

# An Agent-Based Framework for the Active Multi-Level Modeling of Organizations

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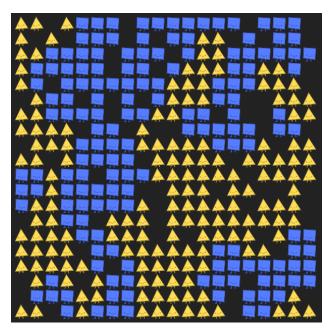


# **Key Points**

- Multi-Level Phenomena exist, and are of significant interest to organizational researchers
- Multi-Level Phenomena require Active Multi-Level Modeling to create good/useful models
  - Active Multi-Level Modeling is ABM at multiple levels of granularity
  - A specific sub-family of multi-modeling
- Data-Centric Modeling is key to rapid development of topical/applied models: data must support instancing at different granularities



# Agent-Based Models and Emergence



Parable of the Polygons (<a href="http://ncase.me/polygons/">http://ncase.me/polygons/</a>)

 An interactive version of the Schelling Model



A swarm of Blue Jack Mackerel form a "bait ball", which confuses predators



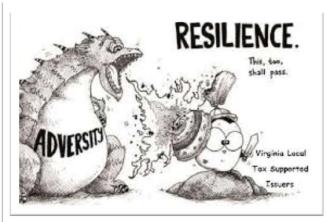
Beautiful elegant useful models with a single level of agency



## **Multi-Level Phenomena**

Definition: Phenomena that occur with actors at multiple levels of granularity





**Turnover** 

Organizational Resilience

Change Resistance





# **Change Resistance**

Definition: Overt or covert resistance to a introduced organizational change

- Noted Risk Factors:
  - Individuals feel they are harmed by the change
  - Individuals don't understand the need for the change
  - Organization has gone through multiple changes in recent memory
  - Organizational culture is not transparent and trusted
  - Organization introduces change poorly





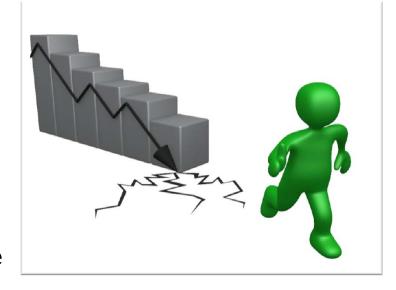


### **Turnover**

Definition: The percentage of workers leaving an organization over a given unit of time

#### Noted Factors:

- Organizations that are going through significant challenges experience higher turnover
- Individuals which are highly embedded in the organization are much less likely to leave
- Organizational socialization procedures can reduce chance of turnover



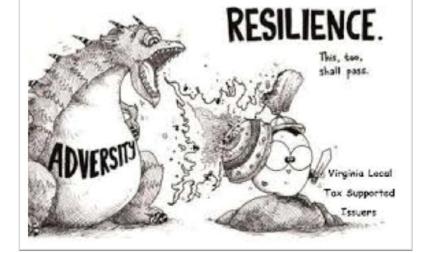




# Organizational Resilience

Definition: The ability of an organization to anticipate, prepare for, and respond to organizational crises

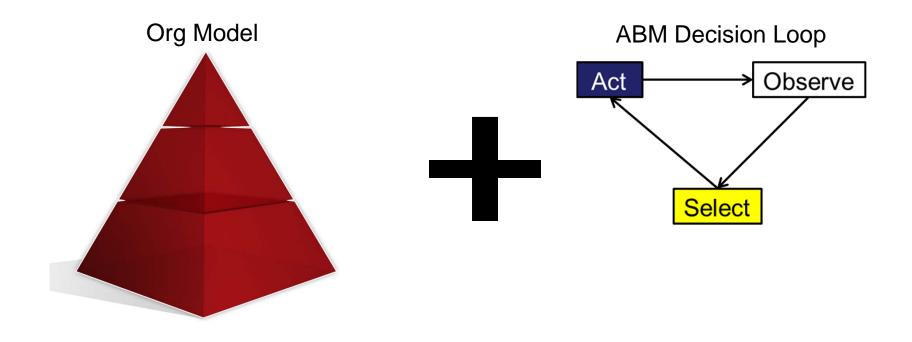
- Noted Factors:
  - Groups are resilient if they are more heterogeneous
  - Individuals are more resilient if they have resources they need
  - Resilience response is shaped by the organization's ideology
  - Organizational guidance which ignores individual practice harms resilience







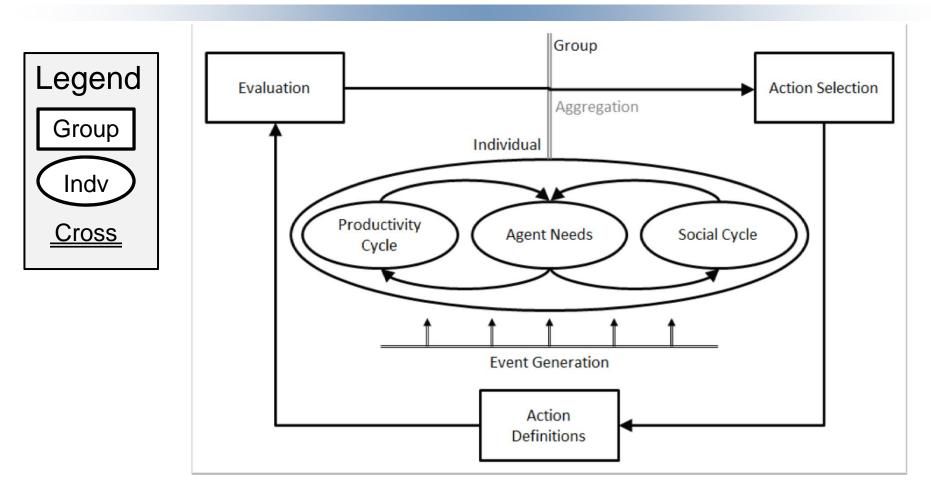
# Multi-Modeling for Multi-Level Phenomena







# **Proposed Framework**





Three+ models with intentional inter-operation!



# **Data-Centric Modeling**



James Hardy/AltoPress/Maxppp





## **Use Cases**

#### **FAA Policy Change**



# Horizontal Merger of a Multinational







## **Use Cases**

#### **FAA Policy Change**



# Horizontal Merger of a Multinational











Get insight on the best way to introduce NextGen air traffic control processes to CONUS airspace management

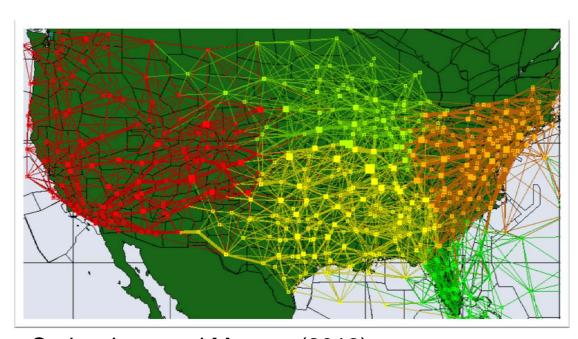
- Understand the differences in communication and process workload from NextGen
- Explore different methods of introduction



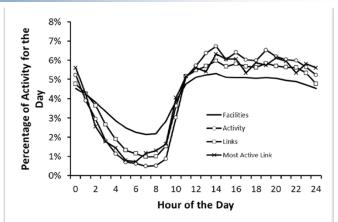


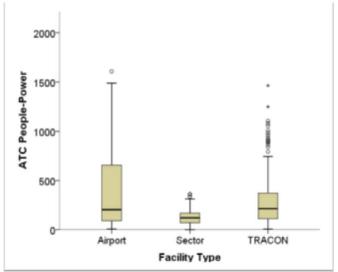






Carley, Lee, and Morgan (2013)



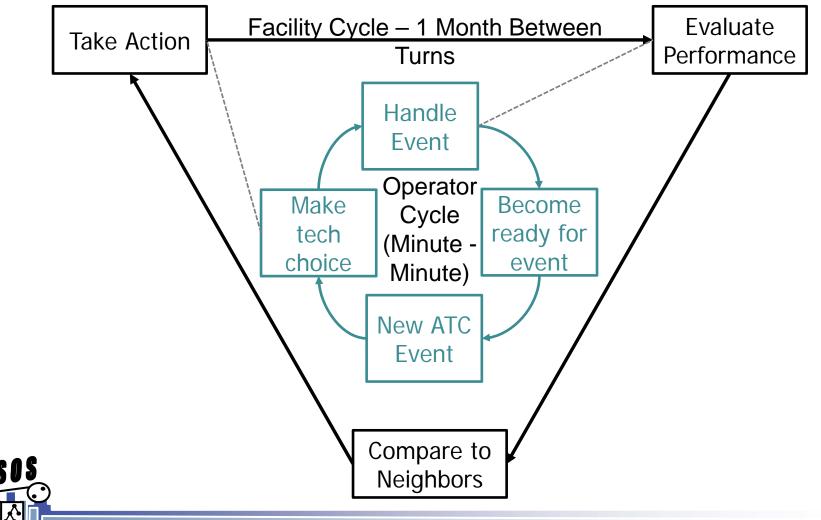








## FAA Simulation Cycle



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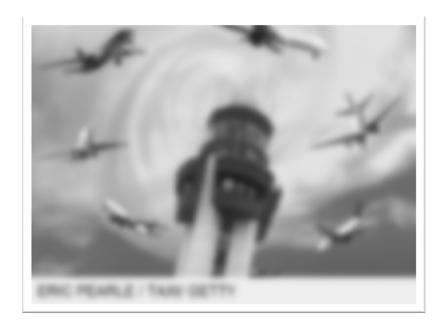
- 1. As flight activity increases, does wide adoption of NextGen procedures tend to reduce the change in outcome service metrics?
- 2. Do different methods of rolling out NextGen have system-wide effects, or is it merely a relationship to the proportion of facilities that have, use, and support NextGen?
- 3. Are NextGen procedures robust to large-scale disruptions, even when baseline activity is higher?





## **Use Cases**

FAA Policy Change



Horizontal Merger of a Multinational







# Horizontal Merger of a Multinational



- Large Multinational, purchased another large company
  - Wants to understand the integration process
  - Asked academic researchers if they wanted to help
- Allowed collection of email-server data for multiple months at multiple points in time
  - Collection Period 1: Right after merger announcement
  - Collection Period 2: A year later
  - Collection Period 3: Another year later
- Encouraged employees to participate in org surveys administered by research team









- Survey was run on a sub-sample of employees. The survey collected various indices, including:
  - Organization Culture (Denison and Mishra 1995)
  - Job Satisfaction (Cammann, Fichman et al. 1983)
  - Commitment to the Organization (Allen and Meyer 1990)
  - Group Identification (van Dick, van Knippenberg et al. 2008)
  - Perceptions of Organizational Justice (Niehoff and Moorman 1993)
- 4849 People surveyed, Year 1
- 4915 People surveyed, Year 2
- 4300 People surveyed, Year 3
- ~11,000 People surveyed in total









- Filtering:
  - English Emails (identified by Tika API)
  - Sent to a small group of people (less than 7)
  - At least one sender and receiver must have taken the survey in any of the three years
- After filtering to 'known actors' from surveys
  - Timeperiod 1 : 233k Emails
  - Timeperiod 2: 700k Emails
  - Timeperiod 3: 1M Emails
- Average Subject Length: 32 Characters
- Average Body Length:
  - Total Characters (includes replies): 2000 Characters
  - Novel\* Characters: 184 Characters

<sup>\*</sup> We wrote code to scrape off reply-chains

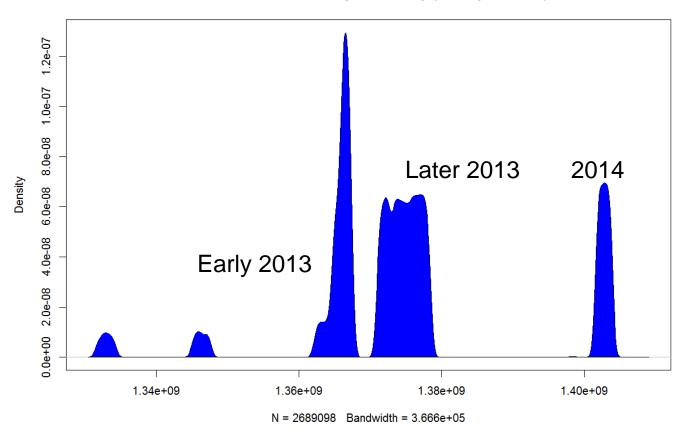






## **Email Draws over Time**

#### Concentration of Email by Time-Stamp (Unix Epoch Time)



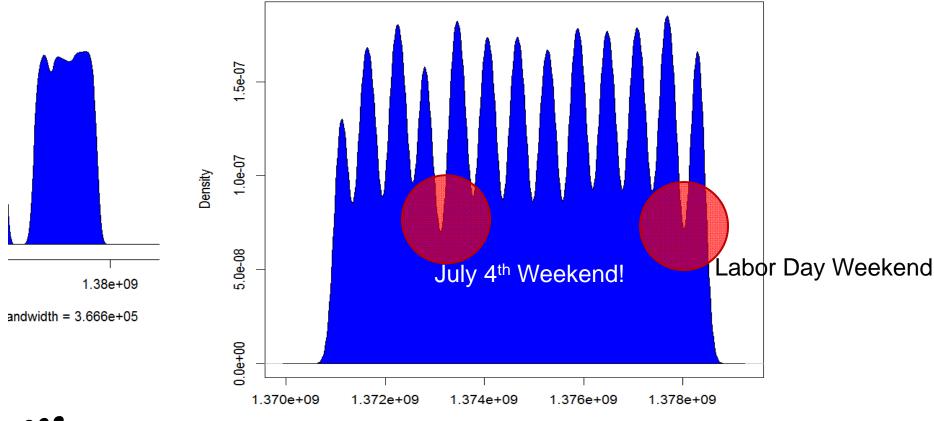




# Email Draws Show Expecte Frequencies



#### Concentration of Email by Time-Stamp (Unix Epoch Time)





N = 1263320 Bandwidth = 1.179e+05





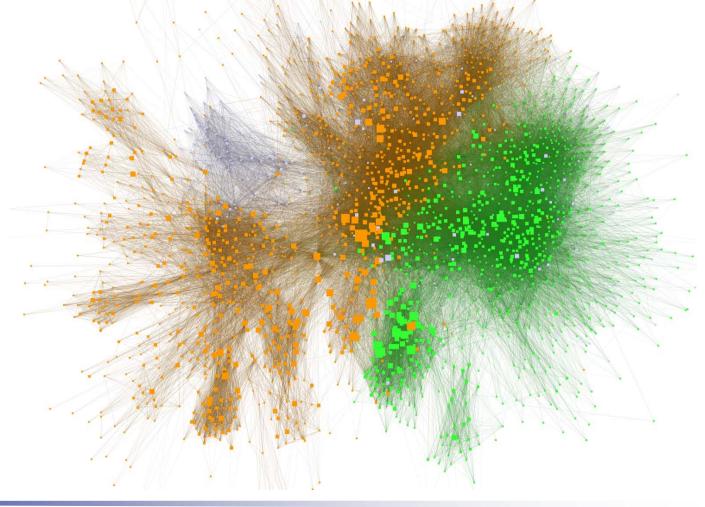
# **Internal Email Interactions**

Employees - Colored by Legacy, Sized by Emails Sent and Received (Direct To/From)

LuxuryCo

StandardCo

MergedCo

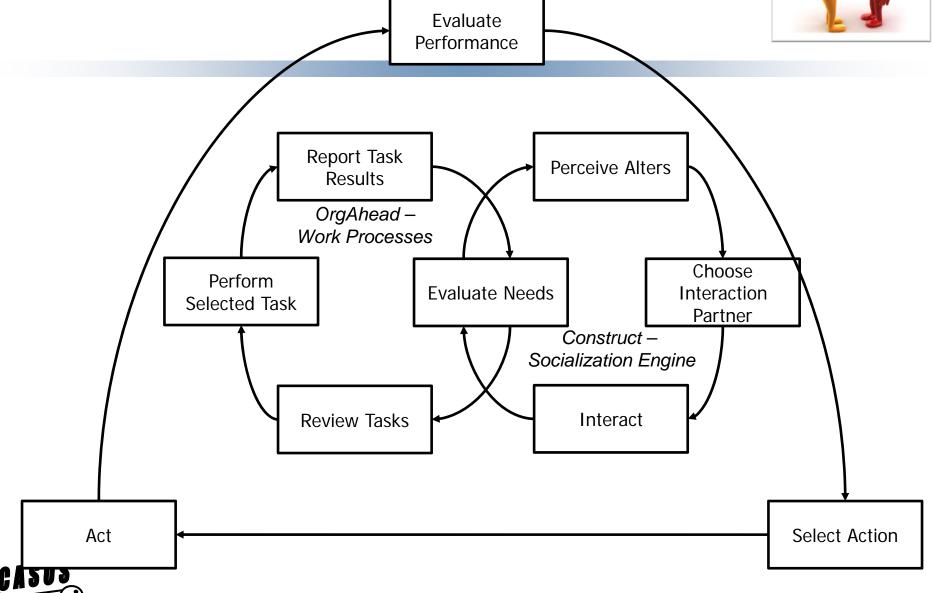






## MultiOrg Simulation Cycle









# (Sim) Research Questions

- 1. Can we predict departure from the organization?
- 2. Can we predict conflict between organizational units?





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