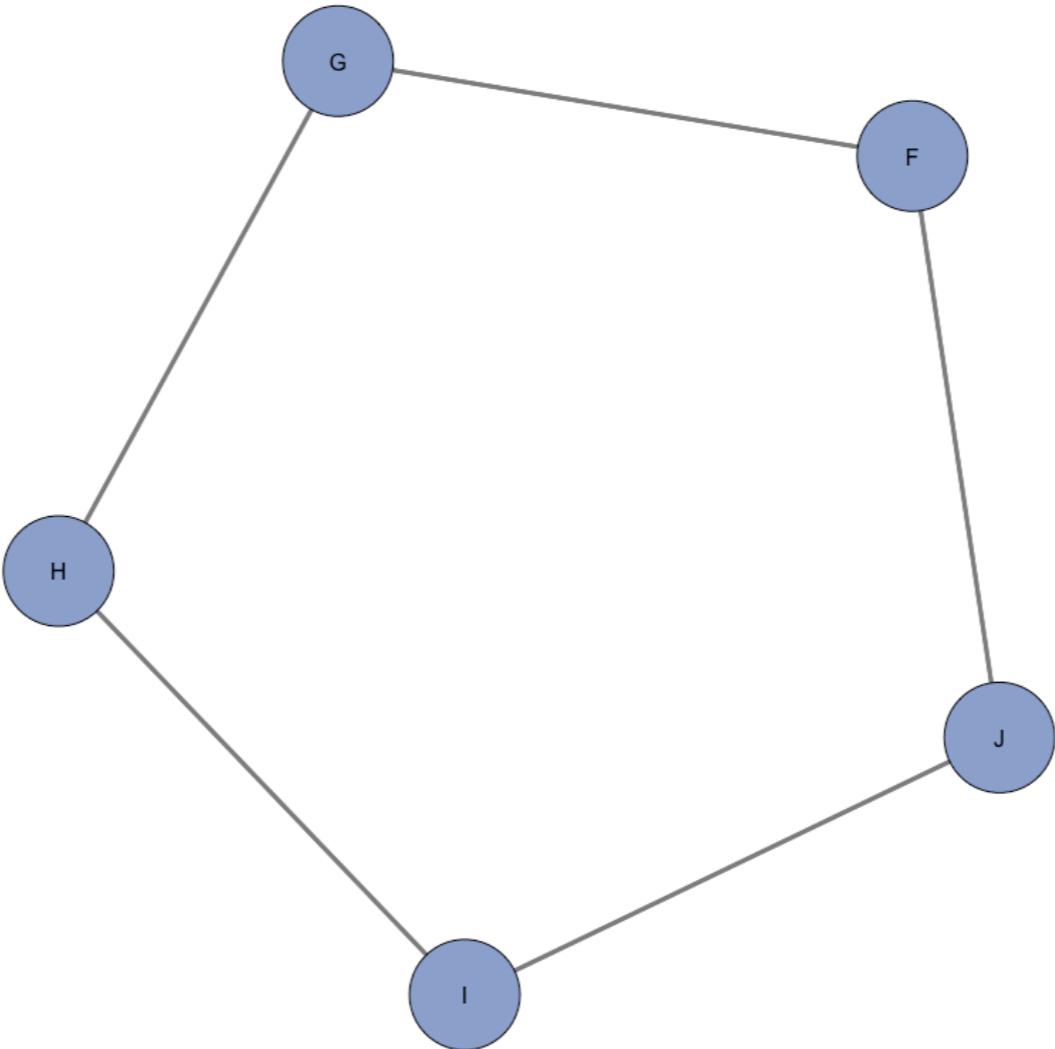
- ❖ We can examine the summary statistics for degree centrality by inspecting the **mean**.
- ❖ The average degree is an important property of a network.
  - ❖ *Why? What does a network with a high average degree look like? A low average degree?*

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# Degree Centralization

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- ❖ We can also calculate how centralized the graph itself is.
  - ❖ *Degree centralization* measures the extent to which the actors in a social network differ from one another in their individual degree centralities.
  - ❖ When degree centrality is evenly dispersed, degree *centralization* will be 0.

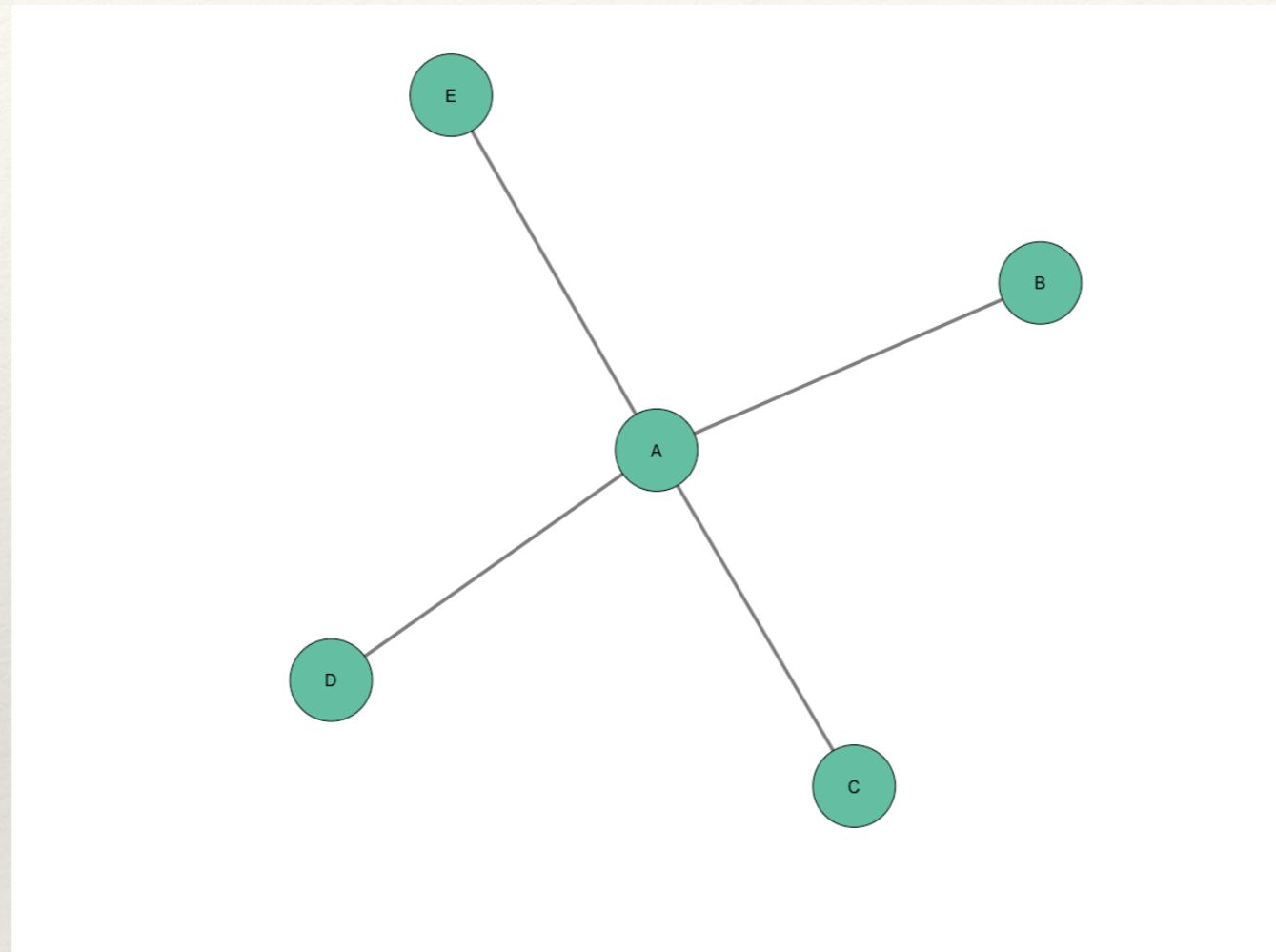


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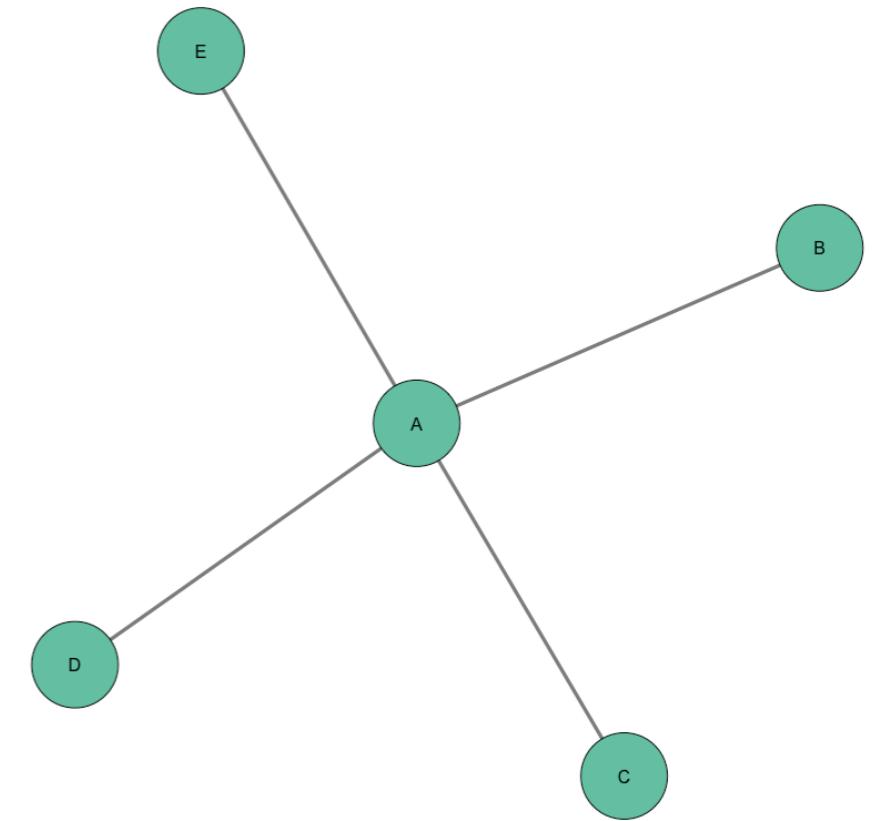
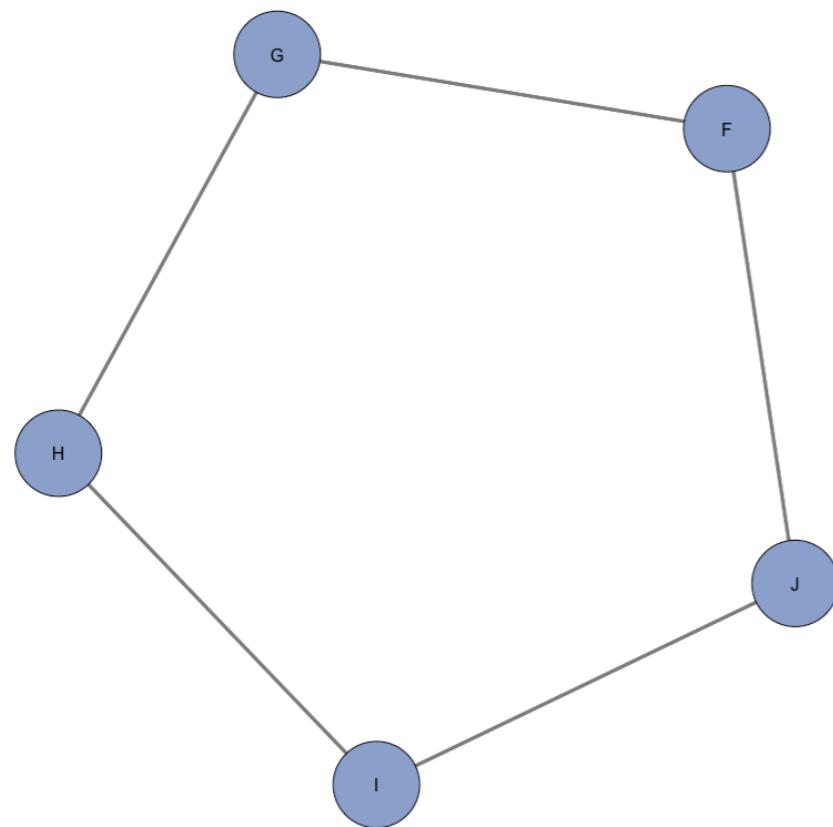
# Degree Centralization

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- ❖ When there is considerable inequality in the actor degrees, degree *centralization* will be close to 1.
  - ❖ Thus, closer to 1 indicates that the graph is hierarchically structured.

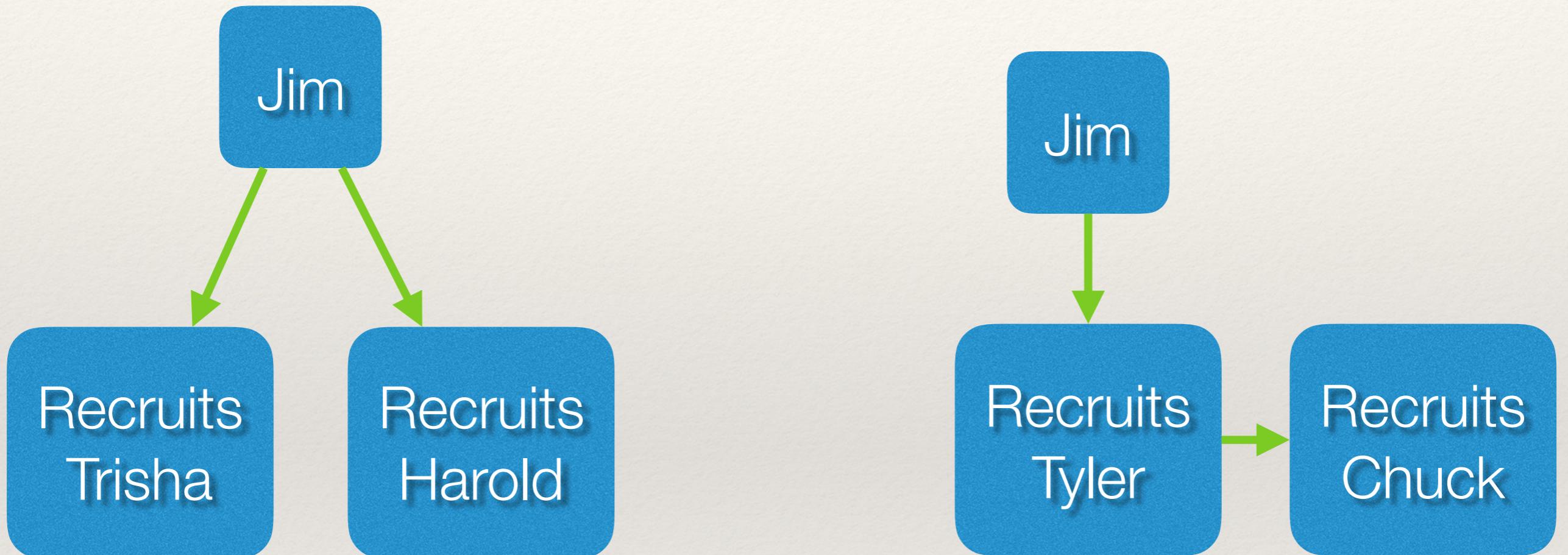


*The degree distribution is more equal here*



*The degree distribution is more unequal here*

# Network Vulnerability



*Which network is more  
vulnerable?*

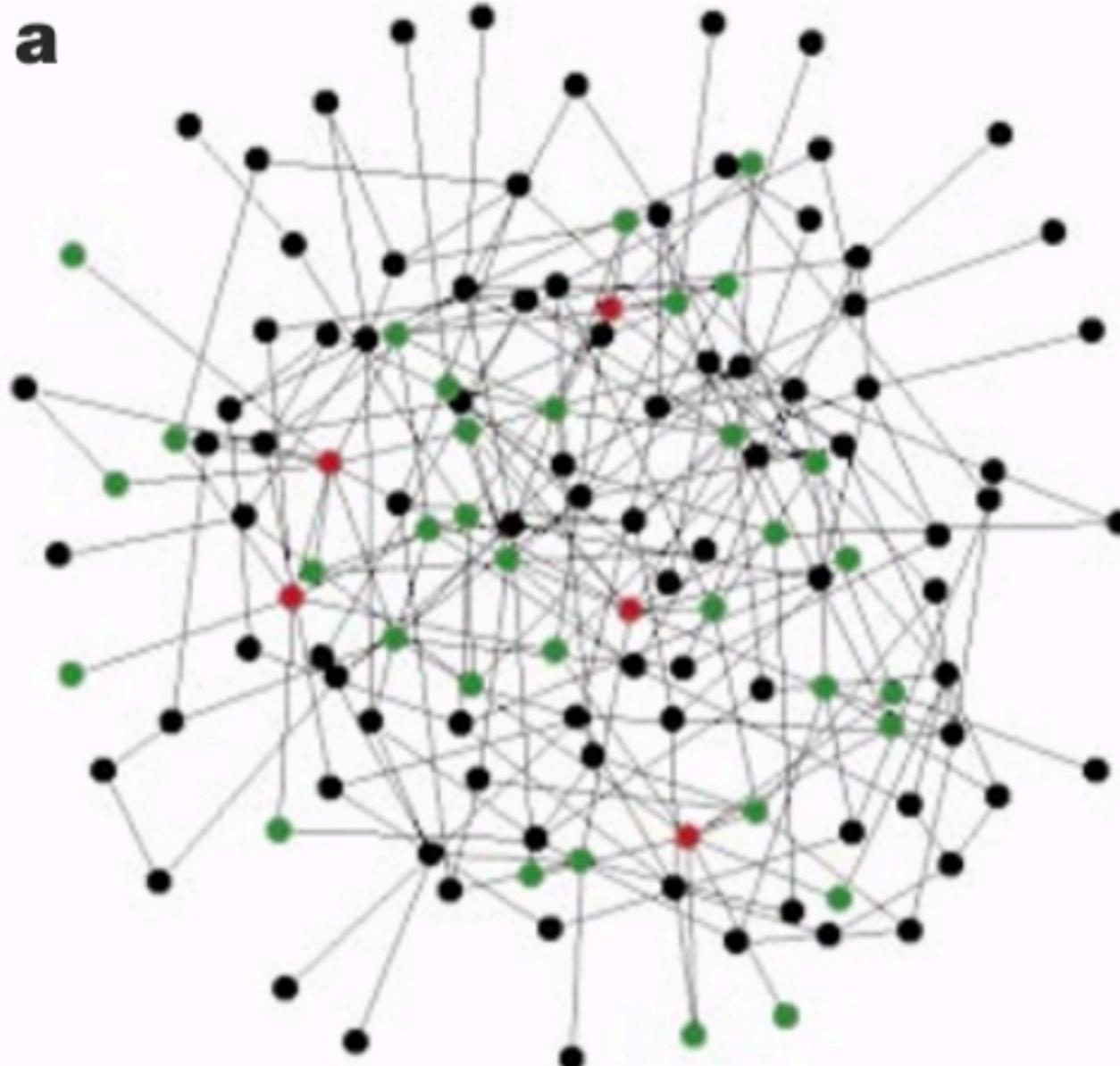
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# Network Vulnerability

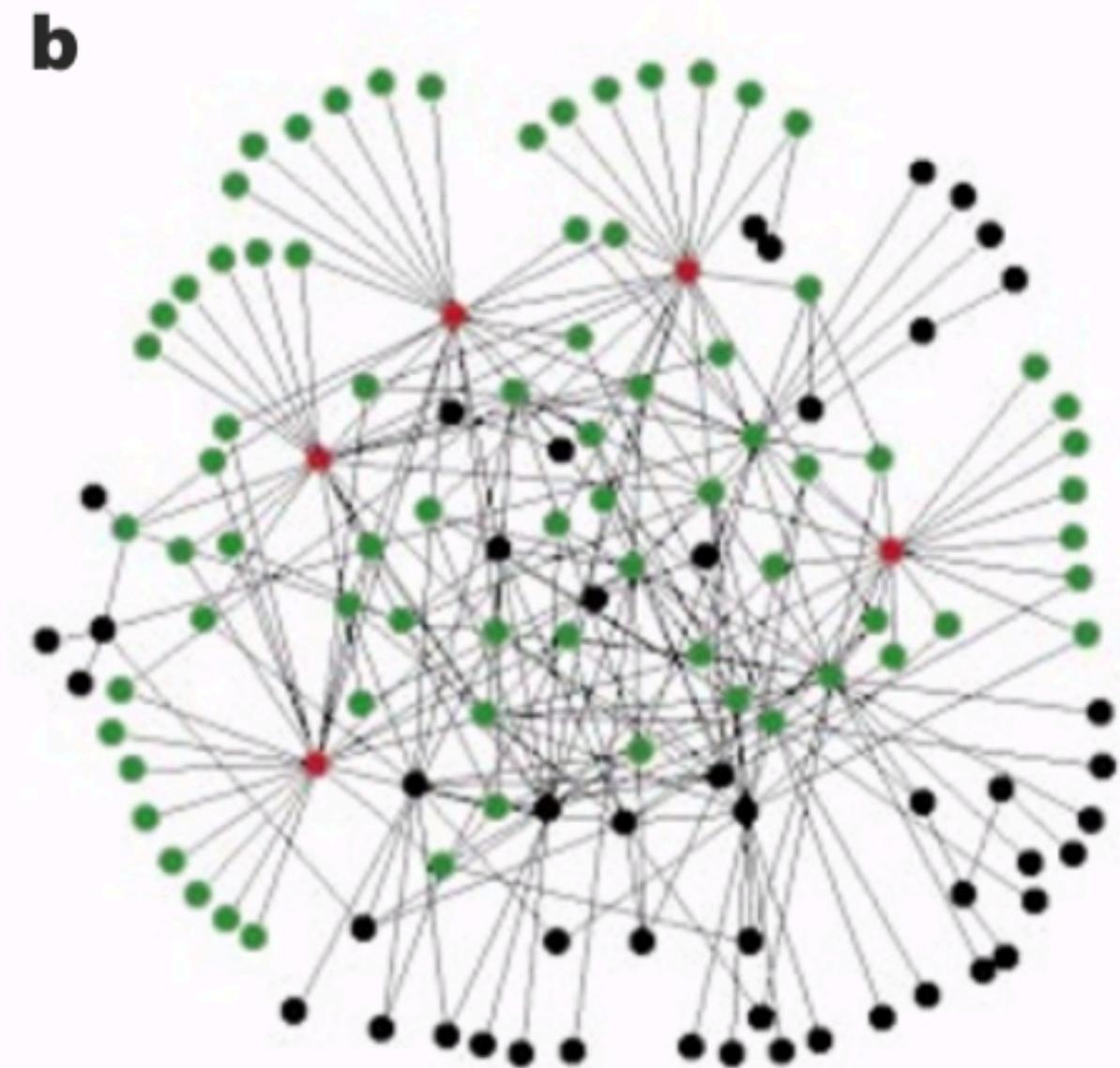
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- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ It depends...
    - ❖ Is it **homogenous** (exponential / decentralized) or **inhomogeneous** (scale-free / centralized)?

# Network Vulnerability



*Degree homogenous  
network*



*Degree inhomogenous  
network*

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# Network Vulnerability

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- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ It depends...
    - ❖ Is it an **error** or an **attack**?

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# Network Vulnerability

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- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ Homogenous networks
    - ❖ Vulnerable to errors, less vulnerable to attacks.
  - ❖ Inhomogenous networks
    - ❖ Less vulnerable to errors, vulnerable to attacks.
- ❖ *Why?*

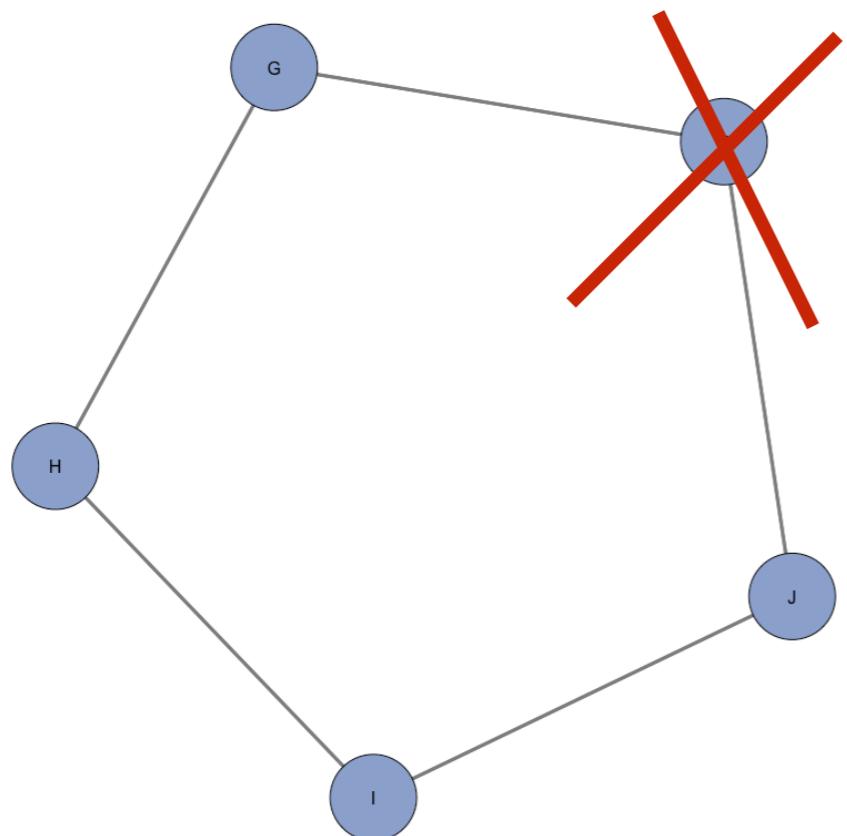
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# Network Vulnerability

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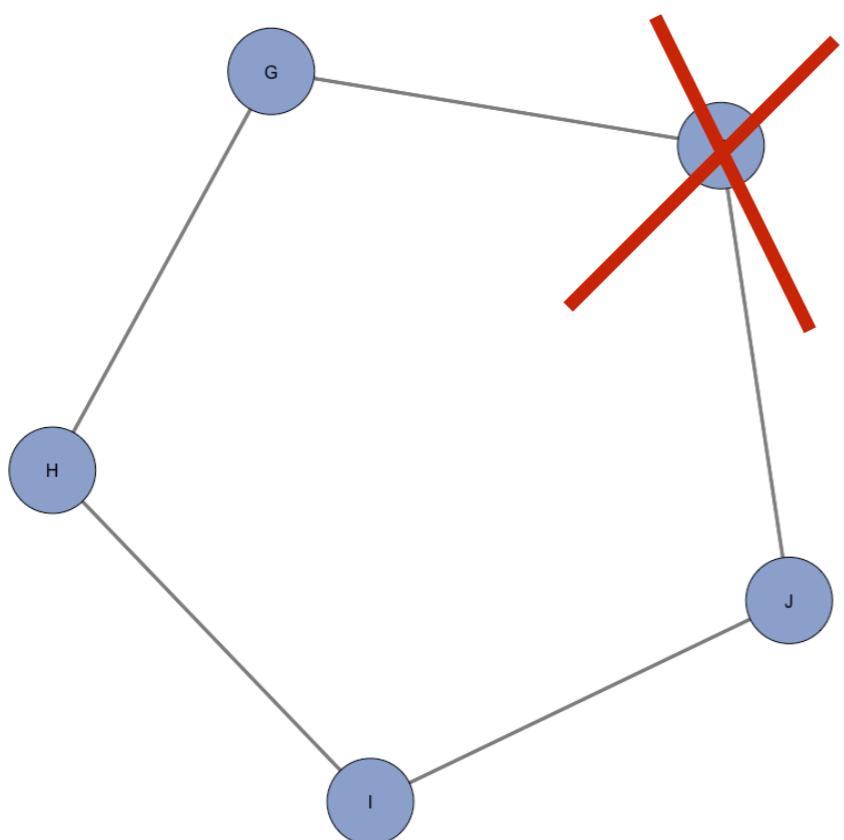
- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ Inhomogeneity **INCREASES** connectivity.
    - ❖ It decreases the diameter (average shortest path).

*What happens to the graph if this node experiences an error?*



*How does G reach J?*

*What happens to the graph if this node experiences an error?*

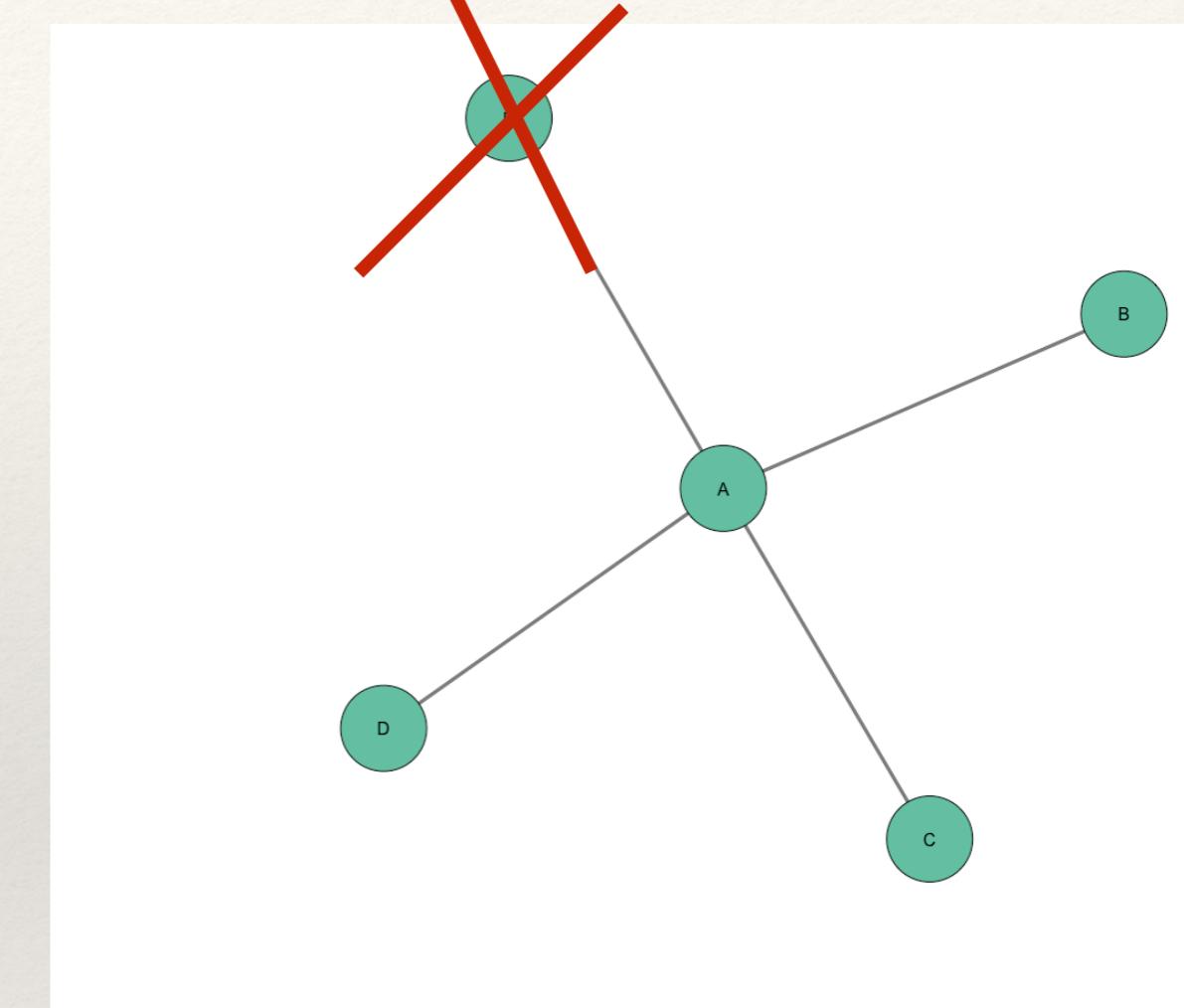


*Why?*

*The average path length increases.*

*What happens to the graph if this node experiences an error?*

*Why?*



*The average path length doesn't change.*

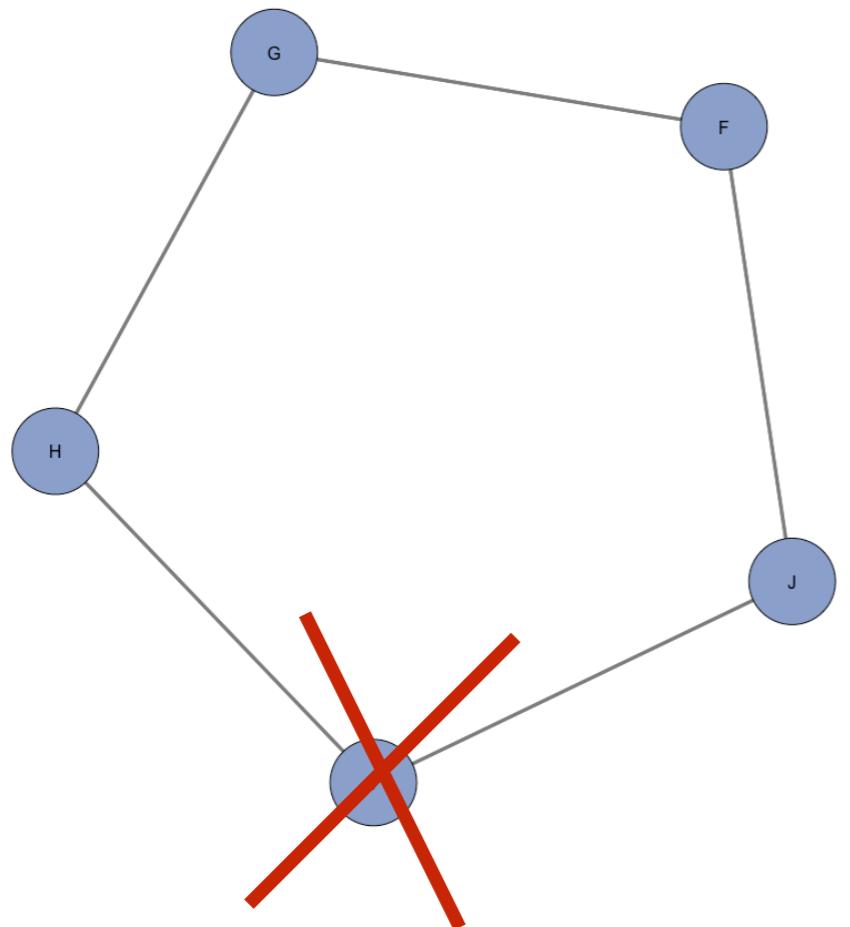
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# Network Vulnerability

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- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ BUT!!!...
  - ❖ The high connectivity is what creates vulnerability to attack.

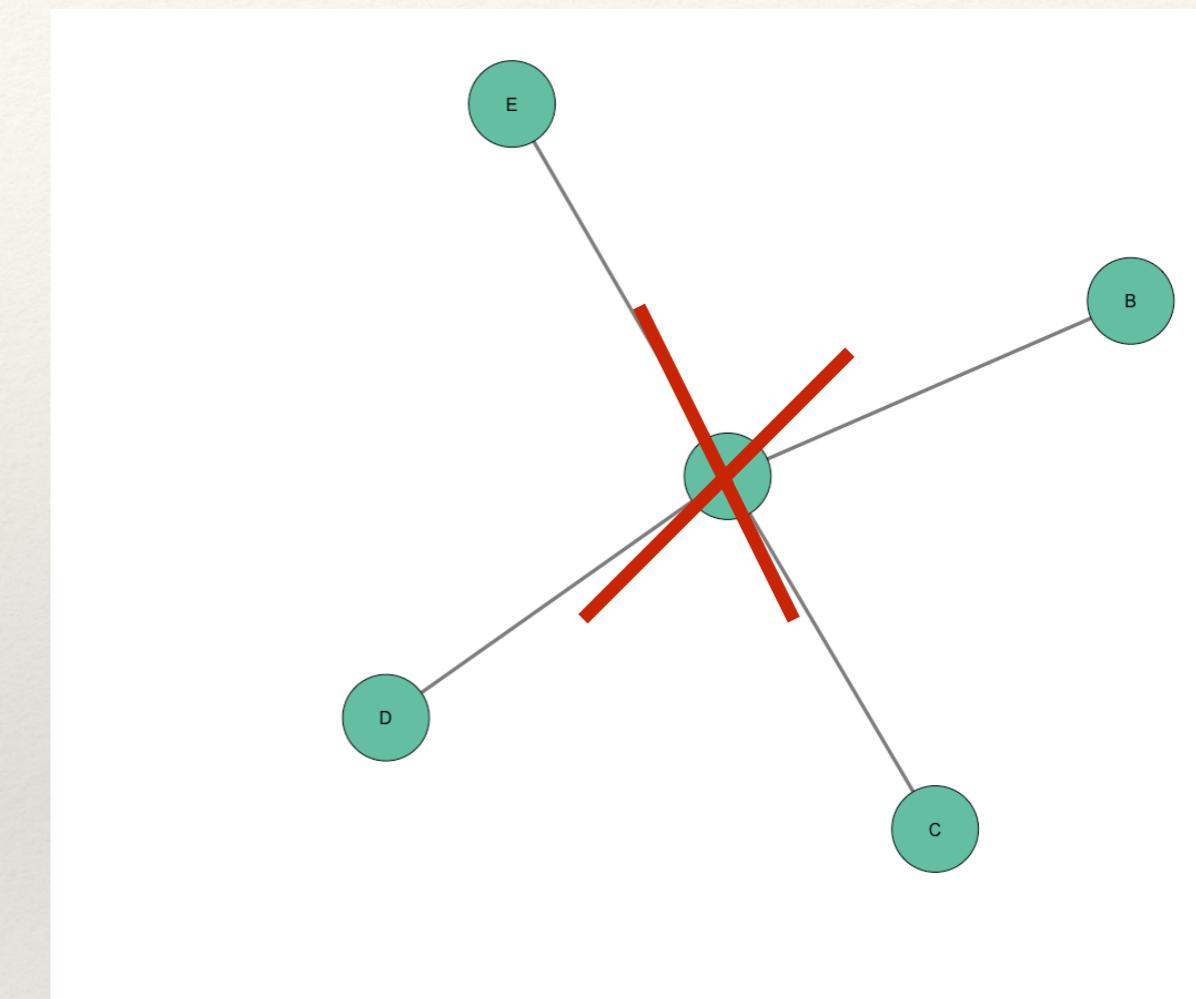
*What happens to the graph if this node experiences an attack?*



*Why?*

*What happens to the graph if this node experiences an attack?*

*Why?*



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# Network Vulnerability

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- ❖ Albert, Jeong, and Barabasi (2000)
  - ❖ Network vulnerability depends on:
    - ❖ The degree distribution (homogenous vs. inhomogeneous)
    - ❖ The type of action (error vs. attack)

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# Remember this?

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- ❖ Aral & Alstyne (2011)
  - ❖ **Strong** and **Weak** ties are important, but for different things.
  - ❖ The “diversity / bandwidth tradeoff”.
    - ❖ More diversity, less bandwidth.
    - ❖ More bandwidth, less diversity.

# Diversity/Bandwidth Tradeoff

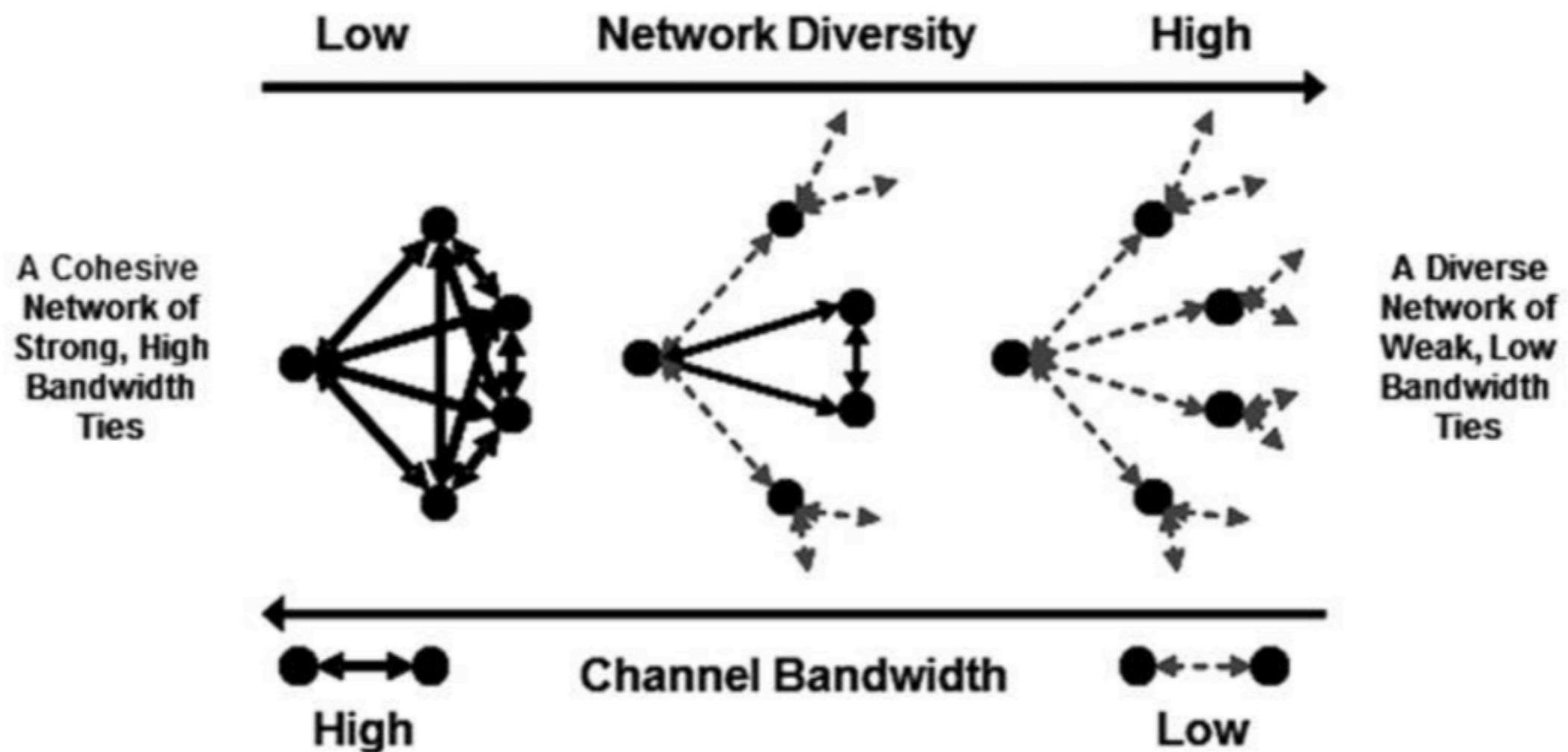


FIG. 1.—The diversity-bandwidth trade-off. As structural diversity increases, channel bandwidth decreases.

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# Illicit Networks

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- ❖ Illicit Organizations face a similar problem
  - ❖ Security/Efficiency Tradeoff
    - ❖ Security-Maintain covert operations and avoid detection
    - ❖ Efficiency-Execute activities with efficiency to optimize output
    - ❖ The setting will shape network structure.

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# Learning Goals

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- ❖ Understand an explanation of structural diversity in illicit networks.
- ❖ Revisit **degree** and **degree centralization**.
- ❖ Understand the differences between **error/attack** and **homogenous/inhomogeneous** in networks.
- ❖ Understand **security/efficiency tradeoff**.

Questions?

Break

# Discussion

## Network Theories and Theories of Networks\*

NETWORK THEORIES ("networks as <i>cause</i> ")		THEORIES OF NETWORKS ("networks as <i>effects</i> ")	
		<i>Explanatory Goal</i>	
<i>Explanatory Model</i>	Social Capital/ Performance ("why are the benefits?")	Homogeneity ("why are nodes similar?")	Network Structure ("why is the network this way?")
<b>Network Flow</b> (ties as pipes)	<u>Capitalization</u>  <b>Definition:</b> Acquisition to resources through ties and this influences human capital which contributes to performance.  <b>Examples:</b> Access to unique information via bridging ties. Information control benefits of structural holes. Solving problems through access to diverse knowledge.	<u>Contagion</u>  <b>Definition:</b> Nodes become similar through a process of "infection" where various "bits" are passed from one node to the other.  <b>Examples:</b> Diffusion of innovations. Peer influence. Disease transmission.	<b>Examples:</b> Homophilous Selection ("why do people with the same attitudes cluster together? They sort into these groups")
<b>Network Coordination</b> (ties as bonds or "prisms")	<u>Cooperation</u>  <b>Definition:</b> Networks provide benefits that can coordinate multiple nodes in order to bring all their resources to bear on a problem.  <b>Examples:</b> Unionization. Collective efficacy in neighborhoods.	<u>Convergence</u>  <b>Definition:</b> Nodes adapt to their environments, and as a result nodes with similar structural environments will demonstrate similarities.  <b>Examples:</b> Administrative assistants have higher levels of communication in organizations.	<b>Examples:</b> Popularity ("why do some individuals receive more ties than others?")

\*Adapted From Borgatti and Halgin (2011) and adams (2020).