



# Modeling and Simulation of Information Flow: A Study of Infodynamic Quantities

Jeff Waters, J.D. and **Marion G. Ceruti, Ph.D.**

Space and Naval Warfare Systems Center Pacific (SSC Pacific)

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***Topic 6: Modeling and Simulation***

# Presentation Topic Outline

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- ▼ **Causal Measures and Physical Equivalents**
    - Visibility of information ( $V_i$ ) – attractive force (push)
    - Visibility of the need for information ( $V_n$ ) – info pull
    - Empowerment of people ( $E_p$ ) – “mass” of particle
    - Barriers to communication ( $B_c$ ) – a repulsive force
    - Perception of risk ( $P_r$ ) – repulsive force
    - Human-to-human communication ( $H_c$ ) - repulsive force
  - ▼ **Effect of Information-Flow Components**
    - Effect of information-flow promoters:  $V_i$ ,  $V_n$  and  $E_p$
    - Effect of information-flow inhibitors:  $B_c$ ,  $P_r$ , and  $H_c$
  - ▼ **Simulating the Behavior of Aggregates of Particles**
    - NetLogo M&S environment where “particles” are agents
  - ▼ **Preliminary Results**
  - ▼ **Ongoing and Future Research**
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# Agent-Based Model Patterned after Chemical Molecular Dynamics Simulations

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- ▼ Past research demonstrates that an analytical solution for information velocity is intractable.
  - ▼ Purpose of current research: Understand factors that affect the rate of information flow.
  - ▼ Agent-Based Model: Information providers and consumers are modeled as particles, as in well-known molecular-dynamics studies.
  - ▼ Information interactions and exchanges are modeled as physical properties and processes, such as collisions with energy transfer.
  - ▼ Factors that enable information transfer are modeled as attractive intermolecular forces.
  - ▼ Factors that inhibit information flow are modeled as repulsive intermolecular forces.
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# Causal Measures & Physical Equivalents: Information-Flow Promoters: ( $V_i$ )

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## $V_i$ = Visibility of information

- ▼ One kind of particle,  $I$ , represents information.
- ▼ Another kind of particle,  $D$ , represents the decision maker who needs the information.
- ▼  $D$  and  $I$  collide and interact in the model like two different kinds molecules in a fluid (e.g. gas or liquid).
- ▼ High  $V_i$  increases information exchange.
  - Information exchange is equivalent to energy, momentum, or electron transfer in matter.
- ▼  $I$  Particles with  $V_i = 0$  interact like molecules in an ideal gas, i.e. no intermolecular forces.
  - Information flow is restricted but the model is simpler.

# Causal Measures & Physical Equivalents: Information-Flow Promoters: ( $V_n$ )

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## $V_n$ = Visibility of the need for information

- ▼ A  $D$  particle with a high value for  $V_n$  is like an  $I$  particle with a high value for  $V_i$ .
  - ▼ Particles with high  $V_i$  or  $V_n$  are like atoms or molecules with large collision cross sections.
    - High  $V_i$  and high  $V_n$  both increase collision frequency and increases information exchange.
  - ▼  $D$  Particles with  $V_n = 0$  interact like molecules in an ideal gas, i.e. no intermolecular forces.
    - Information flow is restricted, same as  $V_i = 0$
  - ▼ Information flow improves if the need for information is visible.
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# Causal Measures & Physical Equivalents: Information-Flow Promoters: (Ep)

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**Ep = Empowerment of people**  
– like the mass of a particle

- ▼ Force = mass x acceleration.
  - ▼ More massive particles represent empowered people in the simulation, e.g. admirals & generals.
  - ▼ Work = force x distance.
  - ▼  $P_o = dW/dt$       **Power** = rate at which work is done.
  - ▼ Massive particles transfer more energy and momentum. They produce work faster.
  - ▼ Empowered people overcome obstacles, transfer more information and work more efficiently.
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# Causal Measures & Physical Equivalents: Information-Flow **Inhibitors (Bc)**

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## **Barriers to communication (Bc)**

- ▼ We model the magnitude of **Bc** as the amount of force and energy (i.e. effort) necessary to enable an information exchange.
- ▼ **Bc** is the inverse of  $E_p$ . Empowered people do not need to exert an inordinate amount of force to communicate information.
- ▼ Barriers to communication inhibit information flow and impede information sharing.
- ▼ Examples:
  - Dates after which no information sharing is allowed
  - Formal requirements for information submissions
  - Approval chains
  - Mandatory use of user-hostile & dysfunctional web sites.



# Causal Measures & Physical Equivalents: Information-Flow **Inhibitors (Pr)**

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## Perception of risk (**Pr**)

- ▼ **Pr** is like a very high pressure in a gas mixture.
- ▼ Pressure on simulated “gas” can separate *D* and *I* components into two immiscible liquid phases.
- ▼ Almost no *D* particles will be near the *I* particles.
- ▼ Interface = only opportunity for information transfer.
- ▼ **Pr** separates decision makers from info they need.
- ▼ People who perceive significant personal risk for sharing info will not share for fear it will affect their:
  - Reputation, performance ratings, promotions
- ▼ Decision makers do not want to accept information they think is high risk, such as information that is:
  - Irrelevant, incomplete, incorrect, stale, misleading, useless



# Causal Measures & Physical Equivalents: Information-Flow **Inhibitors (Hc)**

**Hc = Human-to-human communication**

▼ **Examples:**

- Face-to-face meetings, teleconferences
- Phone calls, email
- In writing, in a paper submitted for approval through a sequential chain of command

▼ Most inefficient communication is direct one-on-one exchange (E). (Better: blogs => low **Hc**)

▼ This exchange does not scale.  $(N^2 - N)/2$

▼ **Hc**, a proximity measure, can be modeled as an inverse power law for inter-particle interaction:

▼ Potential energy,  $P(E) \propto C / r^{Hc}$   $r$  = distance

▼ The higher the **Hc**, the closer the  $D$  and  $I$  particles need to be to exchange information.

# Effect of Information-Flow Components

## Information-Flow Promoters:

- ▼  $V_i$  and  $V_n$  are like attractive forces or other vector quantities that specify a given direction of motion.
  - Velocity ( $\vec{w}$ ) and its time derivatives are vectors.
  - $E_p$  is like mass,  $M$ .
  - $F = M \vec{A}$  becomes  $F$  (info exchange) =  $E_p \frac{d\vec{w}}{dt}$

## Information-Flow Inhibitors :

- ▼  $B_c$ ,  $P_r$ , &  $H_c$  are quantities that describe repulsive forces like those between molecules in a fluid that keep  $D$  and  $I$  particles separated.
- ▼ More momentum is needed for information flow.
- ▼ Likelihood of information exchange decreases as  $B_c$ ,  $P_r$ , &  $H_c$  increase.

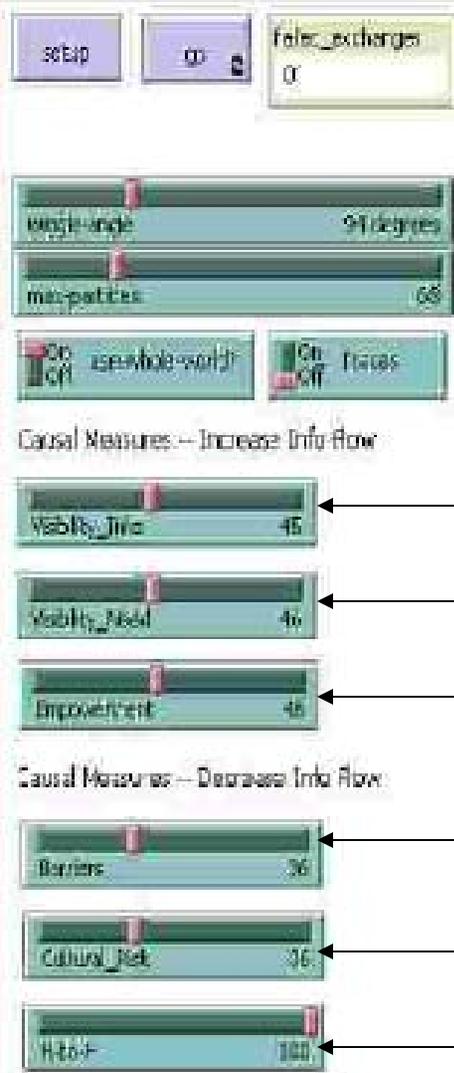


# Experiment Simulating Information Flow with Aggregates of Particles

- ▼ Particles with **information to share: green agents**
- ▼ Decision makers with **insufficient information: red.**
- ▼ Information flow is like the diffusion of a **green gas** consisting of / particles.
- ▼ Information exchange between particles is like:
  - Momentum and energy transfer in a collision
  - Electron exchange in a chemical reaction
- ▼ **Red** particles turn **green** after they receive the information they need.
- ▼ Color change = change in state of decision maker from **high uncertainty** to lower uncertainty.
- ▼ Experimenter controls the rate of information transfer by varying the information flow-components,  **$V_i$ ,  $V_n$ ,  $E_p$ ,  $B_c$ ,  $Pr$ , &  $H_c$ .**

# Net-Logo

## Modeling & Simulation Environment



- NetLogo has intuitive interface to model complex systems that develop over time.
- Users can change independent variables during run time and observe the emergent behavior in real time using sliders:

Visibility of information ( $V_i$ )

Visibility of need for information ( $V_n$ )

Empowerment of people ( $E_p$ )

Barriers to communication ( $B_c$ )

Perception of risk ( $P_r$ )

Human-to-human communication ( $H_c$ )

# Agent-Based Model to Understand Information Flow

The screenshot displays the NetLogo interface for a simulation titled "Macro Info Flow Model & Simulation". The window title is "infoExchangeModel\_ver1 - NetLogo [C:\Program Files\NetLogo 4.0.2\models\Sample Models\Jeff]".

**Control Panels:**

- Interface:** Includes "Interface", "Information", and "Procedures" tabs. A toolbar contains "Edit", "Delete", "Add", and a "Note" dropdown.
- Buttons:** "setup" and "go" buttons are present. A "failed\_exchanges" monitor shows a value of 0.
- Sliders:** "wobble-angle" is set to 94 degrees, and "max-particles" is set to 68.
- On/Off Switches:** "use-whole-world?" and "Traces" are currently turned off.
- Causal Measures -- Increase Info Flow:**
  - Visibility\_Info: 45
  - Visibility\_Need: 46
  - Empowerment: 46
- Causal Measures -- Decrease Info Flow:**
  - Barriers: 36
  - Cultural\_Risk: 36
  - H-to-H: 100

**Simulation Area:**

- Shows a network of agents (green and red squares) connected by links (grey lines).
- Legend:
  - Green Agents: Information Carriers
  - Red Agents: Information Gatherers
  - Links: Exchange Patterns
- Rules:
  - (1) Move, IF Need or Info is Visible, Head Toward It
  - (2) IF H-to-H High, wait till physical contact to exchange
  - (3) IF Empowered & Barriers/Risk Low, Exchange Info
- ticks: 79
- 3D view button

**Command Center:**

```
observer> show H-to-H
observer: 1
```

The Windows taskbar at the bottom shows the Start button, system tray icons, and the time 10:42 AM.



## Ongoing and Future Research: Model enhancements & attributes of particles

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- ▼ Information flow can be modeled as a set of interacting particles representing decision makers and information providers.
- ▼ Future enhancements to model include:
  - Deadlines and dynamic perishable data
  - Dependence on specific information requirements
  - Partial information exchanges
  - Data fusion modeled as three-way collisions or more
  - Confidence measures and uncertainty
- ▼ Confidence measure  $C_d(t) = 1 - U(t)$
- ▼  $U(t) = n^-(t = t_d) / n^-(t = 0)$
- ▼  $U(t)$  is time-dependent uncertainty.
- ▼  $n^-$  = amount of information needed at time,  $t$
- ▼  $t_d$  = decision deadline



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# Backup pages



## Ongoing and Future Research: Levels of Data Persistence and Perishability

- ▼ Confidence and uncertainty can change dynamically during the simulation due to incremental transfer of information.
- ▼ Distributions of deadlines,  $t_d$ , can be selected to simulate various degrees of data persistence.
  - $t_d$  is a property of  $D$  particles.

Data-duration type	Example	Typical $t_e$
Static	Port location	500 years
Semi Static	Ship's OPCON	5 months
Dynamic	Aircraft location	5 minutes



## Ongoing and Future Research: Information Annealing as a Metric for Information Flow

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- ▼ A period of time is needed for the system to absorb new information, during which entropy fluctuates.
- ▼ **Physical annealing:** Multiple iterations of physical “heating” and “cooling” enable each atom to find its optimal place in a physical solid structure.
- ▼ Confidence and uncertainty fluctuate during the decision process. **Infodynamic annealing** is characterized by increases and decreases in entropy & uncertainty.
- ▼ Proposed metrics: How often and how quickly do members of organization adjust confidence in decisions based on new information?

## Future Research: Particle Anisotropy

- ▼ Force of information flow is greatest when people are empowered and information-flow direction and information-inquiry direction are in opposite directions moving toward each other. See **a.** below.
- ▼ Force between the  $D$  and  $I$  particles could be anisotropic (depending on their orientation at the time of collision), like a fluid of linear molecules instead of isotropic point particles. Compare a. & b.

