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## Leveraging Manifold Learning and Relationship Equity Management for Symbiotic Explainable Artificial Intelligence

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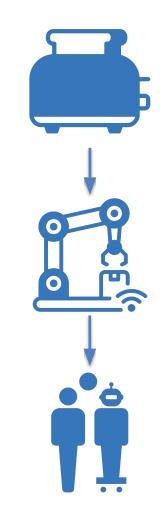
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#### **Interdependence in Human-Machine Teams**

As the capabilities of automation have grown, there is a desire for them to function in ways beyond appliances, or automated performers, but as **interdependent teammates**.

Al need to do more than produce predictions from data. They need to understand their **interdependent purpose in joint activity**. They should **establish, maintain, and repair trust, loyalty**, and **seek to understand their shared task and the intent and abilities** of their human co-performers.



## **Self-Aware Computing**

- 1. It is **introspective** or **self-aware** in that it can observe itself and optimize its behavior to meet its goals.
- 2. It is **adaptive** in that it observes the application behavior and adapts itself to optimize appropriate application metrics such as performance, power, or fault tolerance.
- 3. It is **self healing** in that it constantly monitors its resources for faults and takes corrective action as needed. Self healing can be viewed as an extremely important instance of self awareness and adaptivity.
- 4. It is **goal oriented** in that it attempts to meet a user's or application's goals while optimizing constraints of interest.
- 5. It is **approximate** in that it uses the least amount of precision to accomplish a given task. A self-aware computer can choose automatically between a range of representations to optimize execution -- from analog, to single bits to 64-bit words, to floating point, to multi-level logic.

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#### **SELF-AWARE COMPUTING**

Massachusetts Institute of Technology

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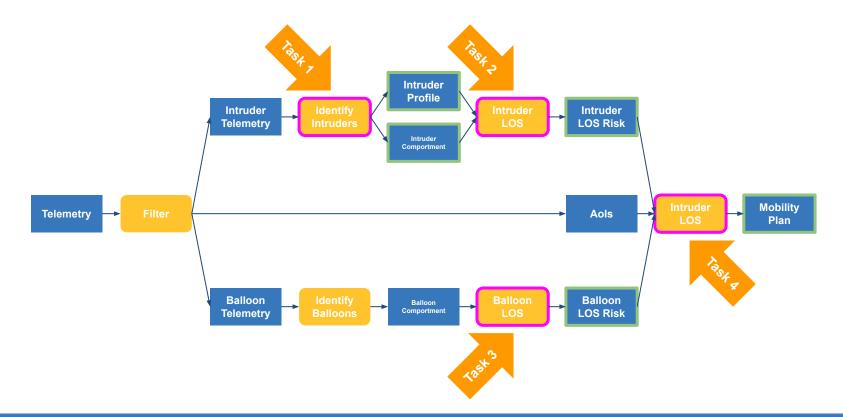
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#### "Sense of Self" and "Theory of Mind"

Captures a prototype sense of self and theory of mind in its use of Joint Activity Graphs, and labeled functions.



#### **Flexibility of JAG-based Reasoning**

#### Use of Semantically Labeled Interchangable Reasoning

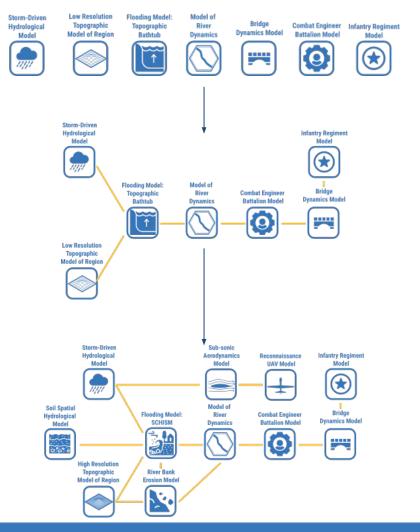
- Units of reasoning can come from varied producers.
- Varying quality and assumptions.
- Including surrogate models built with DeepKoopman

#### Adaptability

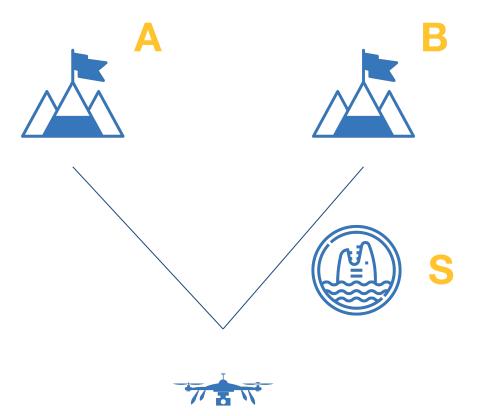
- Units of reasoning evolve over time
- Co-training can improve the results

#### Model Resolution and "Cost"

• Can balance the temporal, execution, and co-performance risk using alternate pathways of reasoning and computation.



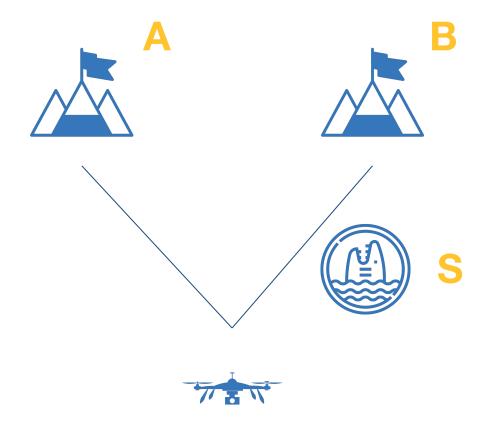
NATO's frameworks for Commander's Intent note that the key aspects that lead to success in joint operations are self-synchronization and understanding complex causes and effects.



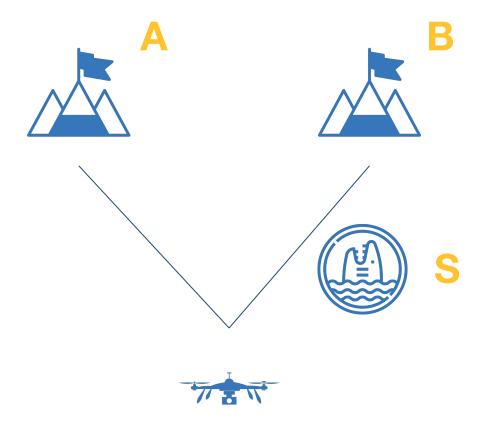
Which objective should we attempt to achieve?

Objective A is achievable without complications.

Objective B forces us to face hazard S.



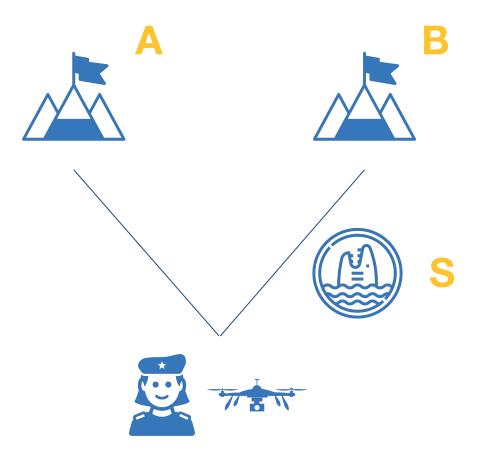
Self-synchronization (A. Alberts, Gartska, & Stein, 1999) is a term used to describe the operational patterns displayed by entities in the absence of traditional hierarchical mechanisms for command and control.



When a commander is present, we can clarify objectives during uncertainty.

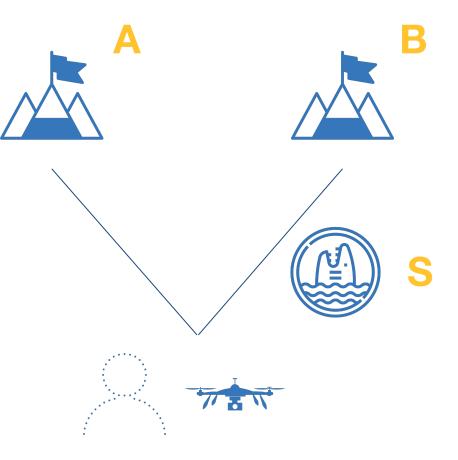
Uncertainty will almost always occur naturally.

Assuring that these decisions are reflective of the goals, missions, and objectives of their human co-performers and real commanders is **a notoriously difficult problem that cannot be solved with explicit constraints and objectives alone** (Russell, 2019; Tegmark, 2017).



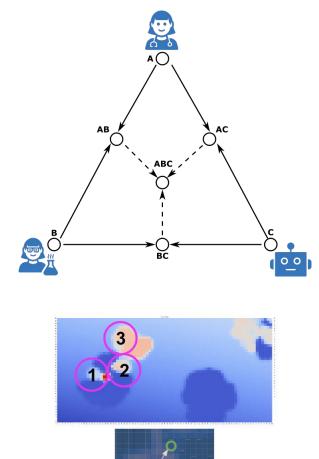
When the commander is absent, we must rely on self-synchronization.

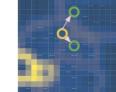
Modern AI does not have this capability.



We can now estimate the underlying topology.

Initial experiments with three synthetic sets of commander's intent on sub-diagnosis for heart disease showed alignment with ~98% accuracy.

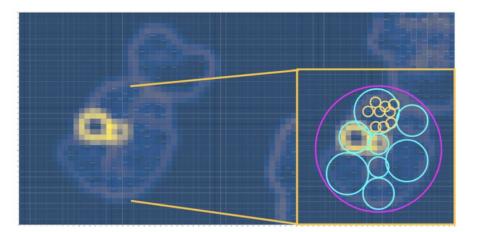










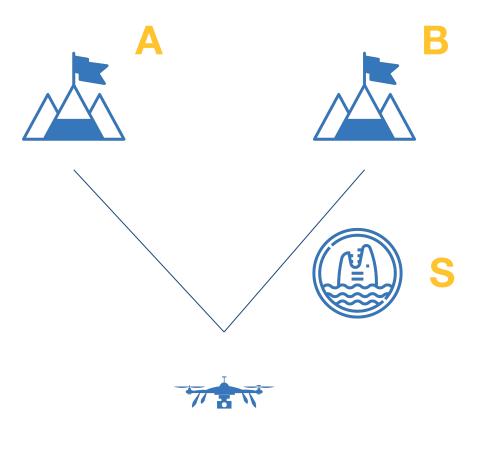


Conceptual pacts tell us what a Commander **thinks**. The estimation of the **topology** allow us to compare items, and place them in the topology to generate Euclidean distance metrics.

What does a "successful mission" look like?

What does "acceptable losses" mean in a situation?

We can model this synthetic commander in the field, during self-synchronization.



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#### Thank you!!!

#### **Dr. Eric Davis, Principal Scientist**

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Galois [gal-wah] Named after French mathematician Évariste Galois www.galois.com