



1

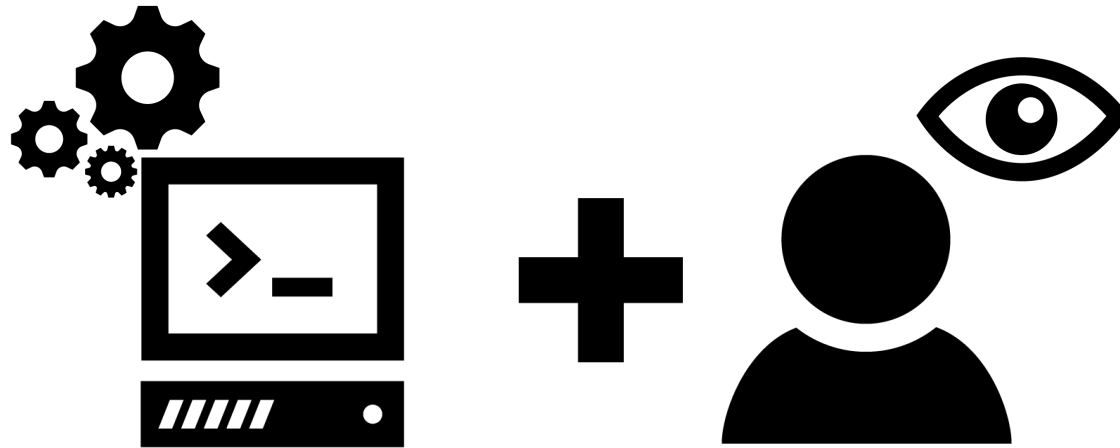


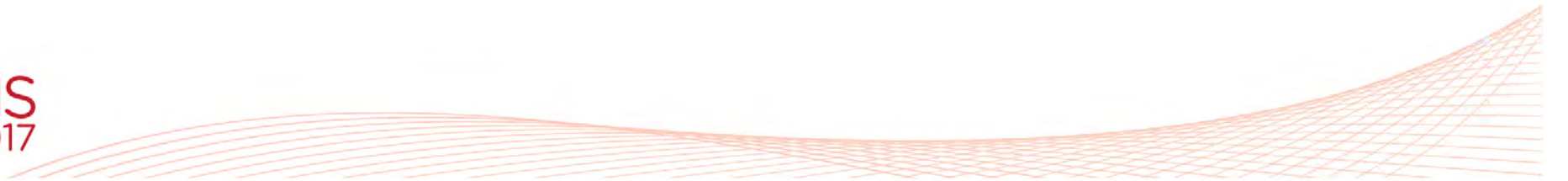
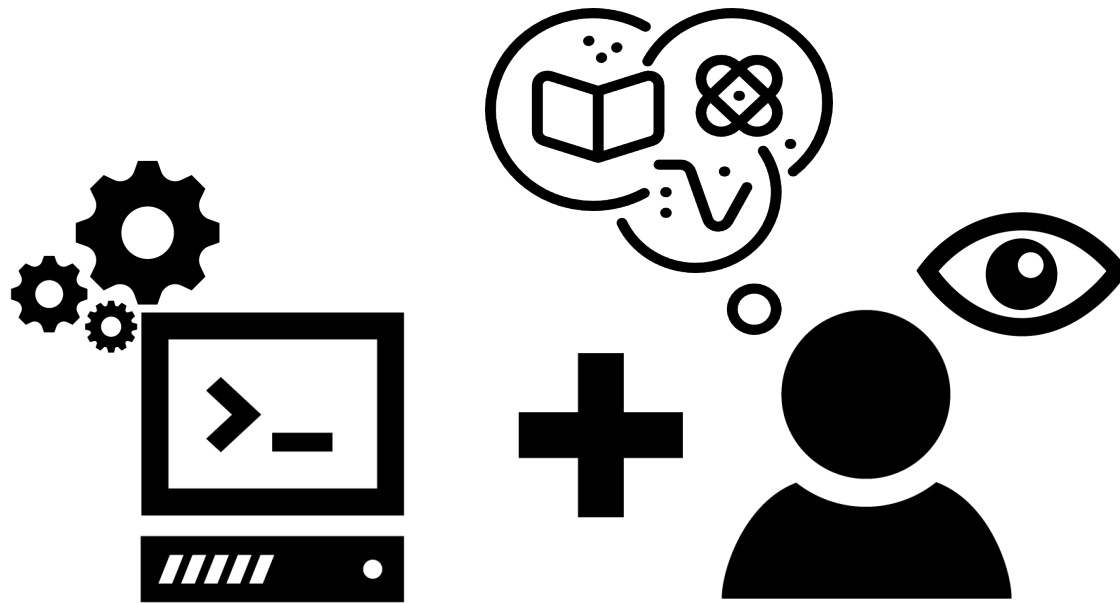
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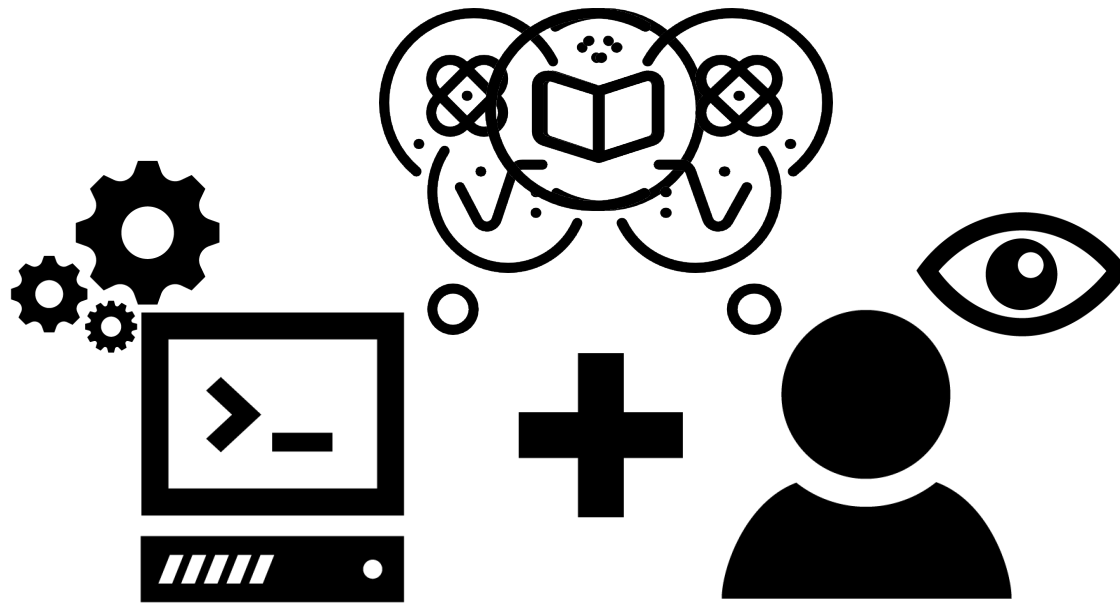


## The role of explicit knowledge: a conceptual model of knowledge-assisted visual analytics

Paolo Federico<sup>1</sup>, Markus Wagner<sup>12</sup>,  
Alexander Rind<sup>12</sup>, Albert Amor-Amorós<sup>1</sup>,  
Silvia Miksch<sup>1</sup>, Wolfgang Aigner<sup>12</sup>









**Explicit Knowledge** = “Data that represents the results of a computer-simulated cognitive process, such as perception, learning, association, and reasoning, or the transcripts of some knowledge acquired by human beings”  
[Chen et al., 2009]

# Knowledge in Visualization

wisdom  
knowledge  
information  
data

[Ackoff, 1989]

knowledge-assisted  
visualization

[Chen M. et al., 2009]

tacit  
explicit

[Wang, 2009]

knowledge-based  
interfaces

[Pike et al., 2009]

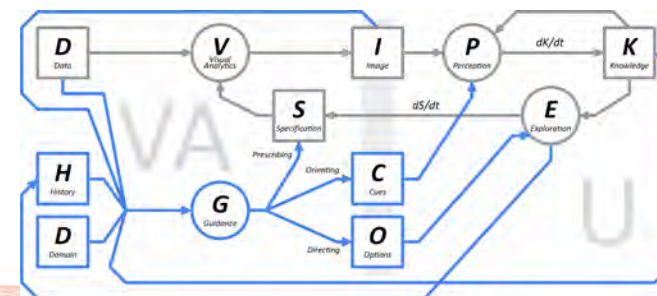
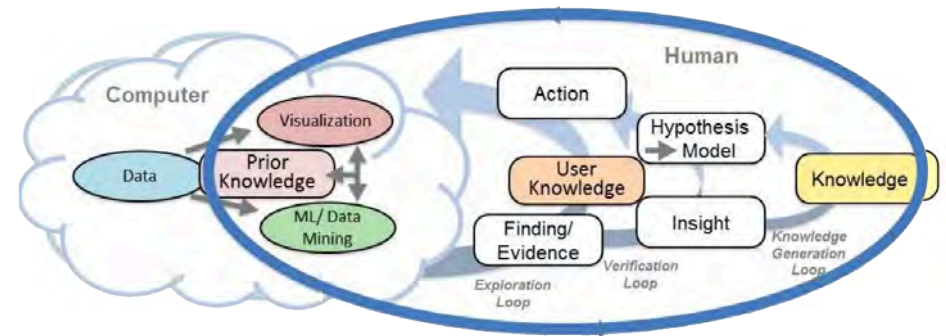
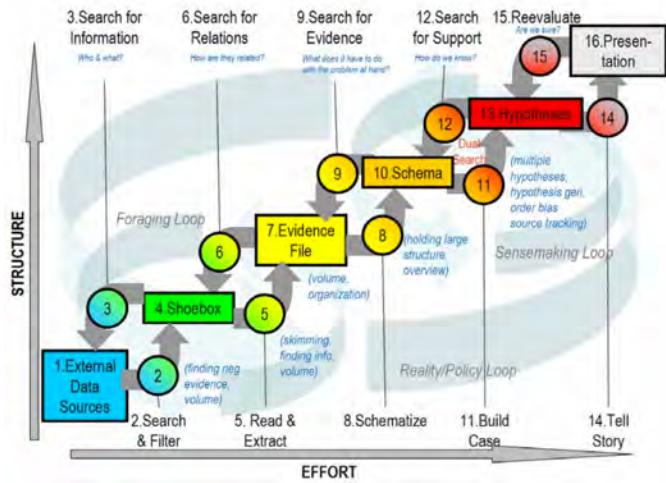
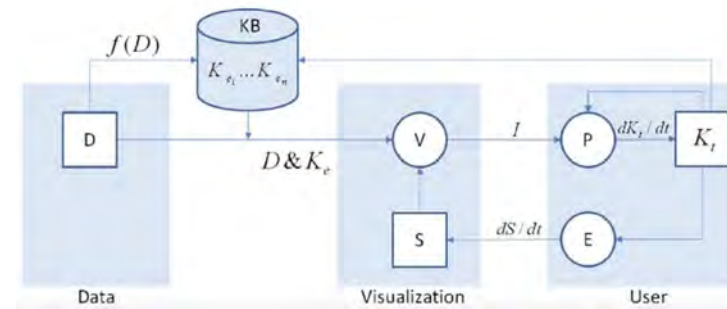
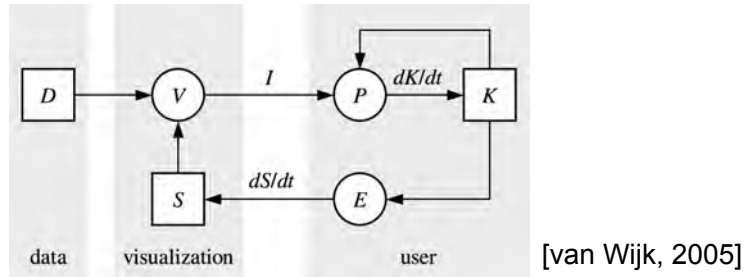
domain  
operational

[Chen C., 2005]

prior  
knowledge  
in the KDD  
process

[Fayyad et al., 1996]

# Visualization Models



# Model Criteria

- VA components
- Spaces
- Knowledge Types
- Knowledge Processes



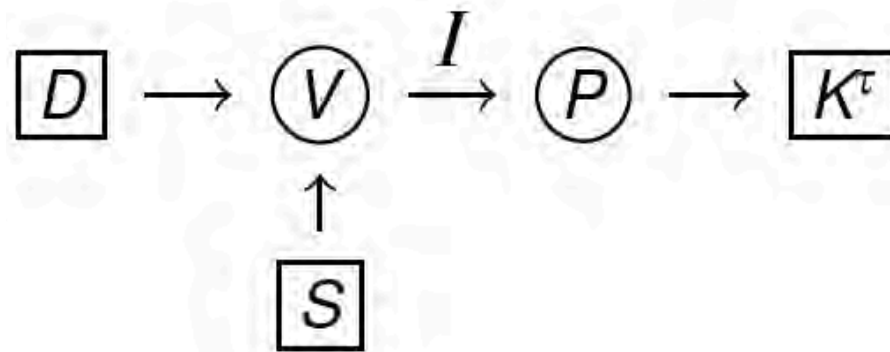


# Knowledge processes

- Generation
  - Visualization
  - Analysis
- Exploitation
  - Visualization
  - Intelligent Analysis
  - Guidance
- Transformation
  - Internalization
    - Knowledge Visualization
    - Simulation
  - Externalization
    - Direct Externalization
    - Interaction Mining



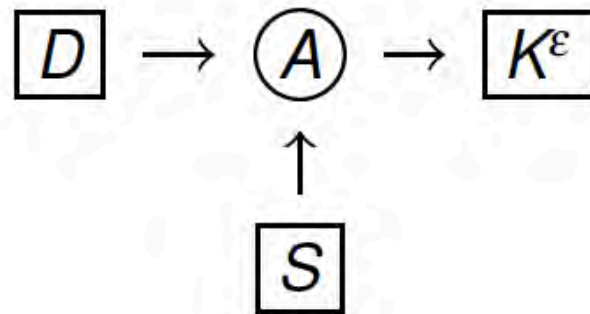
# Generation: Visualization



$D$  data  
 $S$  specification  
 $K^t$  tacit knowledge

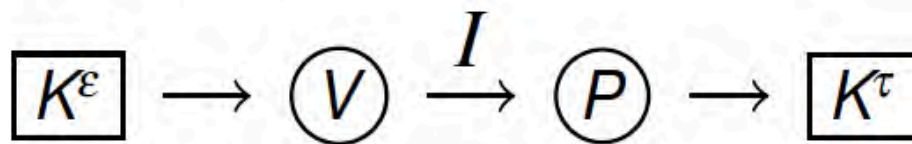
$I$  image  
 $V$  visualization  
 $P$  perception

# Generation: Automated Data Analysis



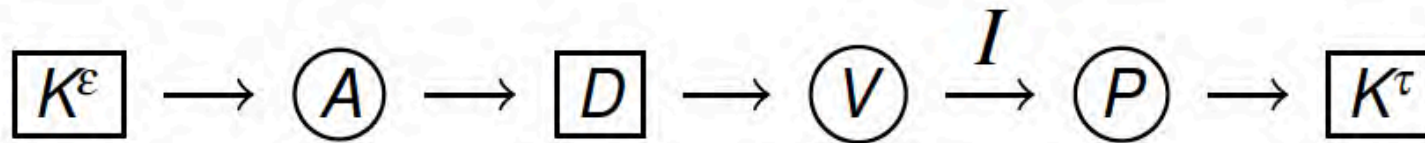
- $D$  data
- $S$  specification
- $K^T$  tacit knowledge
- $K^E$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis

# Transformation: Internalization by Knowledge Visualization



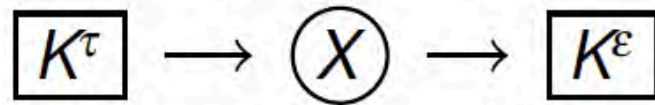
- $D$  data
- $S$  specification
- $K^T$  tacit knowledge
- $K^E$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis

# Transformation: Internalization by Simulation



- D data
- S specification
- K<sup>T</sup> tacit knowledge
- K<sup>E</sup> explicit knowledge
- I* image
- V visualization
- P perception
- A analysis
- X externalization
- E exploration

# Transformation: Direct Externalization



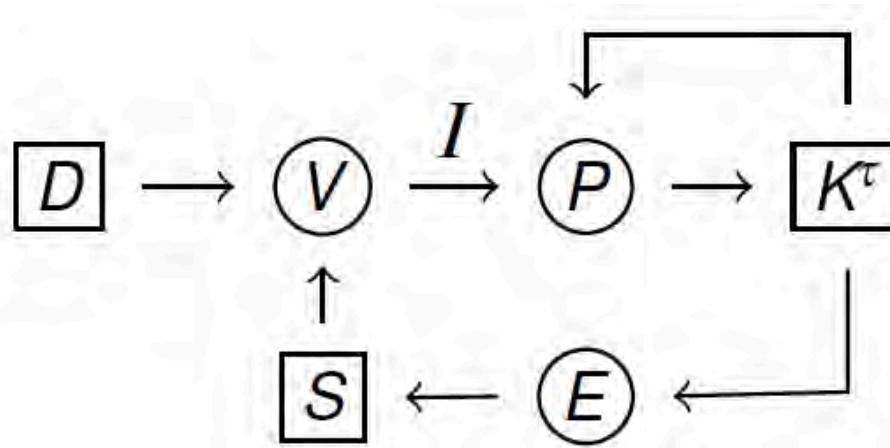
- $D$  data
- $S$  specification
- $K^{\tau}$  tacit knowledge
- $K^{\epsilon}$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis
- $X$  externalization

# Transformation: Externalization by Interaction Mining



- $D$  data
- $S$  specification
- $K^\tau$  tacit knowledge
- $K^\epsilon$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis
- $X$  externalization
- $E$  exploration

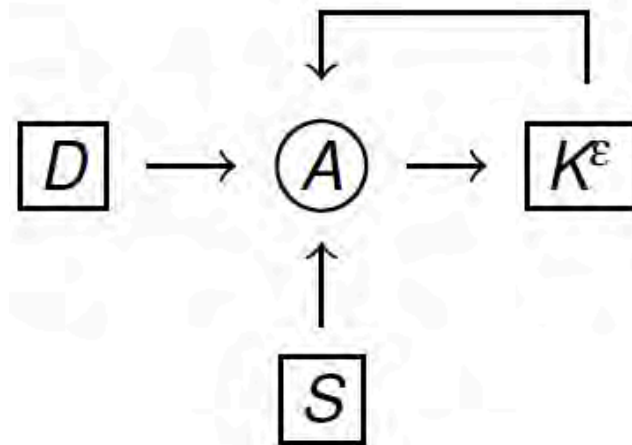
# Exploitation: Visualization



- D* data
- S* specification
- K<sup>t</sup>* tacit knowledge
- K<sup>e</sup>* explicit knowledge
- I* image
- V* visualization
- P* perception
- A* analysis
- X* externalization
- E* exploration

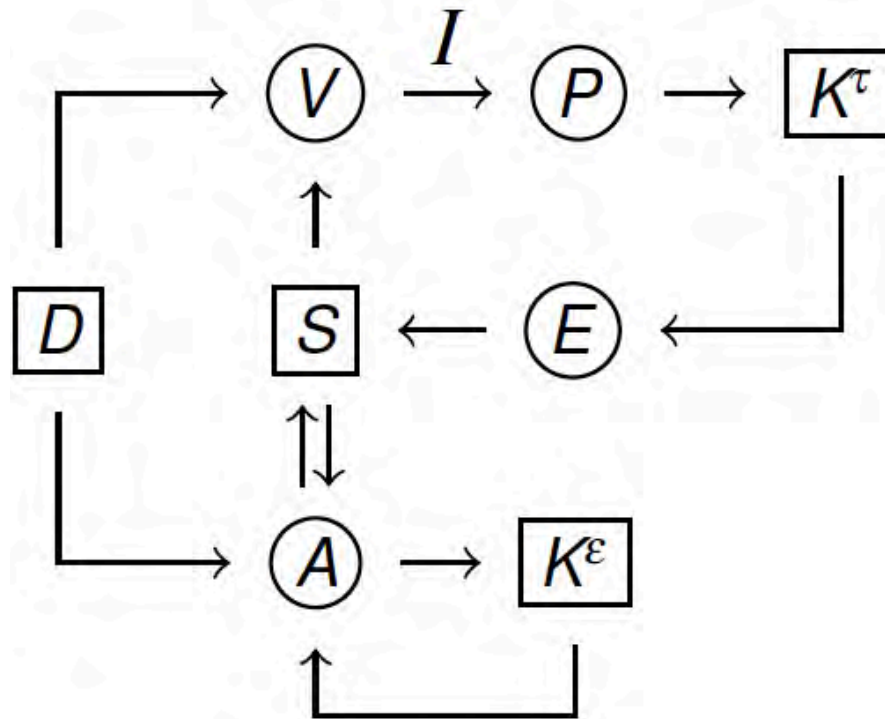


# Exploitation: Intelligent Data Analysis



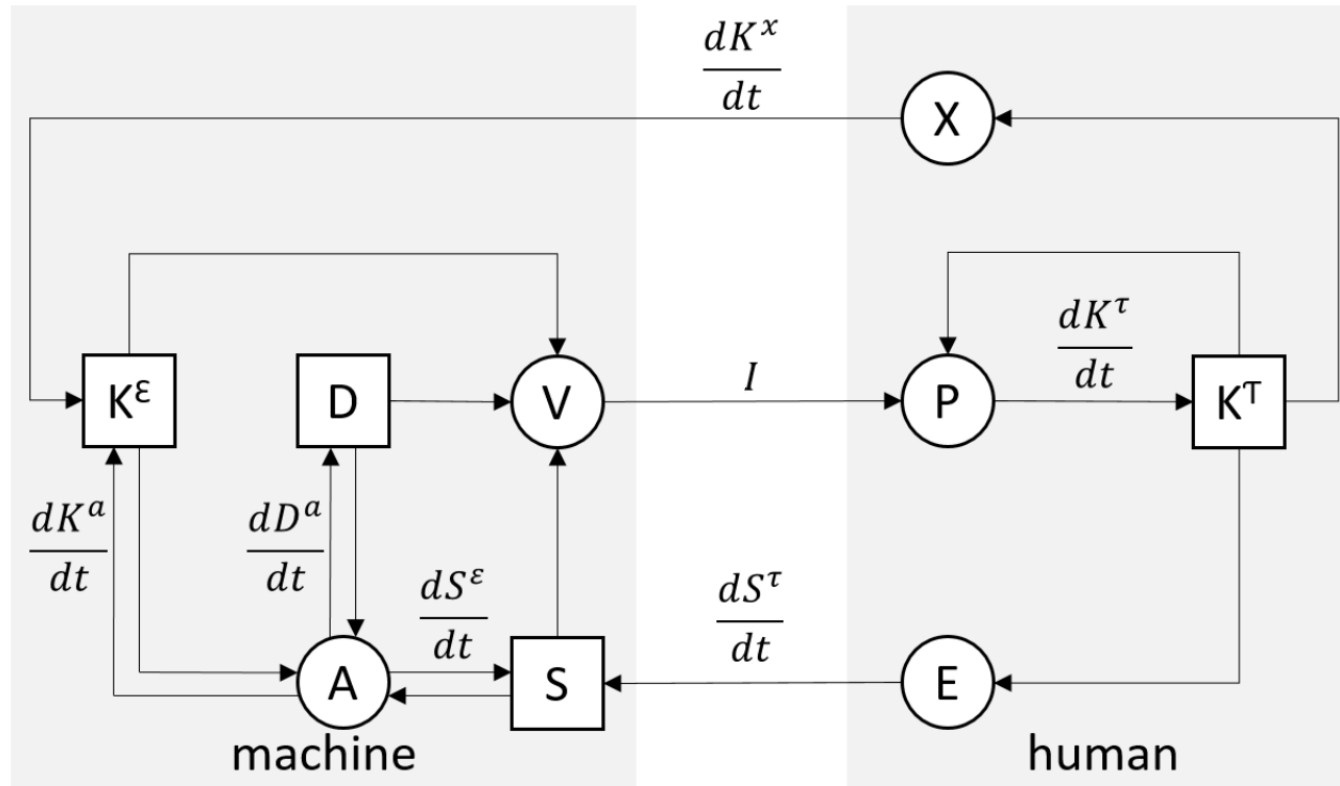
- $D$  data
- $S$  specification
- $K^T$  tacit knowledge
- $K^E$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis
- $X$  externalization
- $E$  exploration

# Exploitation: Guidance



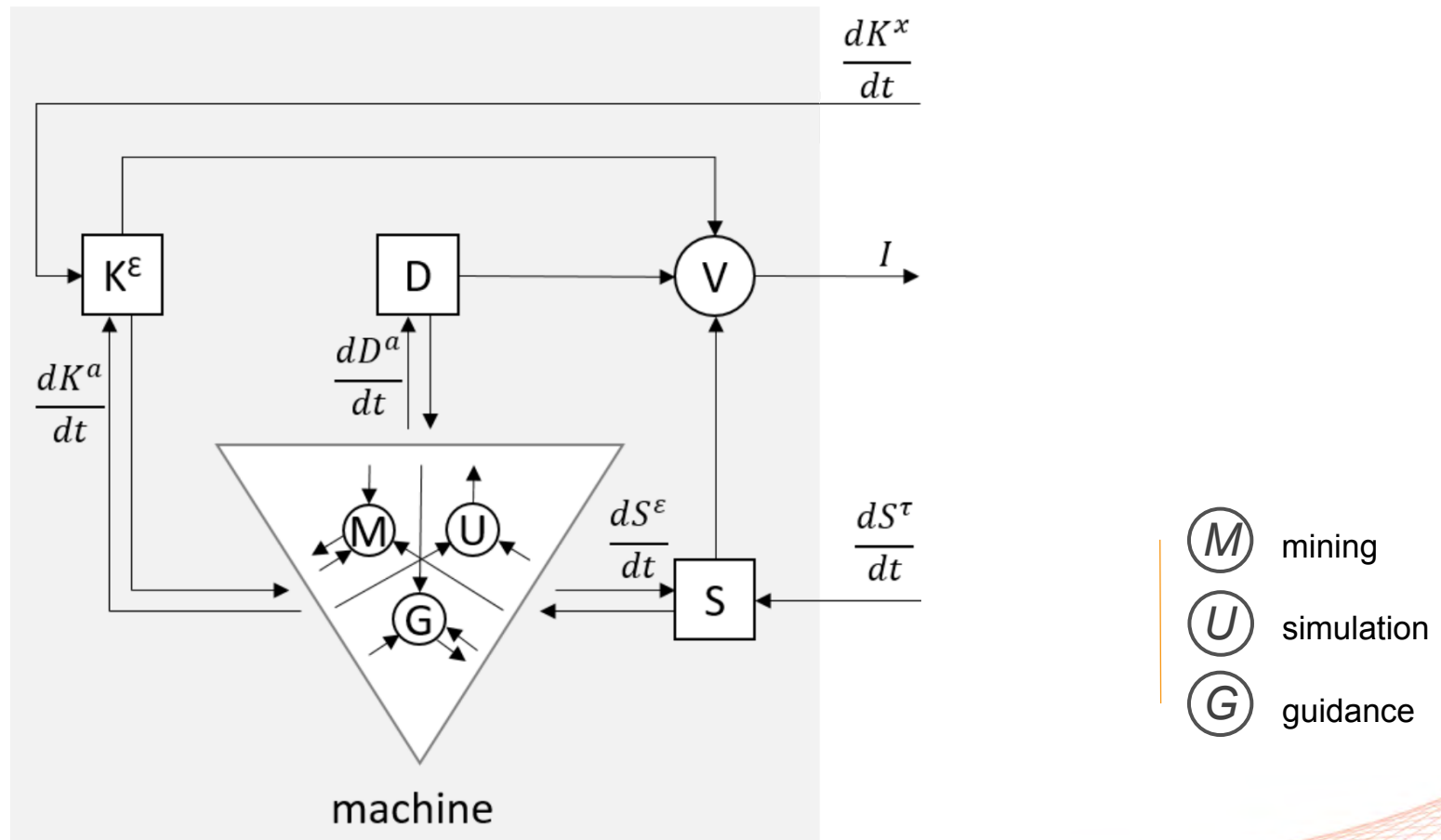
- D* data
- S* specification
- K<sup>t</sup>* tacit knowledge
- K<sup>e</sup>* explicit knowledge
- I* image
- V* visualization
- P* perception
- A* analysis
- X* externalization
- E* exploration

# All processes



- $D$  data
- $S$  specification
- $K^\tau$  tacit knowledge
- $K^\epsilon$  explicit knowledge
- $I$  image
- $V$  visualization
- $P$  perception
- $A$  analysis
- $X$  externalization
- $E$  exploration

# Characterizing Analysis



# Characterizing Knowledge

## Space

Cognitive/Perceptual

Computational

## Type

Operational

Domain/Declarative

Domain/Procedural

## Origin

Pre-design

Design

Data

Single User

Multiple Users

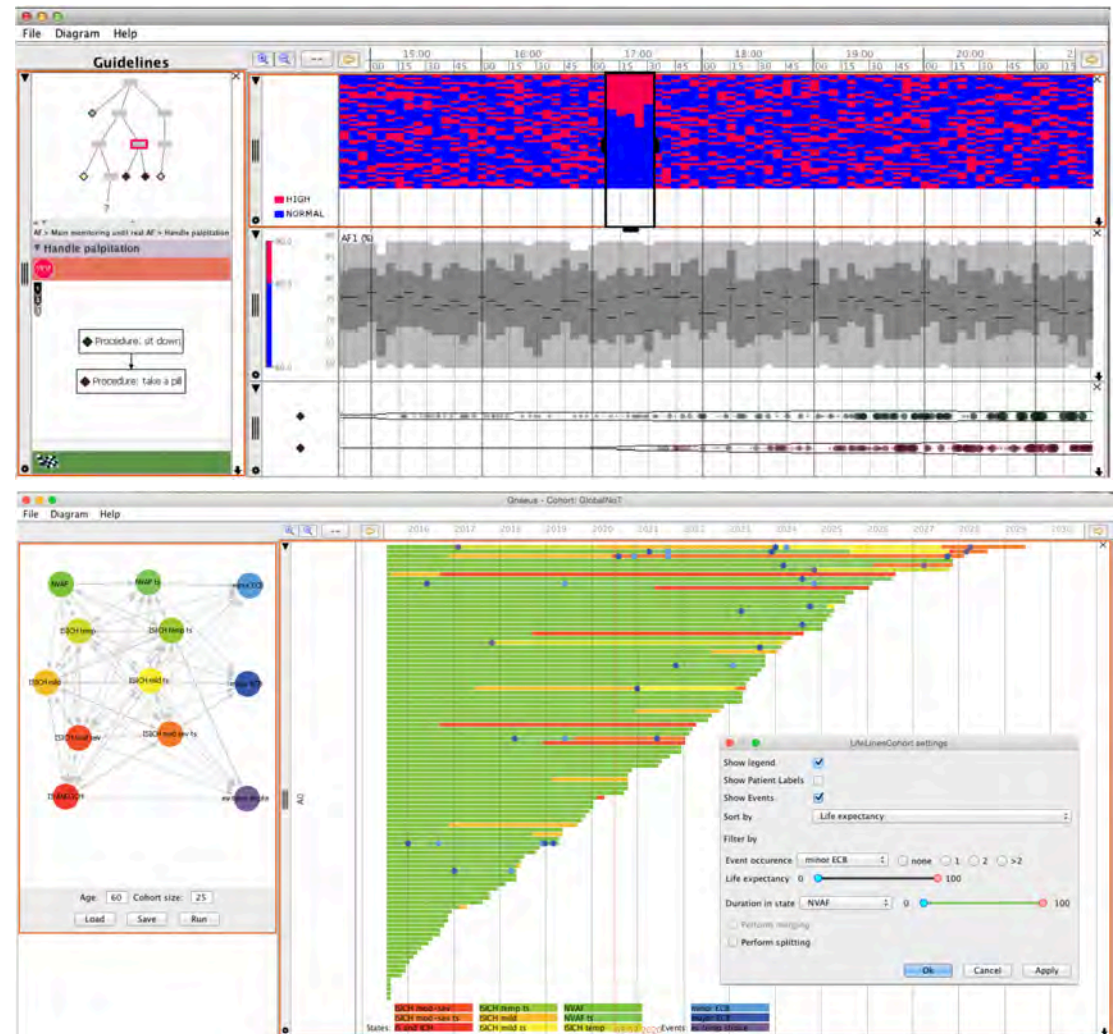
# Applying the model

Process	Data Analysis:		$D \rightarrow (A) \rightarrow K^e$		Finding Waldo [13]
	Knowledge visualization:	$K^e \rightarrow (V)$	$K^e \rightarrow (A) \rightarrow D$	Knave/Visitors [48]	
Simulation:	$K^e \rightarrow (X) \rightarrow K^e$			Smart Grids [67]	
Direct externalization:	$S \rightarrow (A) \rightarrow K^e$			KEGS [79]	
Interaction mining:	$(D, K^e) \rightarrow (A) \rightarrow K^e$			IMAGE [53]	
Intelligent data analysis:	$K^e \rightarrow (A) \rightarrow S$			Compliance [9]	
Guidance:				EVE [11]	
Type	Operational				SemViz [36]
	Domain, declarative				Compliance [5]
	Domain, procedural				Kav-db [34]
Origin	Pre-design				Dabek et al. [27]
	Design				VisExemplar [63]
	Post-design, data				Prajna [69]
	Post-design, single user				Bio ontology [16]
	Post-design, multiple users				Qualizon Graphs [32]
					SemTimeZoom [3,4]
					Garg et al. [35]
					Smart superviews [52]
					DEL [12]
					CareCruiser [38]
					CareVis [2]
					Nam et al. [55]
					PORGY [73]
					RuleBeneder [66]
					VisPad [65]
					Sport Events [25]
					KAVAGait
					VizAssist [10]
					Kamsu et al. [44]
					Gnaeus [33]
					KAMAS [75]
					FMVAS [54]



# Gnaeus

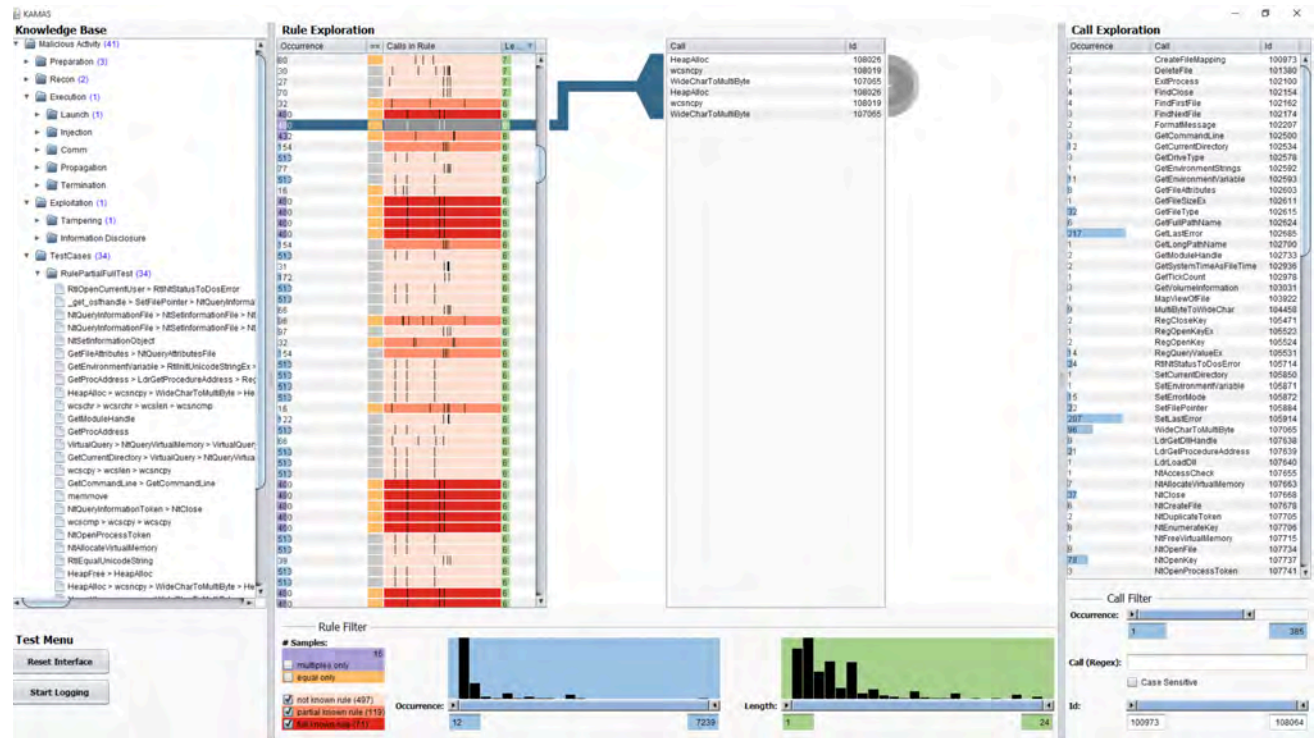
- Processes
  - Data Visualization
  - Knowledge Visualization
  - Simulation
  - Intelligent Data Analysis
  - Guidance
- Type
  - Domain, Declarative
  - Domain, Procedural
- Origin
  - Pre-design



[Federico et al., 2015]

# KAMAS

- Processes
  - Data Visualization
  - Knowledge Visualization
  - Direct Externalization
  - Intelligent Data Analysis
  - Guidance
- Type
  - Domain, Declarative
- Origin
  - Pre-design
  - Post-design, Single User



[Wagner et al., 2017]



# The role of explicit knowledge: a conceptual model of knowledge-assisted VA

- to describe and categorize existing approaches
- to assess existing systems in terms of costs/benefits
- to design new systems and inspire research directions

