

# Large-Scale Simulation for Human Behavior Modeling

## Cognitive Seldon



### Sandia National Laboratories

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## Problem

Analytical *needs* have expanded beyond topics like technology and nonproliferation and now have a core central human element.



Analysts need systems that incorporate *operational social structure*, including *patterns of influence and resistance*, terrorist groups, criminal groups, and general social organization to produce a massively parallel social simulation for a given local or global conflict.



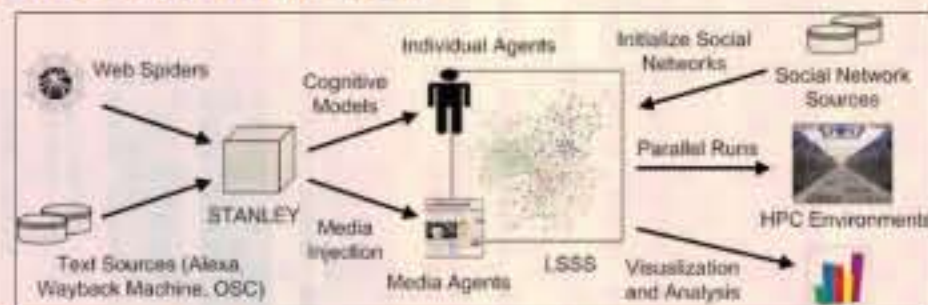
This three-year project is developing new *analytical tools and simulations* to facilitate the *understanding* of these human elements that are scalable to realistic problem spaces. Our Goal is to aid analysts and policy-makers in understanding how the propagation of information may be perceived



- **Critical gaps**
- Automatic generation of human cognitive models based on disparate sources
- Integration of cognitive models with human behavior/social networks
- Automatic identification of social networks characterized by a group or population
- Development of analytic tools to answer real-world questions

## Approach

### Cognitive Seldon Architecture

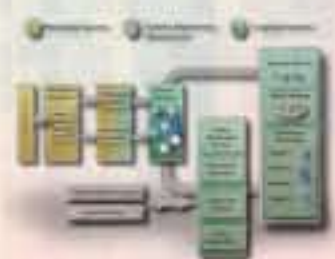


### Our Approach

- Use STANLEY to collect and process internet-based media text (i.e., newspaper articles, blogs)
- Translate that media information into the Cognitive Foundry's cognitive models
- Integrate the cognitive models into the Seldon social network simulation
- Parallelize the combined system to study how realistically sized populations respond to information spread from media sources.

### Cognitive Foundry

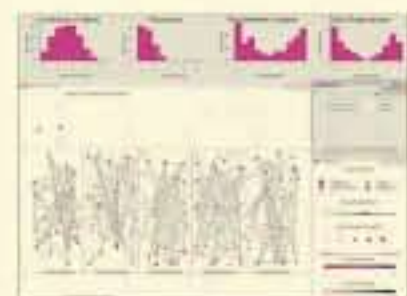
- The Cognitive Foundry is used to create psychologically plausible cognitive models
- The cognitive model is a semantic graph of concepts and their relationships



- Information spreads throughout the graph when activated
- Cognitive models are created automatically from text-based documents
- A lightweight version of the foundry facilitates running in a parallel environment

### Seldon

- An agent-based social simulation toolkit that combines technology and concepts from a variety of different fields
- Name comes from Hari Seldon in Isaac Asimov's Foundation stories
- Has been used to study inner-city gang and terrorist recruitment



- An agent can be an individual or a collective (i.e. school, mosque)
- Seldon allows for dynamic social network evolution
  - Agents interact according to exchangeable rule sets
  - The interactions build relationships and form social networks

### Cognitive Seldon

#### Cognitive Seldon integrates Seldon and the Cognitive Foundry

- Each individual agent has a cognitive model that is used to process new information

#### Goals:

- Use cognitive models for a more-realistic representation
- Study how media affects societies
  - Cognitive models are generated automatically from text corpora
  - Media agents inject additional cognitive information during the simulation
- Run large-scale simulations ( $O(10^6)$  agents) that represent entire populations - parallelization!



### Agent Interactions

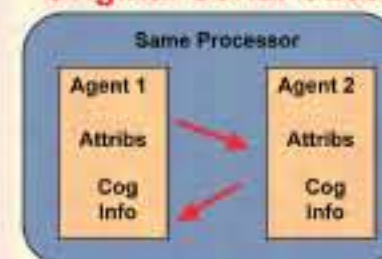
Individuals have cognitive models created from text  
Cognitive information is exchanged during interactions



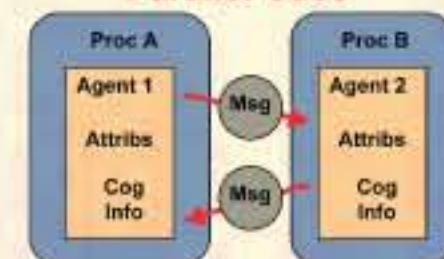
Media Agents also inject cognitive information to their subscribers



#### Original Serial Case



#### Parallel Case



- Messages are particles that exist in their own particle sets
- All messages are routed and delivered concurrently

## Accomplishments

- Development of an High Performance Computing compatible cognitive model
- Parallelization of Seldon and Deployment on Sandia compute cluster
- Incorporation of the 5-factor personality model into Seldon
- Implementation of cognitive models on individual agents in Seldon
  - This is the first time cognitive models have been incorporated into a social simulation
- Development of HPC compatible tools for tracking information flow
- Modeling test case underway: shift in public opinion in Jordan after November 2005 bombings

## Significance

- The capabilities developed by this project can help not only analysts, but also have applications in Iraq and Afghanistan.
  - Course of action analysis (determine the best way to release news of an event or action)
  - Training - help new commanders get a feel for how an area to which they are assigned may react to news of specific events
- There are already two follow-on Work for Others efforts funded using the products of this LDRD
  - Improvement of safety for civilian and military using Ripple
    - Project with Concurrent Technologies Corporation
    - Involves using Cognitive Seldon to improve training for the Marine Corps
  - Large-Scale Social Simulation for Engineering Strategic Communications
    - New BAA project funded by the OSD Counter Terrorism Technology Support Office
    - Use Cognitive Seldon to examine how the Indonesia population will react to information propagated by media sources