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# Ontological Considerations for Uncertainty Propagation in High Level Information Fusion

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## Introduction

Data explosion increases information fusion needs and opportunities

- Uncertainty pervades fusion
- Information fusion divided into
  - Low level: entity oriented, uncertainty reasonably understood
  - High level: relationship oriented emphasis on symbolic techniques
- Multiple techniques for representing / assessing / uncertainty; no consensus on how to compare techniques
- Need to systematize understanding of where / how uncertainty occurs and interacts in a high level fusion process





#### Outline

#### Fusion Level Definition

- Level 2 HLIF taxonomy
- Fusion model

#### Uncertainty in fusion

- Input (data) uncertainty
- Representation uncertainty
- Process uncertainty

Where Innovation Is Tradition

Output uncertainty

#### Conclusion





#### **Modified Joint Directors of Laboratories (JDL) model**

Level	Title	Definition		
0	Signal / Feature Assessment	Estimate signal or feature state.	Î	
1	Entity Assessment	Estimation of entity parametric and attributive states (i.e. of entities considered as individuals)	Low Level	
2	Situation Assessment	Estimate the structures of parts of reality	1	
3	Impact Assessment	Estimate the utility/cost of signal, entity or situation states, including predicted utility / cost given a system's alternative courses of action	High Level	
4	Process Assessment	A system's self-estimate of its performance as compared to desired states and measures of effectiveness.	$\checkmark$	





# Creating a Level 2 HLIF Taxonomy: Sowa's Ontology

		Types of Entities				
en		Physical		Abstract		
twe		Continuant	Occurrent	Continuant	Occurrent	
nships be Entities	Independent	Object	Process	Schema	Script	Leve
	Relative (Few / Focused)	Juncture	Participation	Description	History	
Relatio	Mediating (Many / Interacting)	Structure	Situation	Reason	Purpose	

Viewpoint matters – Airplane both an object and a structure

Timescale matters – Ice cube as continuant and occurent





## Taxonomy of Level 2 HLIF Types



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## Level 2 Fusion Process Model





## Input (Data) Uncertainty



## **Representation Uncertainty**



#### Uncertainty Derivation

- Objective
- Subjective
- Uncertainty Type
  - Aleatory
  - Epistemic



- Uncertainty Model
  - Bayesian
  - Dempster-Shaffer
  - Possibility Theory
  - Imprecise Probability
  - Random Set Theory
  - Fuzzy Theory / Rough

#### Sets

- Interval Theory
- Uncertainty Factors
- Uncertainty Nature
  - Ambiguity
  - Empirical
    - Random
  - Vagueness
  - Incompleteness
  - Inconsistency



## **Process Uncertainty**





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## **Output Uncertainty**

#### Completeness of the hypothesis set

Where Innovation Is Tradition

Open versus closed world assumptions





### Conclusion

#### Uncertainty In the Fusion Process Model





