



Responsibly Designing Open Science Data Teams

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 hi, i'm amanda 

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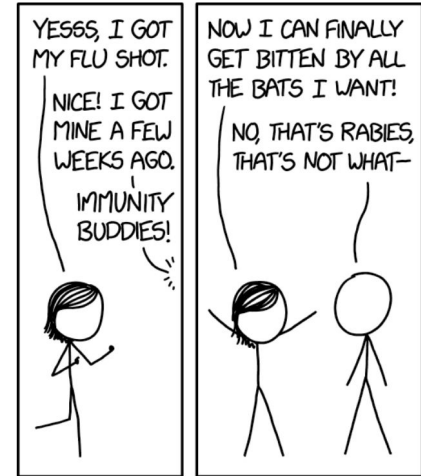
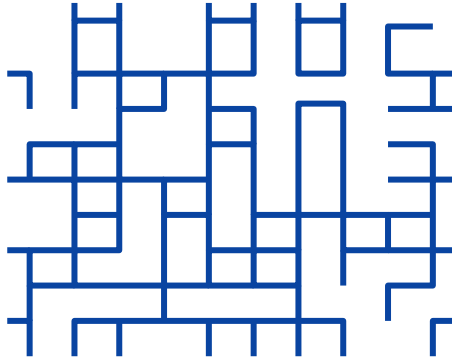
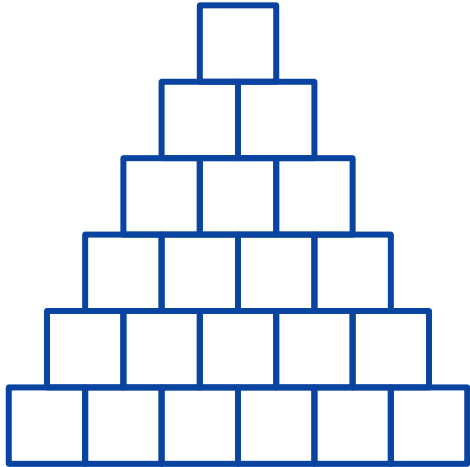
Advisor for Open Source Community
Africa

Academic Advisory Board, UBC Master of
Data Science Program

Co-author with Alice Zheng, “Feature
Engineering for Machine Learning”
[O'Reilly, 2018]

Organizer @ Seattle PyLadies

I am *endlessly fascinated* by the difference between ***the systems we aim to create*** + the ***real systems which emerge***.



[xkcd - flu shot](#)



The Systems We Created + Their Emergent Challenges



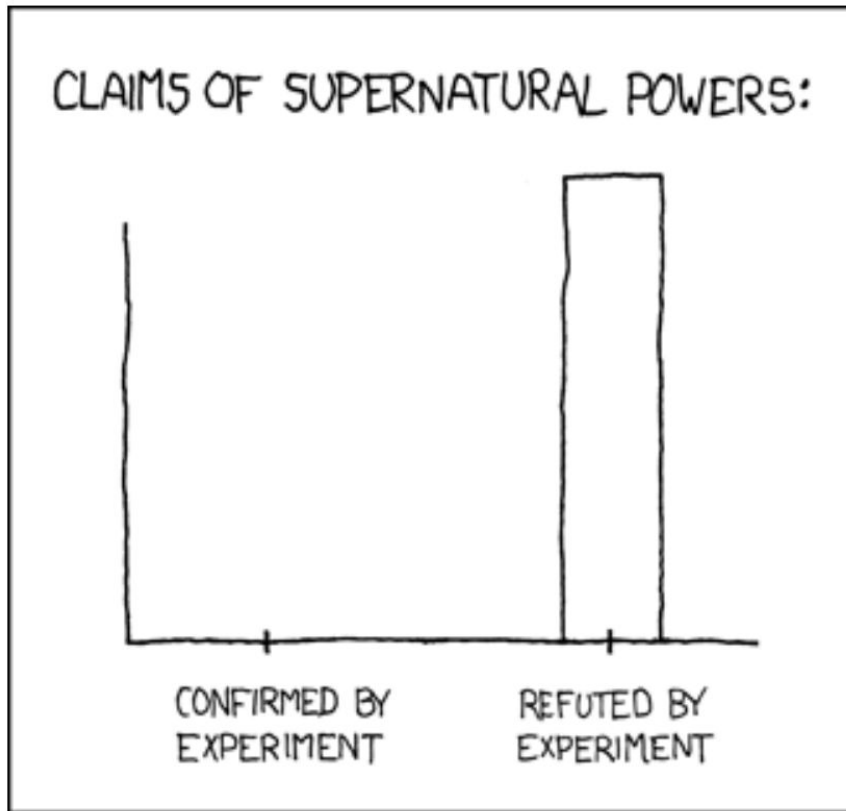
Big Data



The Promise of Big Data

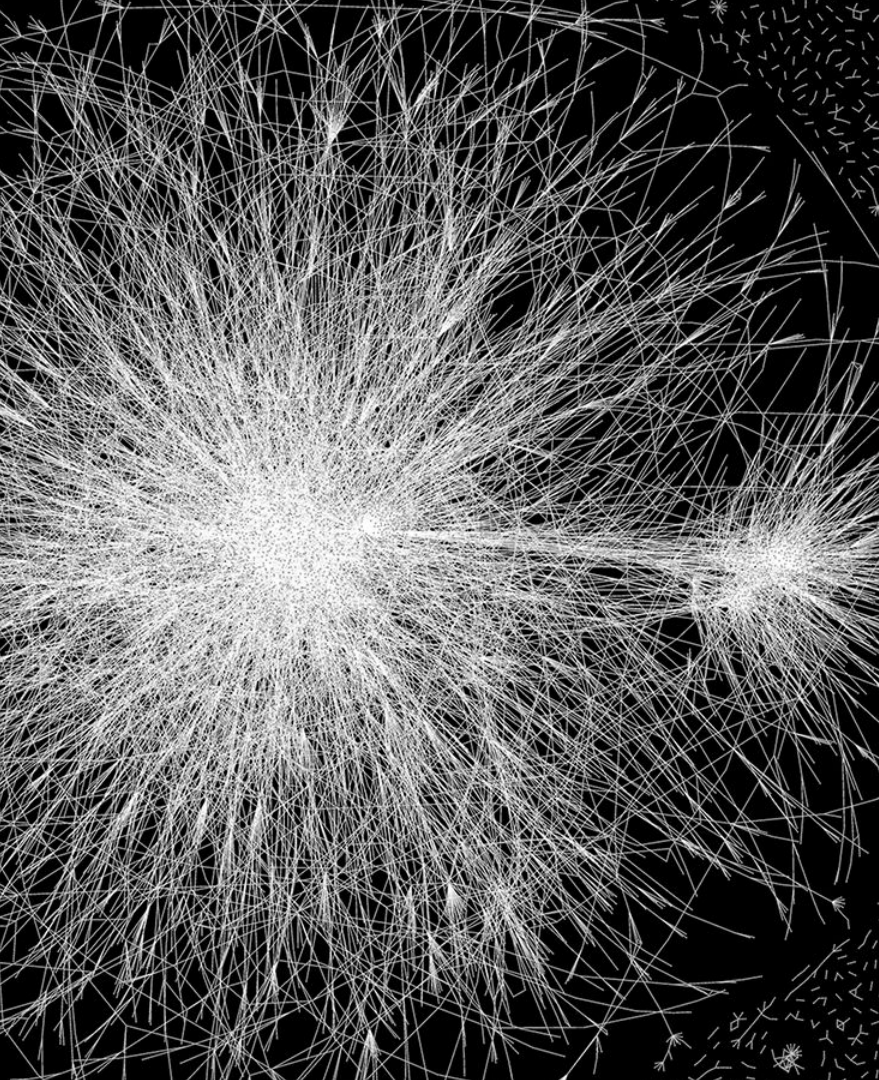
@amcasari

The Reality of Big Data





Data Science

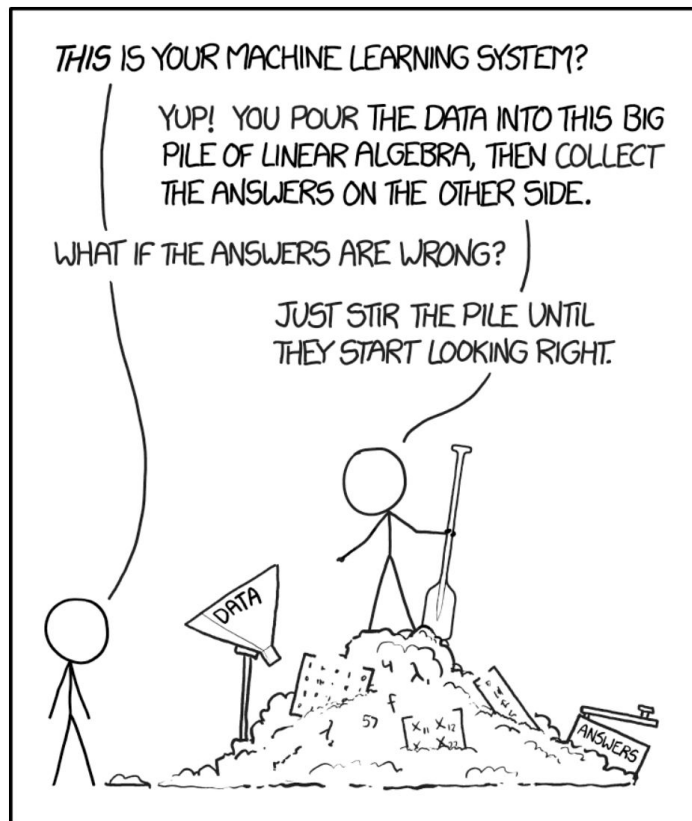


The Promise of Data Science

image: [shared channels @ slack](#)

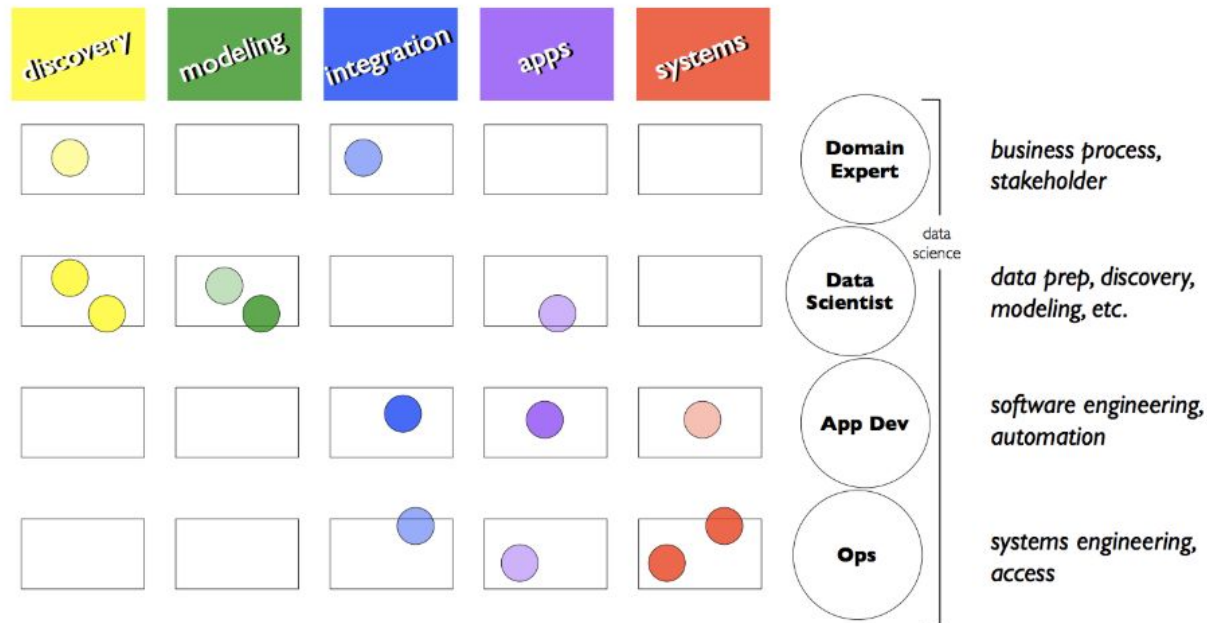
@amcasari

The Reality of Data Science



The Reality of Data Science

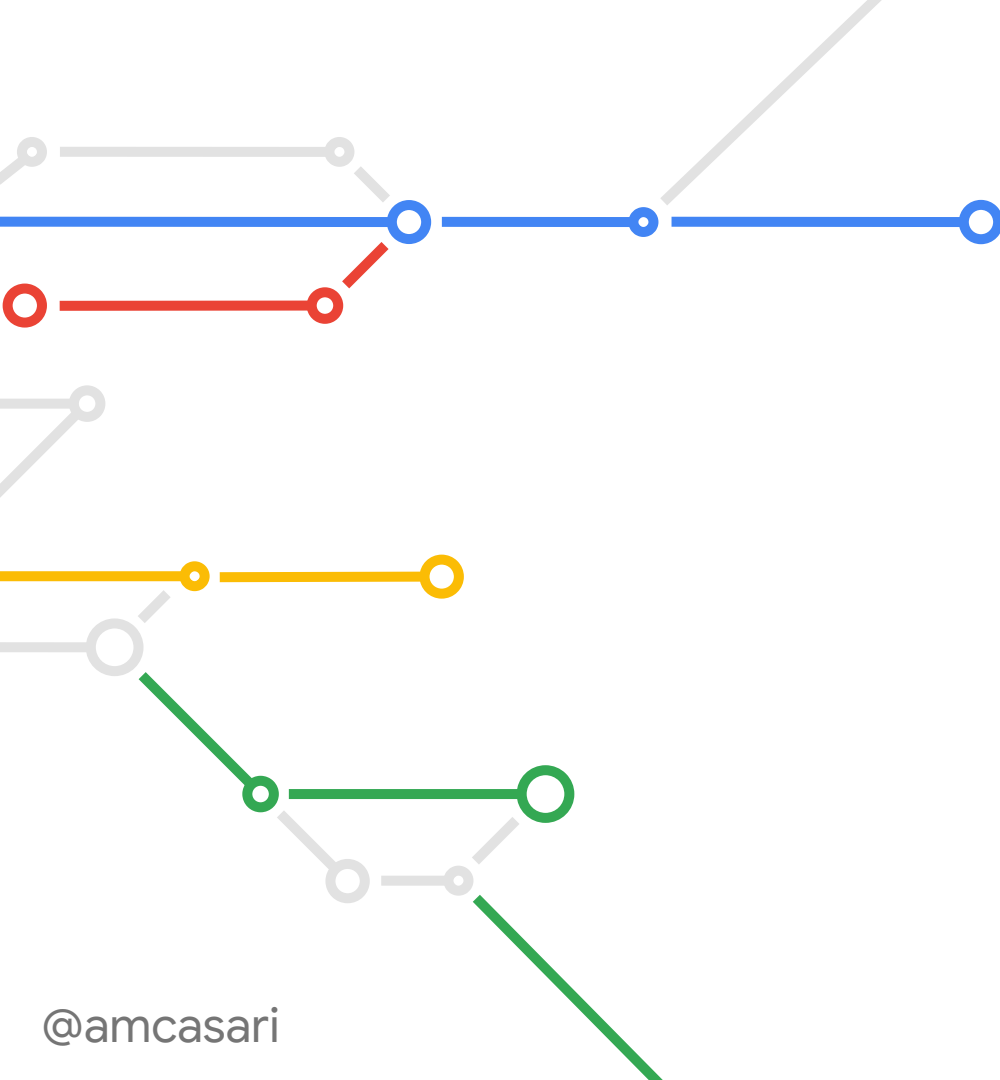
Team Composition = Needs × Roles



“blurring these roles is wonderful... however, when businesses get into trouble, they also tend to “push down” these roles, **blurring boundaries** in ways which stresses teams and **limits scalability**.”

NB: effective, hands-on management in Data Science must live in the space of **integration**, not delegate it”

diagram and description courtesy of Paco Nathan



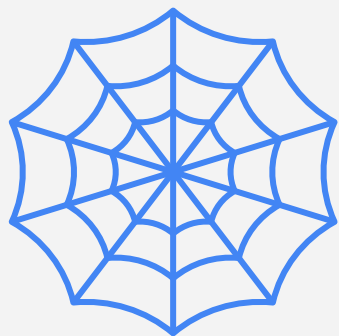
...sound familiar?

An abstract graphic on the left side of the slide consists of several horizontal and diagonal lines in blue, red, yellow, and green, each with small circles at the ends. Some lines are solid, while others are dashed. The lines are arranged in a way that suggests a network or a flow.

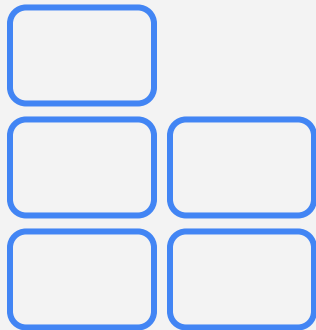
Open Science

The Promise of Open Science

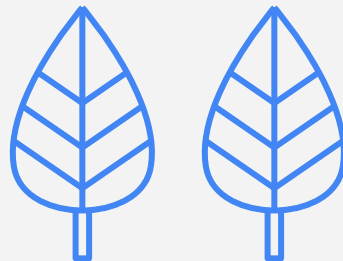
Resiliency



Scalability



Reproducibility

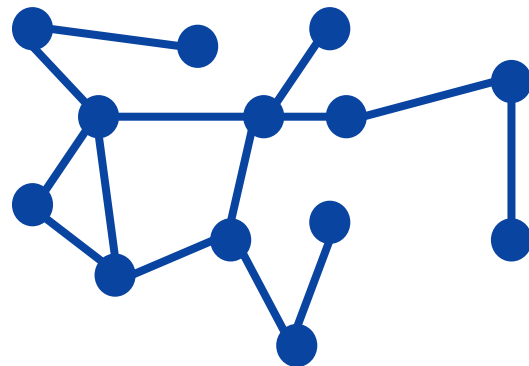
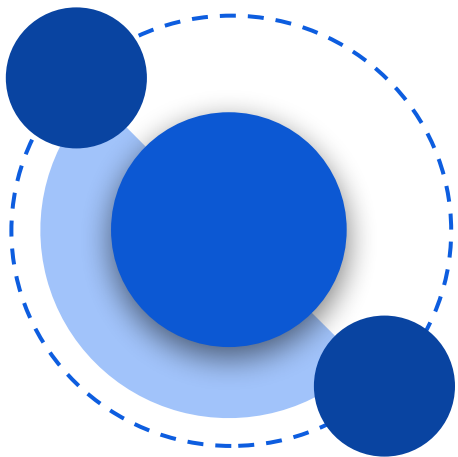


Transparency



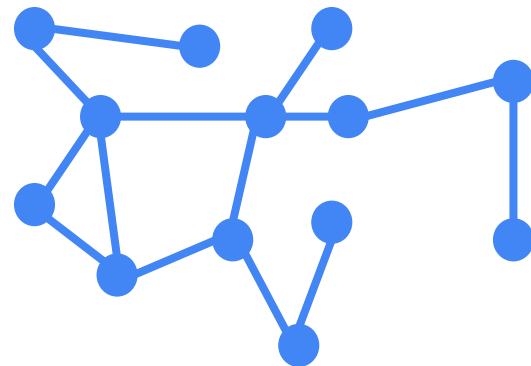
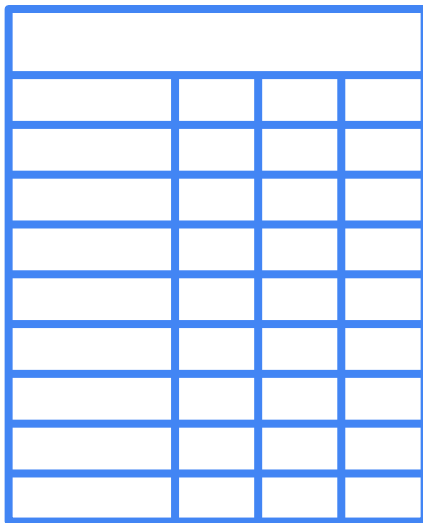
...for equity + equality of knowledge.

It's about the *Problems + Stacks + Teams*



...it's about the interdependent system.

Examine the shape of the system...





Lists as Problems as Stacks as Teams

Lists as Problems...



- Simple dimensions
- Well scoped outcomes
- Success is getting from A to B
- Clear timelines

Lists as Problems as Stacks...



- Use known technical architectures
- Open source for the win!
- Keep it simple
- Success is it can be done 1 to N times well + predictably
- Maintenance is clear

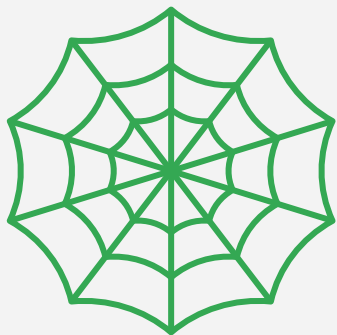
Lists as Problems as Stacks as Teams



- Role descriptions look much like requirements list
- “Full stack” problem solvers
- Independent individuals
- Growth is methodically extending the project’s known feature set

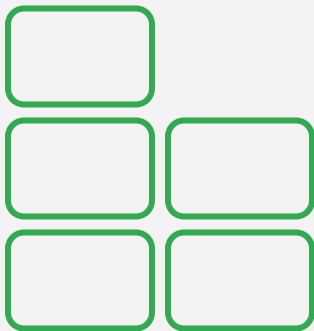
Lists as... - Managing Your Tradeoffs

Resiliency



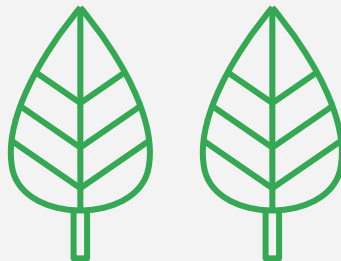
Linear

Scalability



ACID is fine

Reproducibility



Deterministic

Transparency

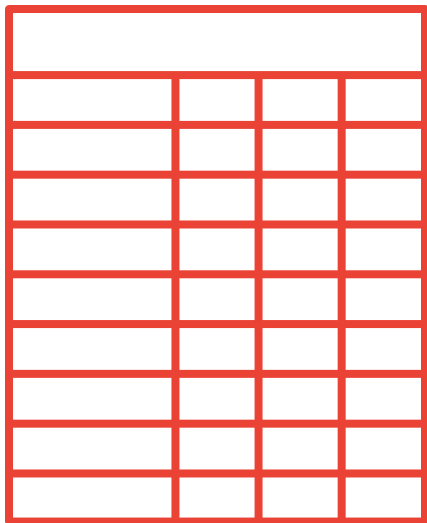


Clear



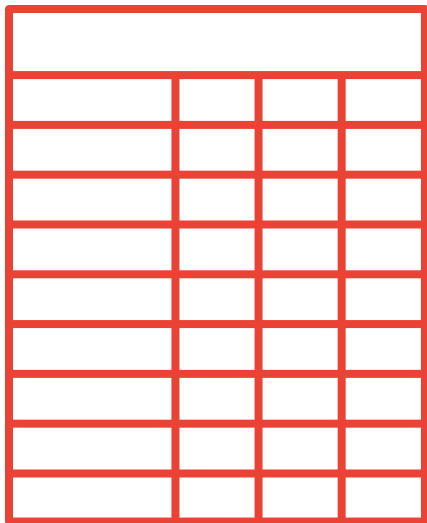
Matrices as Problems as Stacks as Teams

Matrices as Problems...



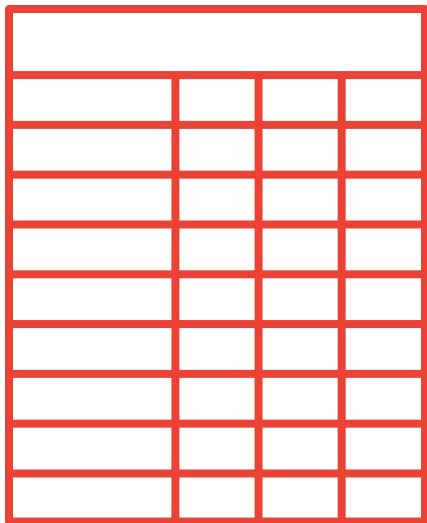
- Problem extends broadly + deeply
- Problem space + outcomes are ambiguous, but constrained
- Timelines can be known, with scoping

Matrices as Problems as Stacks...



- Use known technical architectures
- Centralized versus decentralized versus service versus platform
- Success is it can be done N times repeatably and reasonably fast
- Maintenance is clear + distributed

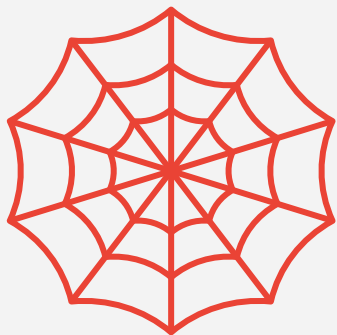
Matrices as Problems as Stacks as Teams



- Roles + skill sets can be distributed across team
- Workloads can spread out
- Known shape of roles + skills needed for success
- Fixed mindsets work well here - lots of knowns, clear expectations

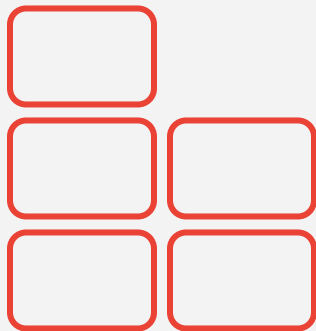
Matrices as... - Managing Tradeoffs

Resiliency



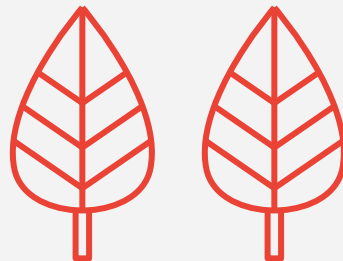
Big O

Scalability



CAP applies

Reproducibility



Deterministic

Transparency

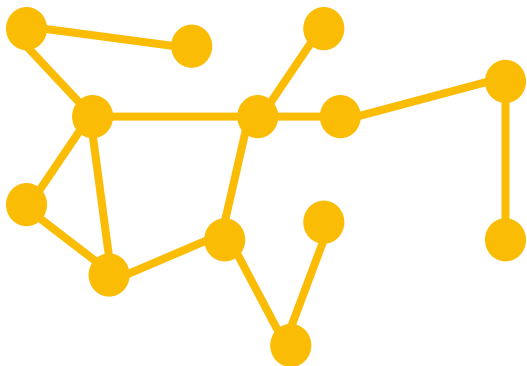


Distributed



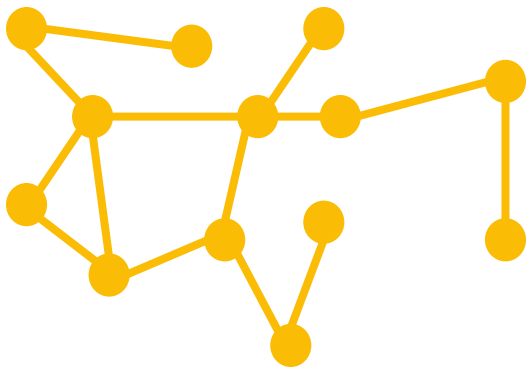
Networks as Problems as Stacks as Teams

Networks as Problems...



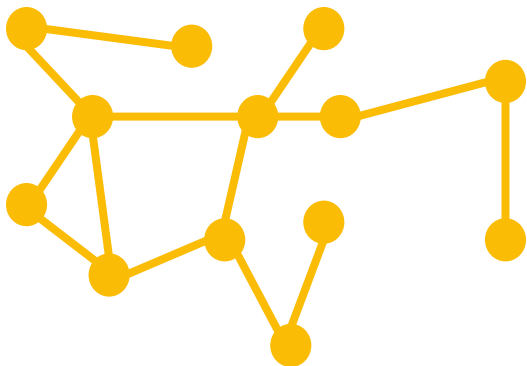
- Problem space is ambiguous
- Constraints can change over time
- Clear short term timelines + outcomes
- Clear long term vision + goals
- Path between short + long term is not necessarily developed yet

Networks as Problems as Stacks...



- Plan for growth + modularity
- Open source for the win!
- Expect needs to change over time
- Expect complexity to grow over time
- It's not done until it's documented

Networks as Problems as Stacks as Teams



- Nodes
 - Distribution of skills matters
 - Adjacency of roles/skills can flex
- Edges
 - Communication is critical
 - It's not done until it's documented + open to the team + accessible

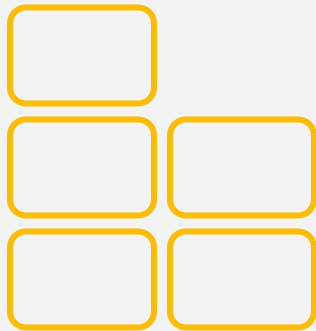
Networks as... - Managing Tradeoffs

Resiliency



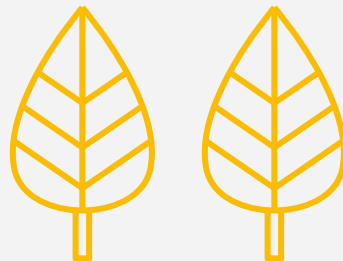
Nonlinear

Scalability



CAP applies

Reproducibility

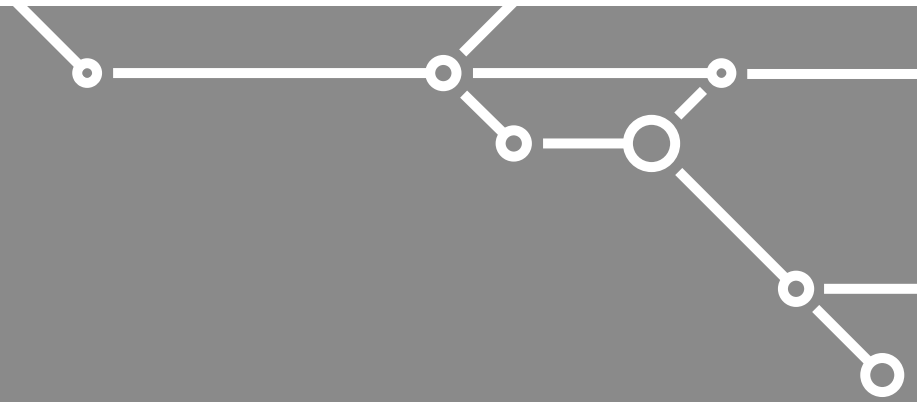


Probabilistic

Transparency

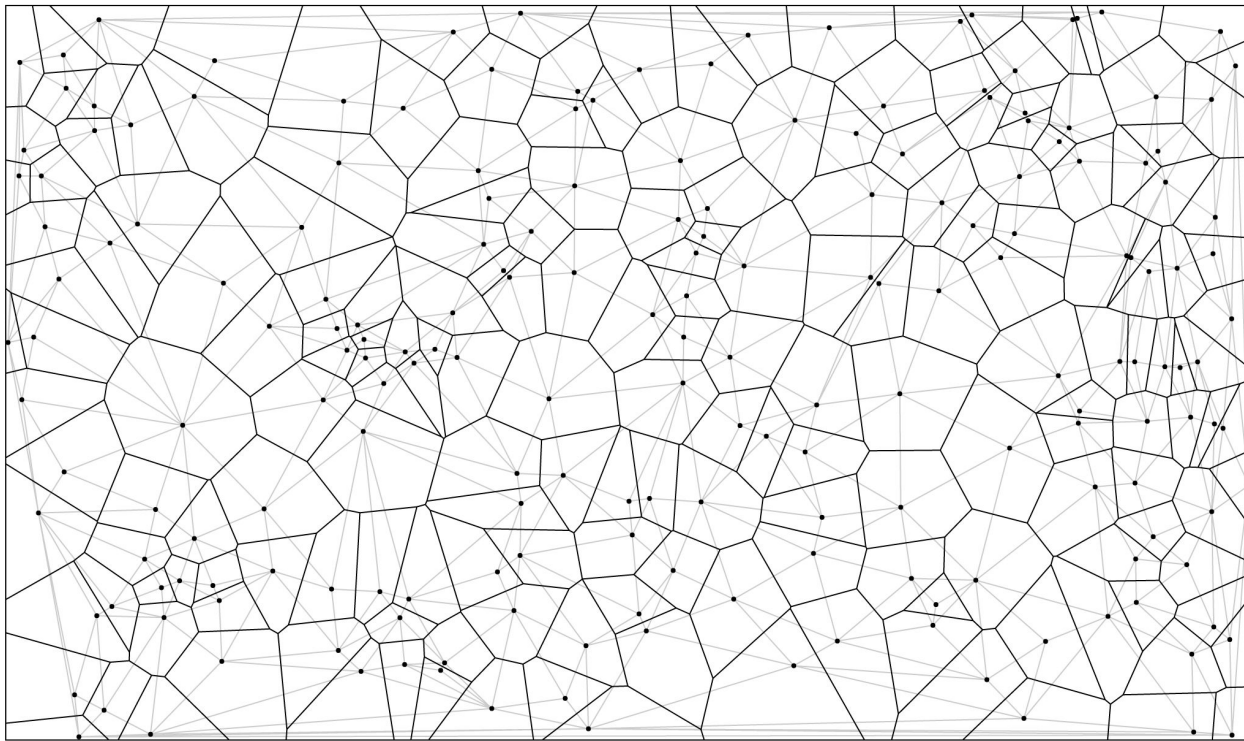


Observable



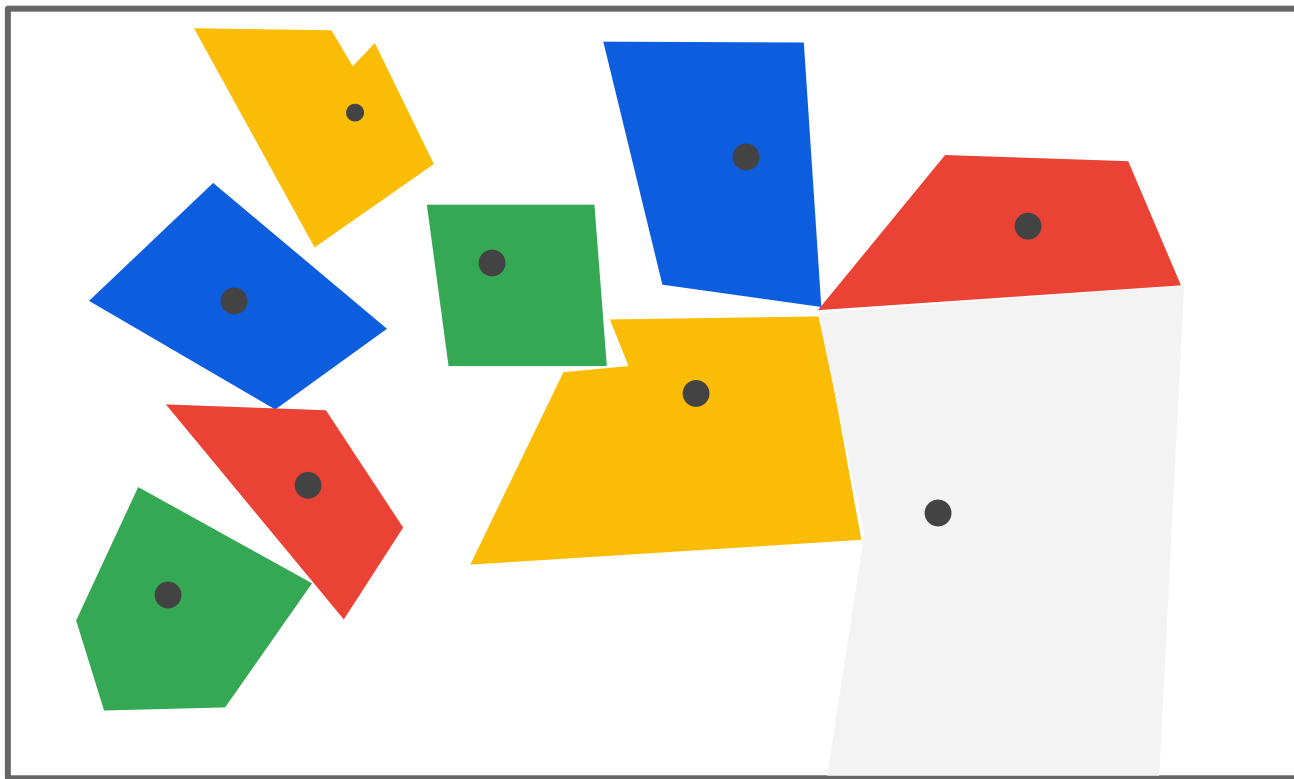
Evolutionary Networks as Problems as Stacks as Teams

Evolutionary Networks as... Space Filling Shapes



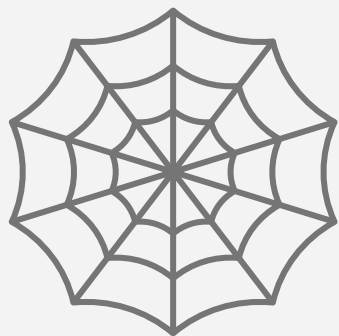
[@mbostock - voronoi](#)

Evolutionary Networks as... Room to Grow



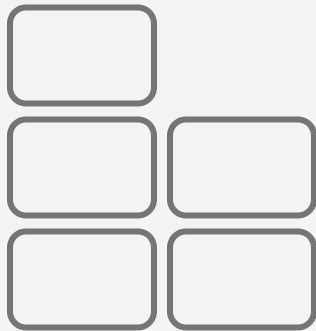
Evolutionary Networks - Managing Tradeoffs

Resiliency



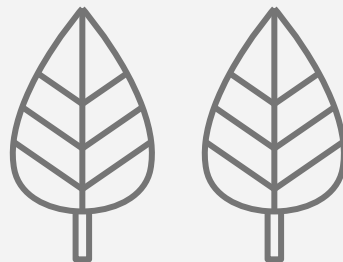
Nonlinear

Scalability



CAP applies

Reproducibility



Probabilistic

Transparency



Observable

...same as other networks

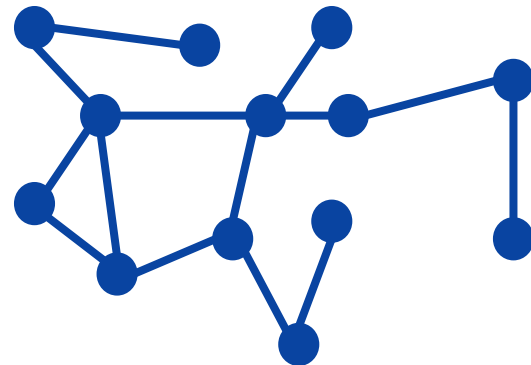
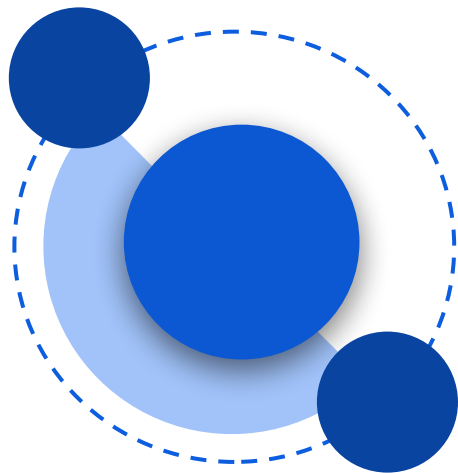
(with potentially greater return on team investment)

An abstract graphic on the left side of the slide consists of several horizontal and diagonal lines in blue, red, yellow, and green, connected by small circular nodes. Some lines are solid, while others are dashed. The nodes are also colored to match their respective lines. The overall composition suggests a network or a path.

The Path Forward

To design systems responsibly --

- Find the shape of your problem
- Consider your (necessary) constraints
- Consider your resources: technical + people
- Consider your tradeoffs
- Find where you can leave room for growth



***Design your projects responsibly, as
interdependent systems:
people + tech + resources + constraints***



Thank you

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opensource.google.com

Recommended reading on building teams + complexity

- *The Girls of Summer: The U.S. Women's Soccer Team and How It Changed the World*, Jere Longman (2001)
- *The Manager's Path: A Guide for Tech Leaders Navigating Growth + Change*, Camille Fourier (2017)
- *Resilient Management*, Lara Callender Hogan (2019)
- *Systems Thinking, A Primer*, Donella Meadows (2008)
- *An Elegant Puzzle: Systems of Engineering Management*, William Larson (2019)