

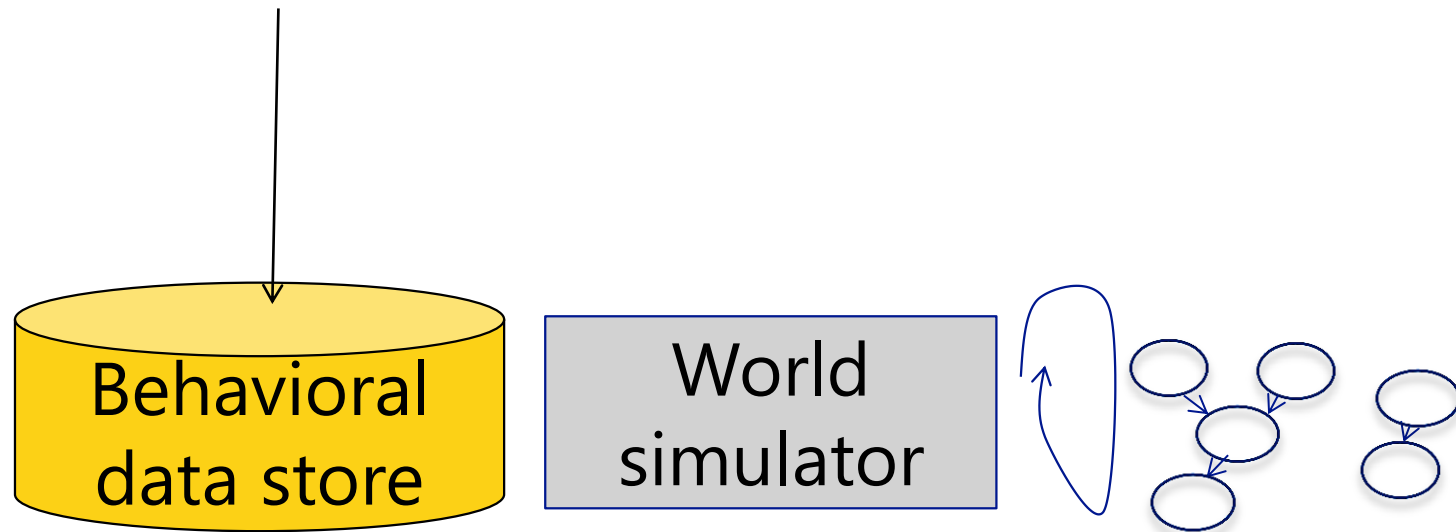
Crowd Physics: Studies of Collaborative Opportunities in Spatiotemporal Networks of People

Eric Horvitz

Joint work with John Krumm and Adam Sadilek

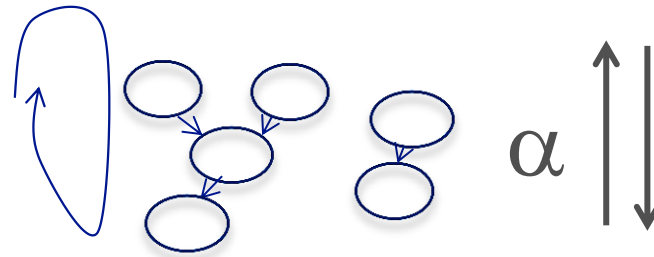
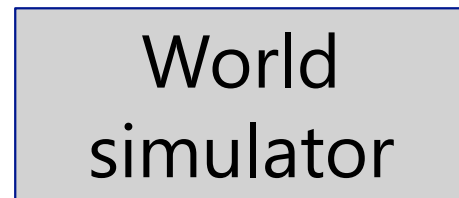
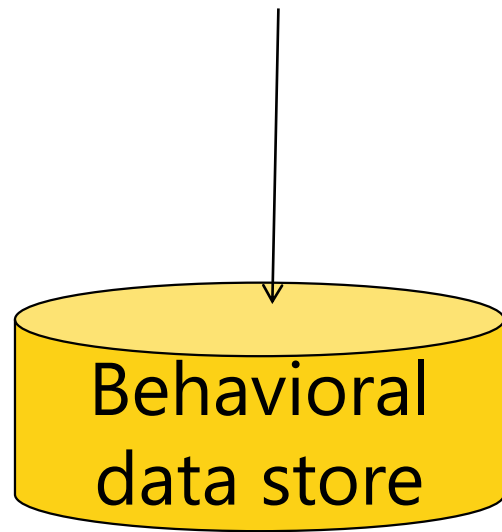
Paradigm for Digital Experimentation

Population activity
in the wild



Paradigm for Digital Experimentation

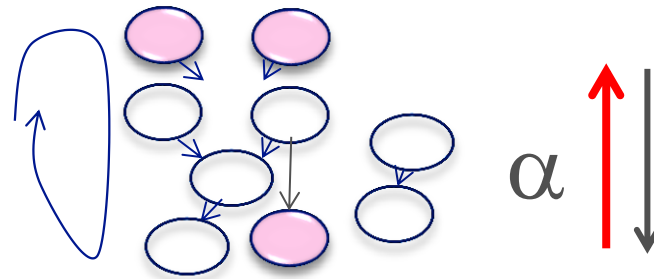
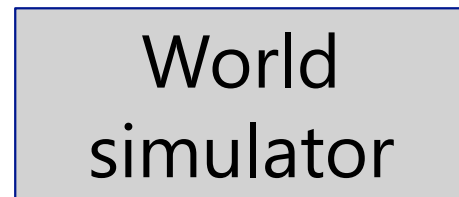
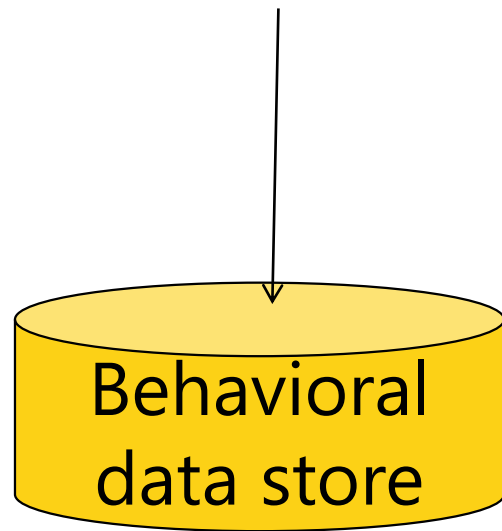
Population activity
in the wild



What-if studies

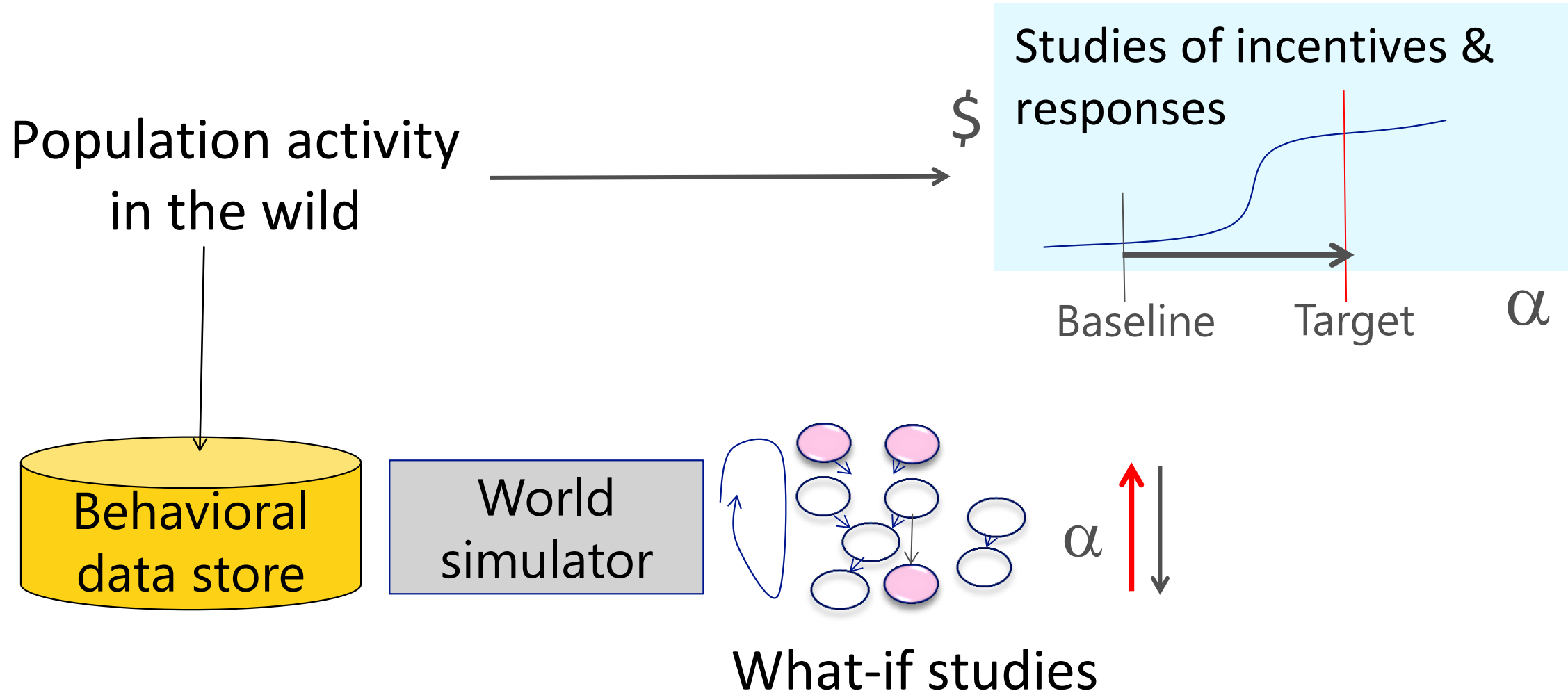
Paradigm for Digital Experimentation

Population activity
in the wild

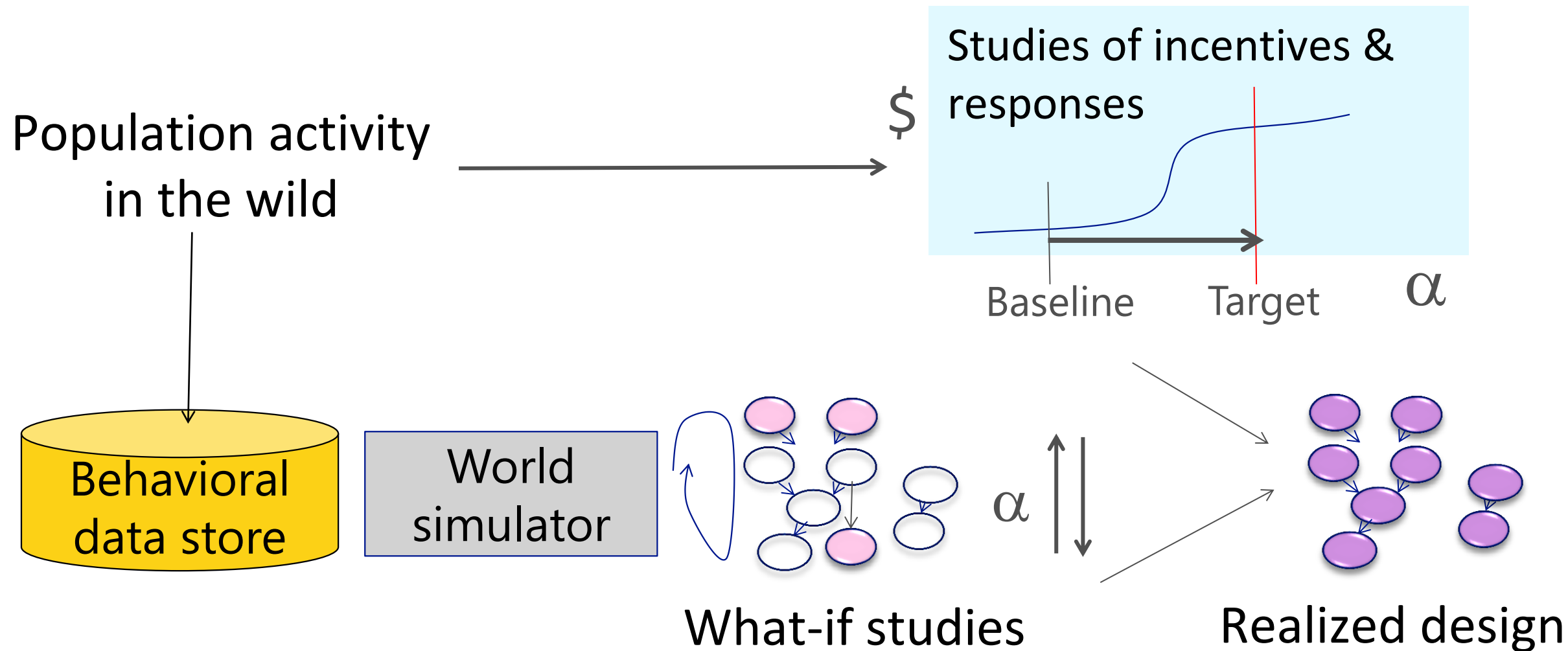


What-if studies

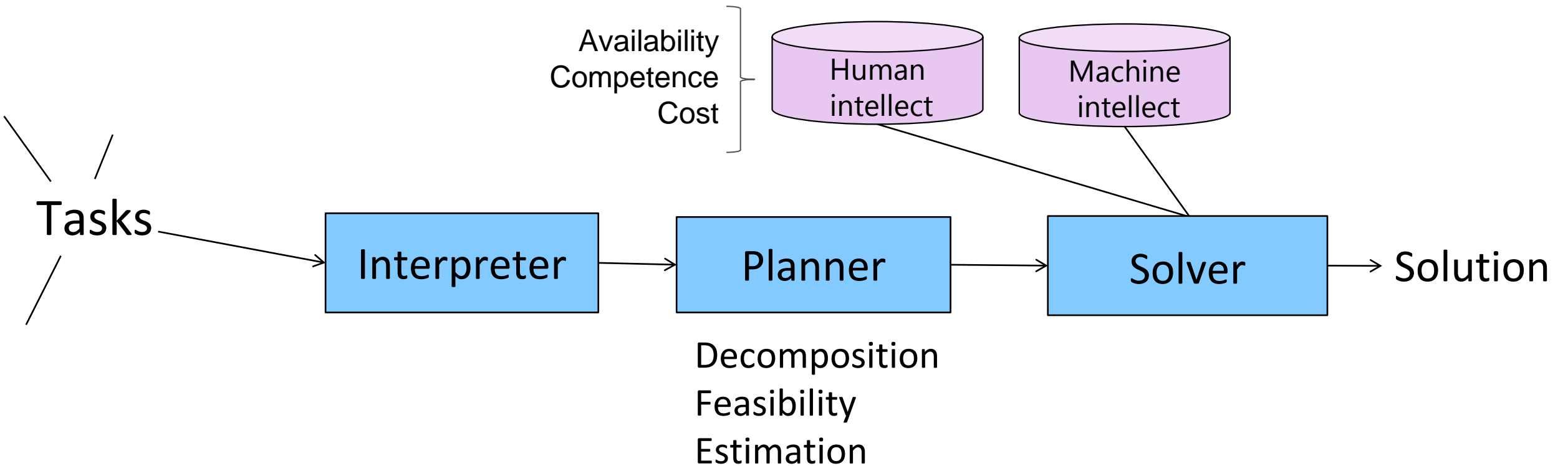
Paradigm for Digital Experimentation



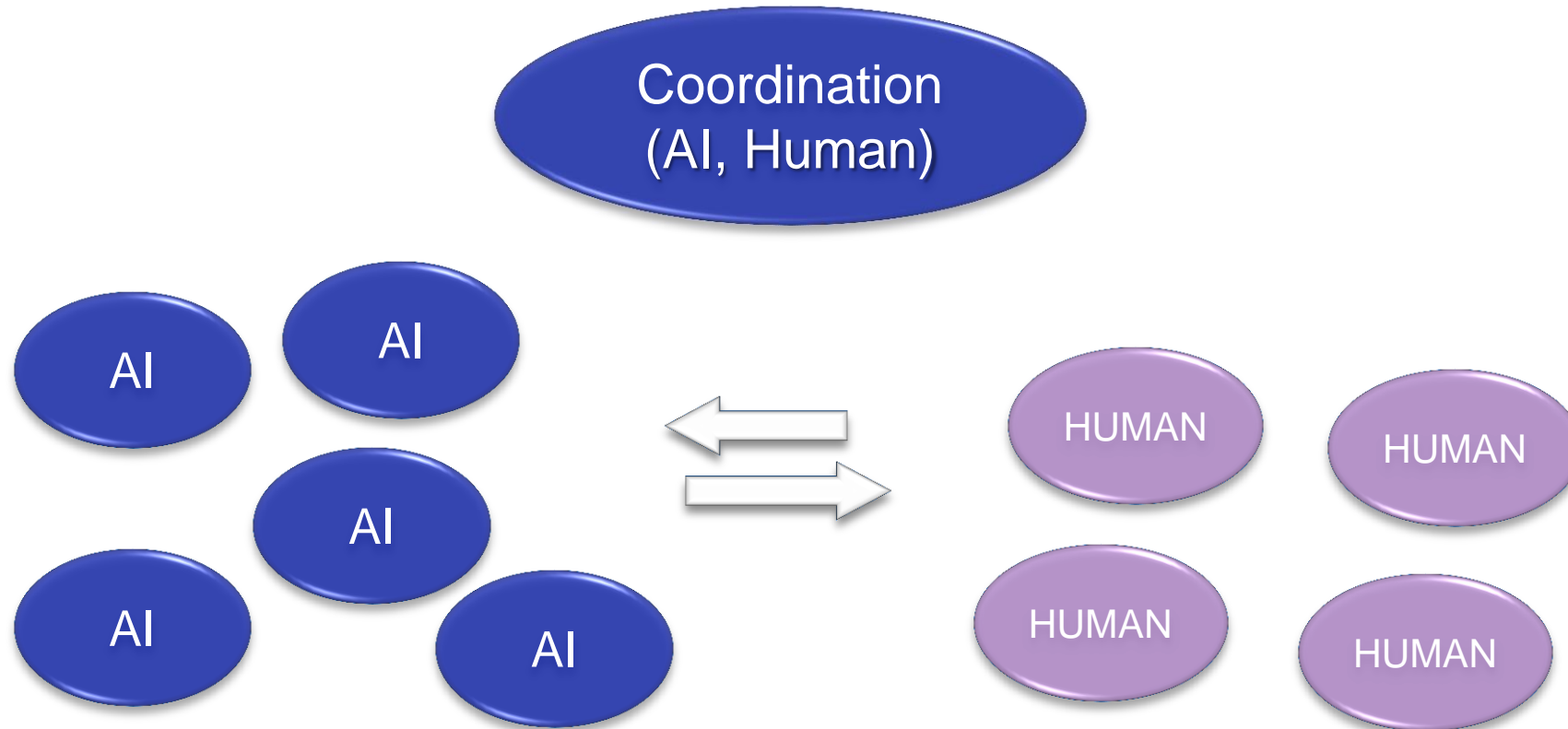
Paradigm for Digital Experimentation



Motivation: Generalized Task Markets

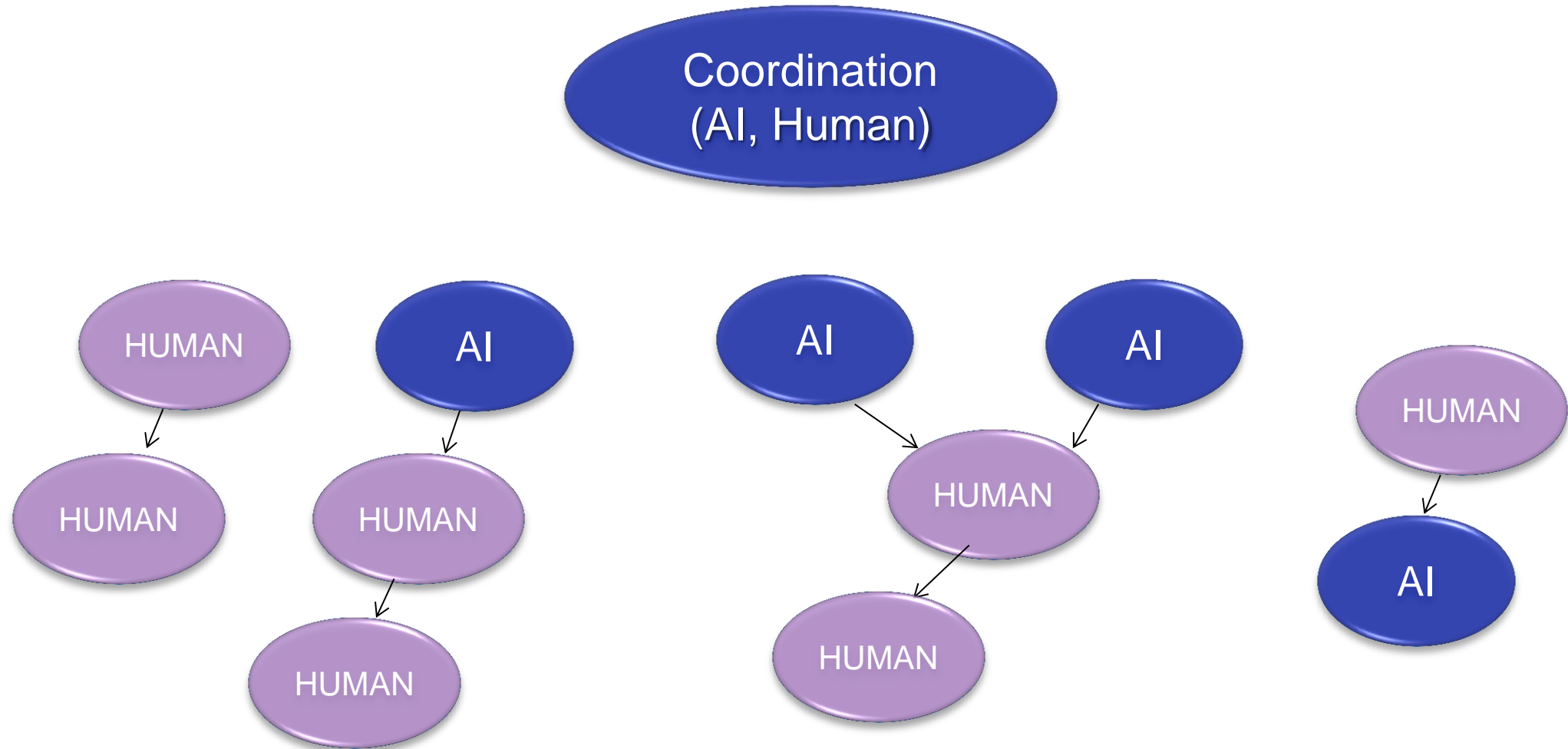


Motivation: Generalized Task Markets



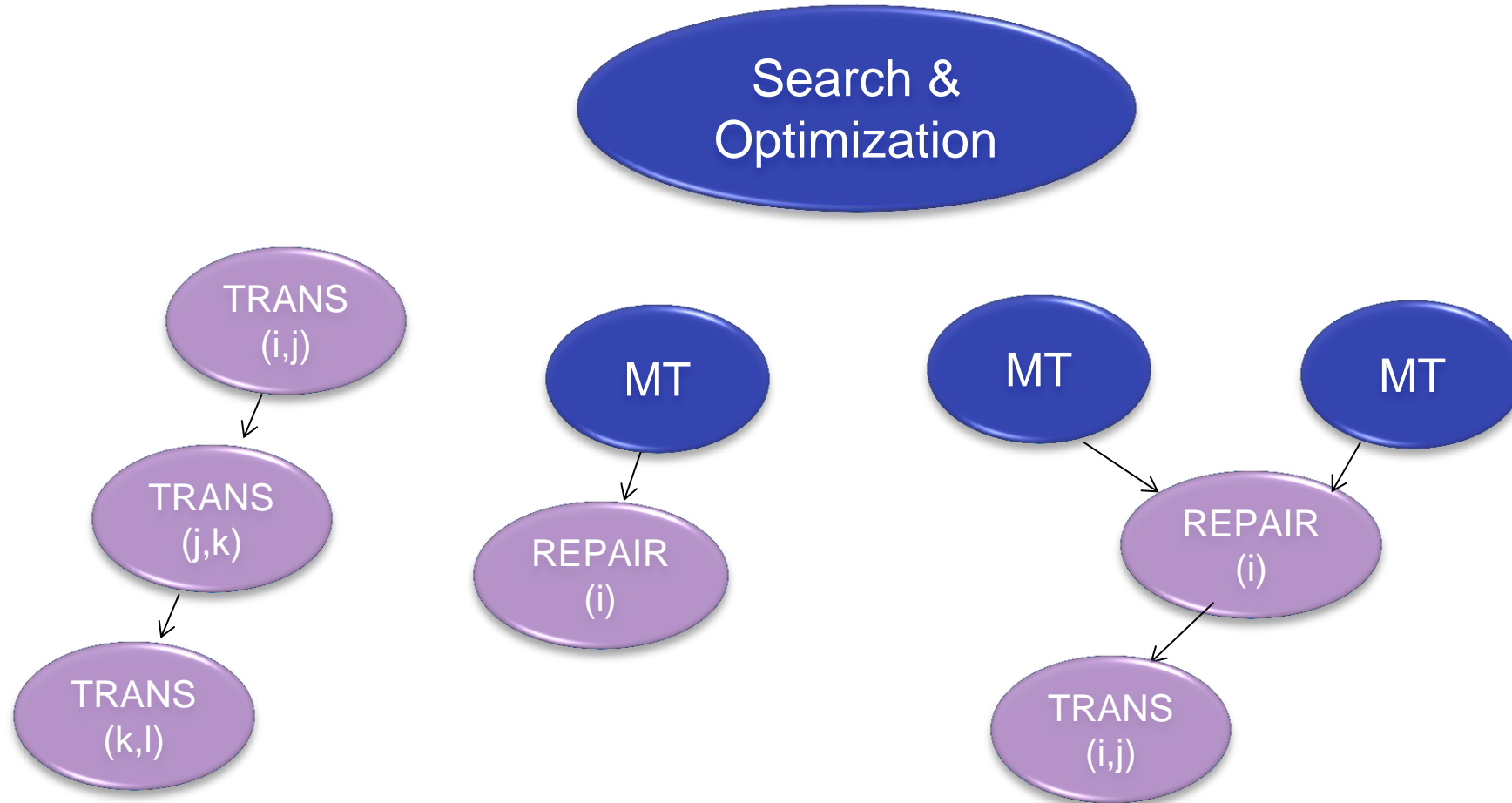
Ideal assemblies of human & machine intelligence

Workflows & Routing



Example: Lingua Mechanica

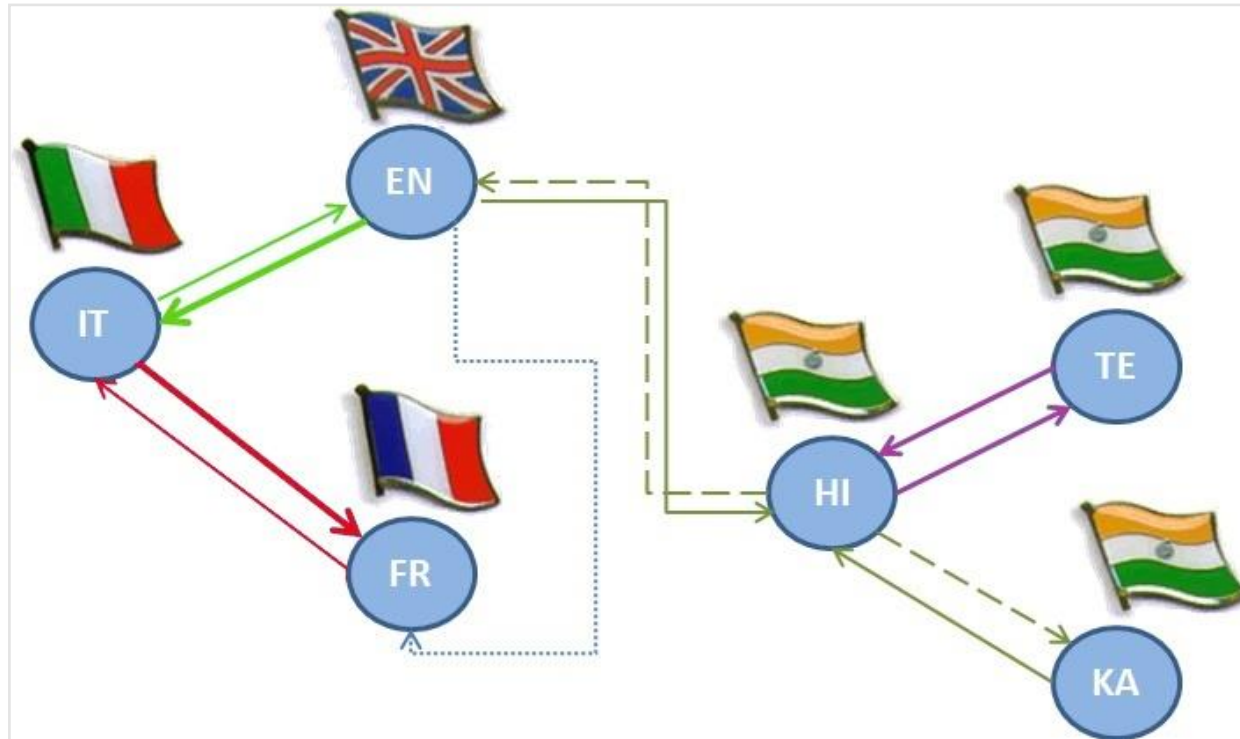
Translate languages via networks of people & machines



Example: Lingua Mechanica

Translate languages via networks of people & machines

Learn competencies & availabilities of crowdworkers

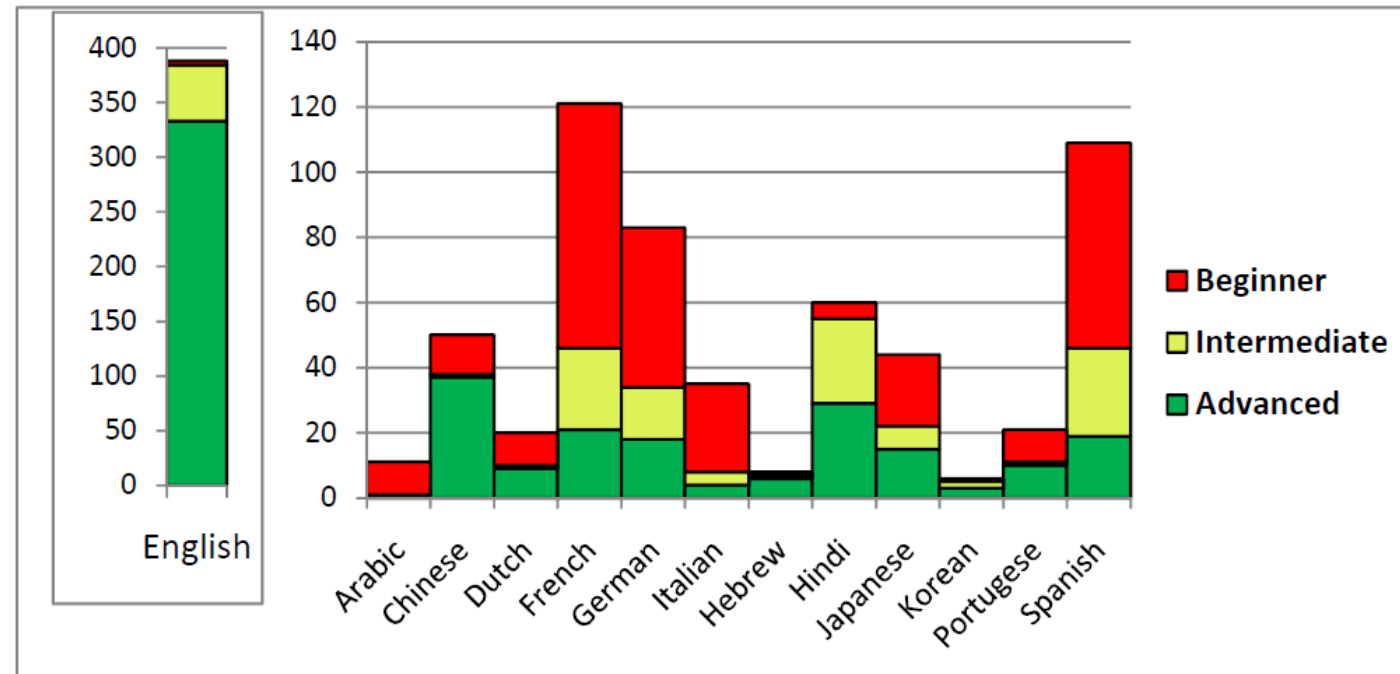


Example: Lingua Mechanica

Translate languages via networks of people & machines

Learn competencies & availabilities of crowdworkers

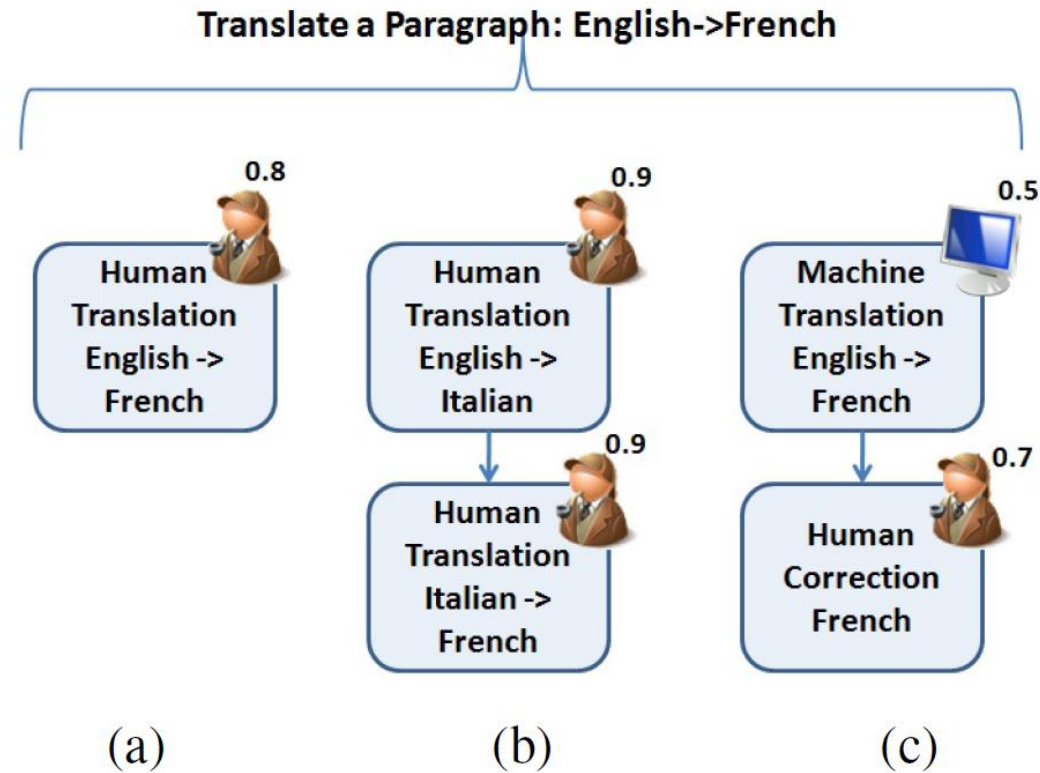
Crowdworker translation competencies



Example: Lingua Mechanica

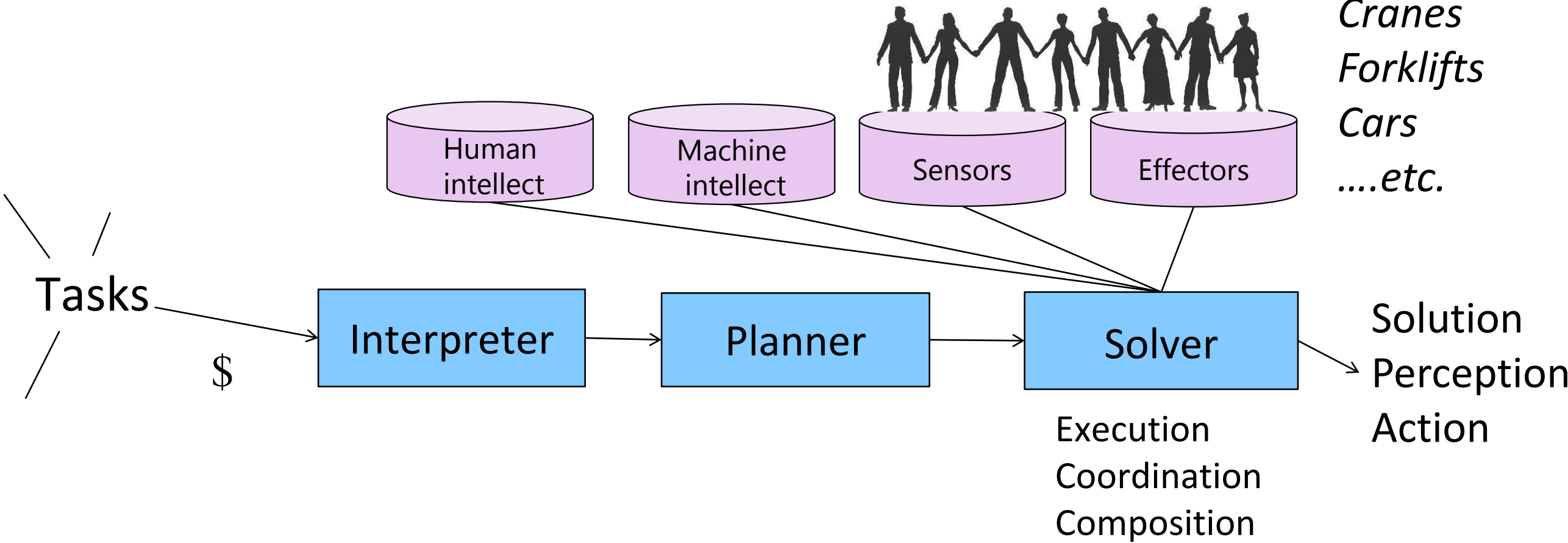
Translate languages via networks of people & machines

Learn competencies & availabilities of crowdworkers



Getting Physical: Crowd Physics

*People
Cameras
Cranes
Forklifts
Cars
....etc.*



Crowd Physics Studies

Capture real-world data on location and mobility

Digital experimentation via parameter sweeps

Seek insights on shaping “fabric” of collaboration

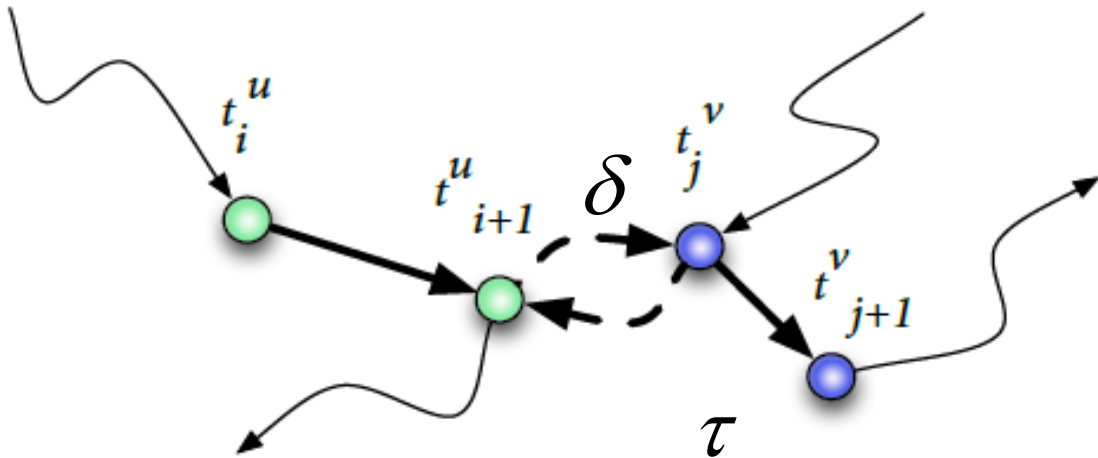
Preferences, incentives and links to collaborative fabric

Implications & directions

Canonical Crowd Physics Problem

Shaped Contact Graphs

Actively “shaped” routing graph: set proximity δ , dwell time τ



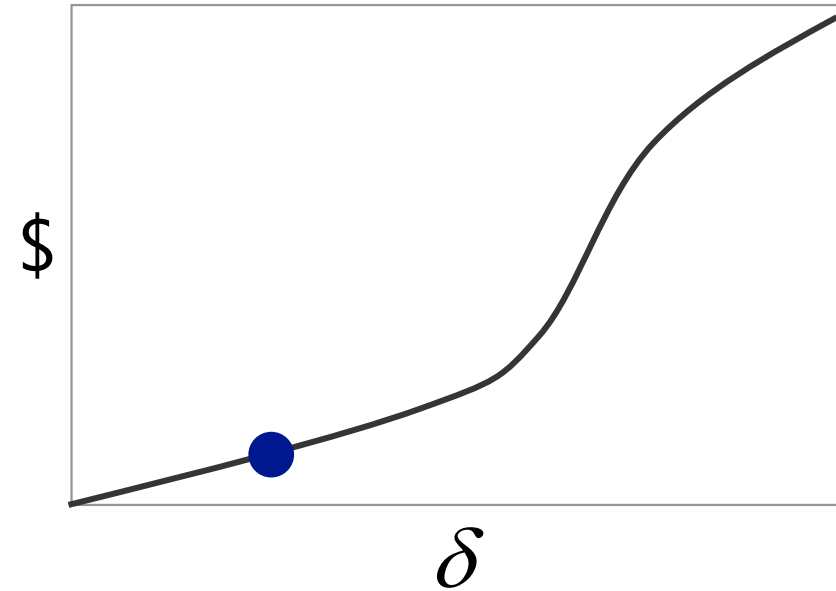
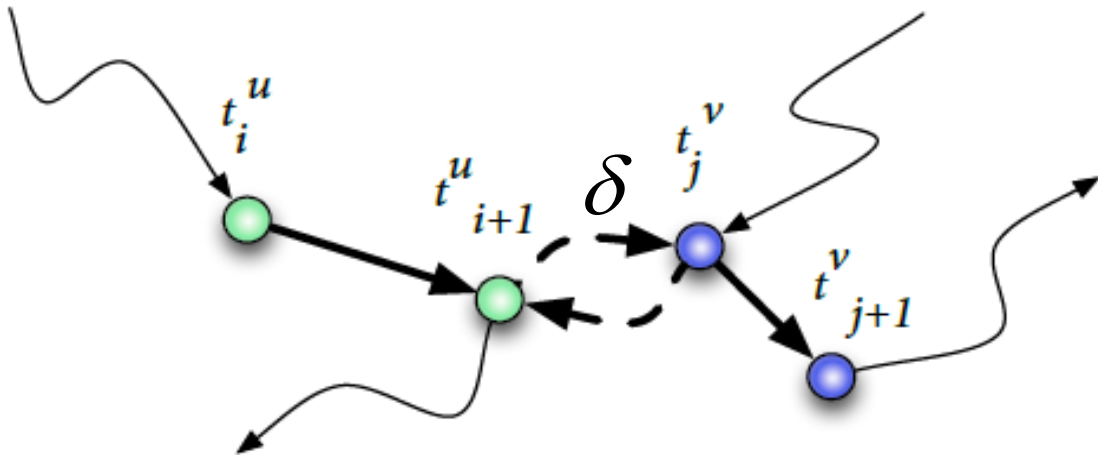
Studies

Locations via GPS-coded tweets
Sweep through δ, τ

Contact Graphs from Tweets

Shaped Contact Graphs

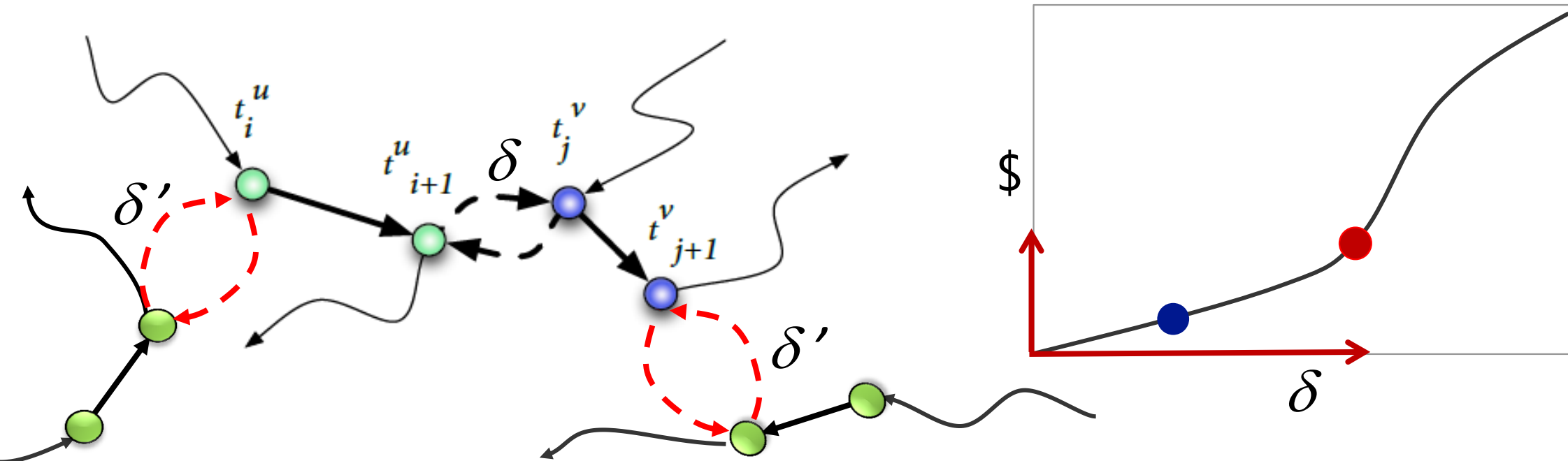
Actively “shaped” routing graph: set proximity δ , dwell time τ



Contact Graphs from Tweets

Shaped Contact Graphs

Actively "shaped" routing graph: set proximity δ , dwell time τ



Contact Graphs from Tweets

Shaped contact graphs: Experiments with design

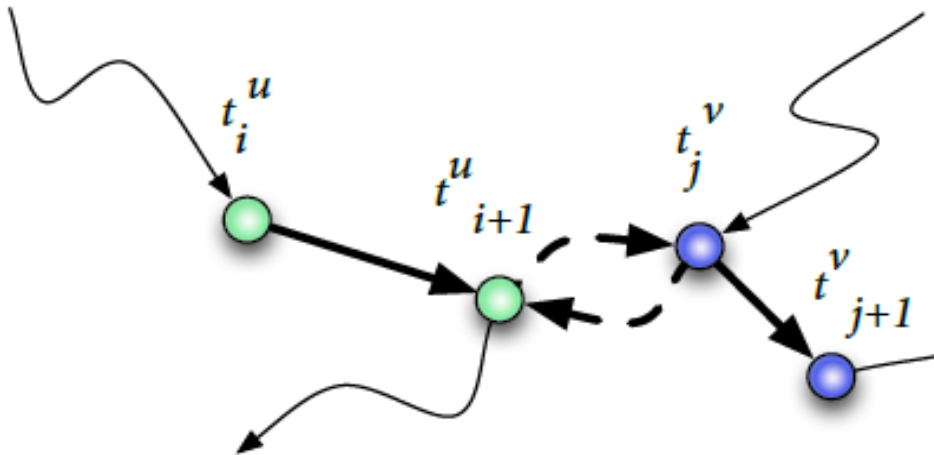
Actively “shaped” routing graph: set proximity δ , dwell time τ

21 days

Cities: 60x60 km

$\delta=100$ meters

$\tau=30$ minutes



Dataset	Days	Users	Tweets	Edges in G
NYC	21	47,713	544,606	740,489
SEA	21	10,424	125,620	140,075
US	2	371,481	3,434,898	3,931,884

Canonical Task: Routing Physical Objects

Synchronization & sequencing of effort

Local vs. centralized plans

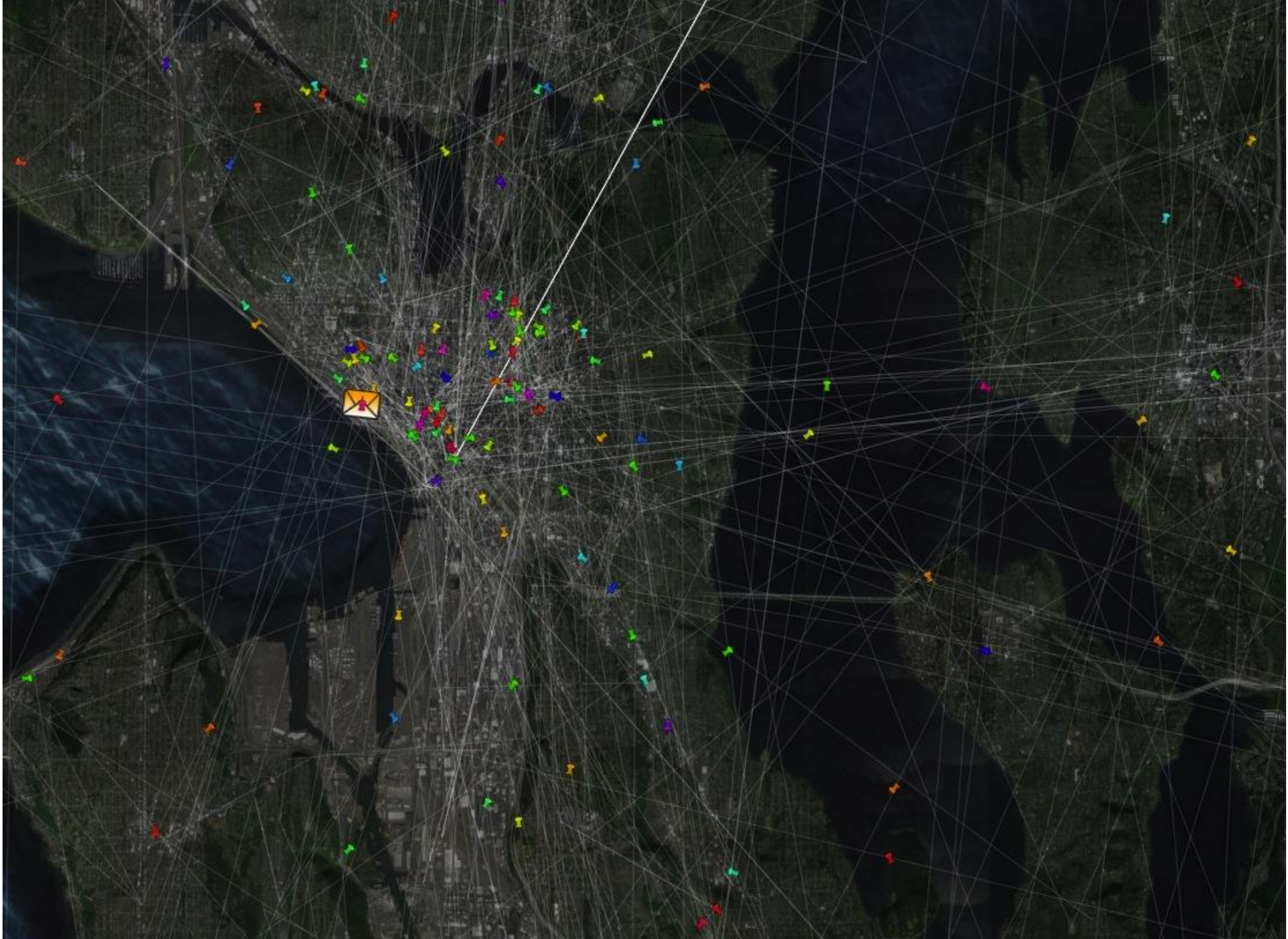
Canonical task: Route packages

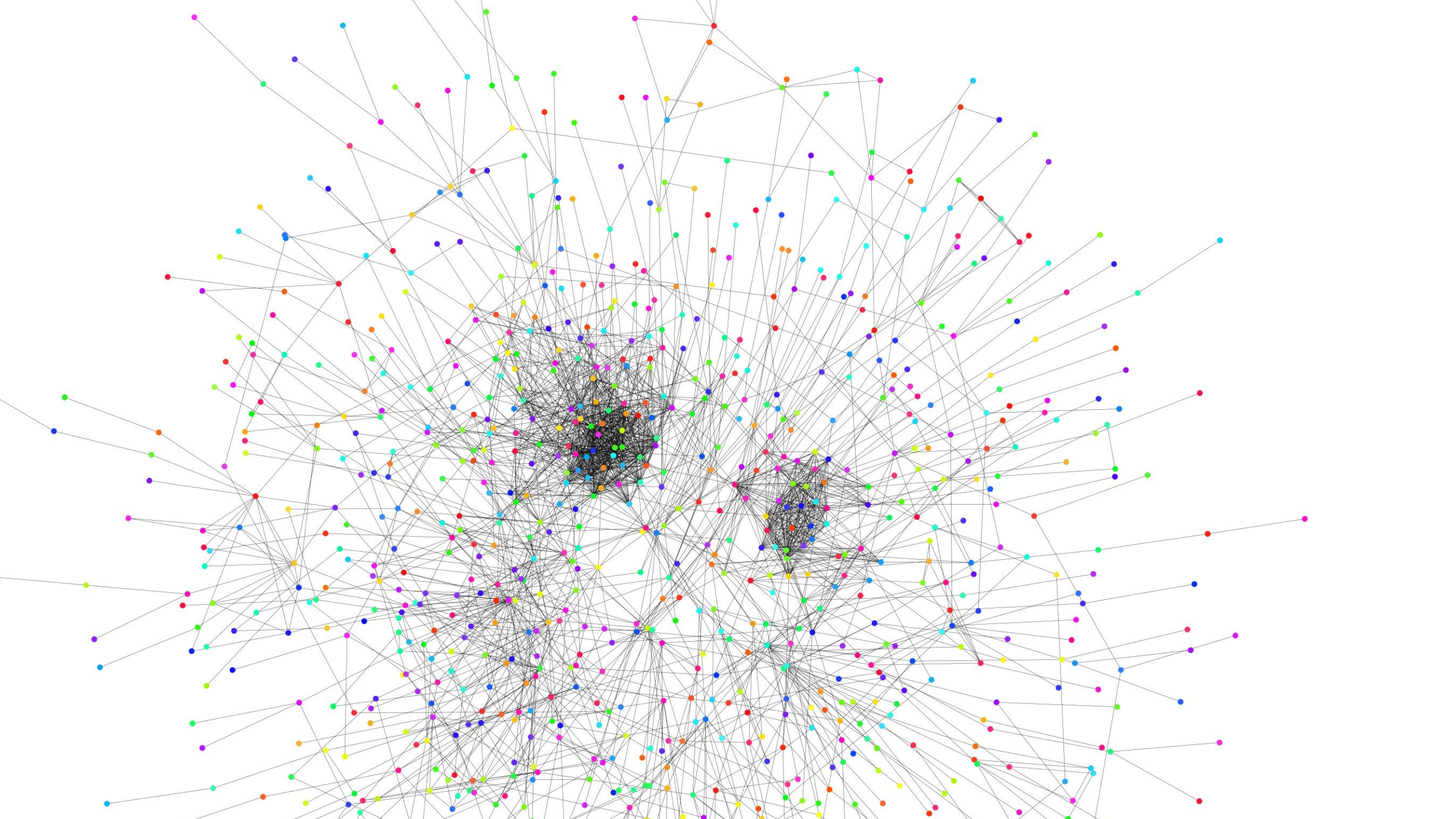


- Coverage & reachability
- Efficiency (delivery time)
- Optimality of routing heuristics
- Robustness to graph ablation
- Locale sensitivity

Video

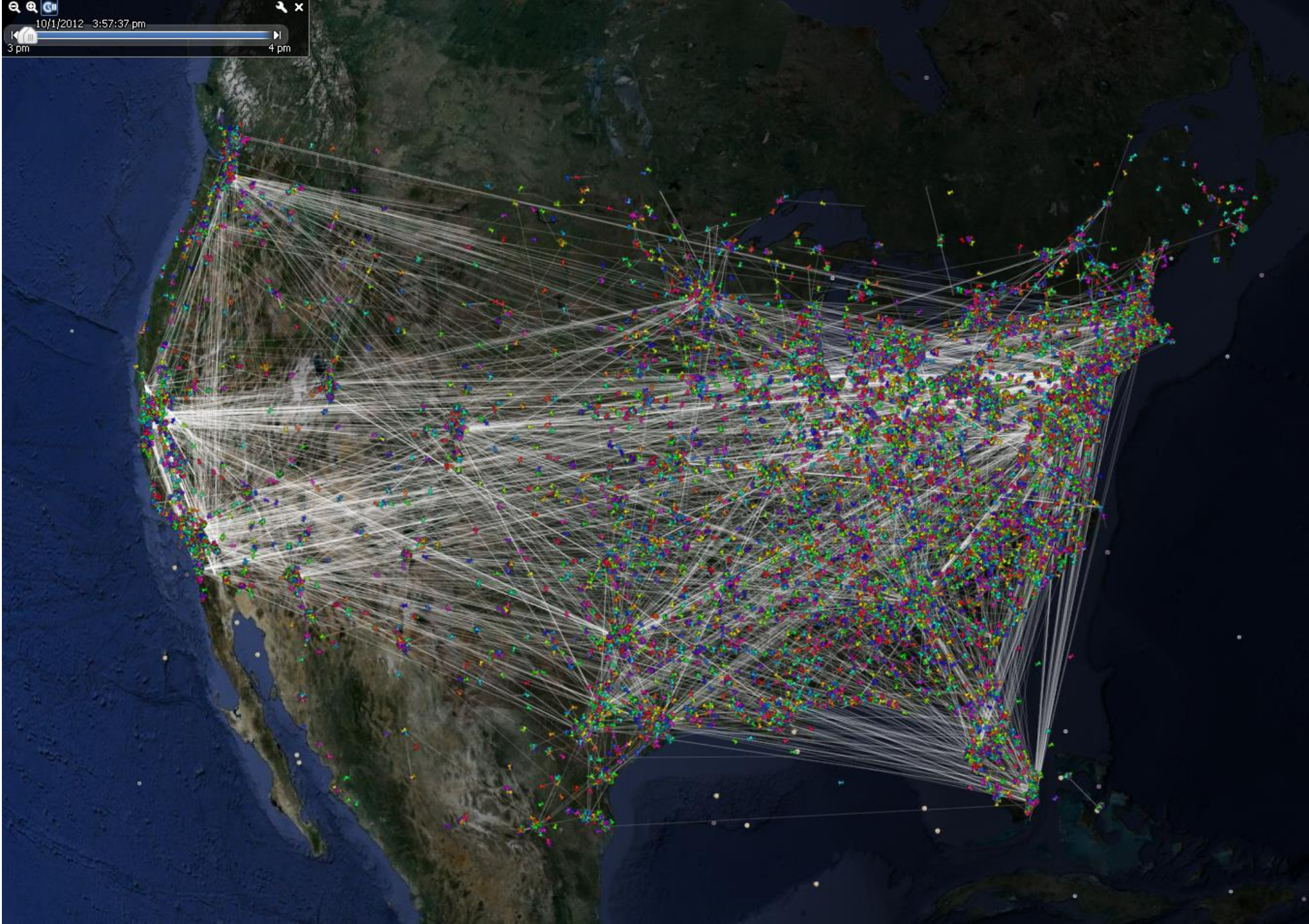






Video





Results on Contact Graphs

Random infinite graphs

Static, homogeneous networks, repeat lattice structure

Studies: Properties of finite, real-world contact graphs

Leverage for task coordination

Properties of Constructed Graphs

Lévy flight: random walk w/
heavy-tailed probability distribution.

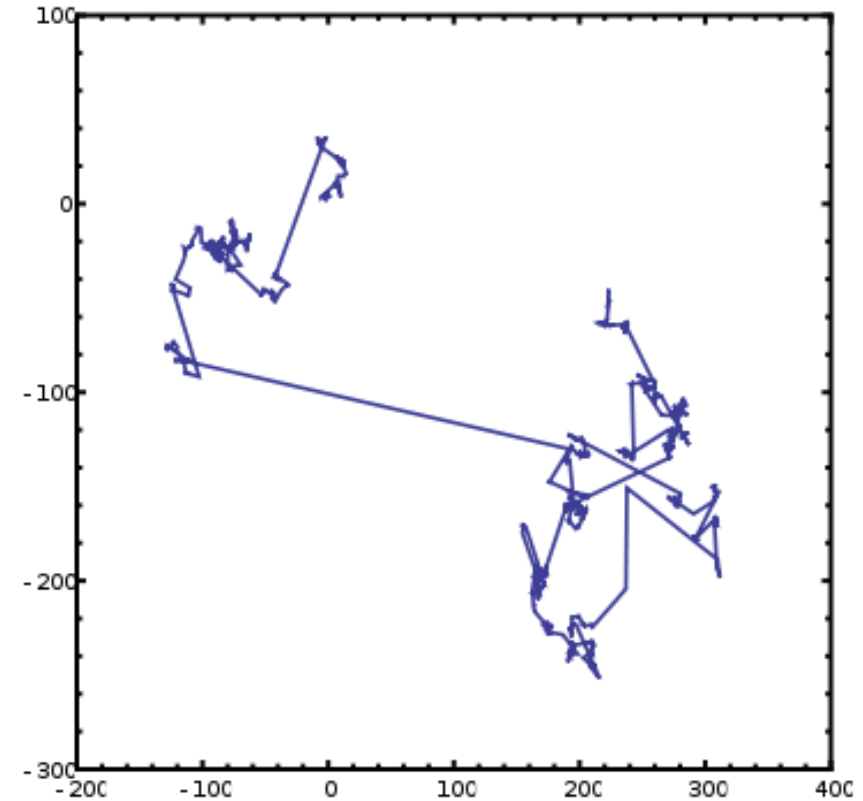
Frequent short-hops, rare long jumps
(Mandelbrot)

$$P(x) \propto x^{-\beta} \quad \beta = 2.2$$

Small-world phenomenon?

Graph diameter $O(\log n)$

Shortest path discoverable?



Studies of Routing in Contact Graphs

Global: Dijkstra, Floyd-Warshall

Assume: Complete, static knowledge

Real-time: Uncertainty about future locations

Local opportunistic routing

Use heuristics based on historical data

Routing Studies

60 x 60 km bounding box around Seattle, 6 months
450 x 450 m cells, start & destination (c_i, c_j)

Test: Final 35 hours

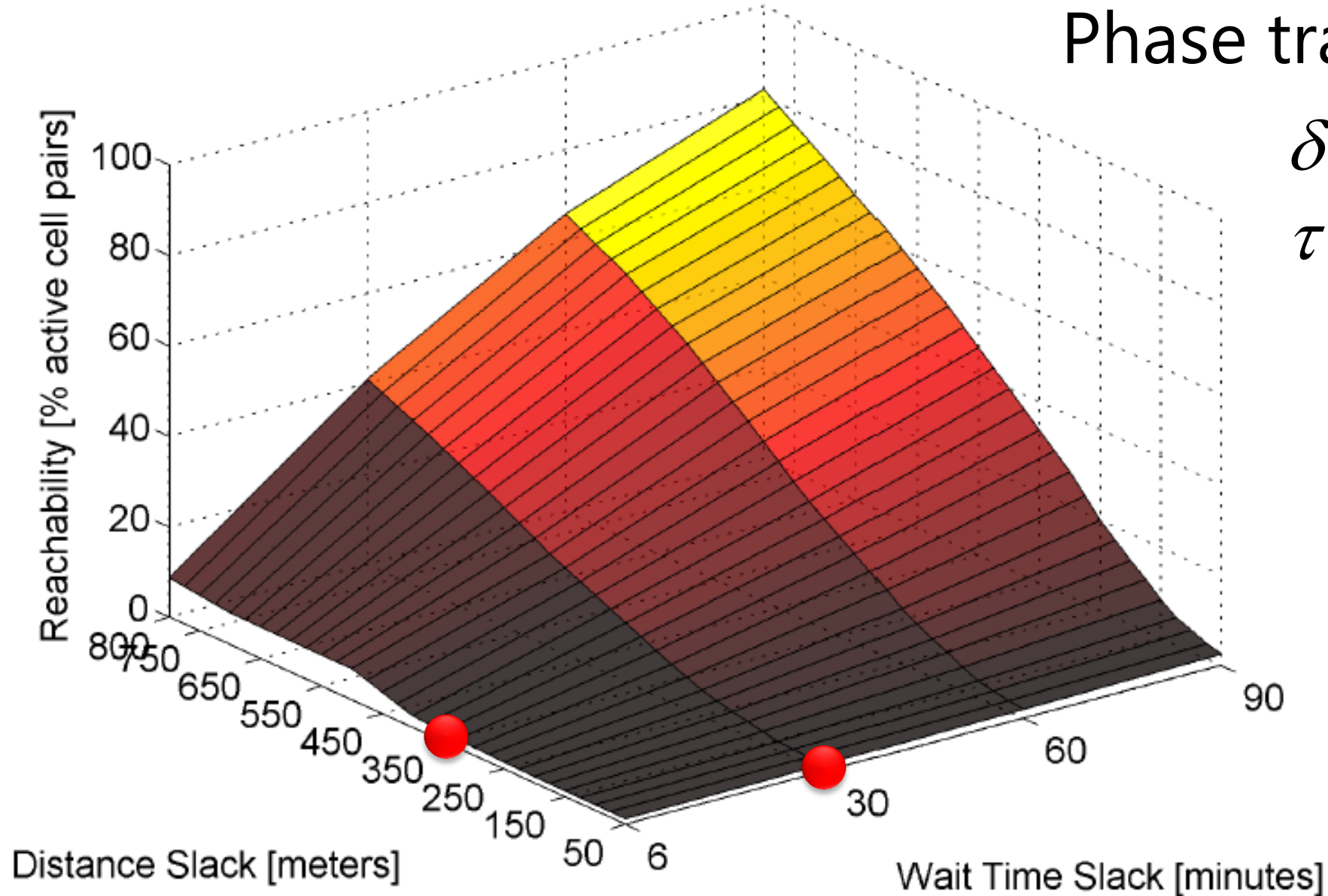
Train: Rest of 6 mos.

Local policy:

- > For each location ℓ , consider statistics of proximity to ℓ .
- > Keep package or handoff based on historical proximity

Global: Dijkstra

Phase Transition in Reachability

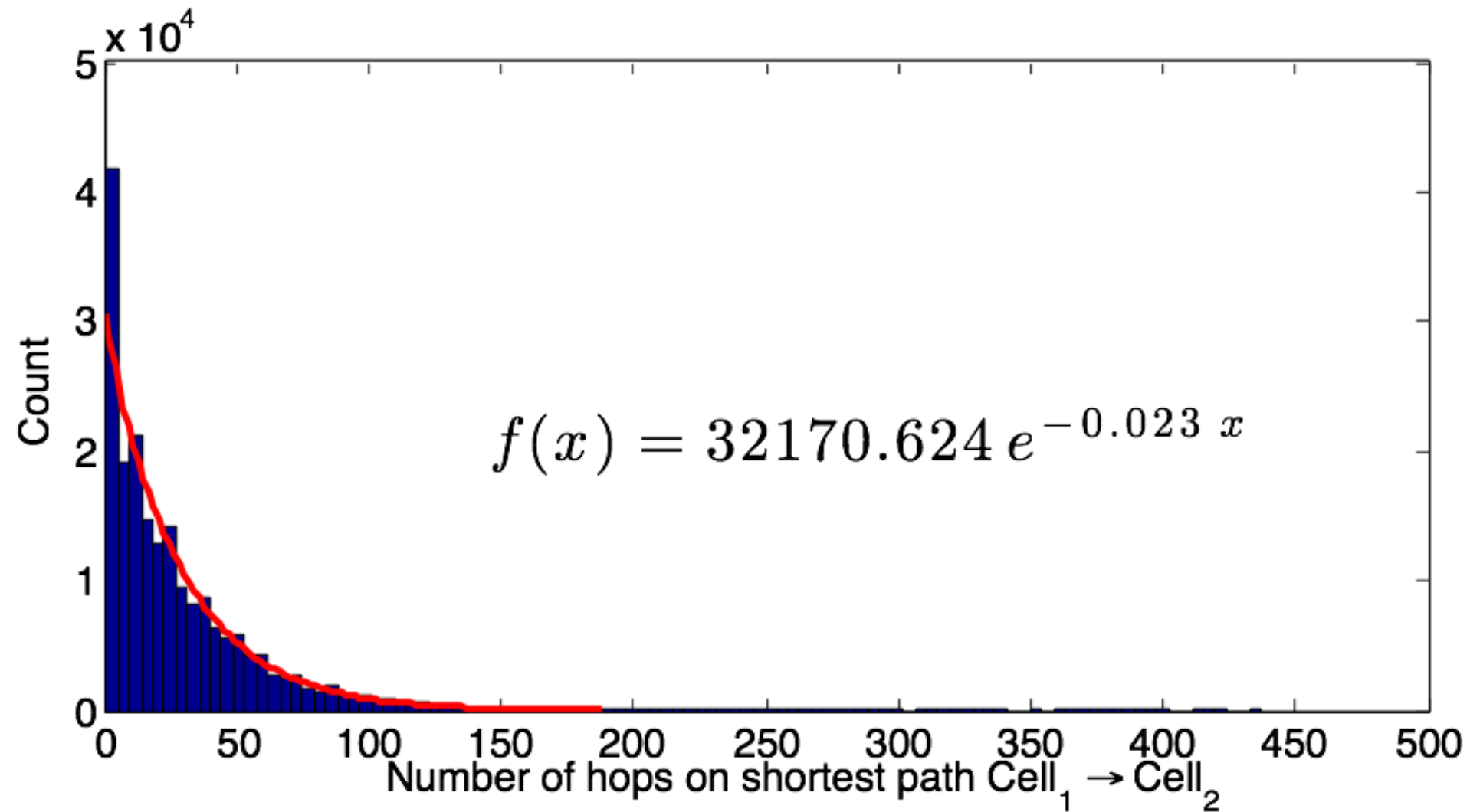


Phase transition @

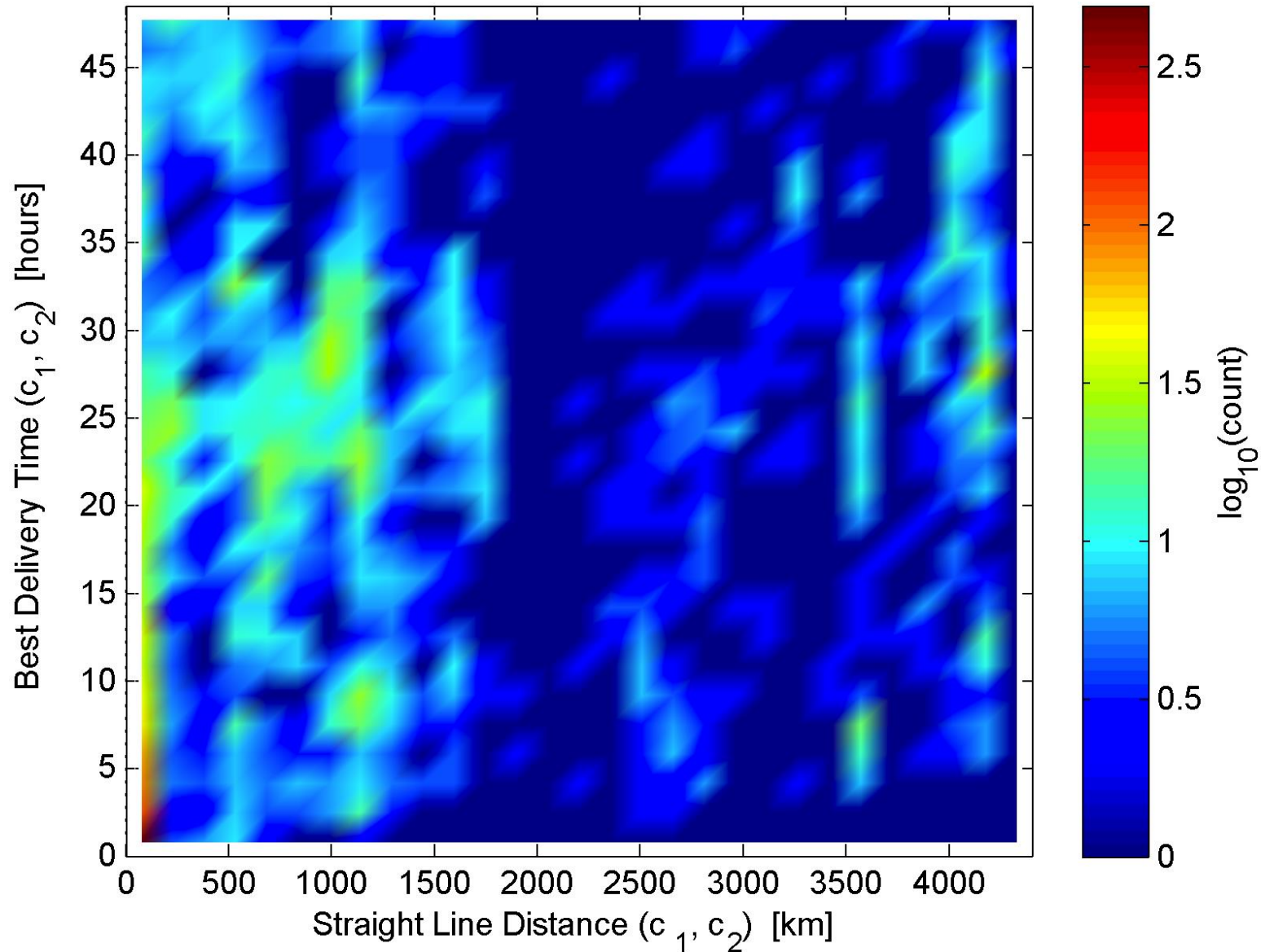
$\delta = 350$ meters

$\tau = 30$ minutes

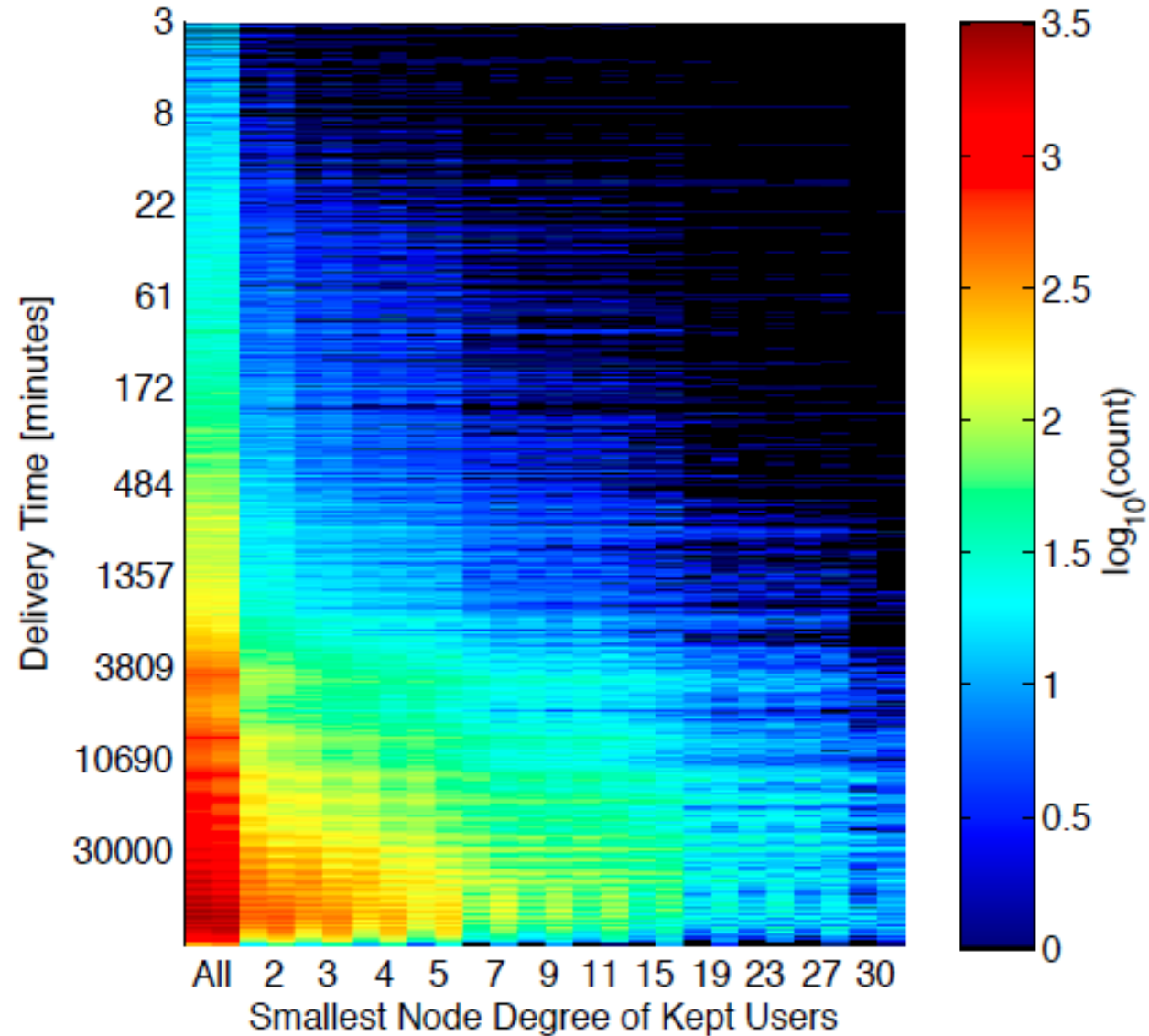
Distribution of Shortest Paths



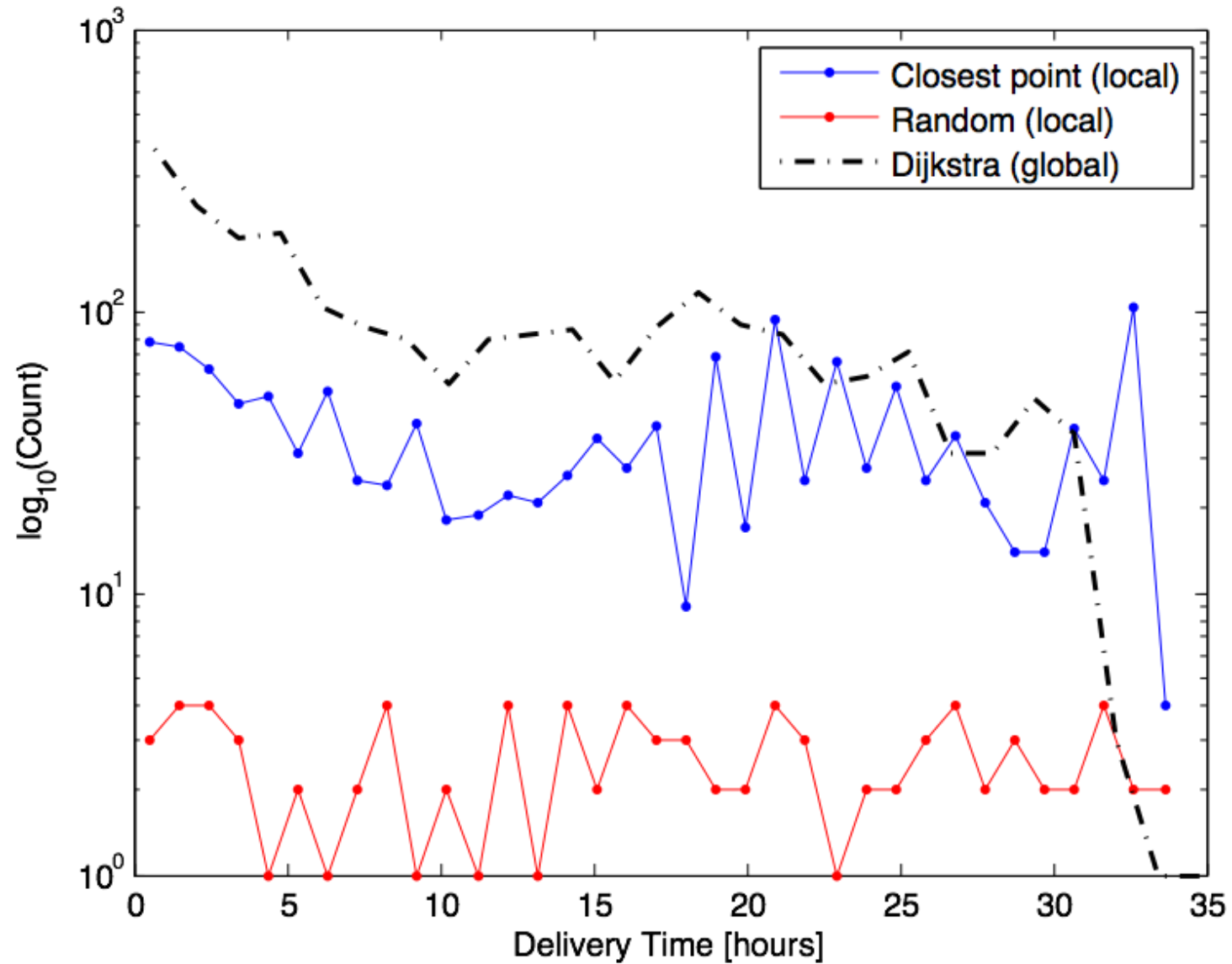
Delivery Times Across US



Studies of Robustness



Local vs. Global Planning



Understanding & Shaping Collaborative Systems

Studies of crowd physics for sensing & acting in world

Design, optimization of collaborative substrate

Rich area, multiple directions for enhancing collaboration

Opportunities include new approaches to epidemiology,
e.g., where reachability & efficiency are minimized

