

Connections

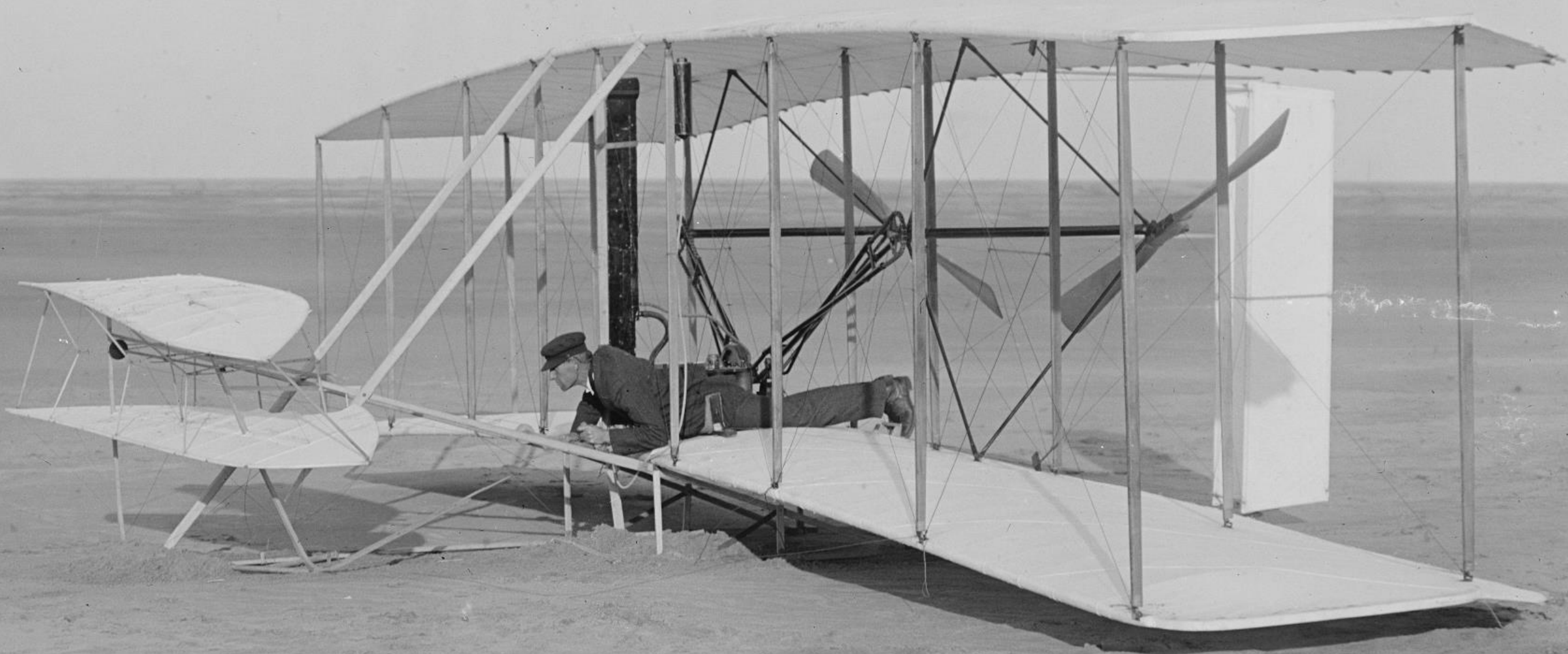
Eric Horvitz

ICMI 2015

November 12, 2015

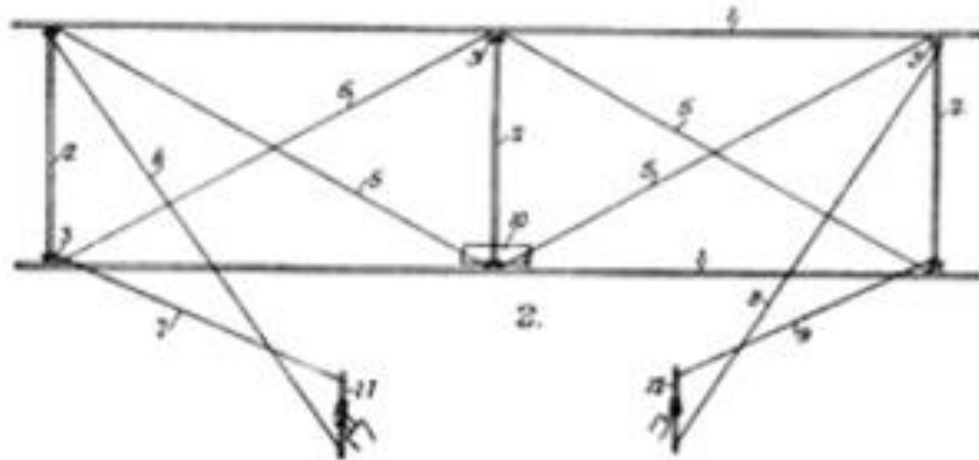
Sustained Accomplishment Award Lecture

Connections

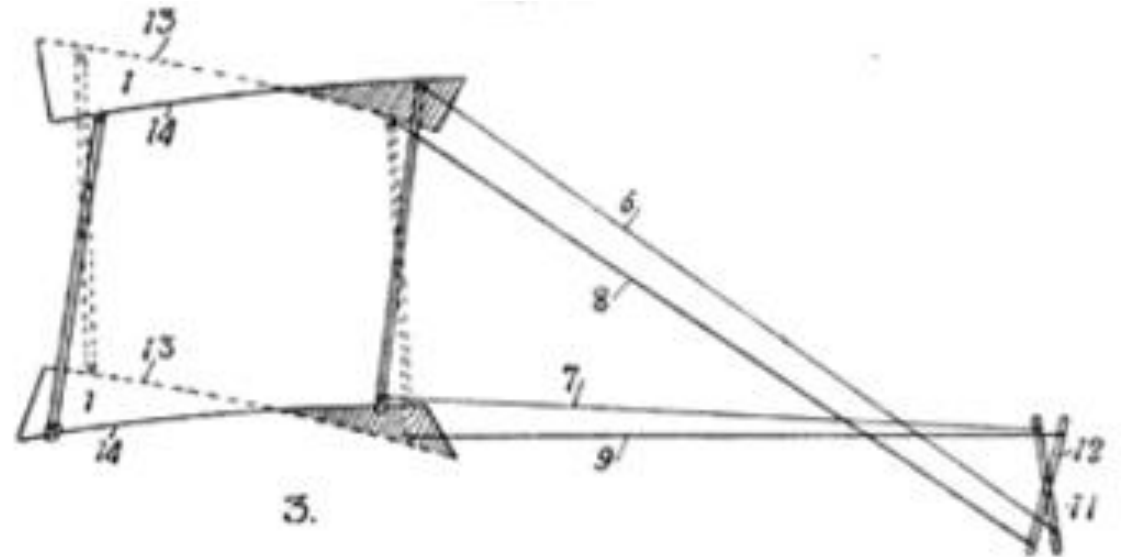


Toward Fluid Connectivity

Promise of Deeper Human-Machine Connection & Collaboration



Deland's Exhibit, Drawing of Wright's 1899
Etc. Sheet 1



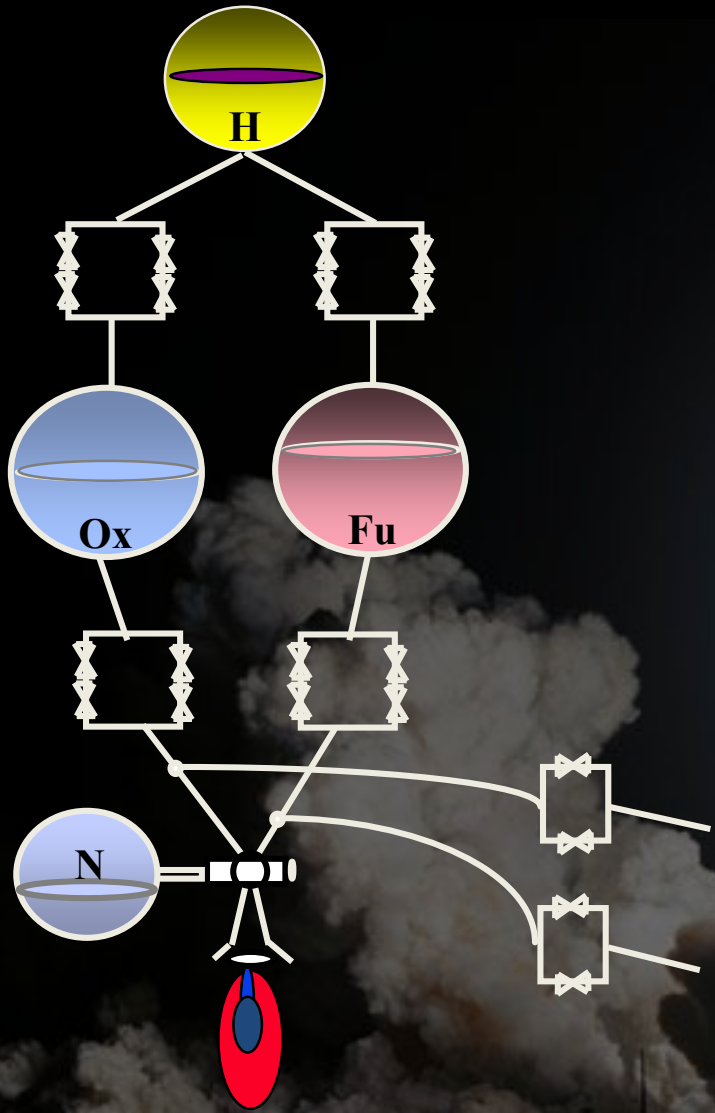
An early connection

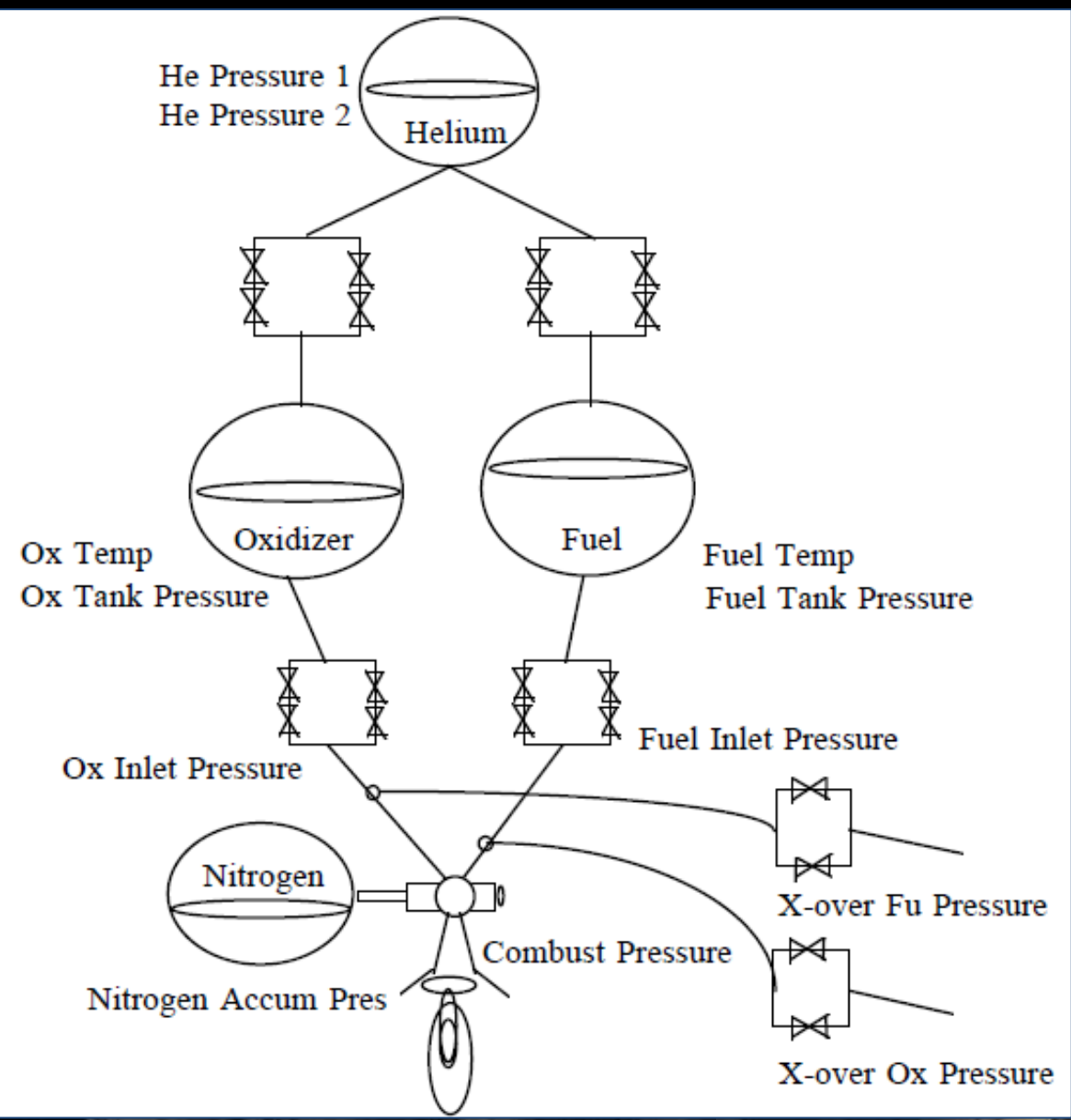
Engaging at NASA's Mission Control Center on human-in-the loop



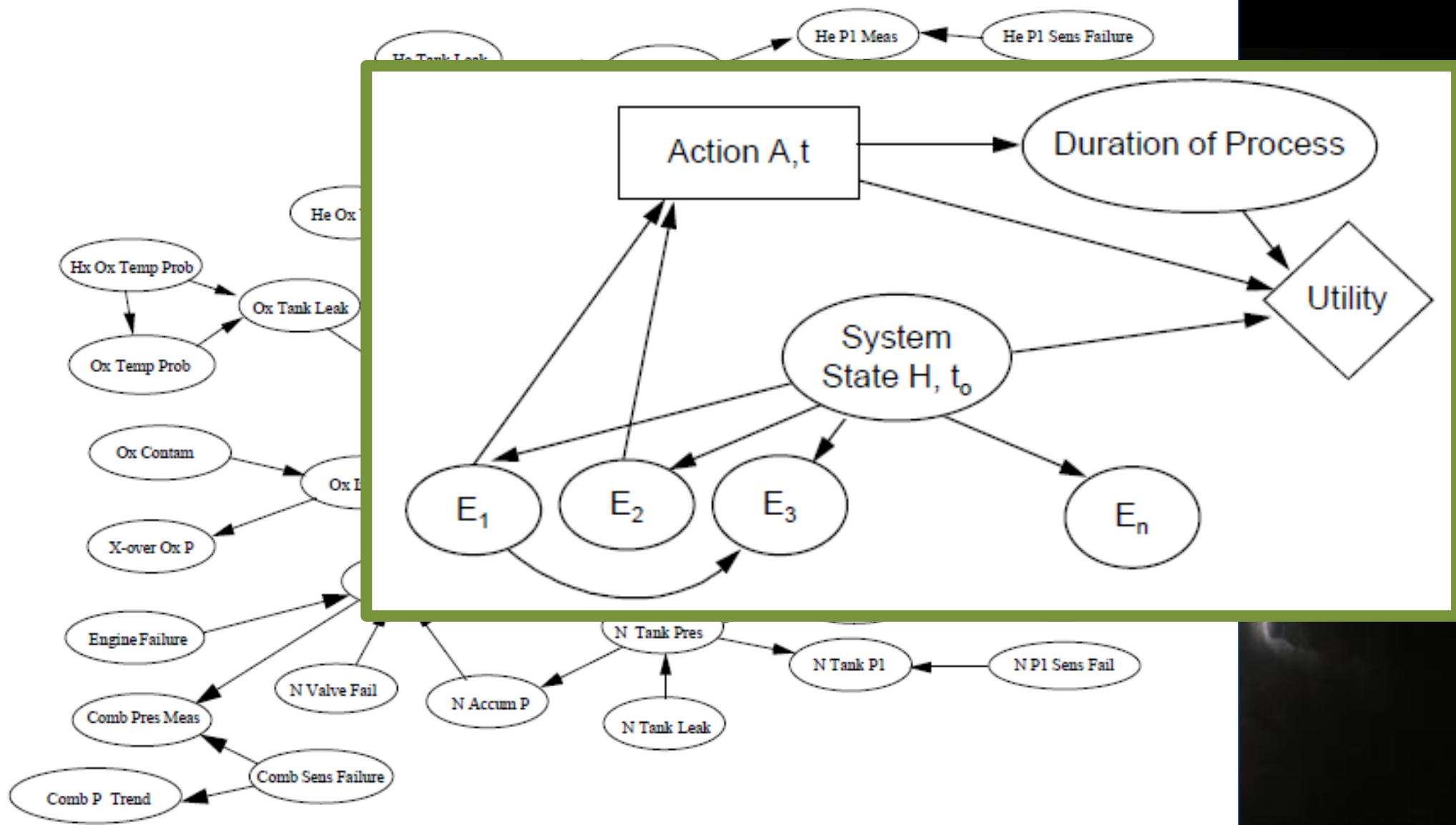






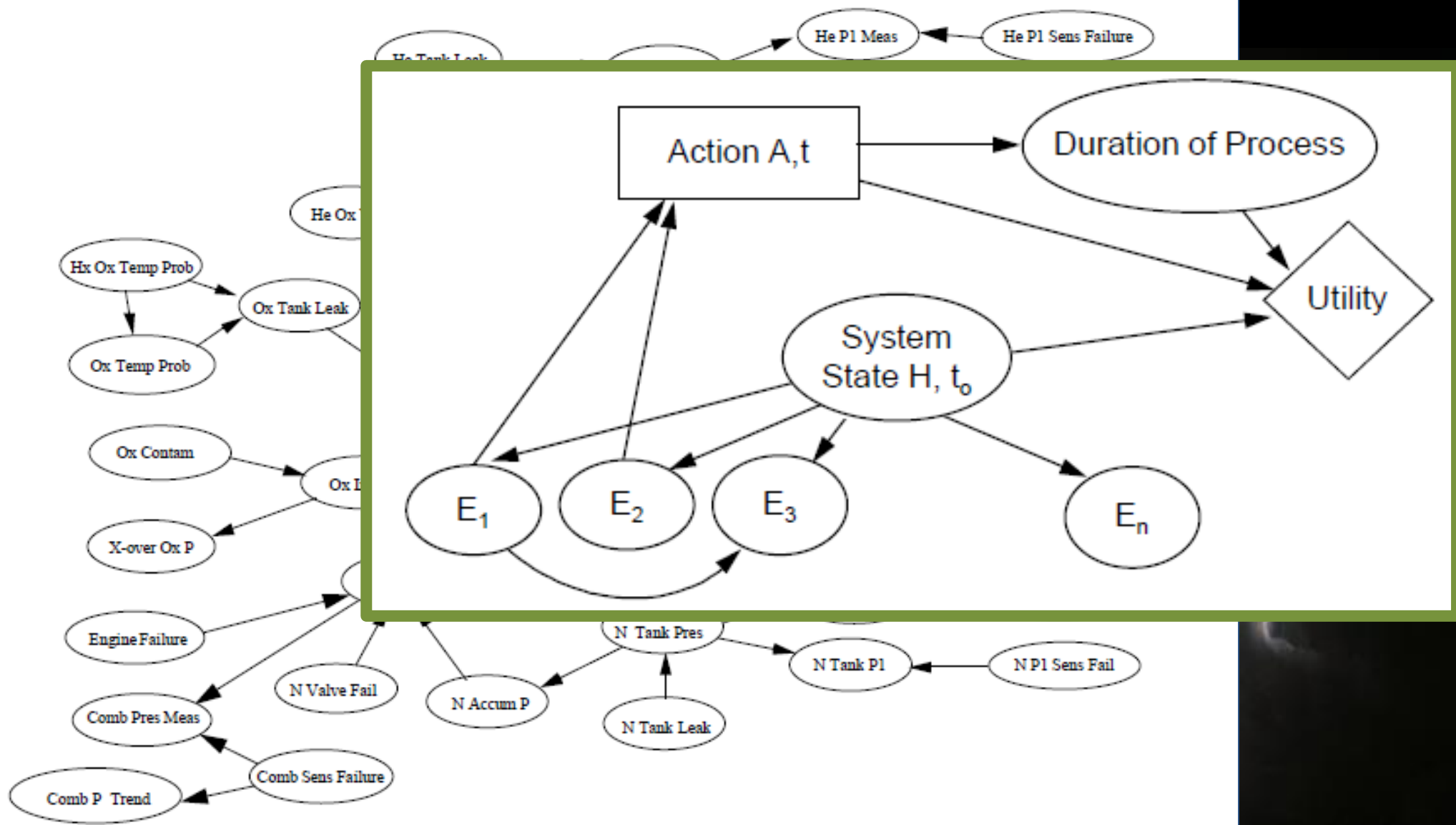


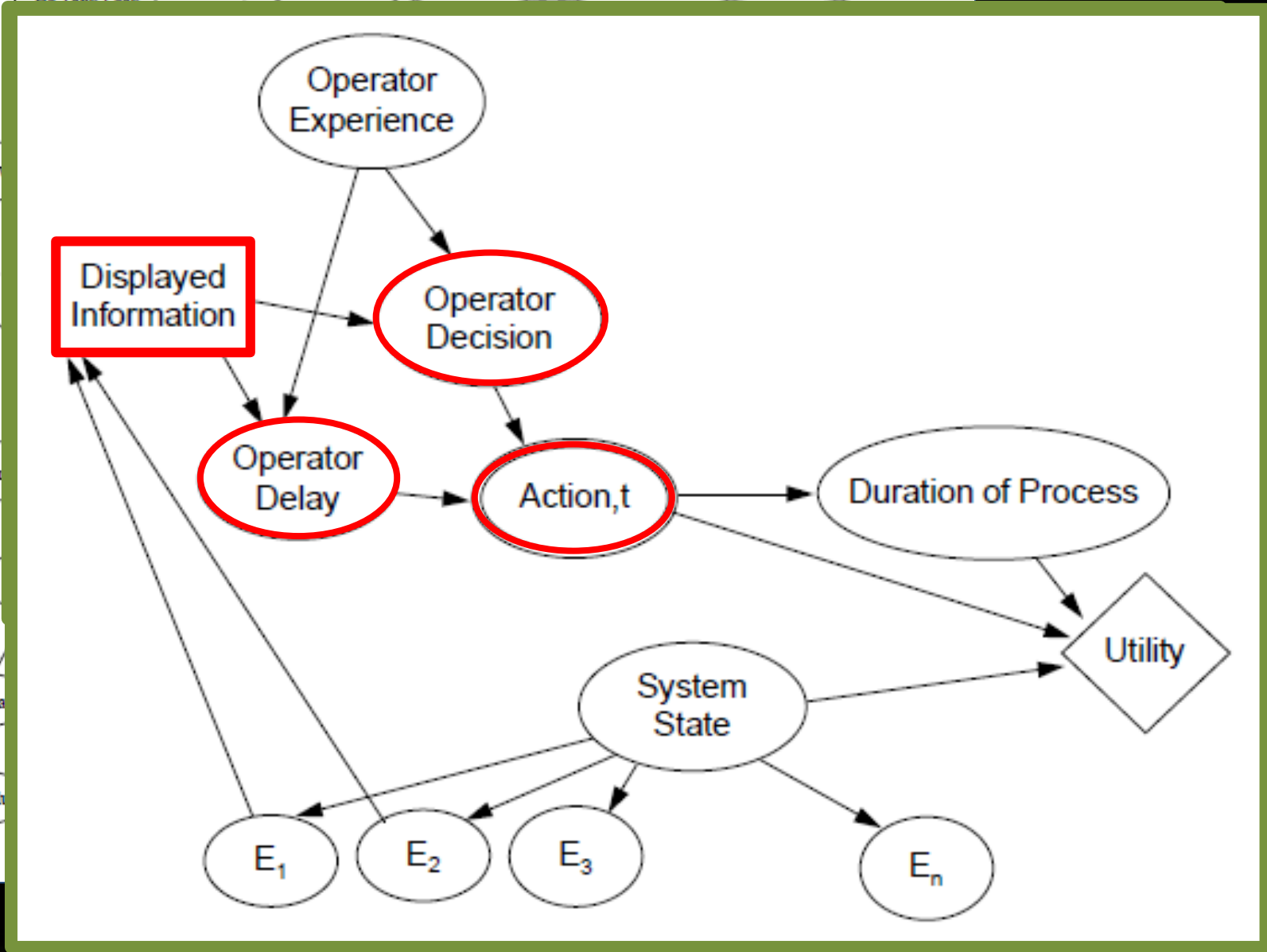
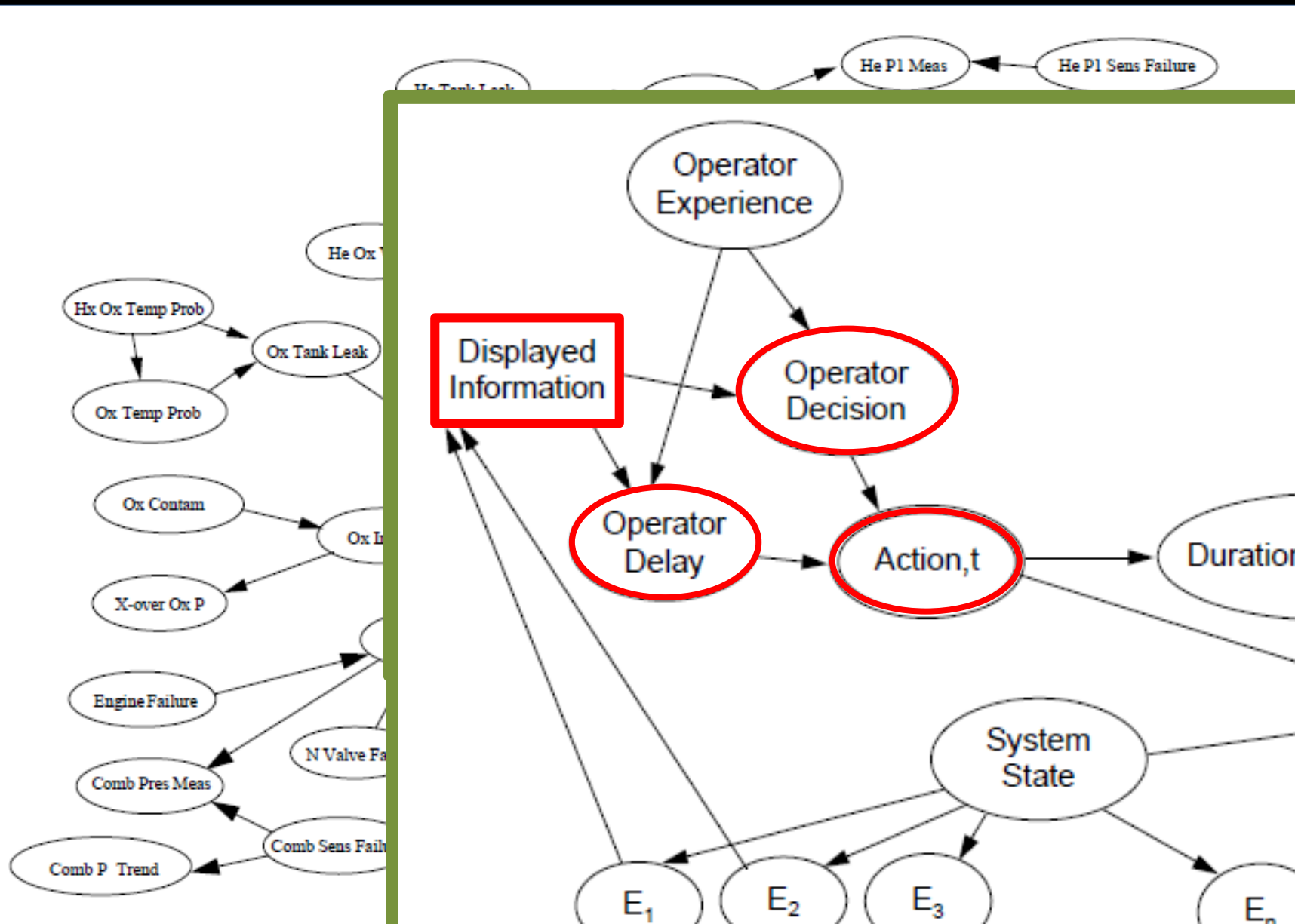


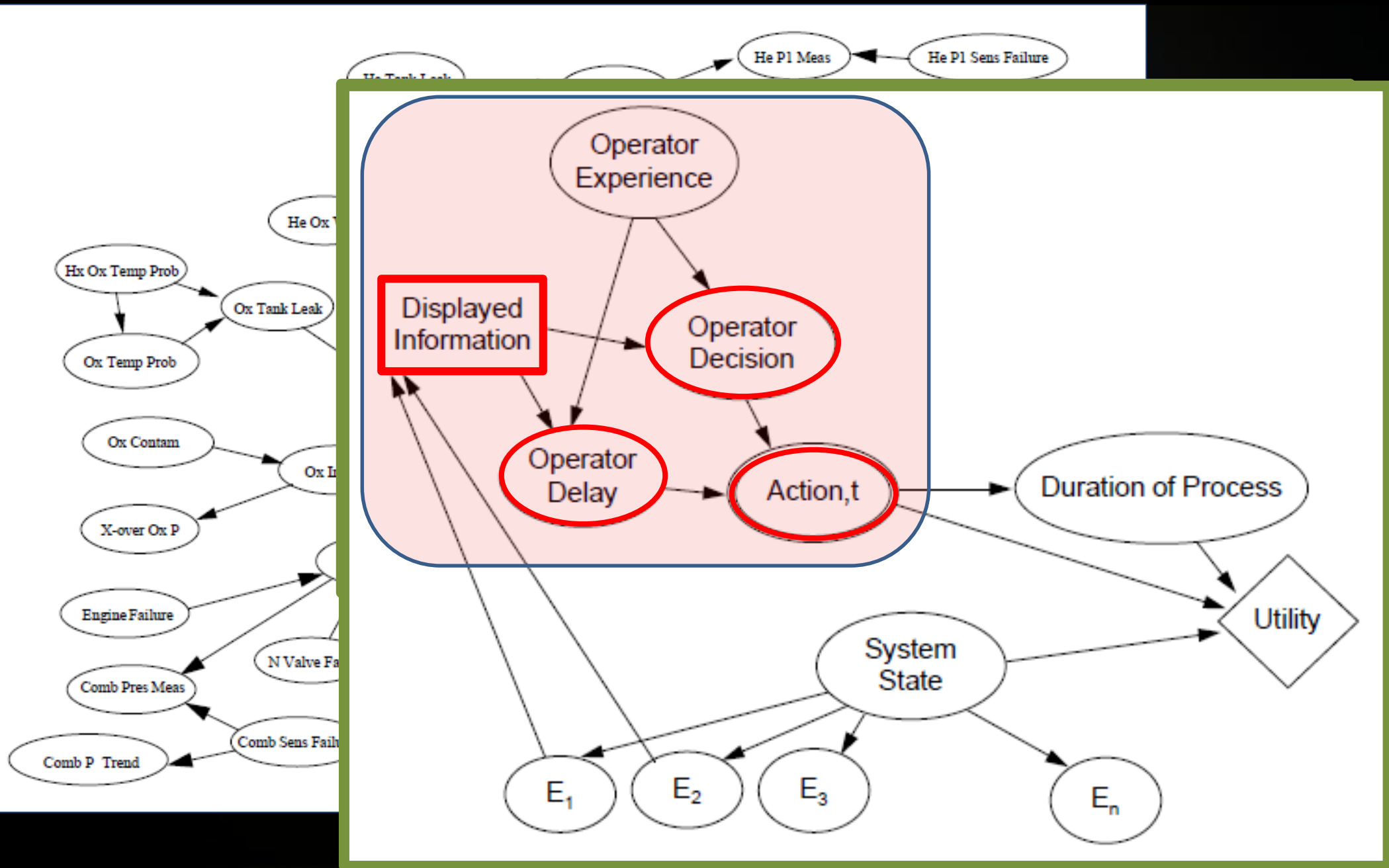


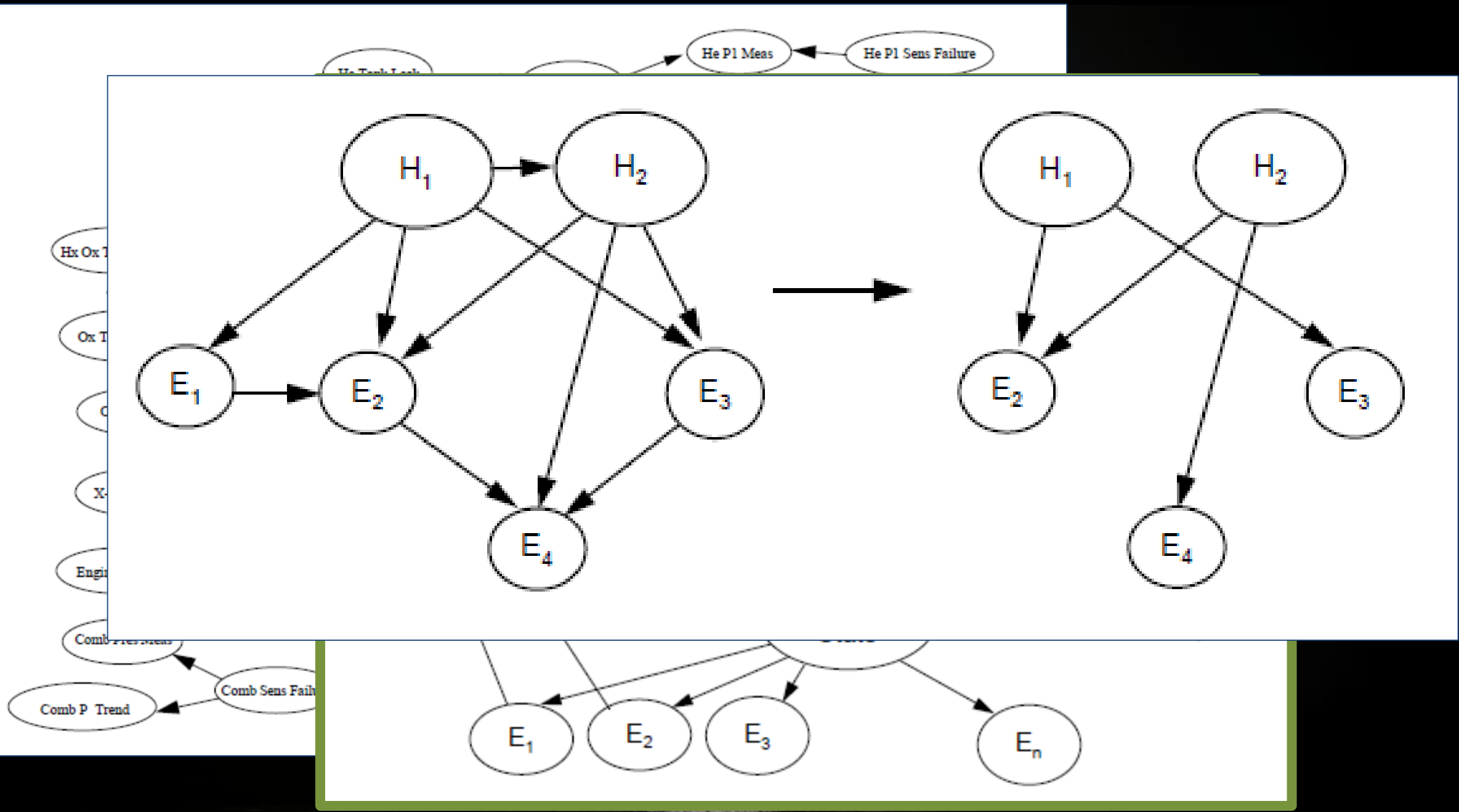


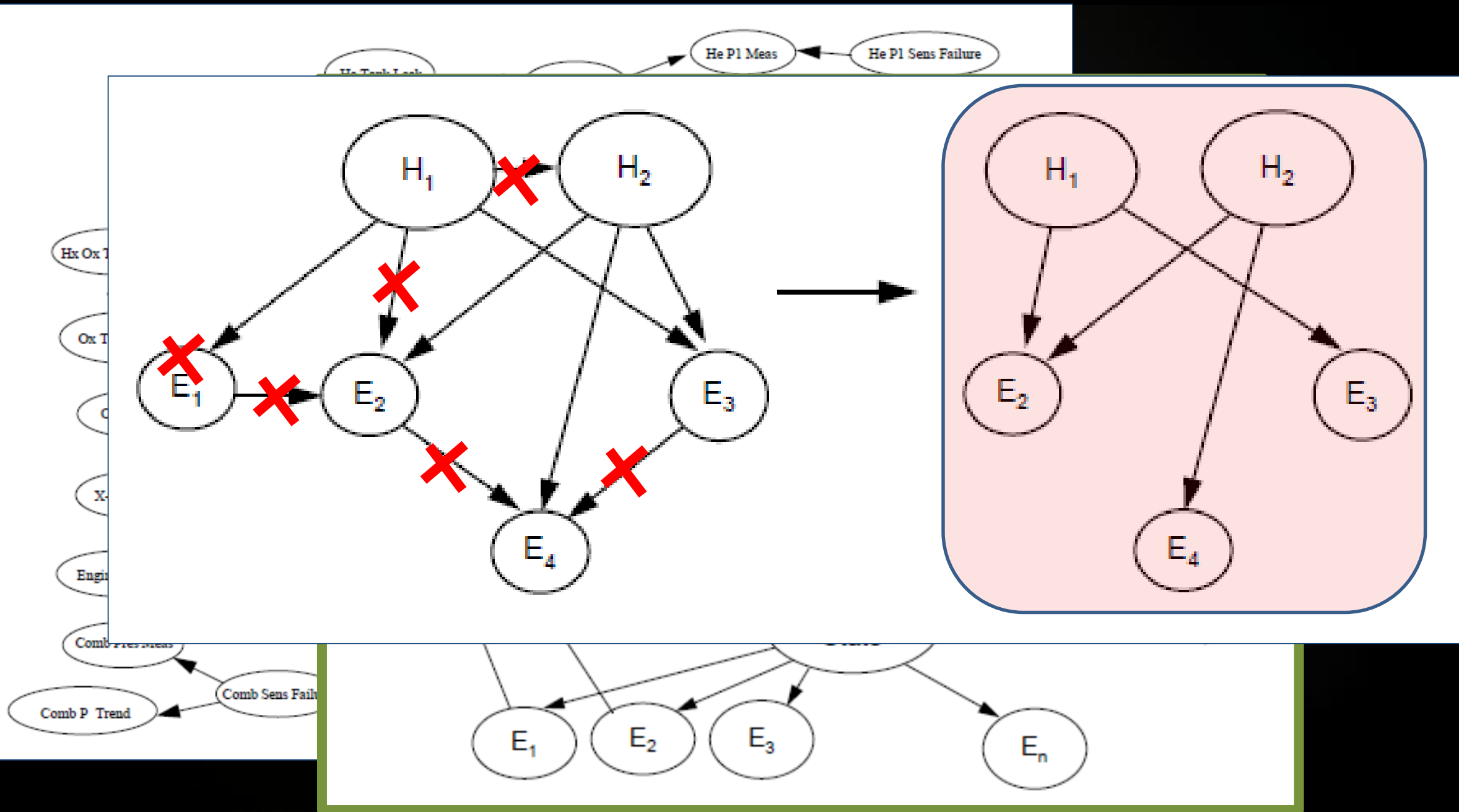
H., Barry. [Display of Information for Time-Critical Decision Making](#). UAI, 1995.











F/W 48/103

ASCENT / ENTRY PROP RR1104 CH024

CGAT 268:04:57:47 J-ET
GNC NM 304

5:08:17:47 SITE TDR

		LEFT		RIGHT		FORWARD	
		OX	FU	OX	FU	OX	FU
WE VLV A	CL / TK P1	2440	2320	2448	2320	2176	2022
WE VLV B	CL / TK P2	2440	2320	2448	2320	2176	2022
ISOL 12	CL / TK PRESS	246	246	246	246	246	246
345 A	CL / TK CUT P	244	244	244	244	244	244
345 B	CL / TK CUT P	244	244	244	244	244	244
MANF 1	CL / MANF 1 P	244	244	244	244	244	244
MANF 2	CL / MANF 2 P	244	244	244	244	244	244
MANF 3	CL / MANF 3 P	244	244	244	244	244	244
MANF 4	CL / MANF 4 P	244	244	244	244	244	244
MANF 5	CL / MANF 5 P	244	244	244	244	244	244
PFS QUANTITY %		50.6	50.8	51.0	51.0	31.0	31.0
BFS QUANTITY %		66.0	50.8	51.0	51.0	31.0	31.0
PFS/BFS USABLE LBS		1110	1097	1119	1119	620	620
WE VA / VD	CL/P1 / P2	2390	2390	2390	2390	0	0
V1 1 / 2	CL/LK DET %	255	256	255	256	0	0
TK ISOL A	CL/TK PRESS	255	256	255	256	0	0
TK ISOL B	CL/ENG IN P	255	256	255	256	0	0
FIRE / ENG PC2 / STATUS		67	8	67	8	0	0
VEL ACCL FPS2	IMU SEL	2100	2100	2100	2100	0	0
FUEL INJ	TEMP	8:00:00:00	8:00:00:00	8:00:00:00	8:00:00:00	0	0
CV 1	CL BPV1	5.9	5.4	5.9	5.4	0	0
CV 2	CL BPV2	5.8	267	5.8	267	0	0
PRV PG1	CL M2 P1/P2	474	264	474	264	0	0
PG2	CL M2 REG P	457	164	457	164	0	0
TIG	D:H:M:S.C	490	200	490	200	0	0
QUANTITY	AFT LBS	260104196:17.91	260104196:17.91	260104196:17.91	260104196:17.91	0	0
QUANTITY	TOT LBS	268:04:55:56.78	268:04:55:56.78	268:04:55:56.78	268:04:55:56.78	0	0
QUANTITY	AFT LBS	268:04:54:11.20	268:04:54:11.20	268:04:54:11.20	268:04:54:11.20	0	0
QUANTITY	TOT LBS	268:04:29:13.67	268:04:29:13.67	268:04:29:13.67	268:04:29:13.67	0	0
QUANTITY	TOT LBS	268:04:66:26.97	268:04:66:26.97	268:04:66:26.97	268:04:66:26.97	0	0
TANK LK DETECT	1	RA FAIL	IMU	RA FAIL	IMU	0	0
USABLE	2	IMU BITE/7	3	IMU BITE/7	3	0	0
PASS	3	BODY FLAP	CYCL	BODY FLAP	CYCL	0	0
	4	BCE STRG 3	STKR	BCE STRG 3	STKR	0	0
		IMU		IMU		0	0

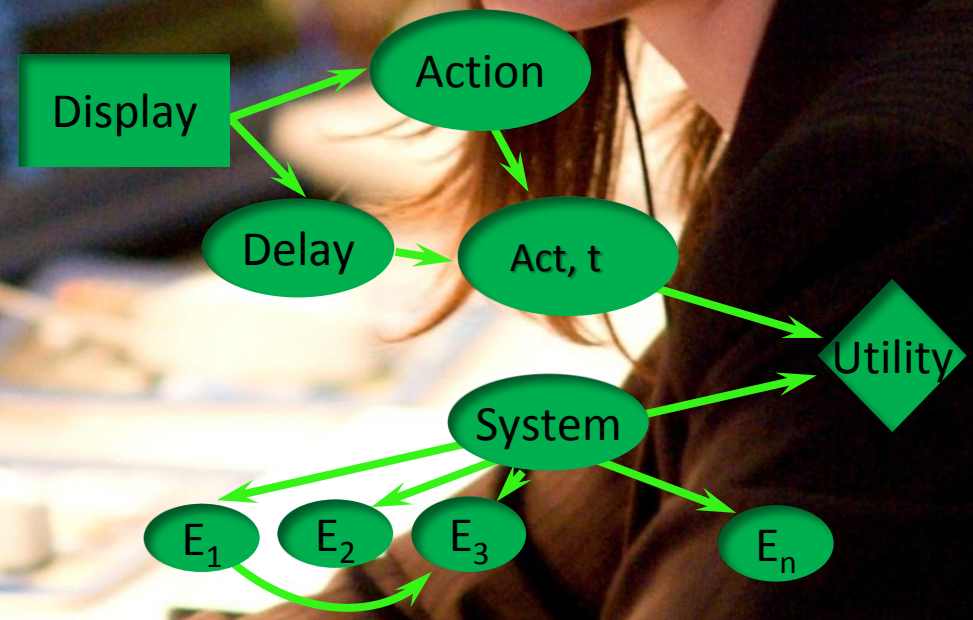
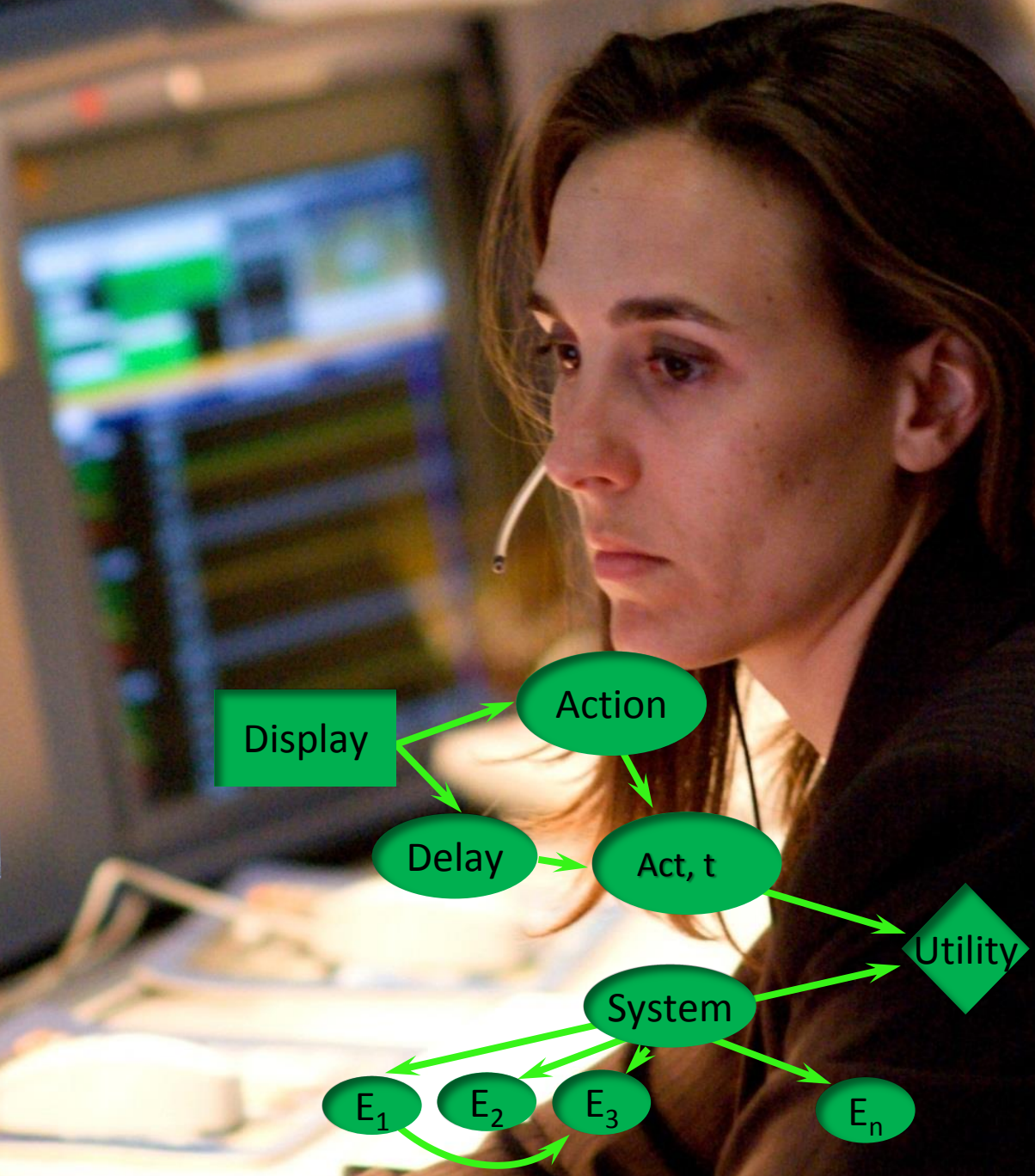


FW 48/103
 CGAT 268:04:57:47 J-ET
 GNC NM 304

ASCENT / ENTRY PROP RR1104 CH024
 5:08:17:47 SITE TDR

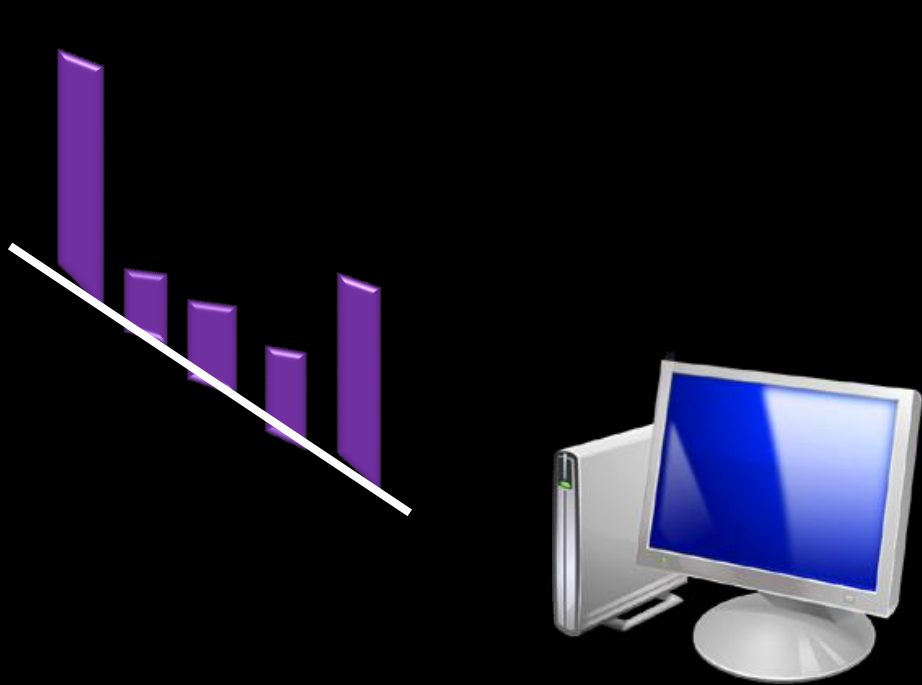
				LEFT		RIGHT		FORWARD				
	Q	F	OX	FU	Q	F	OX	FU	D	F	OX	FU
Oxygen				15.6				14.2				
Fuel Pres				10.5				11.8				
Chamb Pres				5.4				4.8				
He Pres				17.7				14.7				
Delta v				33.3				63.3				
Oxygen				10.2				10.6				
Fuel Pres				12.8				12.5				
Chamb Pres				0.0				0.0				
He Pres				15.8				15.7				
Delta v				32.3				63.3				

RCS ONS
 HE VLV A CL TK P1
 HE VLV B CL TK P2
 ISOL 12 CL TK PRESS
 345 A CL TK CUT P
 345 B CL TK CUT P
 NAMF 1 CL NAMF 1 P
 NAMF 2 CL NAMF 2 P
 NAMF 3 CL NAMF 3 P
 NAMF 4 CL NAMF 4 P
 NAMF 5 CL NAMF 5 P
 PFS QUANTITY %
 BFS QUANTITY %
 PFS/BFS USABLE LBS
 HE VA / VO CL/P1 / P2
 V1 1 / 2 CL/LK DET %
 TK ISOL A CL/TK PRESS
 TK ISOL B CL/ENG IN P
 FIRE / ENG PC2 / STATUS
 VEL ACCL FPS2 / IMU SEL
 FUEL INJ TEMP %
 CV 1 CL BPV1 %
 CV 2 CL BPV2 %
 PRV PG2 CL M2 P1/P2
 PG1 D:HM:S,C
 M:S,C
 TIG AFT LBS
 BURK AT AFT LBS
 QUANTITY TOT LBS
 QUANTITY AFT LBS
 QUANTITY TOT LBS
 QUANTITY TOT LBS
 TANK LK DETECT
 TILTY
 RA FAIL IMU
 MU BITE/7
 BODY FLAP
 SCE STRG 3
 CYCL STKR

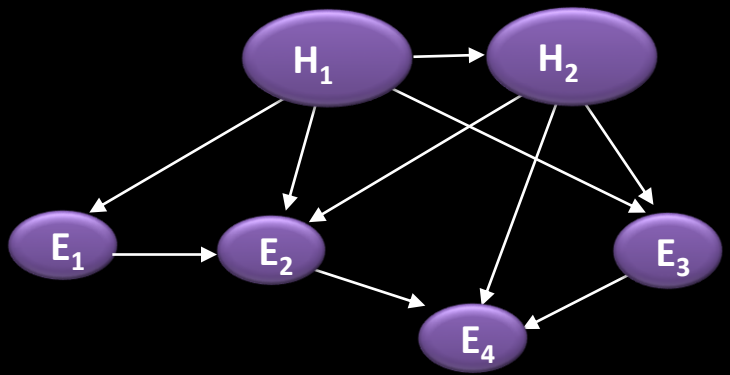


Pillars

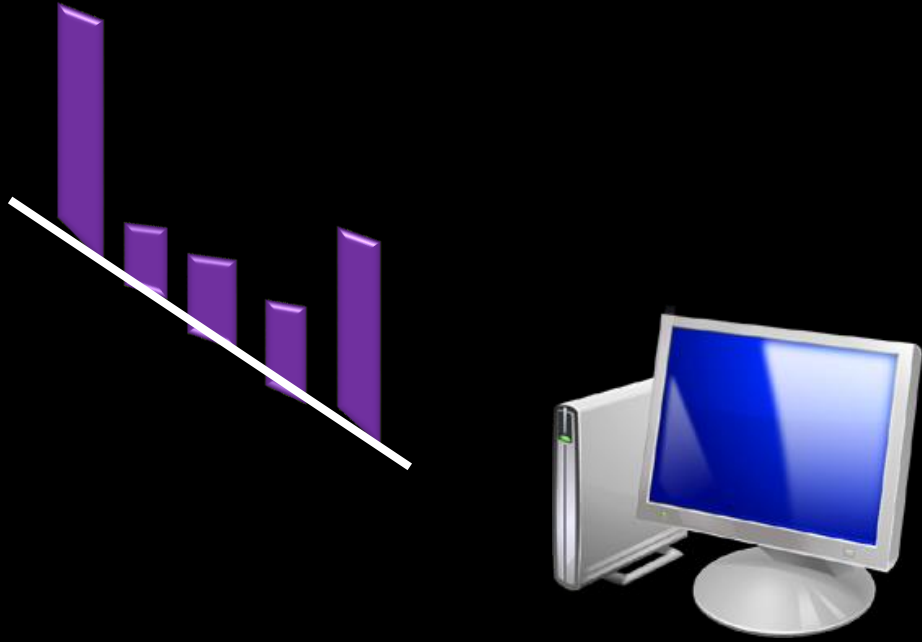
Pillar: Inferring Beliefs, Goals, Knowledge



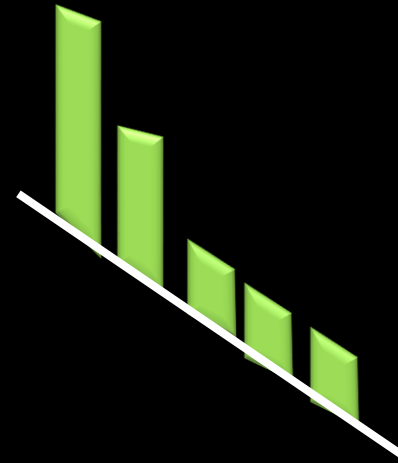
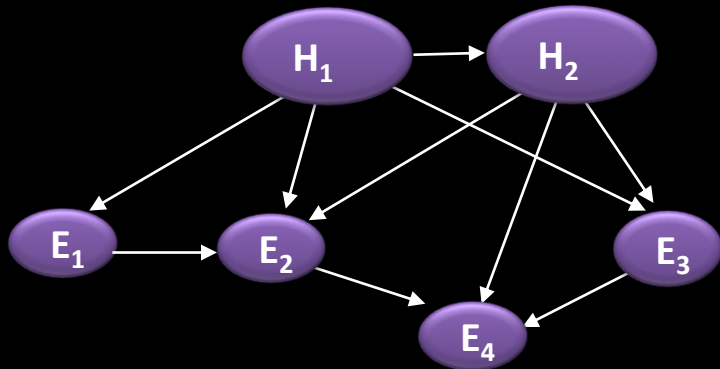
Predictions about world



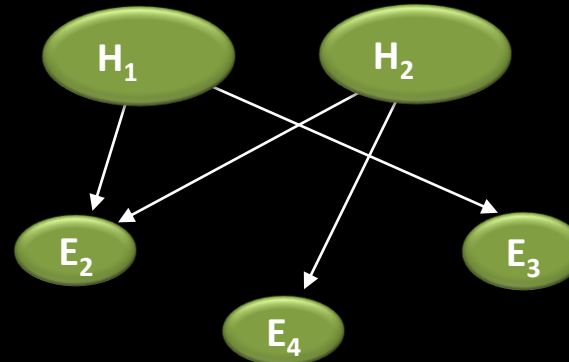
Pillar: Inferring Beliefs, Goals, Knowledge



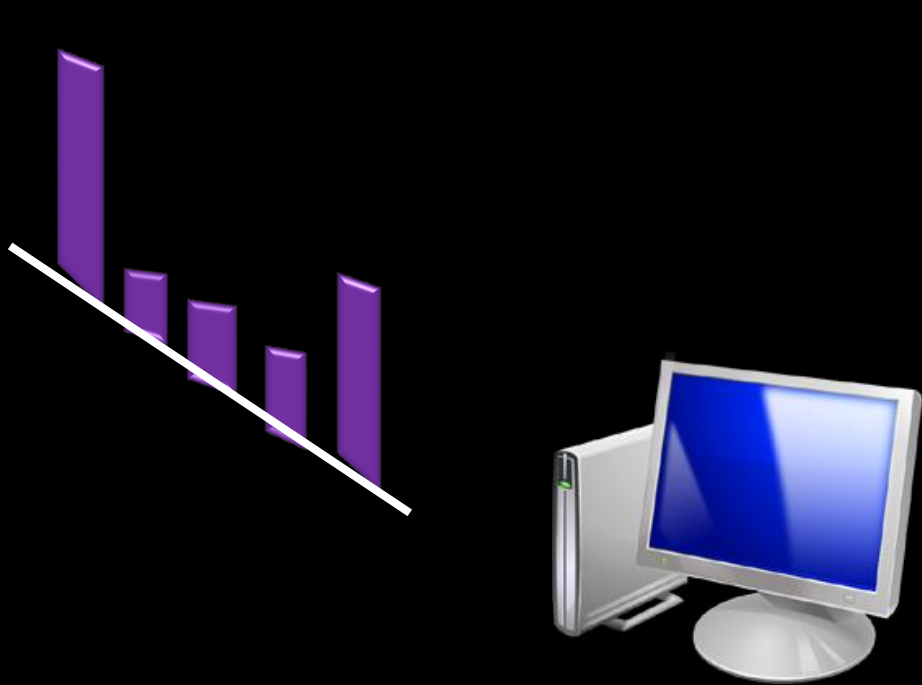
Predictions about world



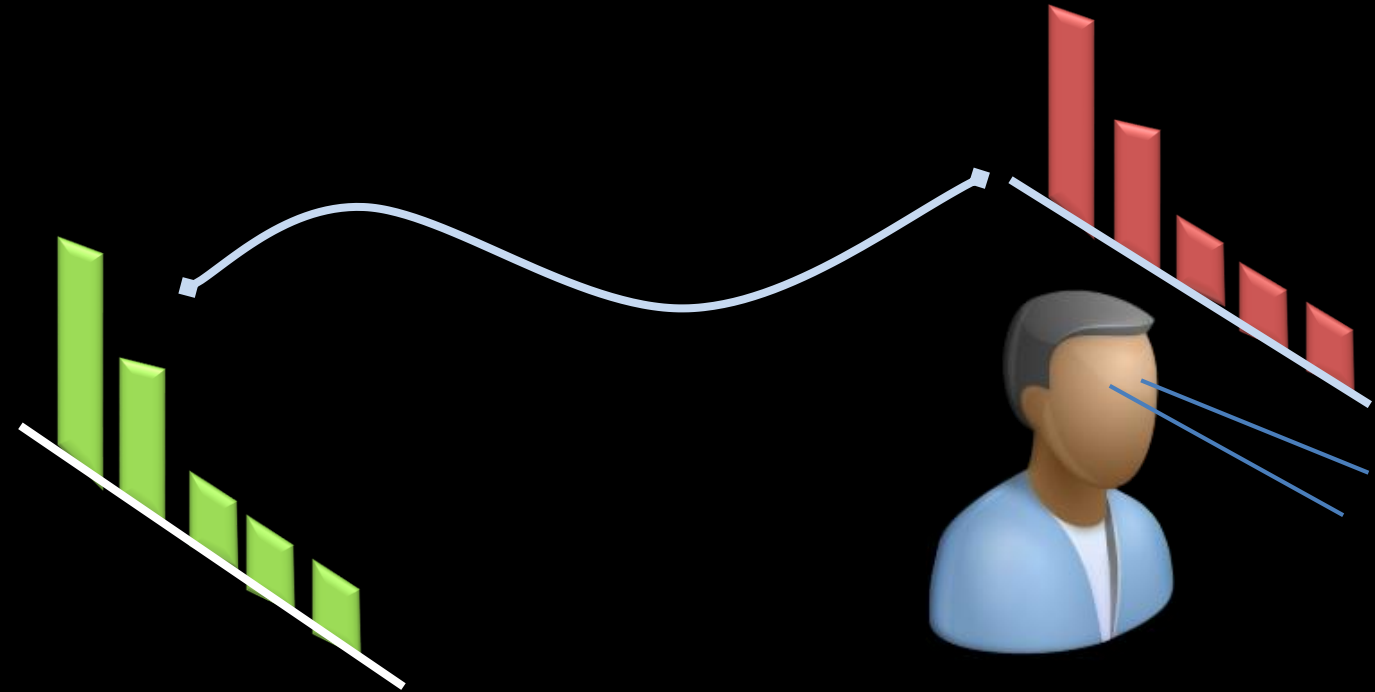
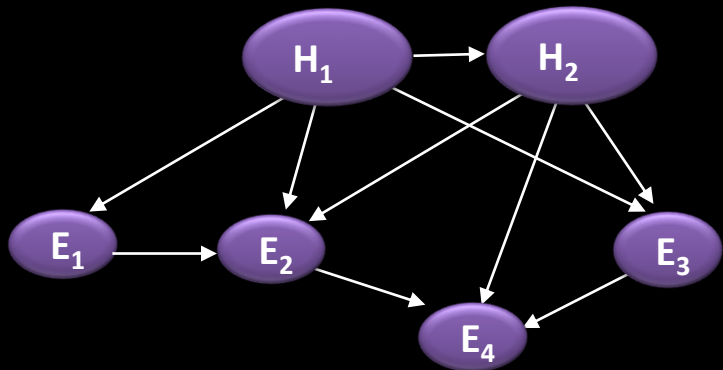
Inferences on beliefs, goals, knowledge



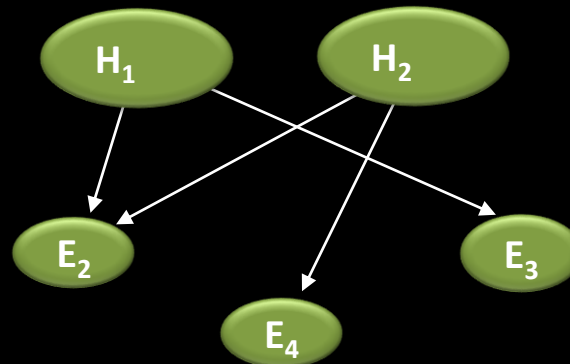
Pillar: Inferring Beliefs, Goals, Knowledge



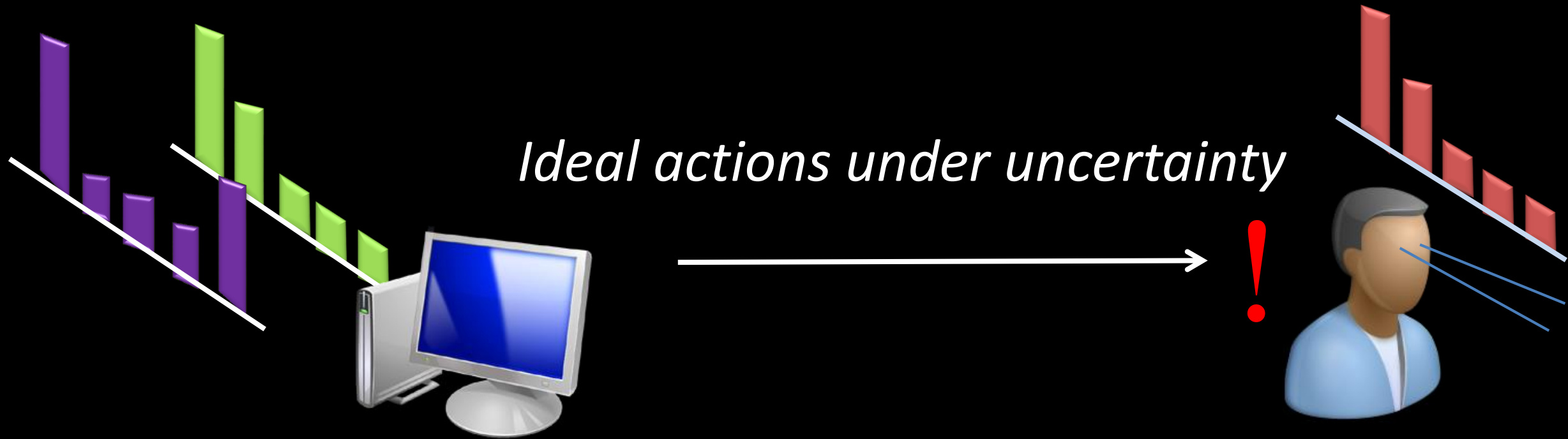
Predictions about world



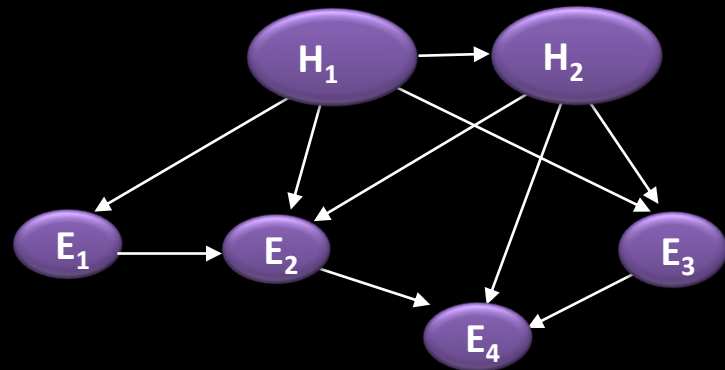
Inferences on beliefs, goals, knowledge



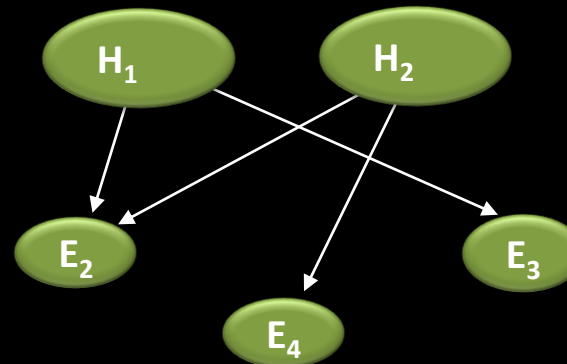
Pillar: Inferring Beliefs, Goals, Knowledge



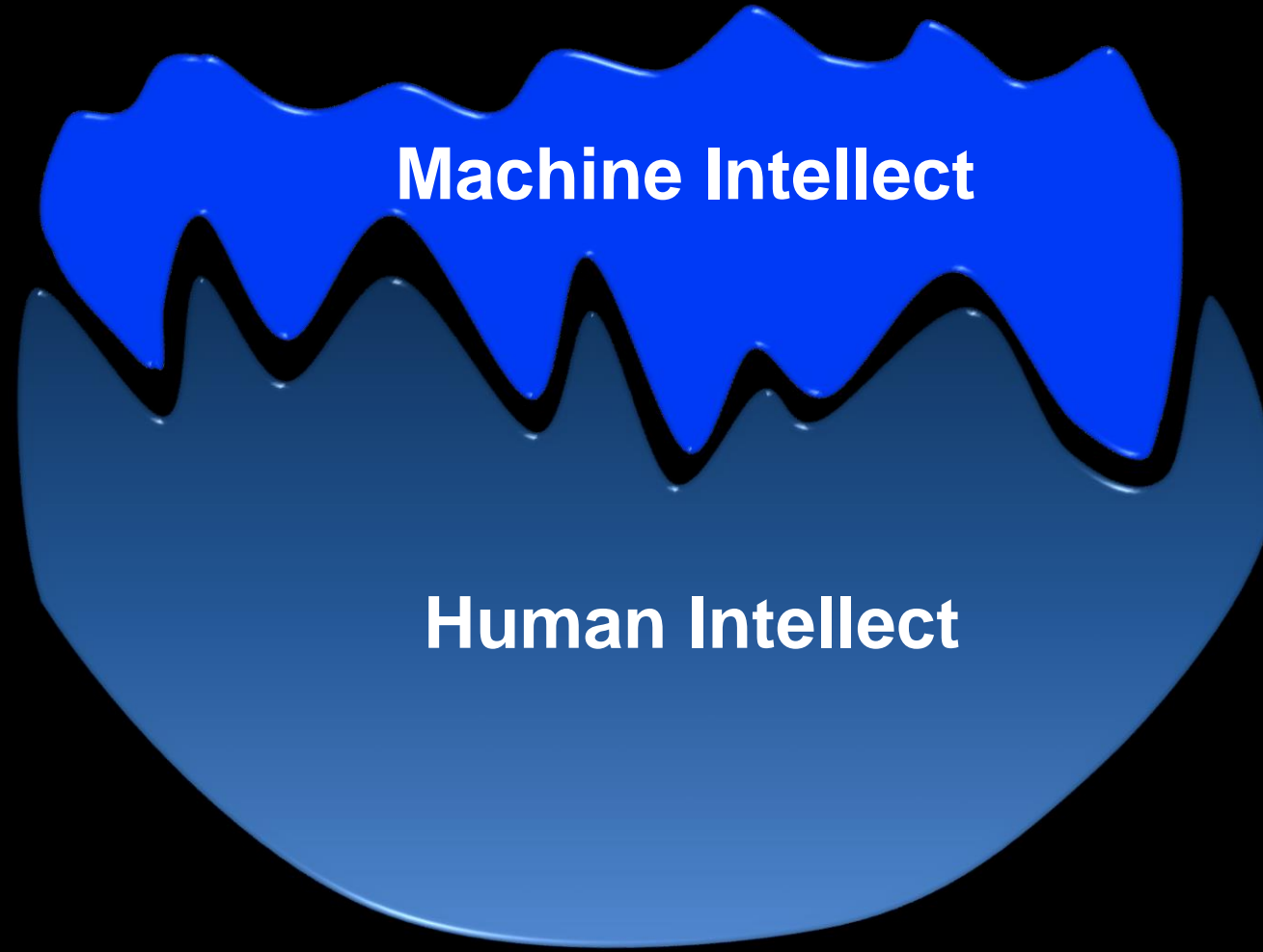
Predictions about world



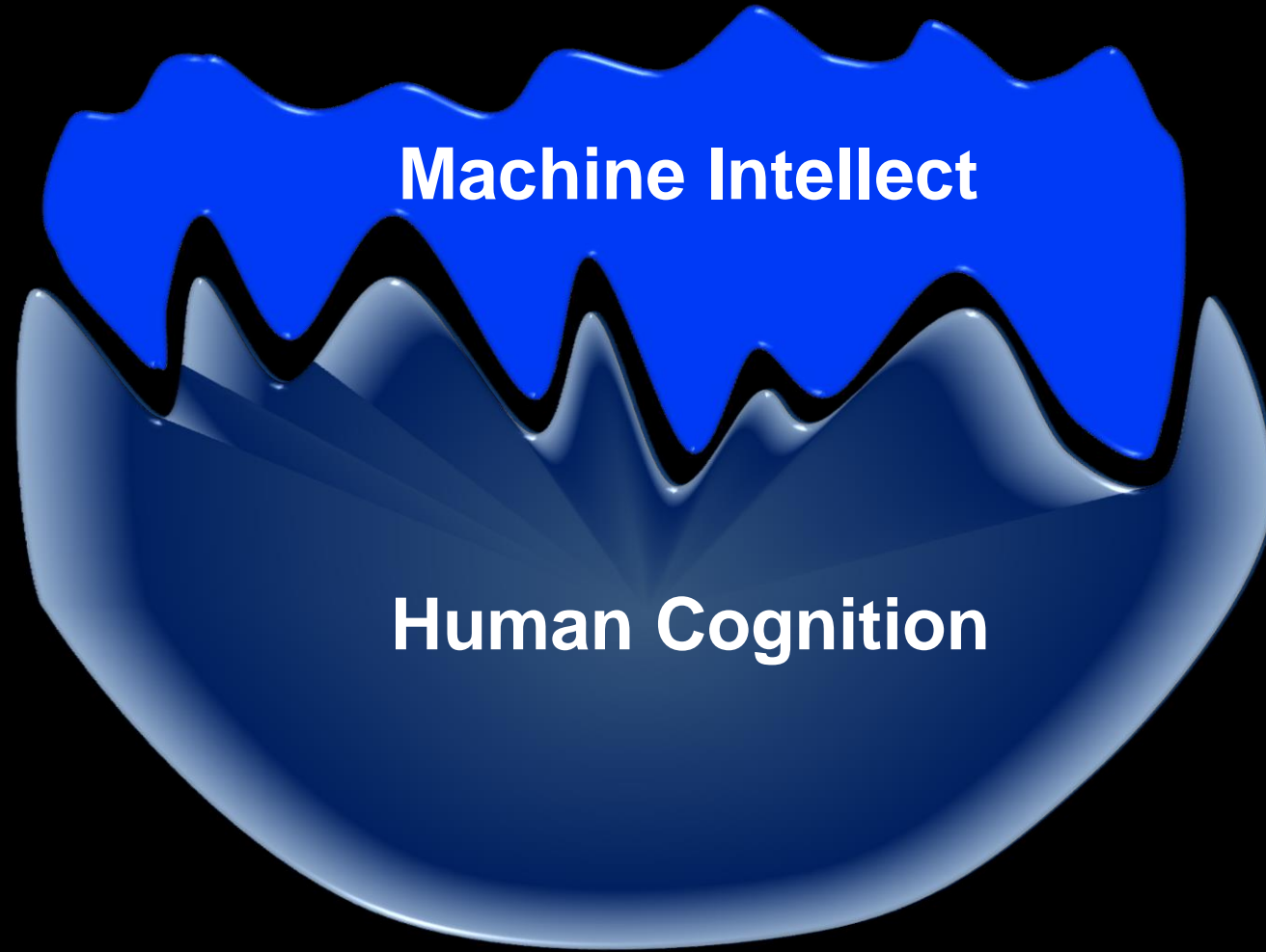
Inferences on beliefs, goals, knowledge



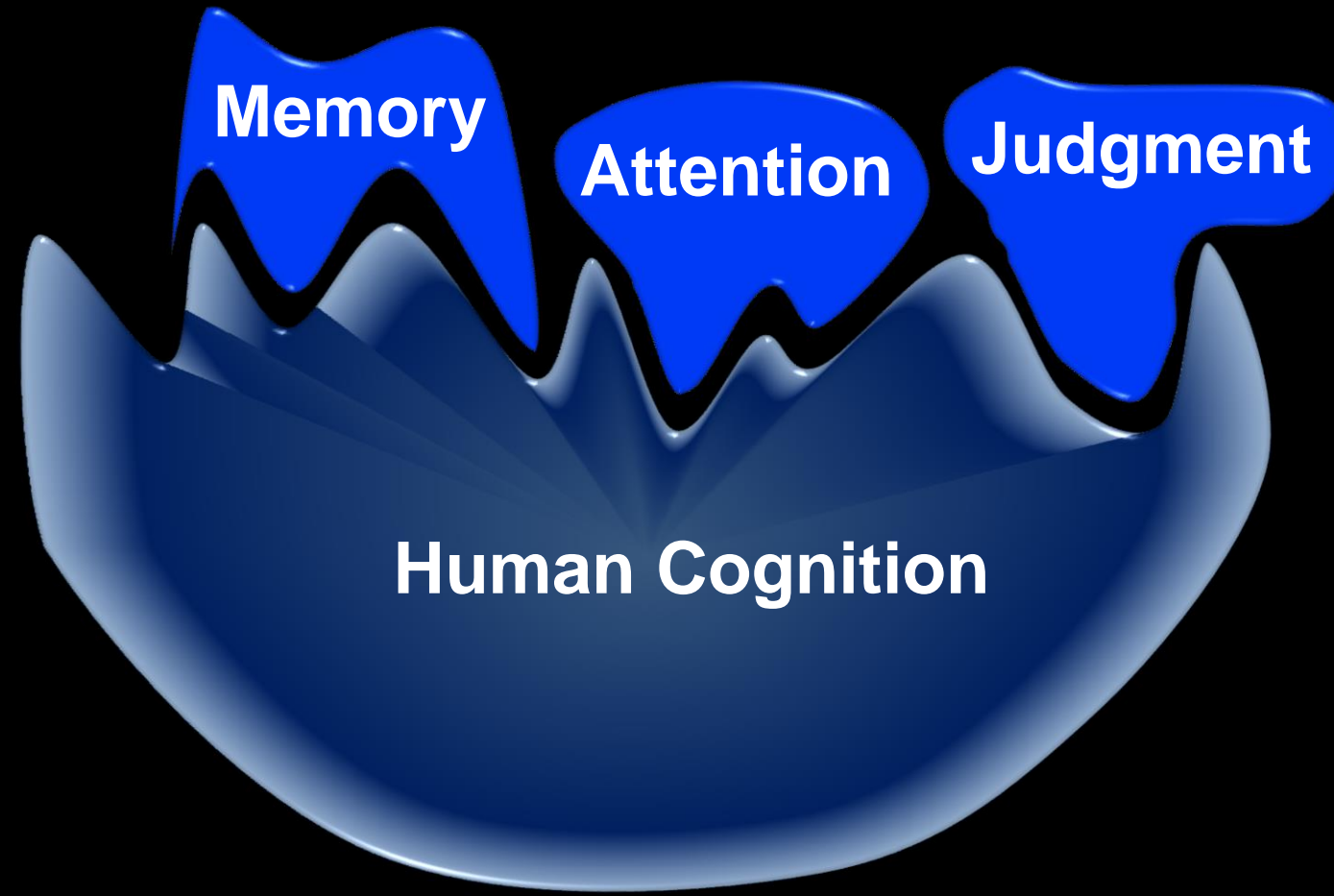
Pillar: Complementarity



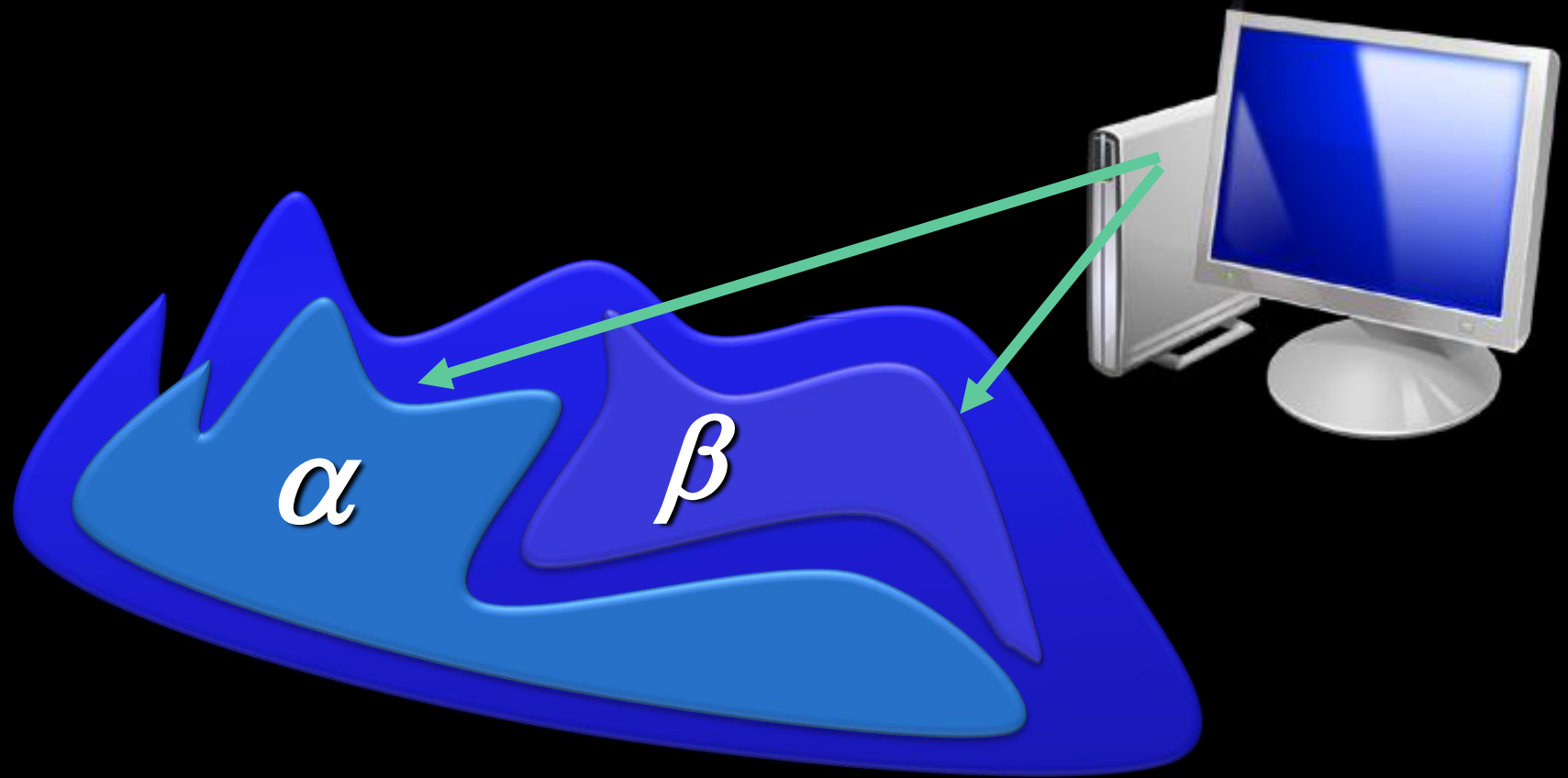
Pillar: Complementarity



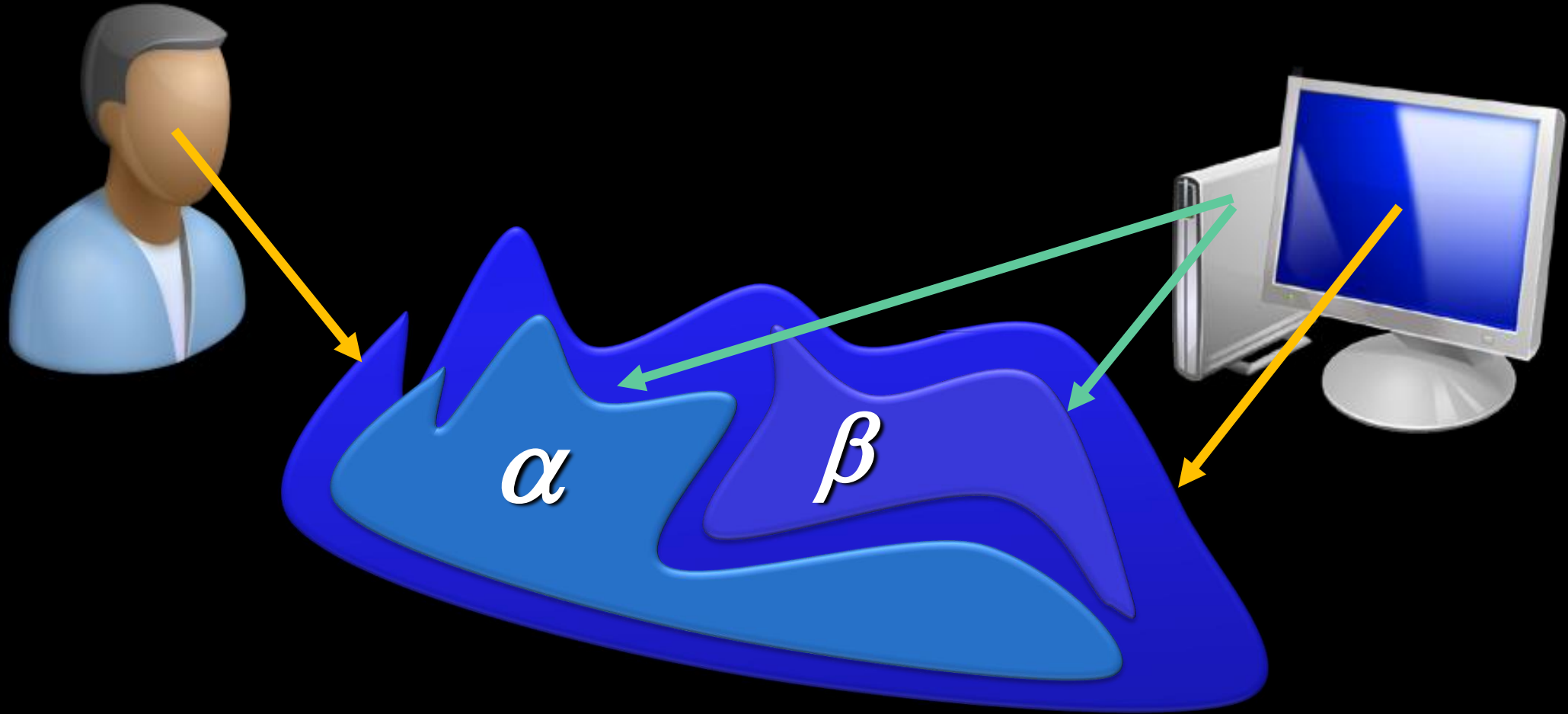
Pillar: Complementarity



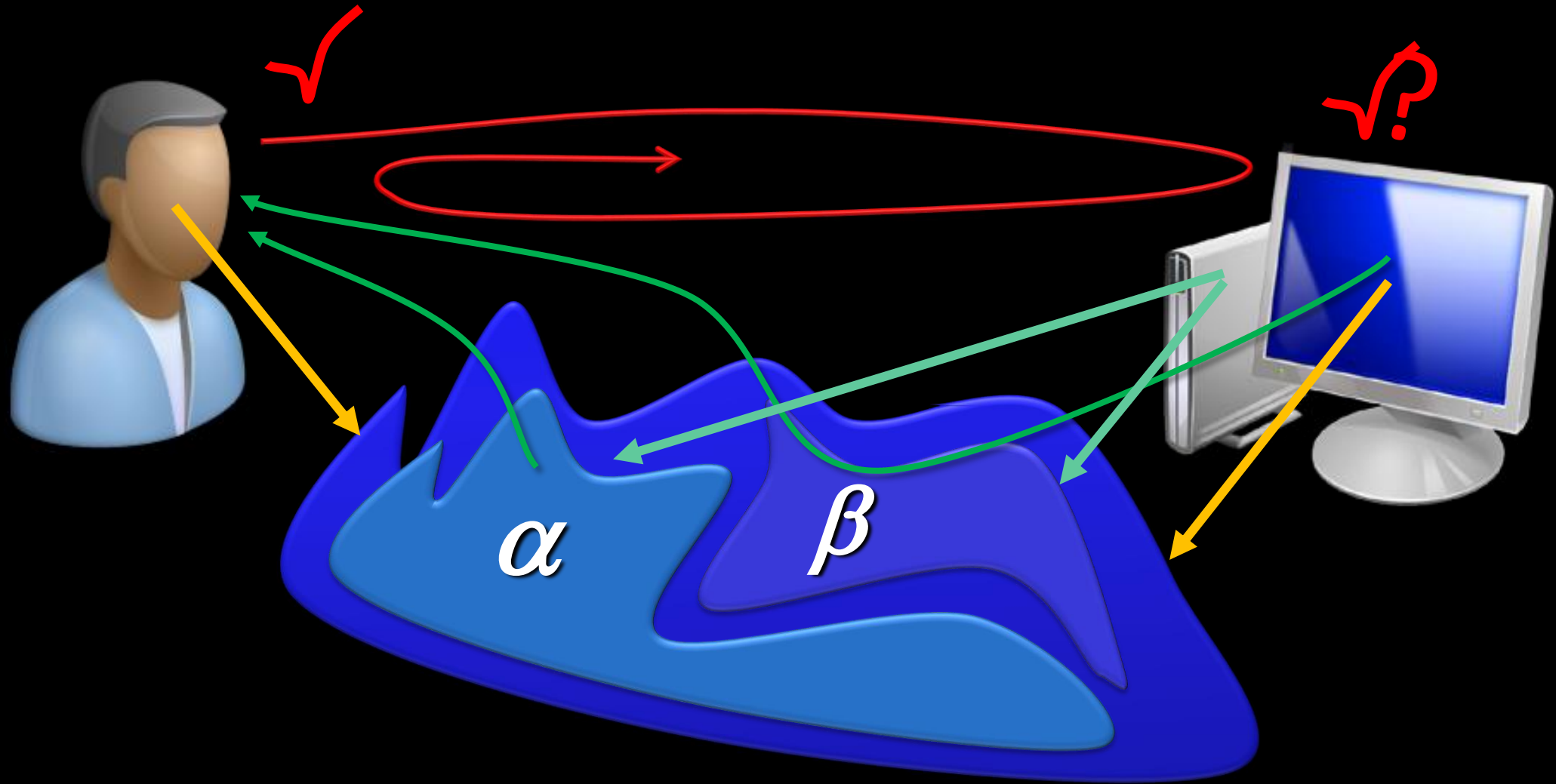
Pillar: Mix of Initiatives



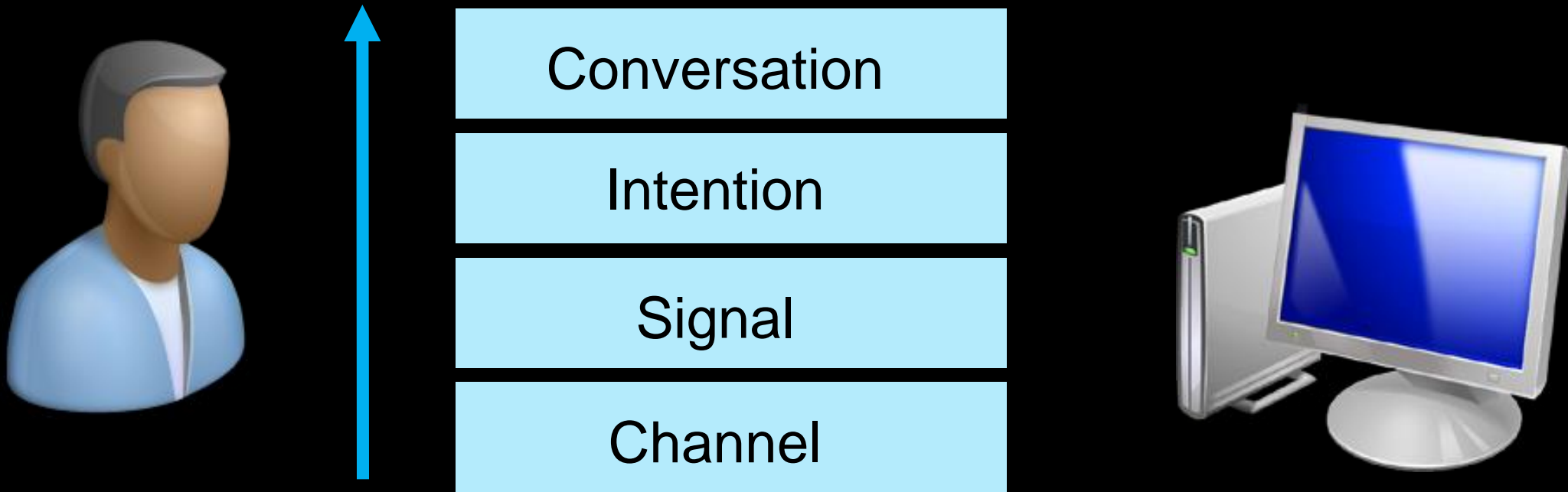
Pillar: Mix of Initiatives



Pillar: Mix of Initiatives



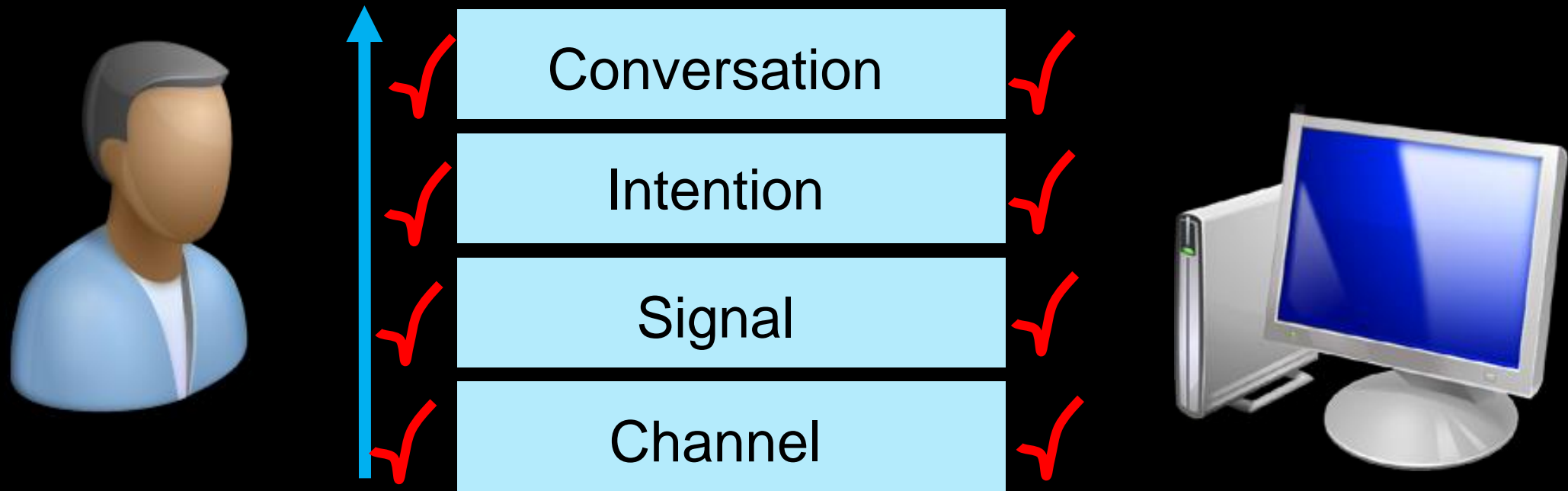
Pillar: Coordination



Continuous process of contributing, signaling, monitoring

Clark, Duncan, Goffman, Goodwin, Kendon, et al.

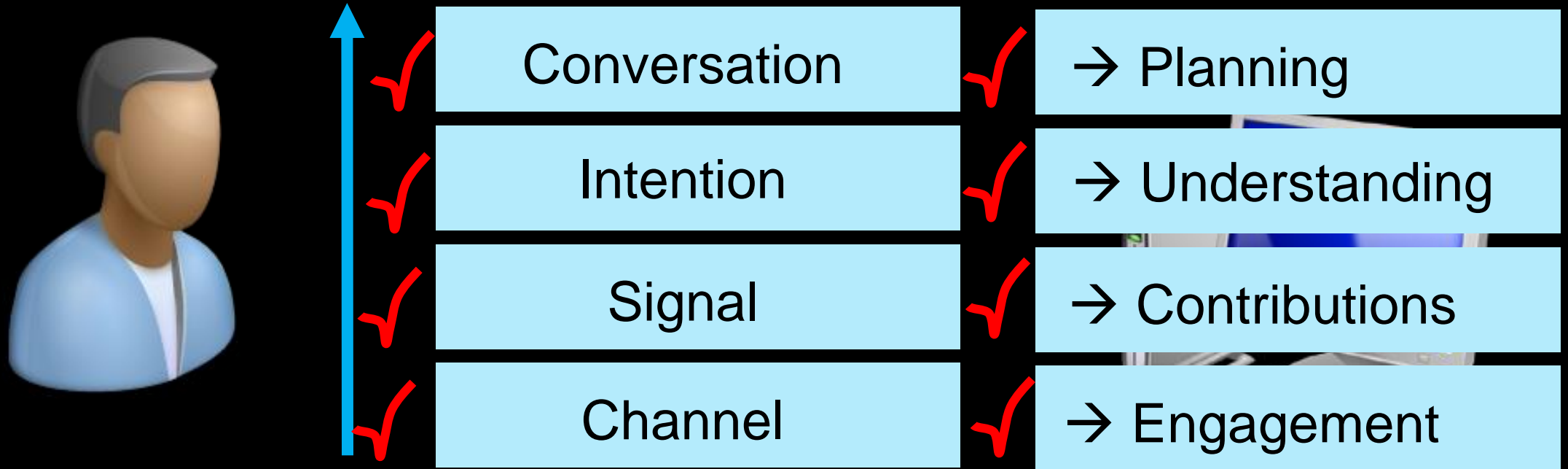
Pillar: Coordination



Continuous process of contributing, signaling, monitoring

Clark, Duncan, Goffman, Goodwin, Kendon, et al.

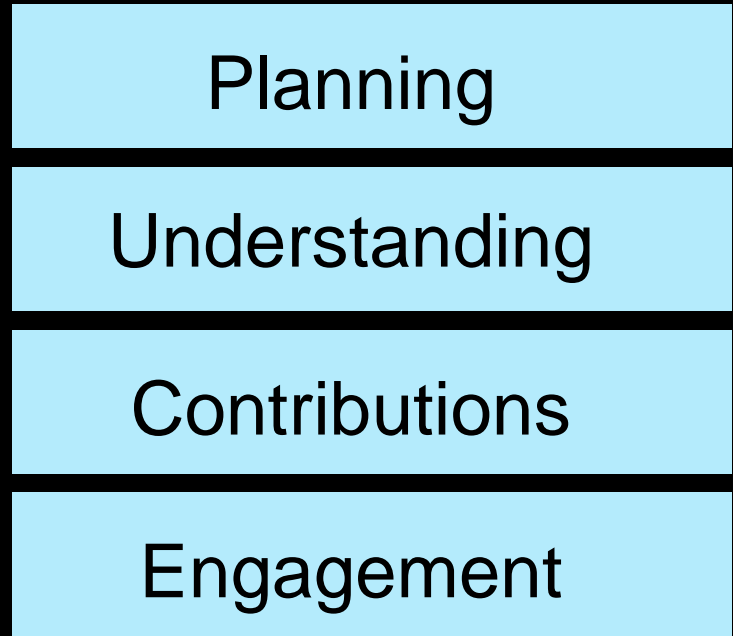
Pillar: Coordination



Continuous process of contributing, signaling, monitoring

Clark, Duncan, Goffman, Goodwin, Kendon, et al.

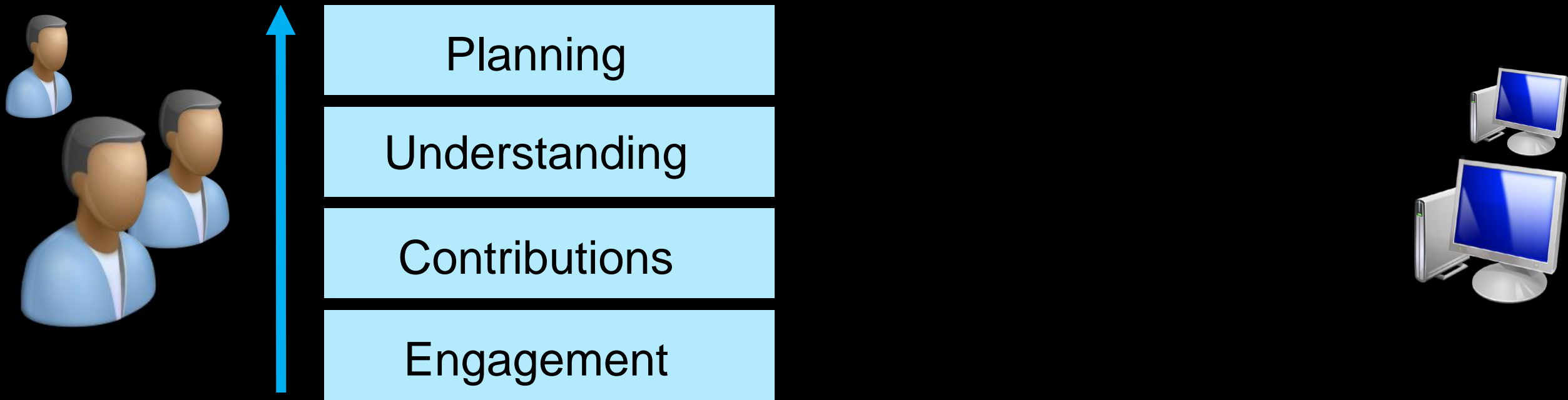
Pillar: Coordination



Continuous process of contributing, signaling, monitoring

Clark, Duncan, Goffman, Goodwin, Kendon, et al.

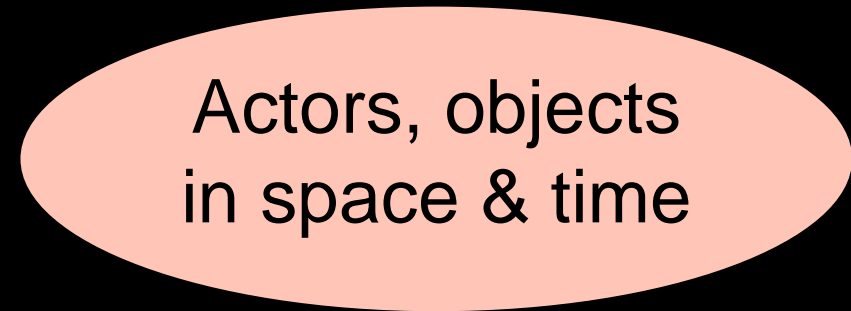
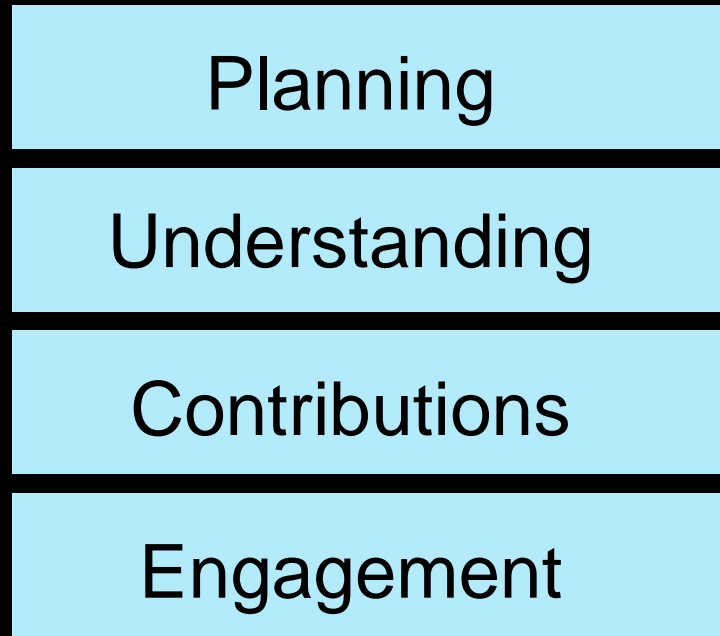
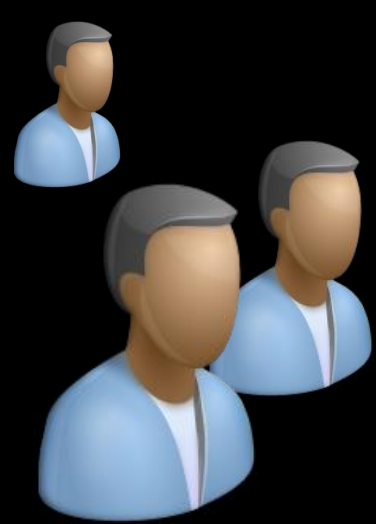
Coordination in Open World



Situated interaction

Bohus, H. et al.

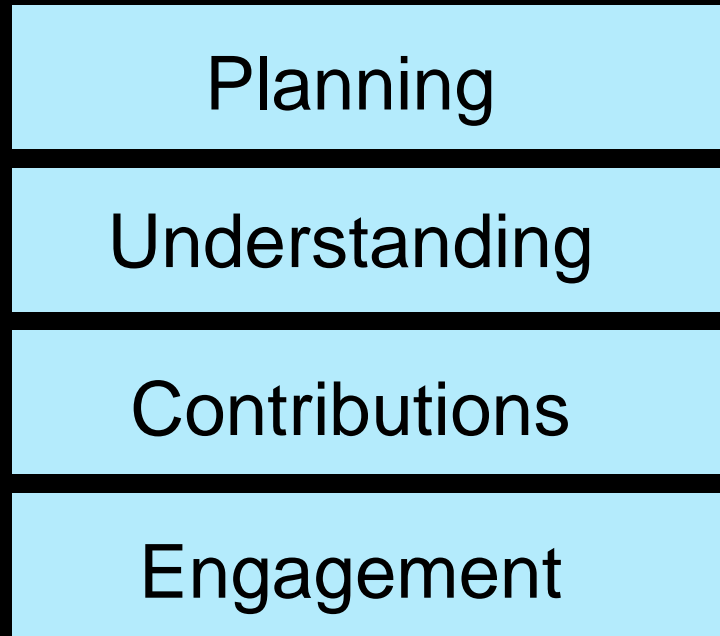
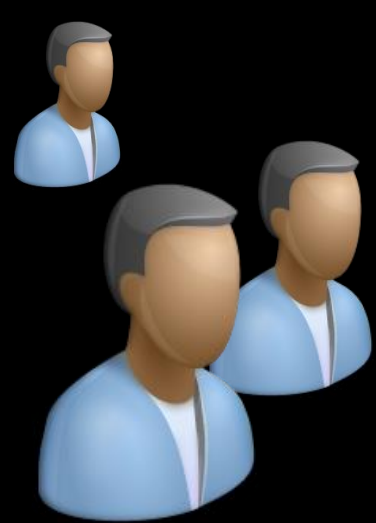
Coordination in Open World



Situated interaction

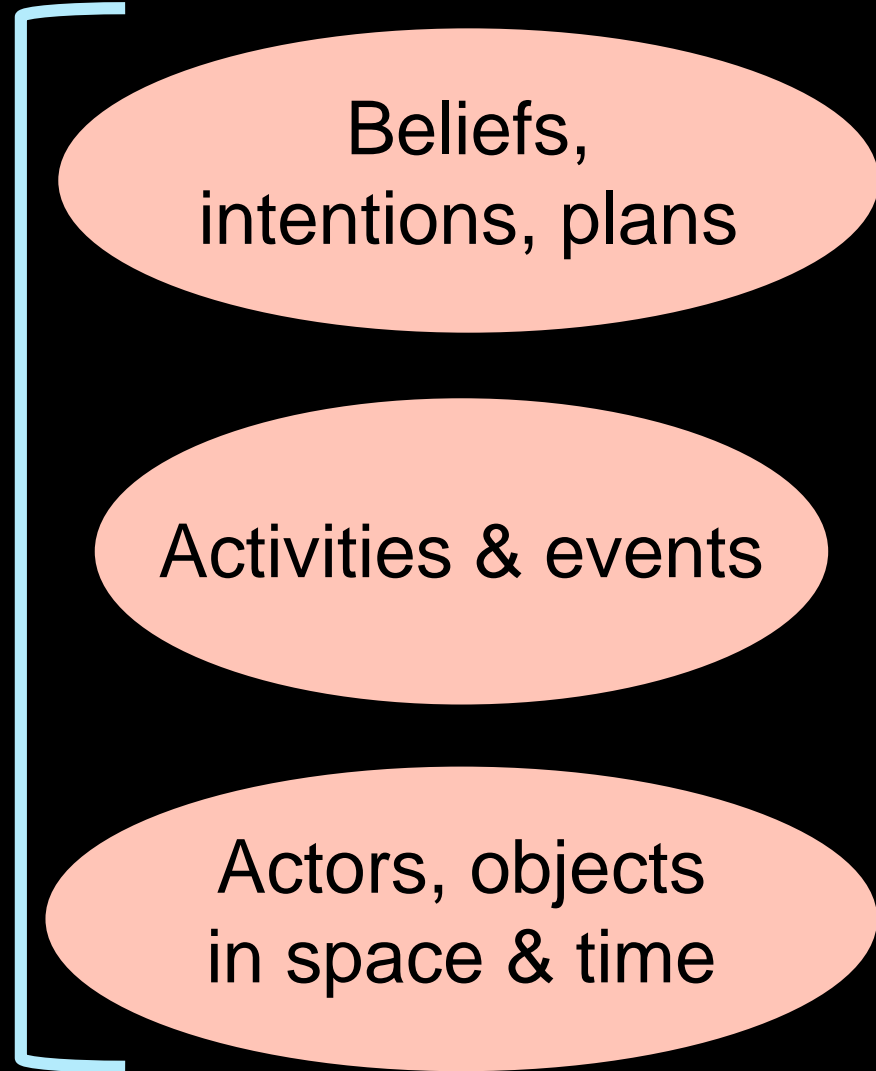
Bohus, H. et al.

Coordination in Open World

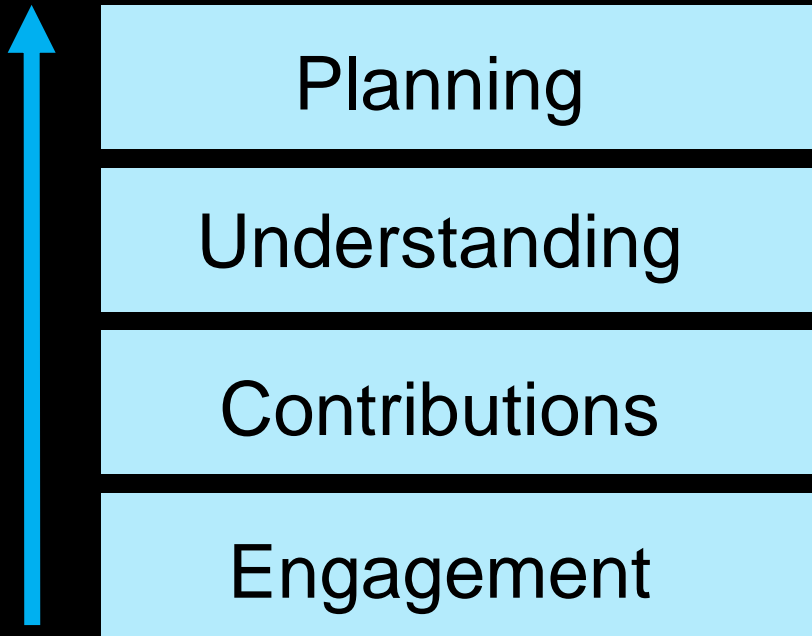
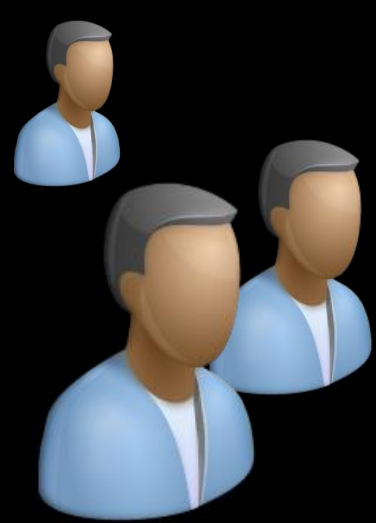


Situated interaction

Bohus, H. et al.

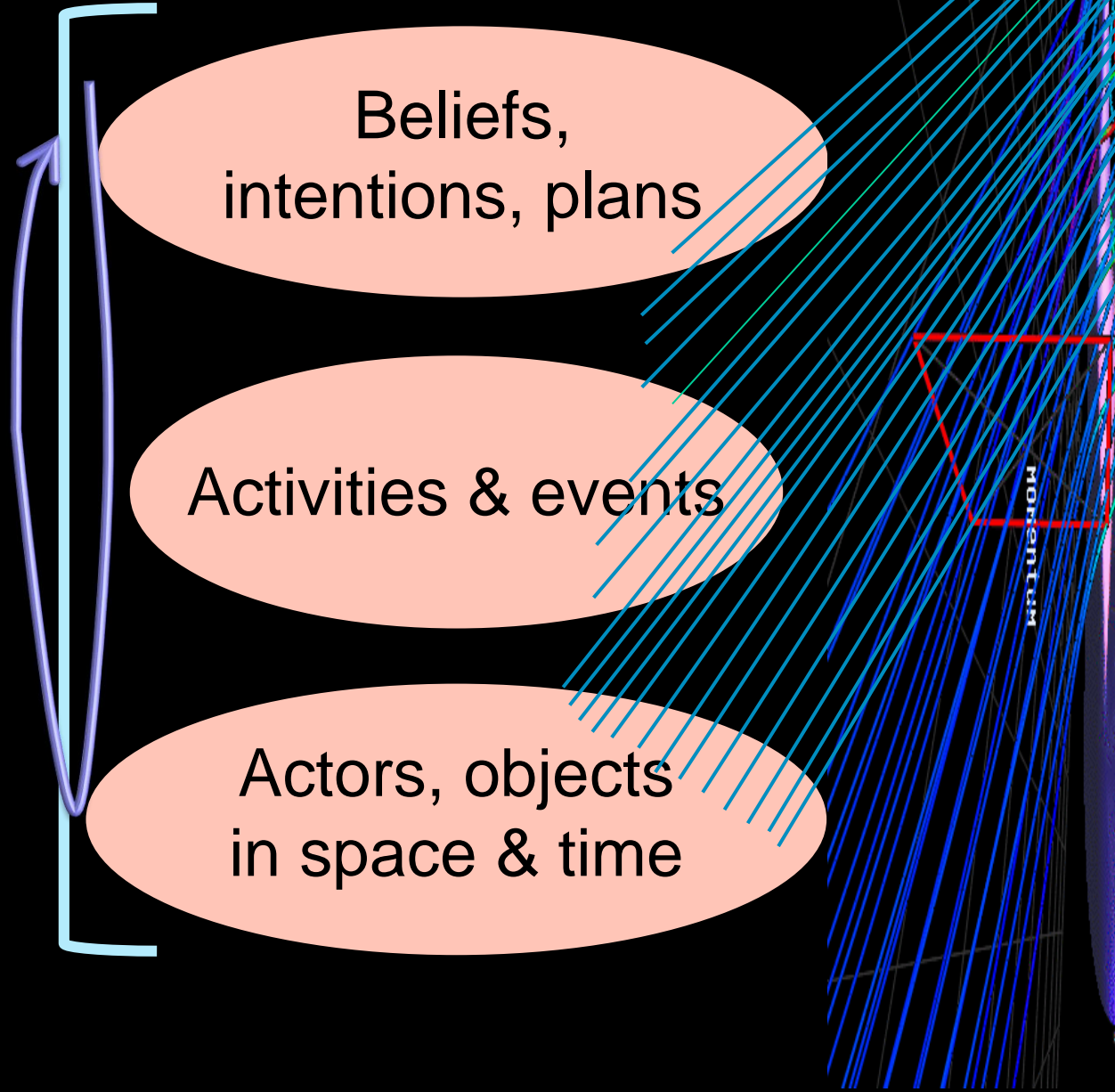


Coordination in Open World



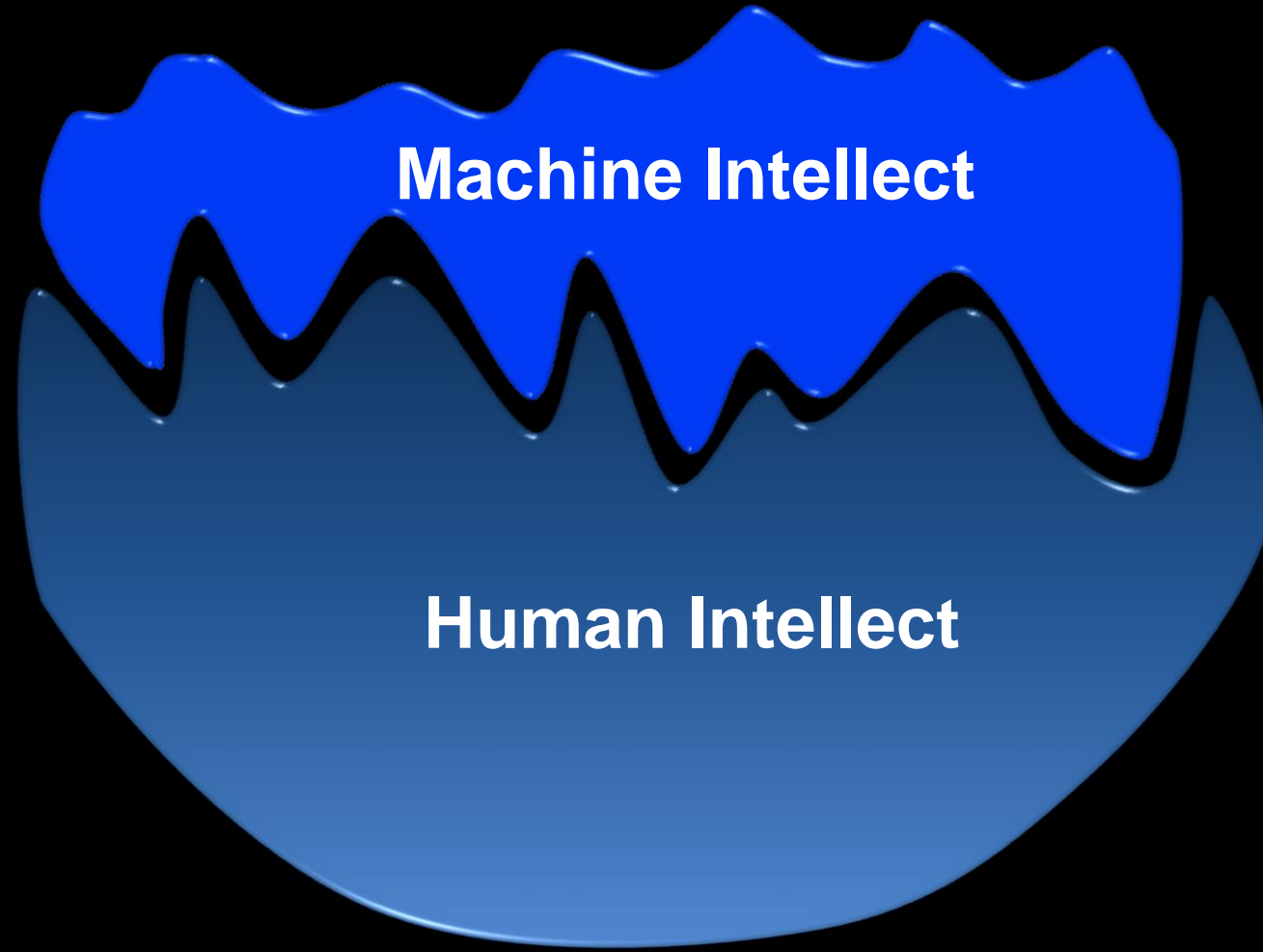
Situated interaction

Bohus, H. et al.



Reflections on several research efforts

Efforts in Complementarity

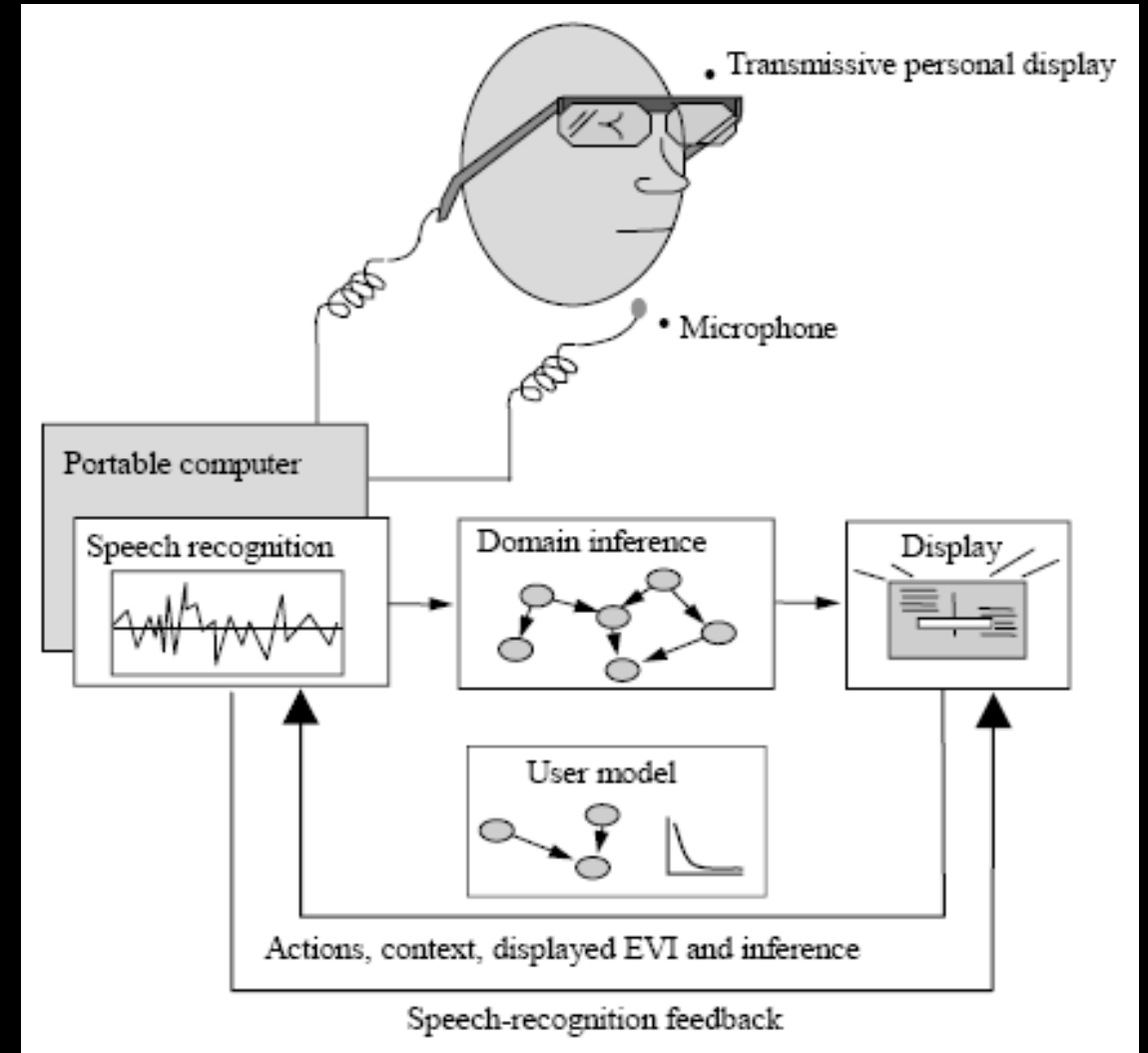


Handsfree Trauma Care System (1991)



H., Shwe, [Handsfree Decision Support: Toward a Non-invasive Human-Computer Interface](#), SCAMC, 1995.

Handsfree Trauma Care System



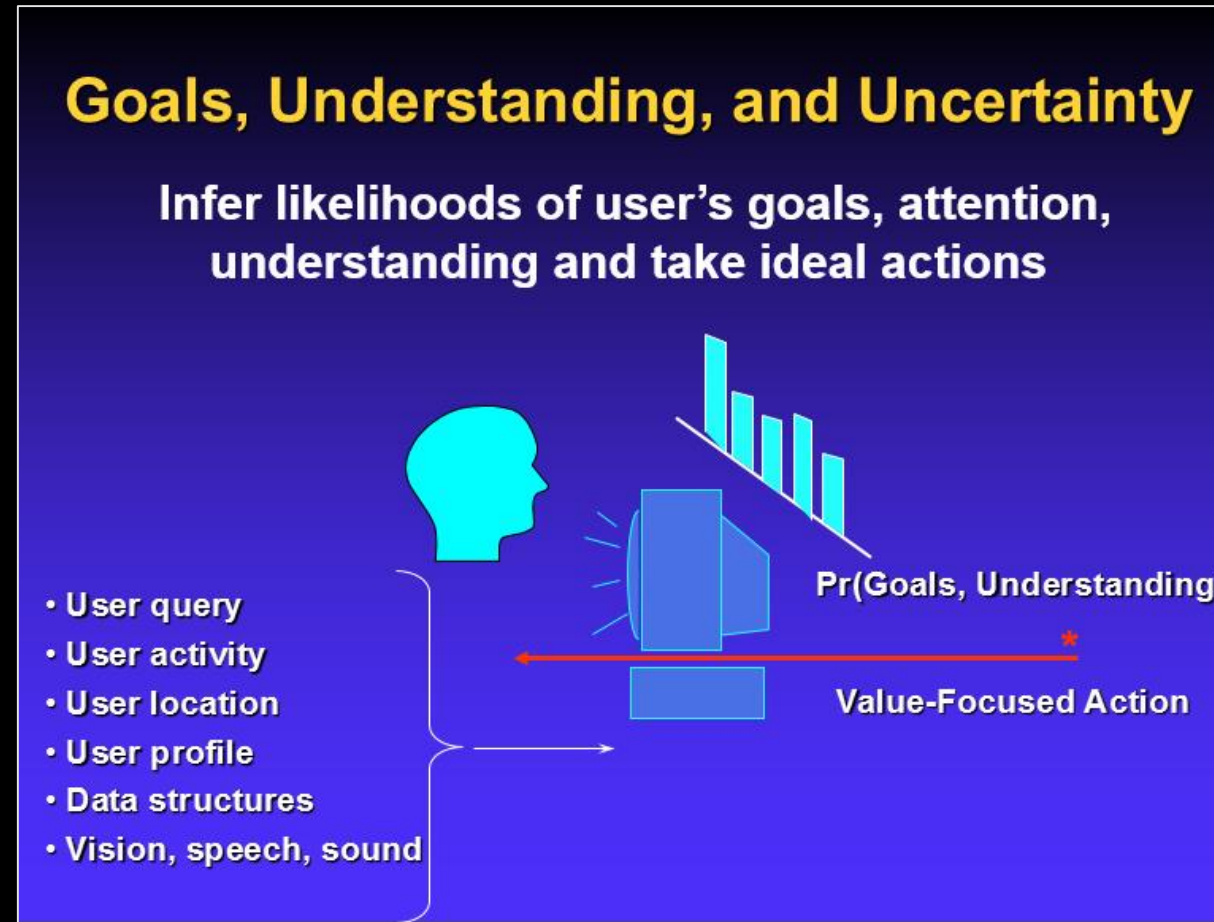
Handsfree Trauma Care System

Video



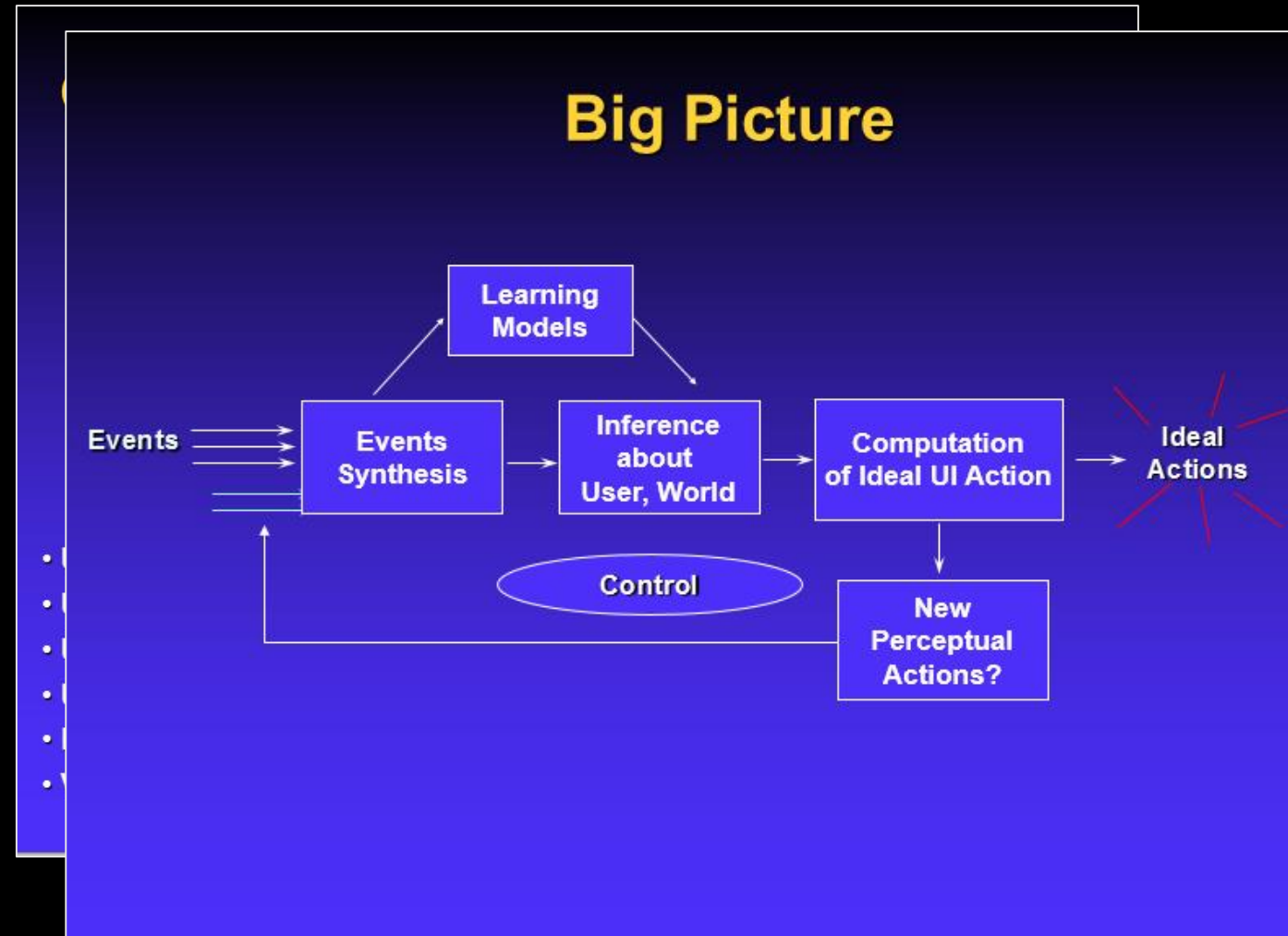
H., Shwe, Handsfree Decision Support: Toward a Non-invasive Human-Computer Interface, SCAMC, 1995.

Lumiere Project (1993)



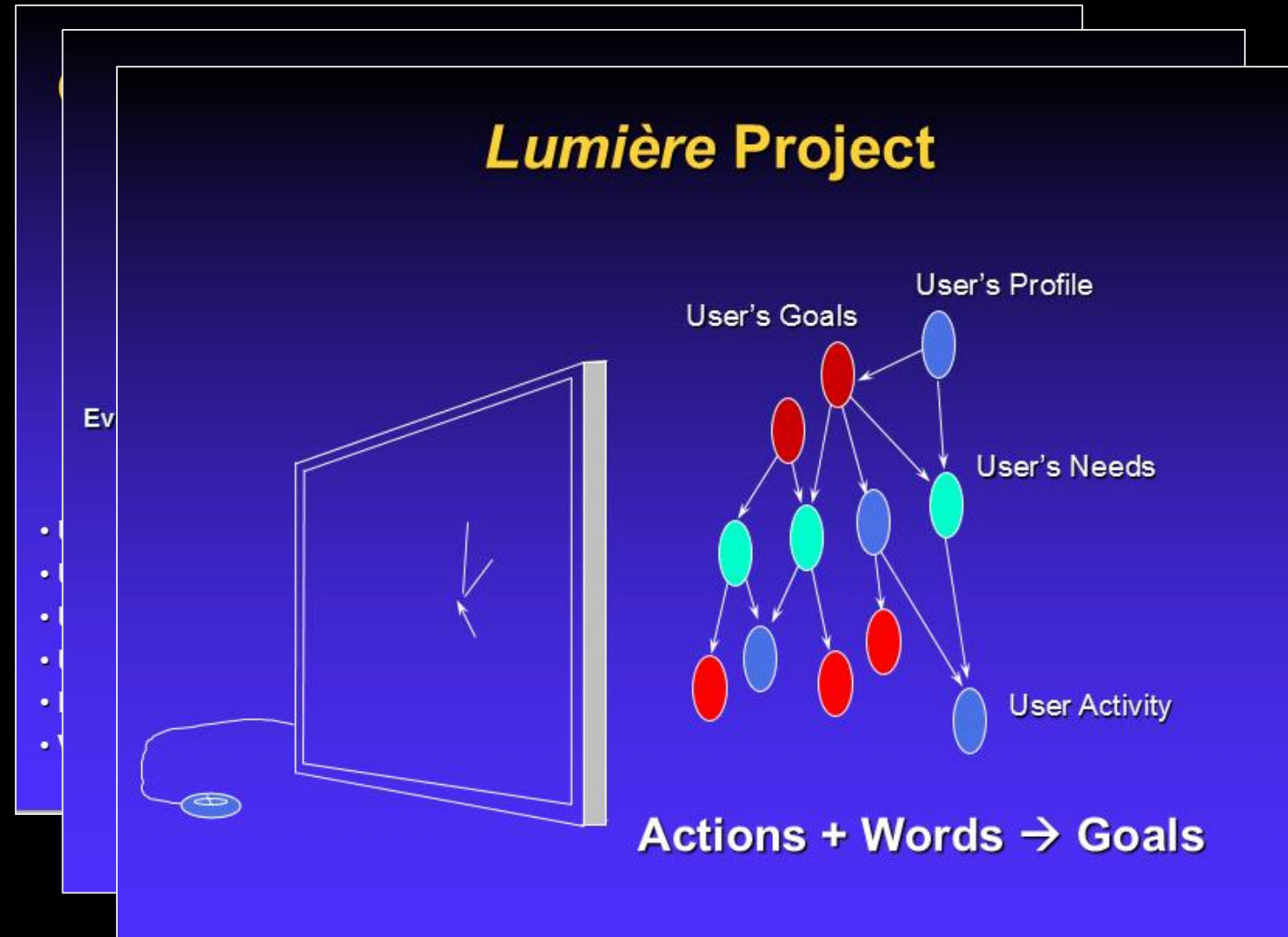
Slides from early days at Microsoft Research...

Lumiere Project (1993)



Slides from early days at Microsoft Research...

Lumière Project (1993)



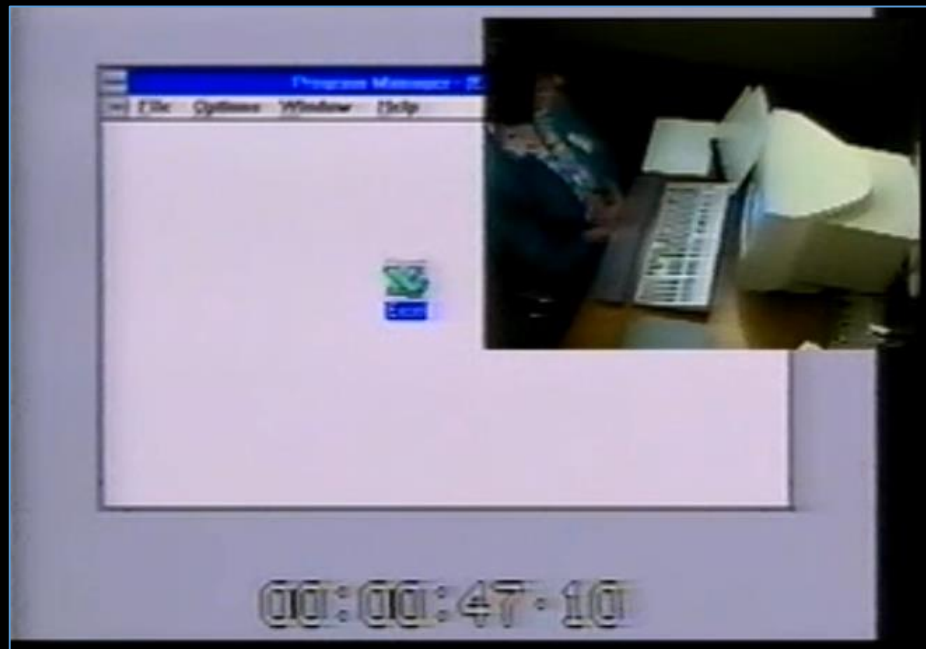
Slides from early days at Microsoft Research...

Learning about Assisting Computer Users

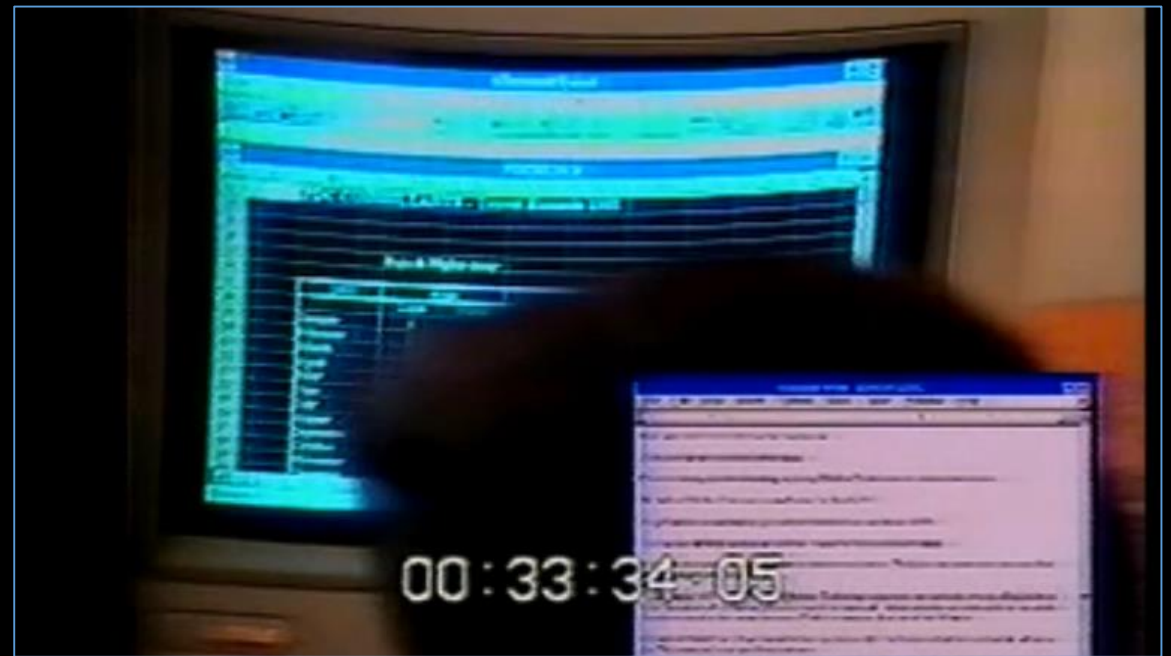


Wizard of Oz Studies

Expert peeks through a keyhole, plays assistant role



User with challenge task



Expert as Wizard of Oz "Agent"

Video

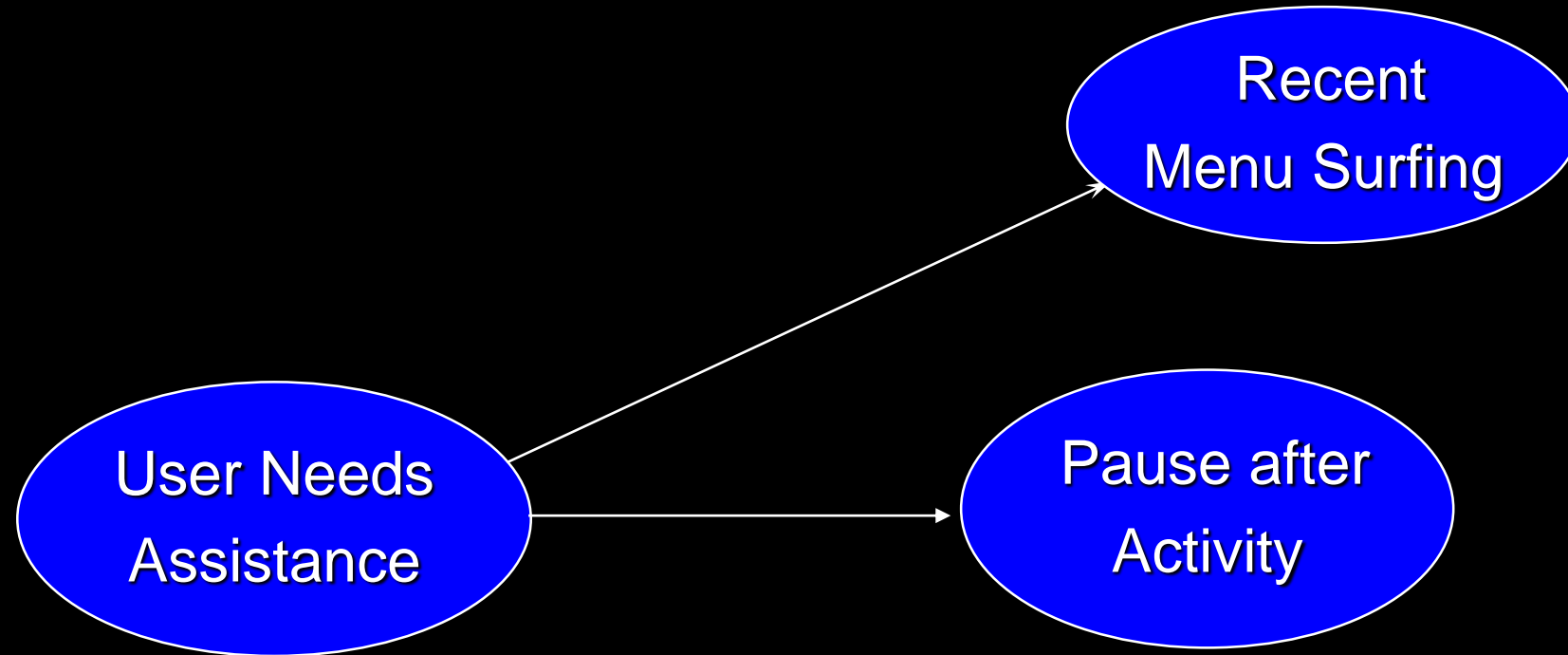
Evidential distinctions identified

- Search: e.g., exploring of multiple menus
- Introspection: e.g., sudden pause, slowing of command stream
- Focus of attention: e.g., selected objects
- Undesired effects: e.g., command/undo, dialogue opened and cancelled
- Inefficient command sequences
- Syntactic / semantic content of file
- Goal-specific sequences of actions

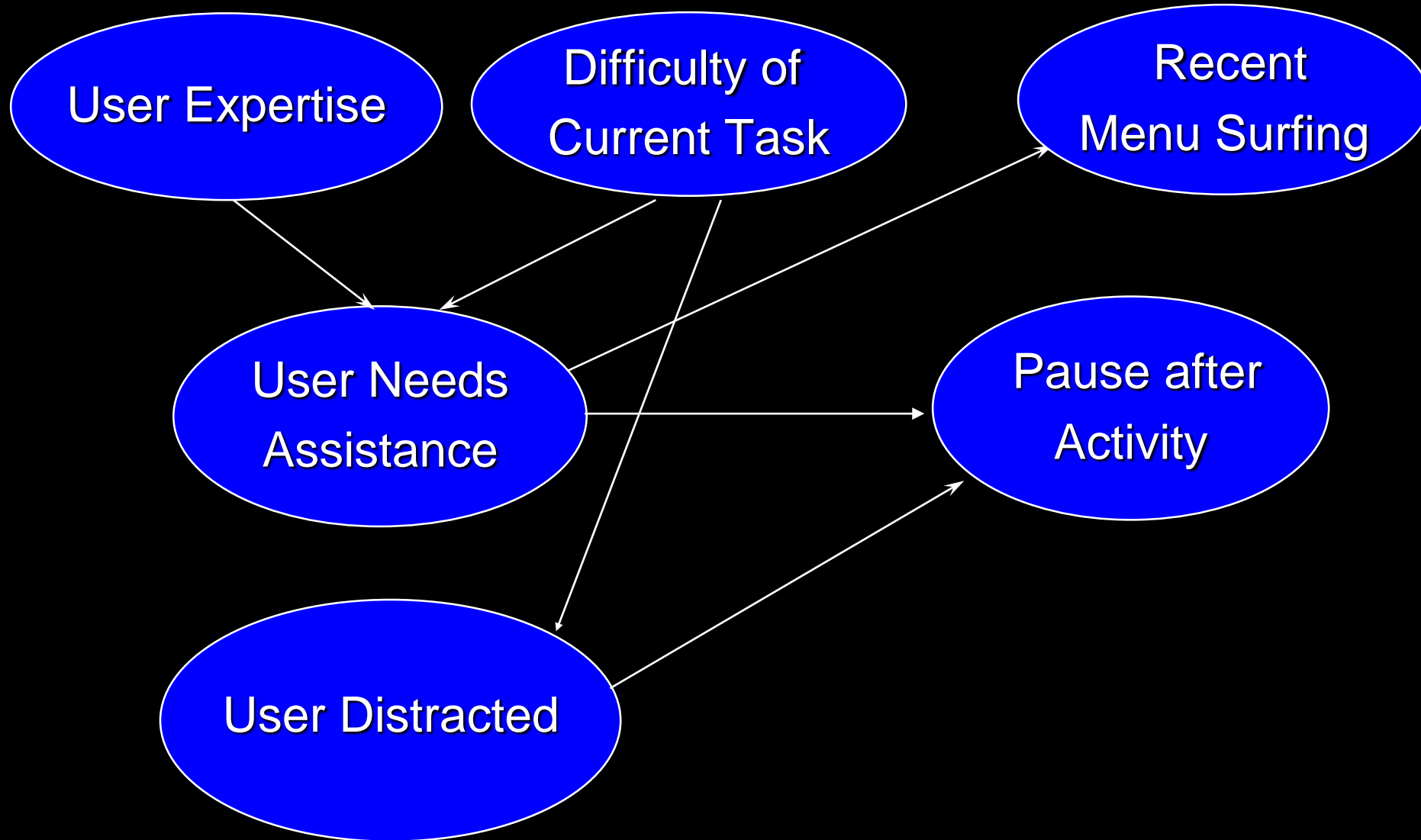
Building Bayesian user model



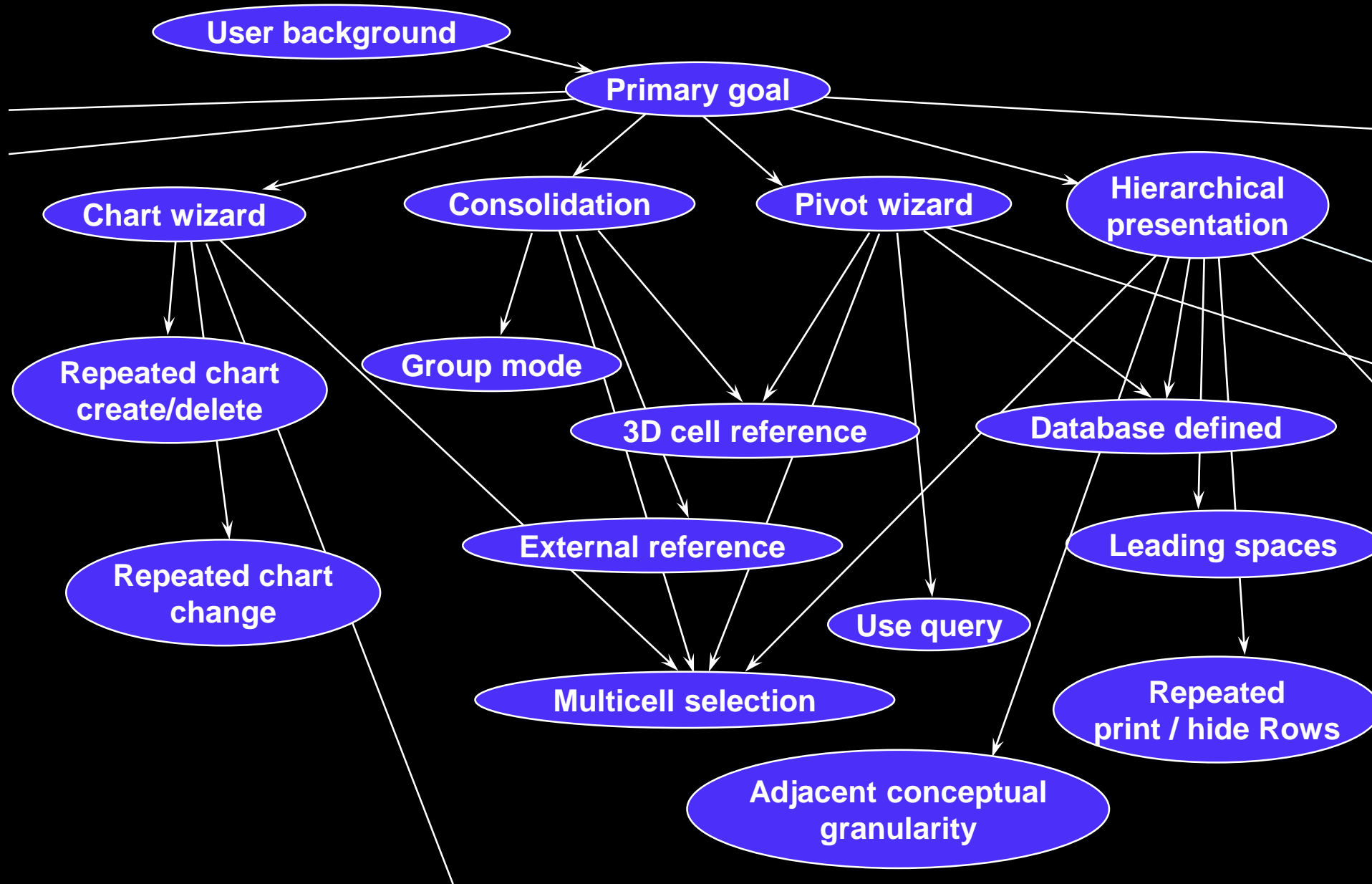
Building Bayesian user model



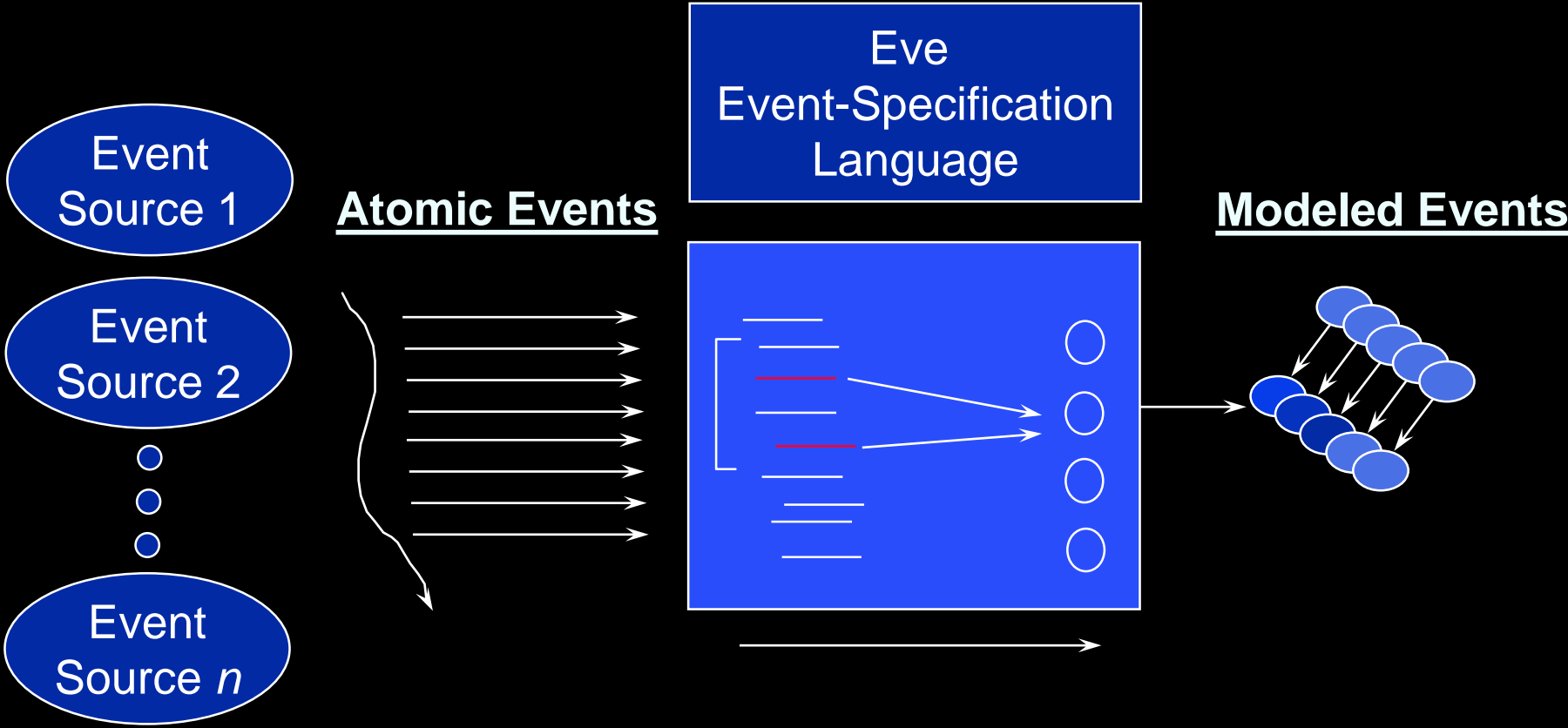
Building Bayesian user model



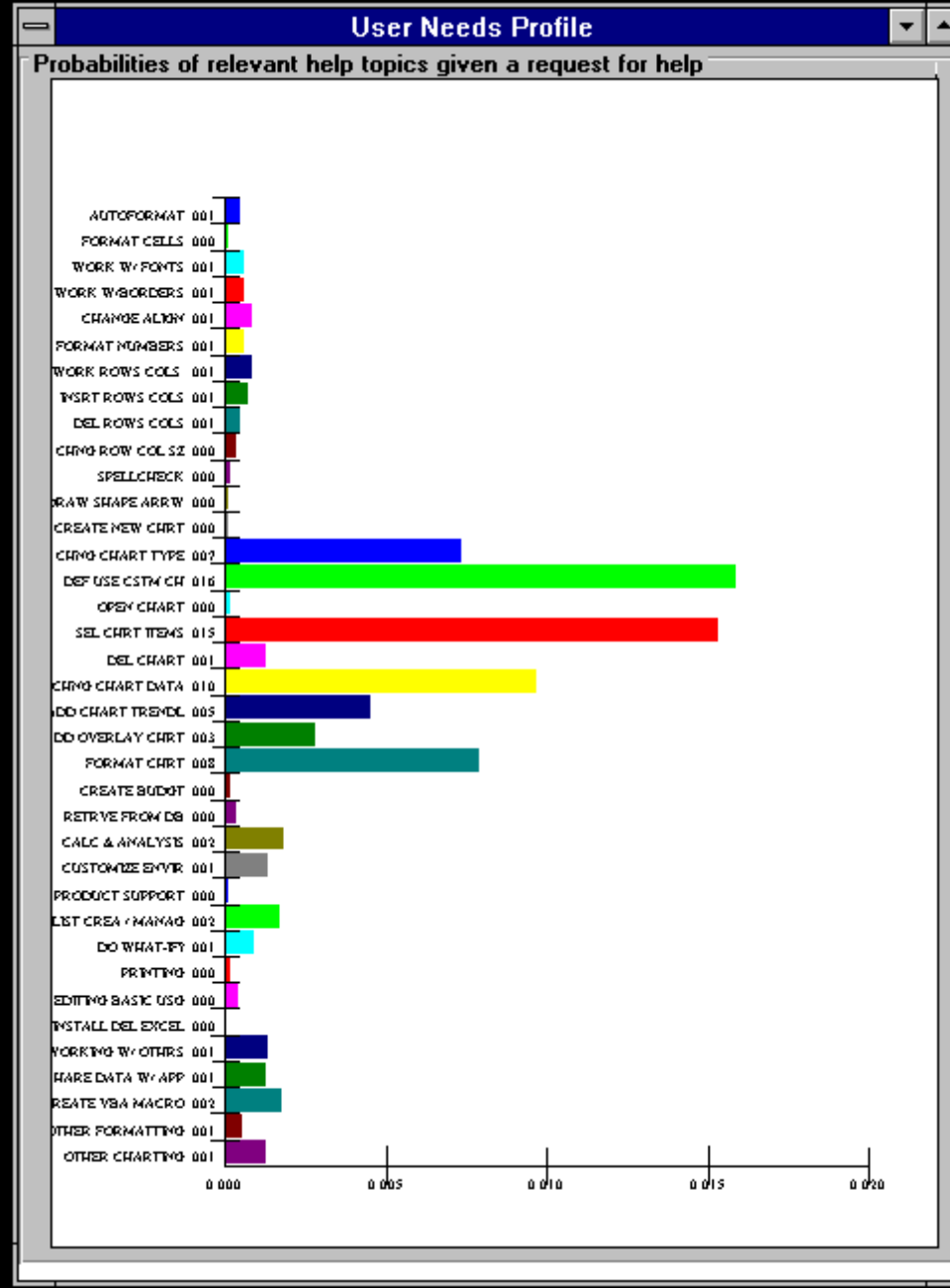
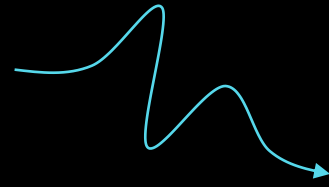
Lumière Bayesian Net



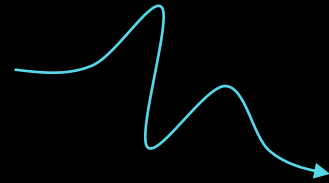
Event Streams and Architectures



Sensed actions



Sensed actions

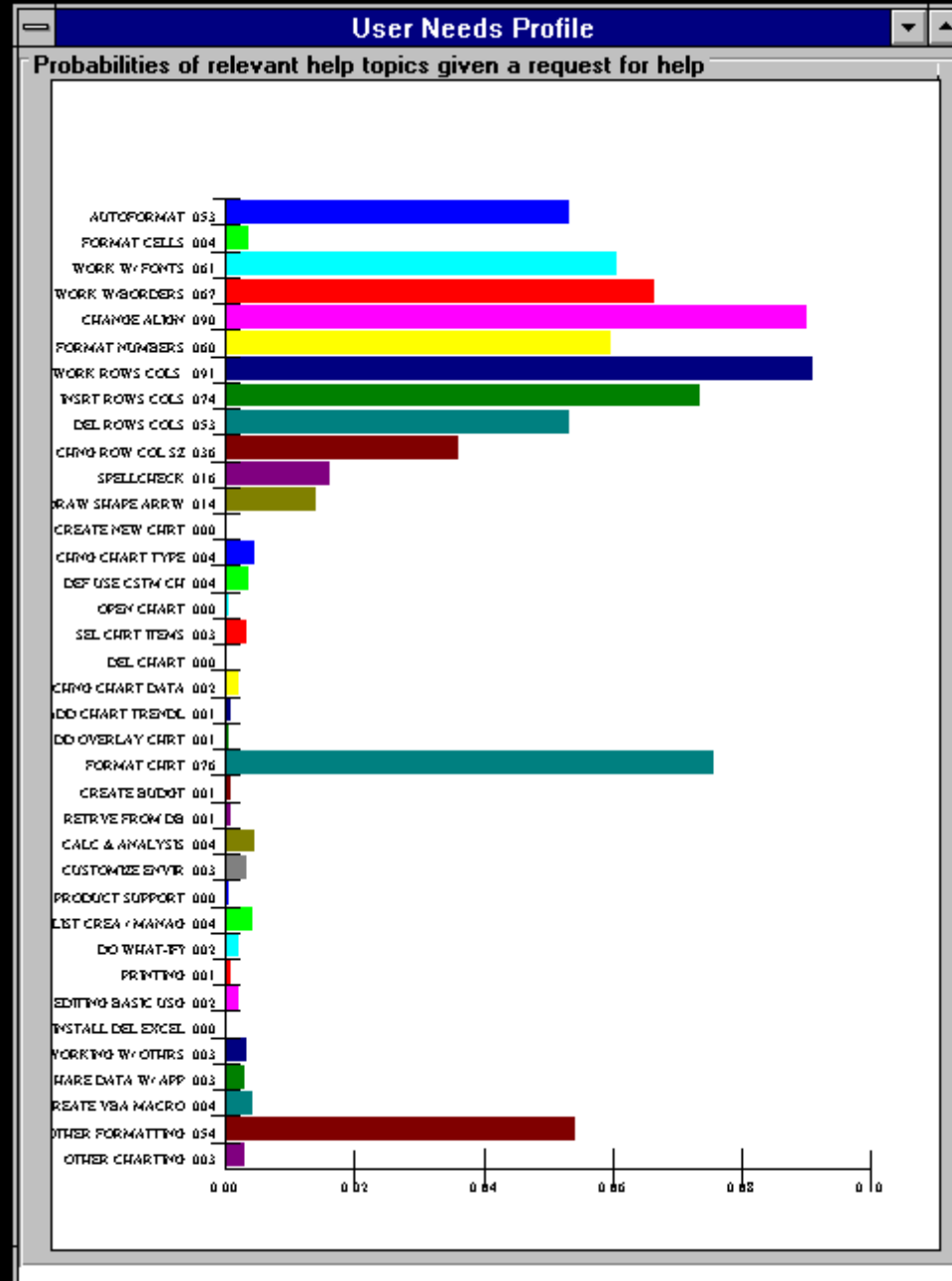


Help Wizard's Best Guesses for Help:

- Working with rows and columns
- Changing alignment
- Format a chart
- Insert new rows and columns
- Working with borders

Help Search

Freely describe your problem:



Sensed actions

Help Wizard's Best Guesses for Help:

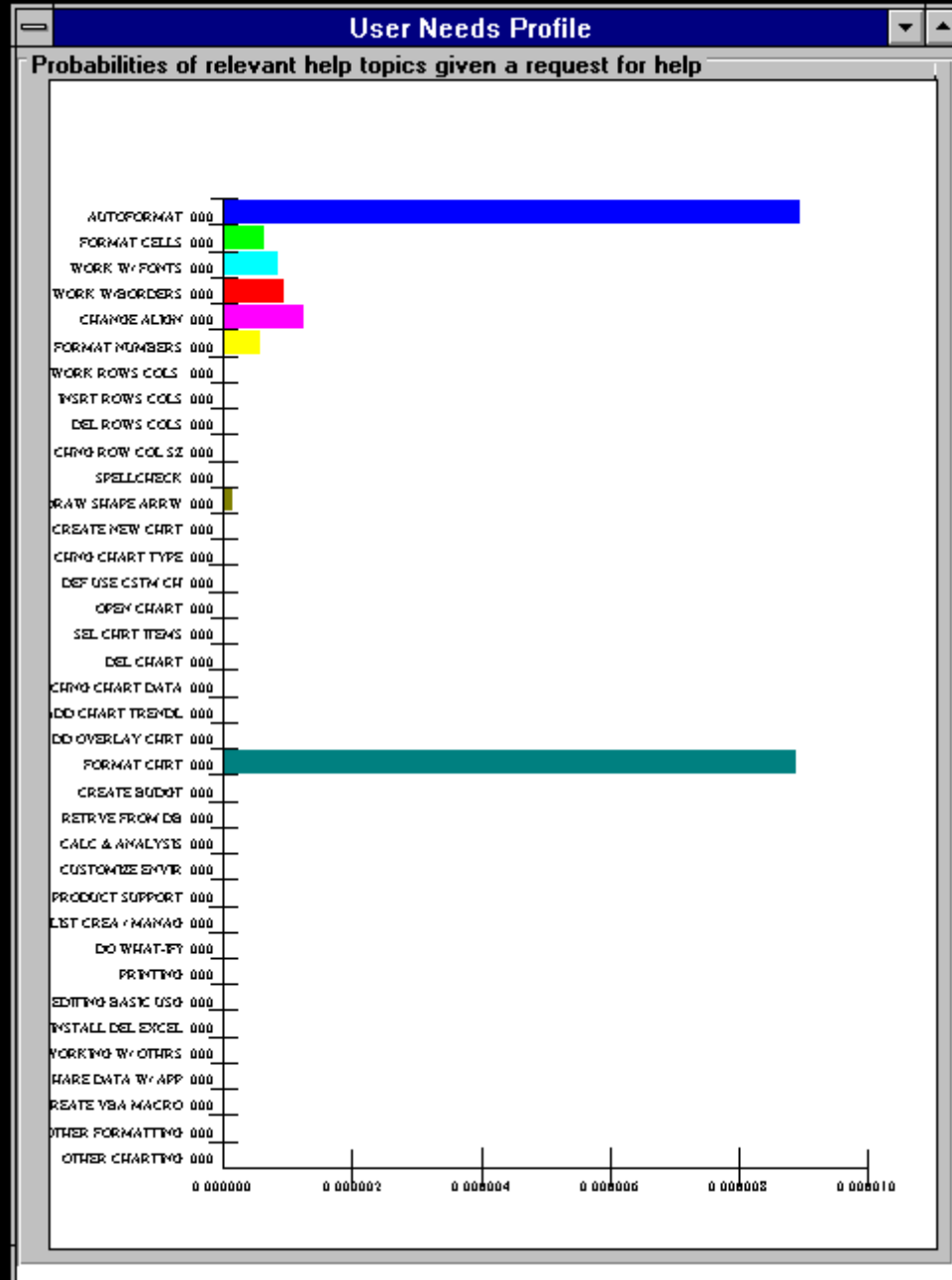
- Autoformatting my document
- Format a chart
- Changing alignment
- Working with borders
- Working with fonts

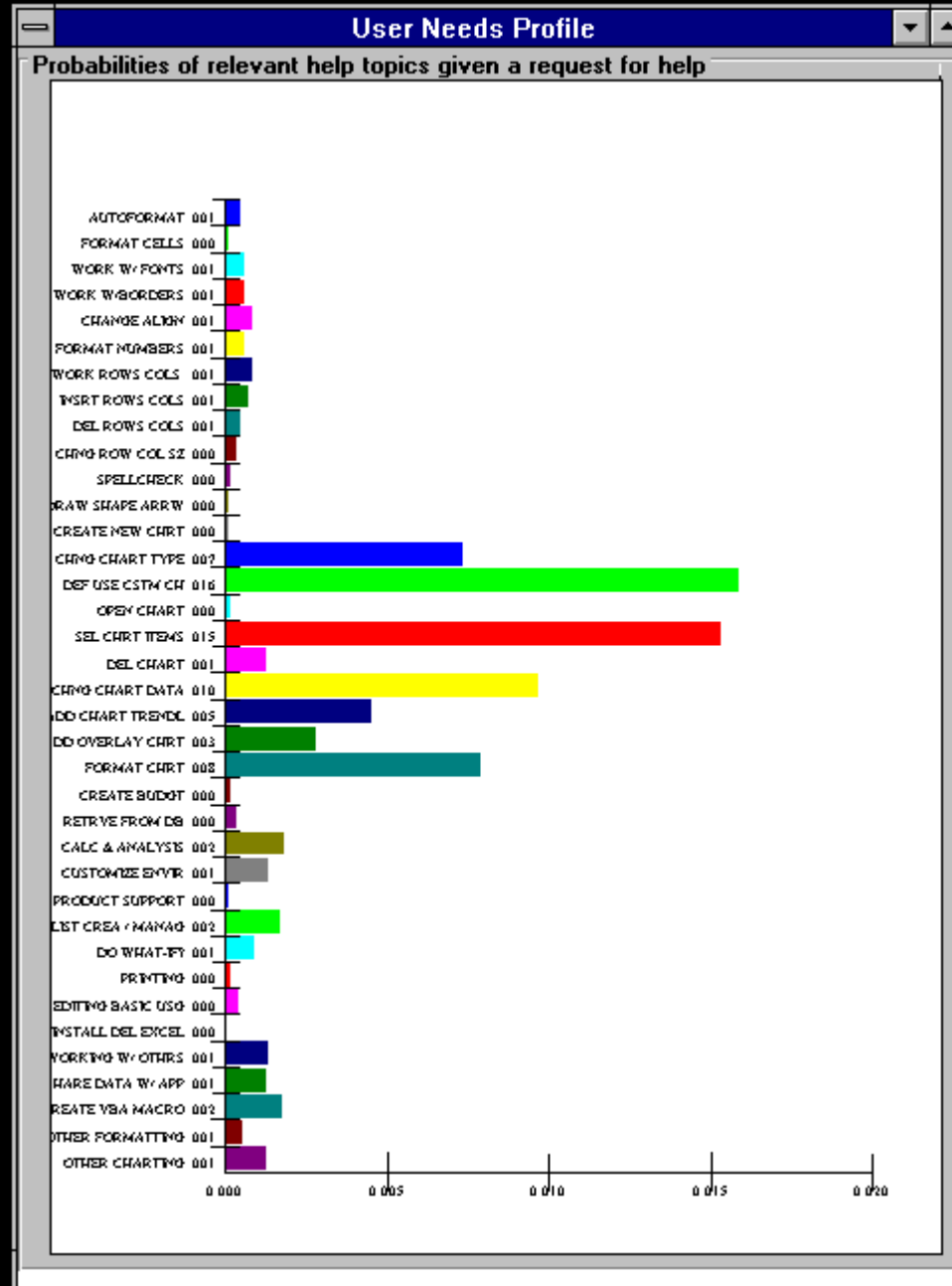
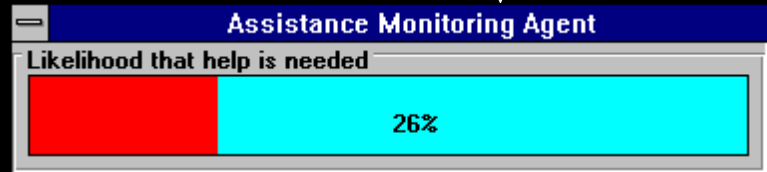
Help Search

Freely describe your problem:

how do i make this look prettier?

User's query





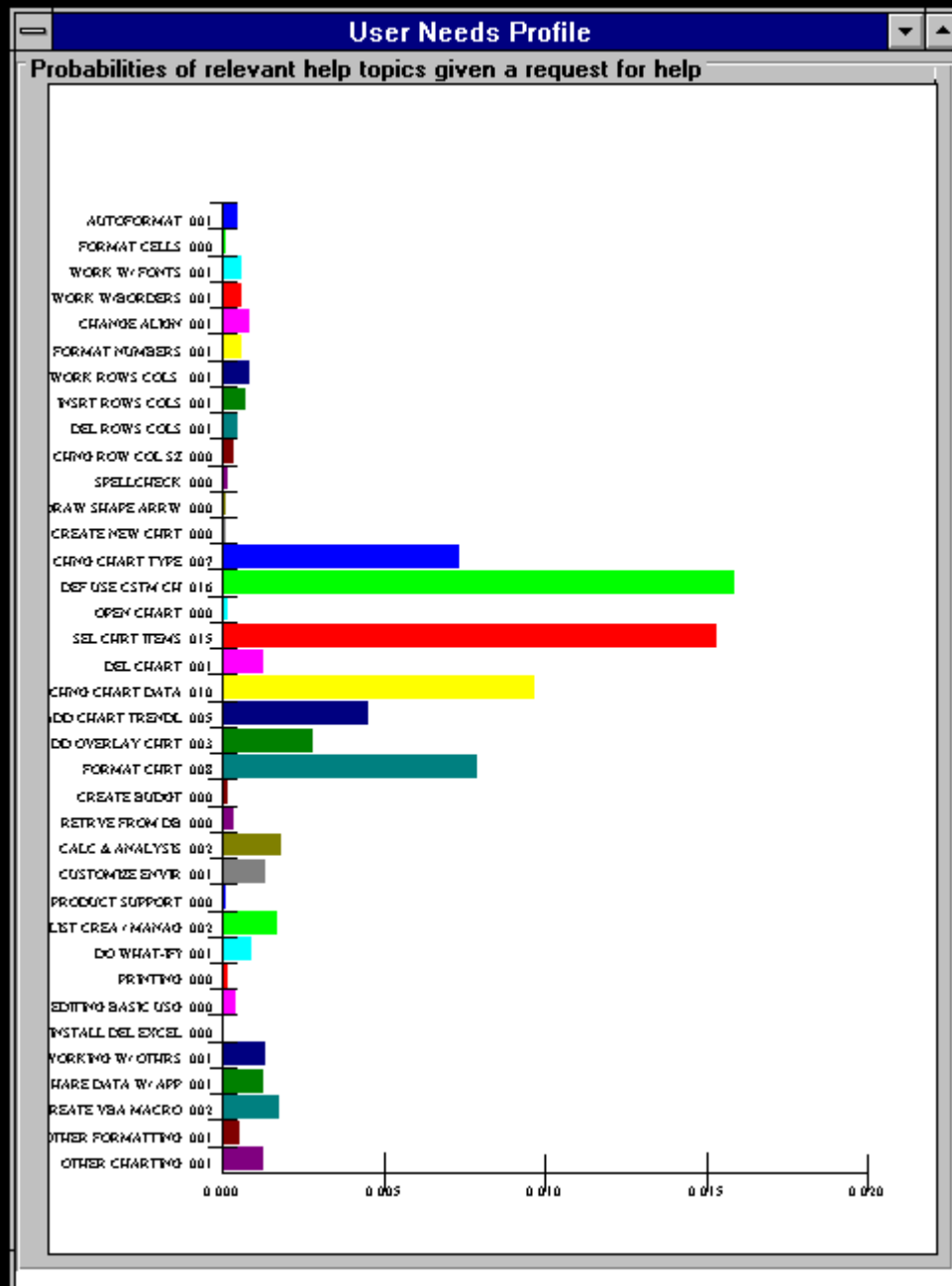
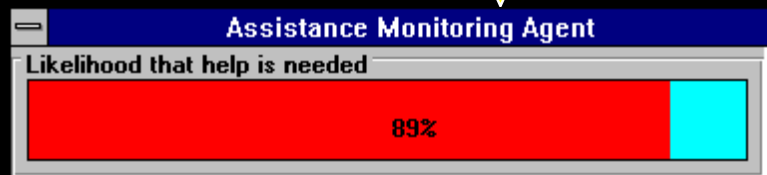
Prob. user desires assistance

May I Offer You Help...

Format cells and their contents
 Checking for spelling errors
 Performing calculations

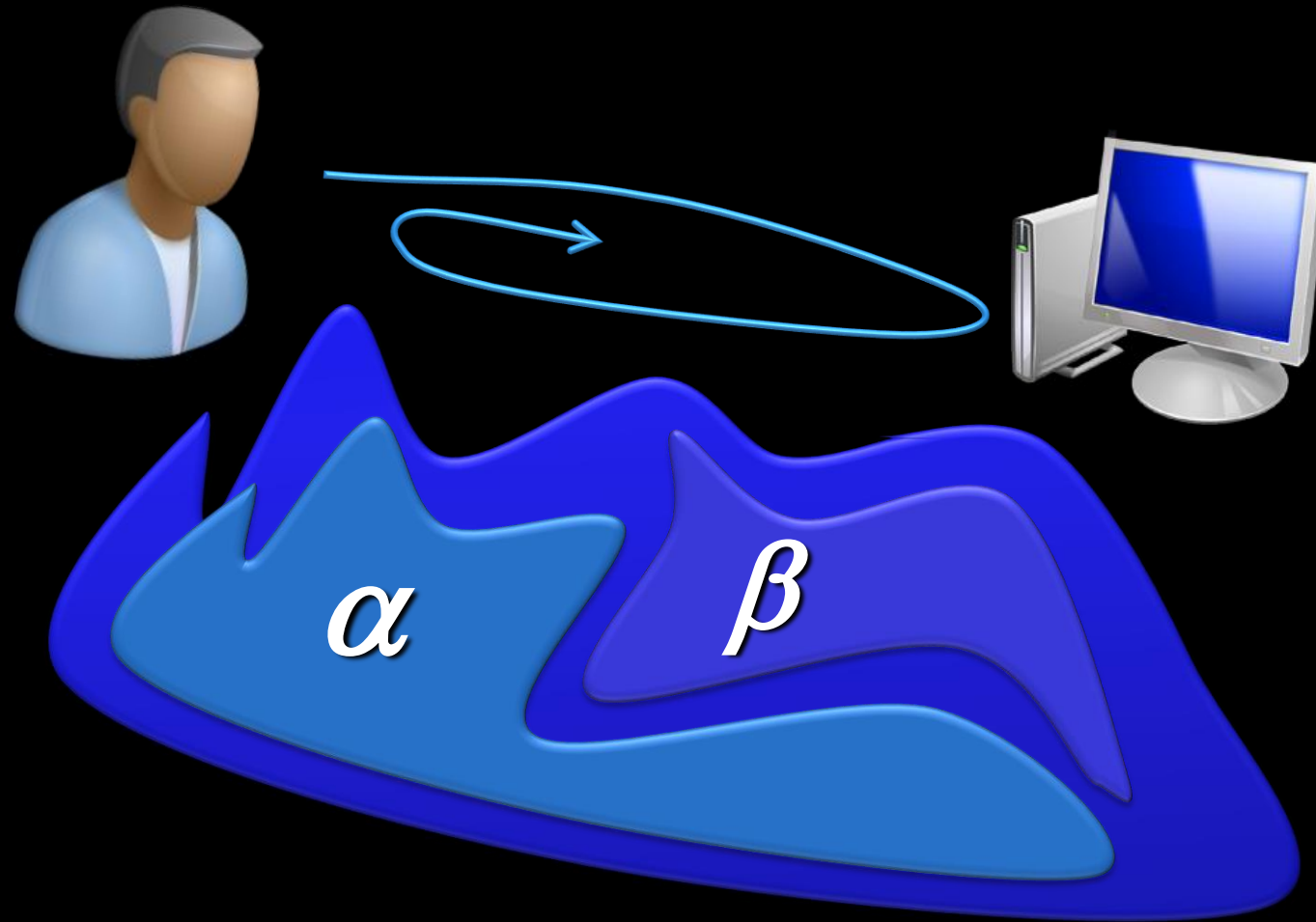
More.....Bother Me.....Less

Help
 Expand
 Cancel



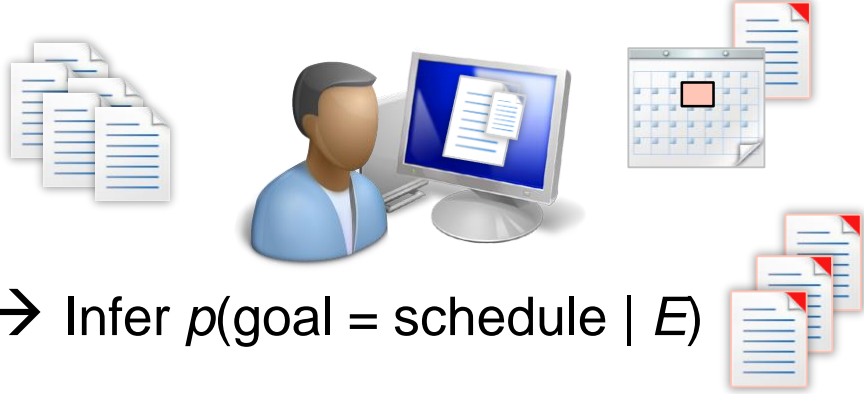
Prob. user desires assistance

Efforts with Mix of Initiatives



Lookout (1998)

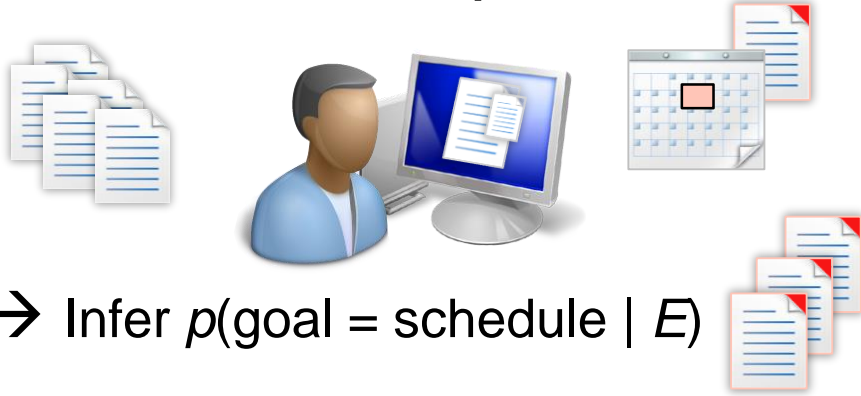
In-stream supervision



→ Infer $p(\text{goal} = \text{schedule} \mid E)$

Lookout (1998)

In-stream supervision

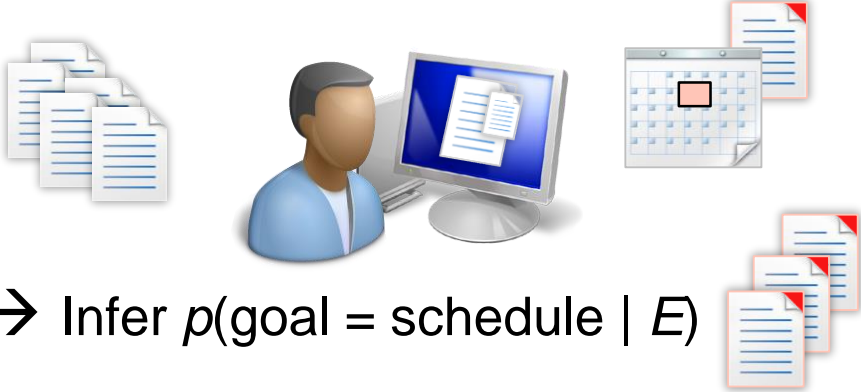


→ Infer $p(\text{goal} = \text{schedule} \mid E)$

- Do nothing?
- Engage user? (*and when?*)
- Just do it?

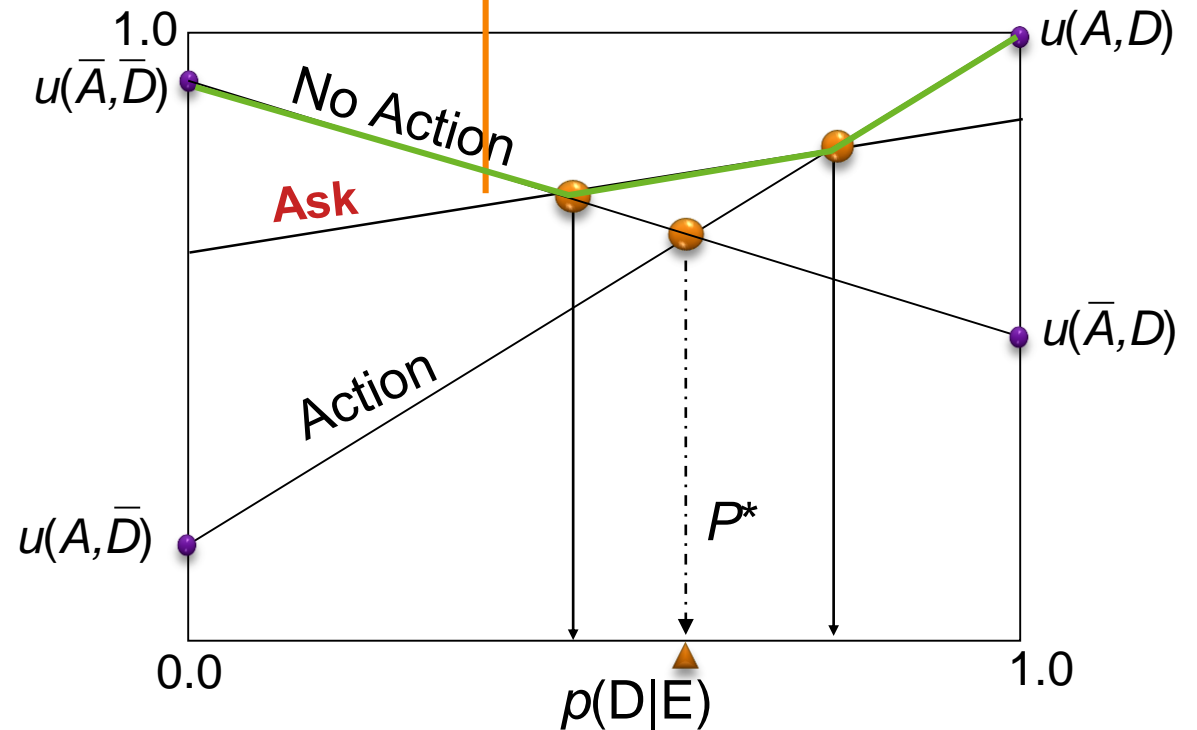
Lookout (1998)

In-stream supervision



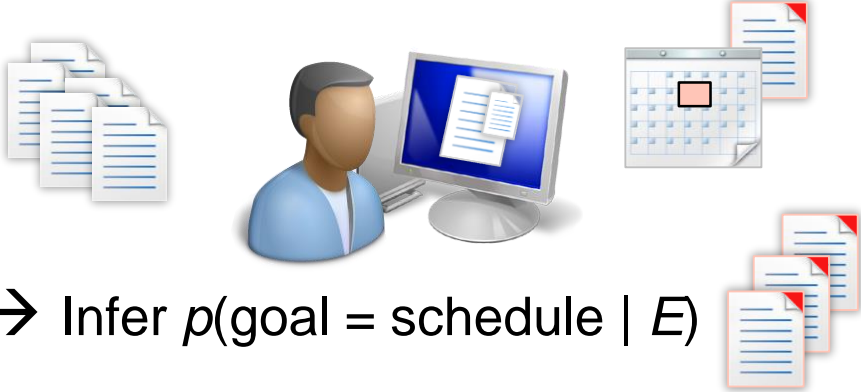
- Do nothing?
- Engage user? (*and when?*)
- Just do it?

Predictive Model

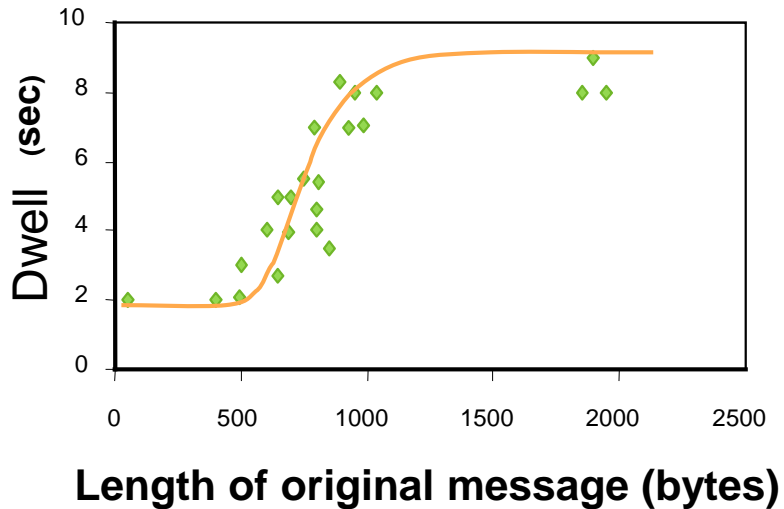


Lookout (1998)

In-stream supervision

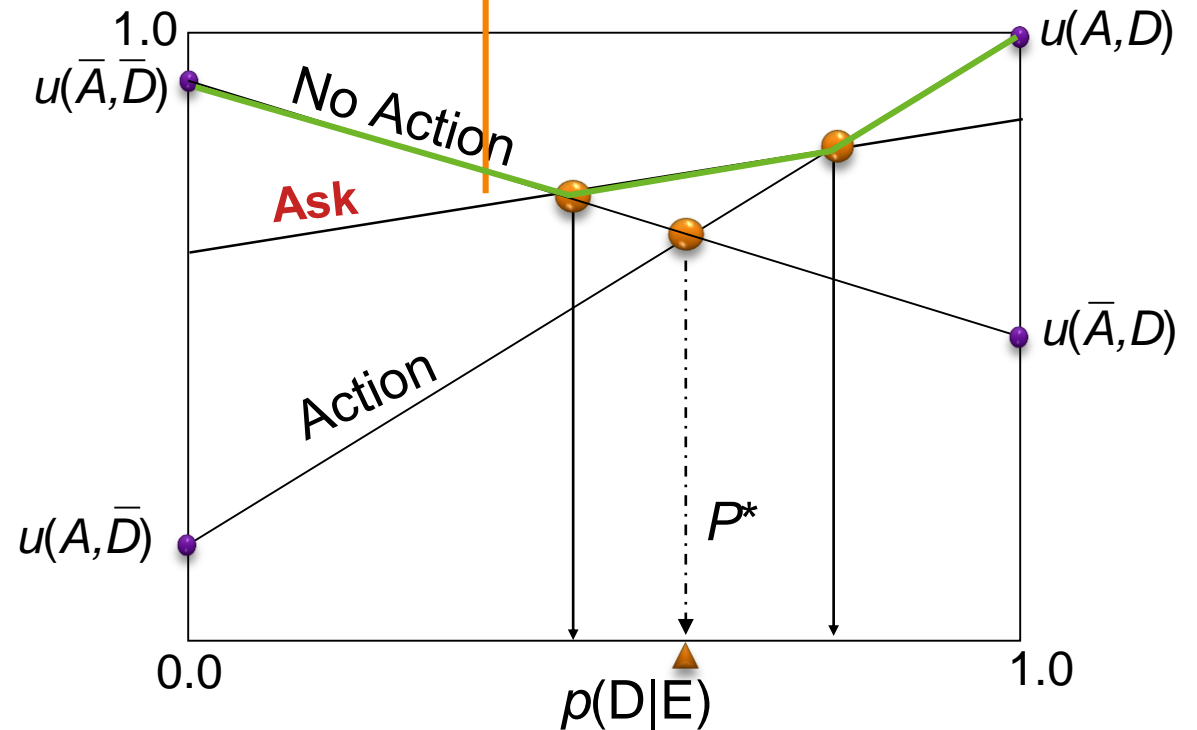


Getting the timing right



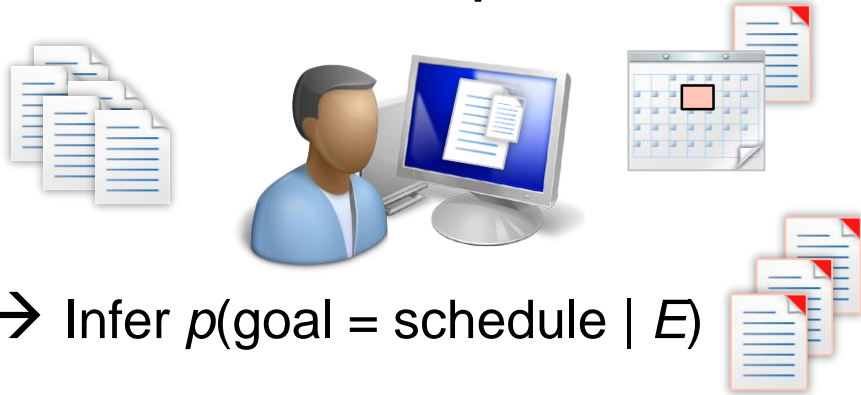
- Do nothing?
- Engage user? (*and when?*)
- Just do it?

Predictive Model



Lookout (1998)

In-stream supervision



- Do nothing?
- Engage user? (*and when?*)
- Just do it?

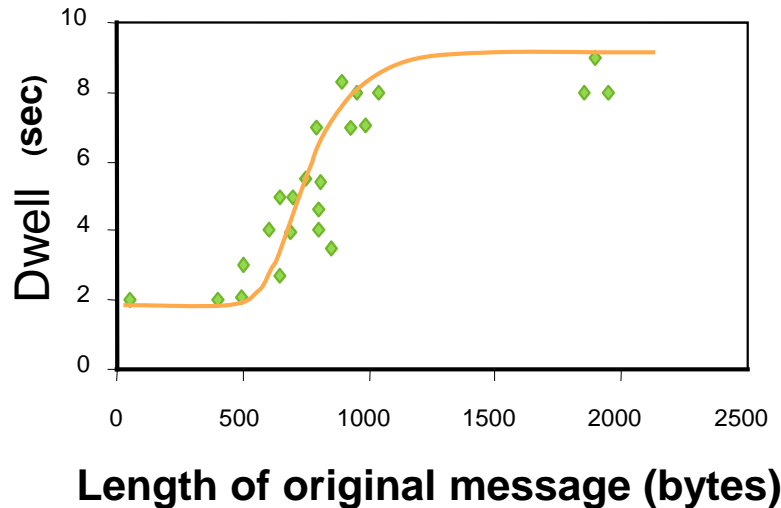


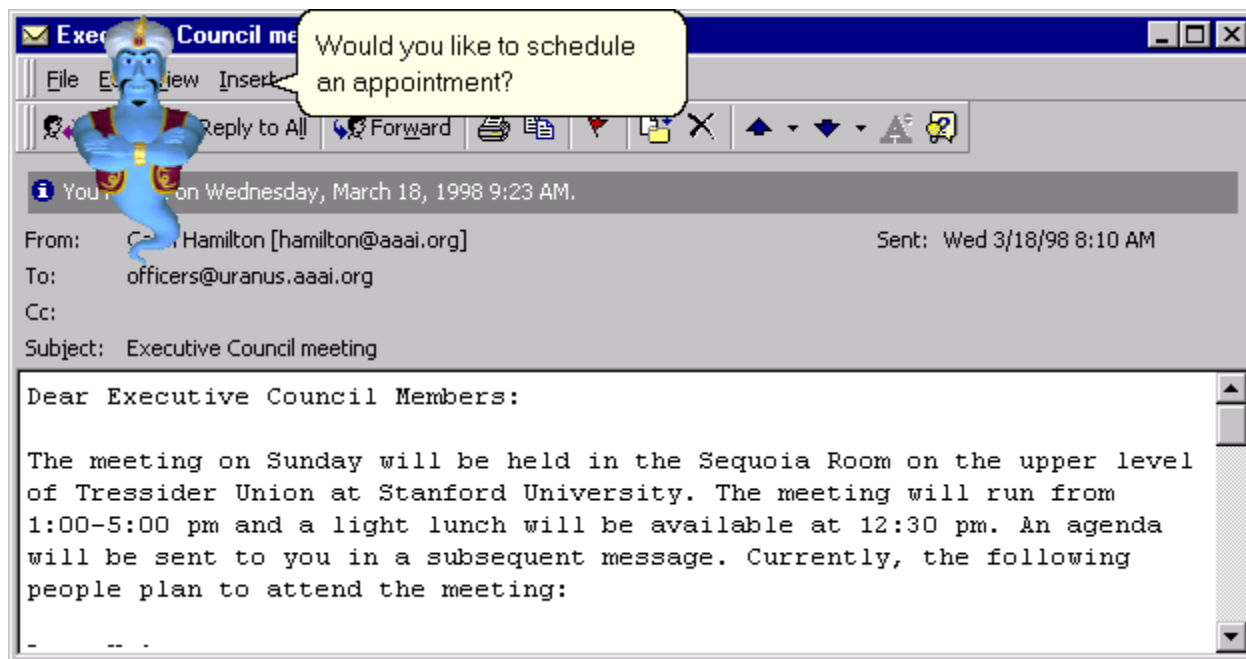
You will be busy then with the Lumiere project meeting... How about trying Friday at 3 PM.

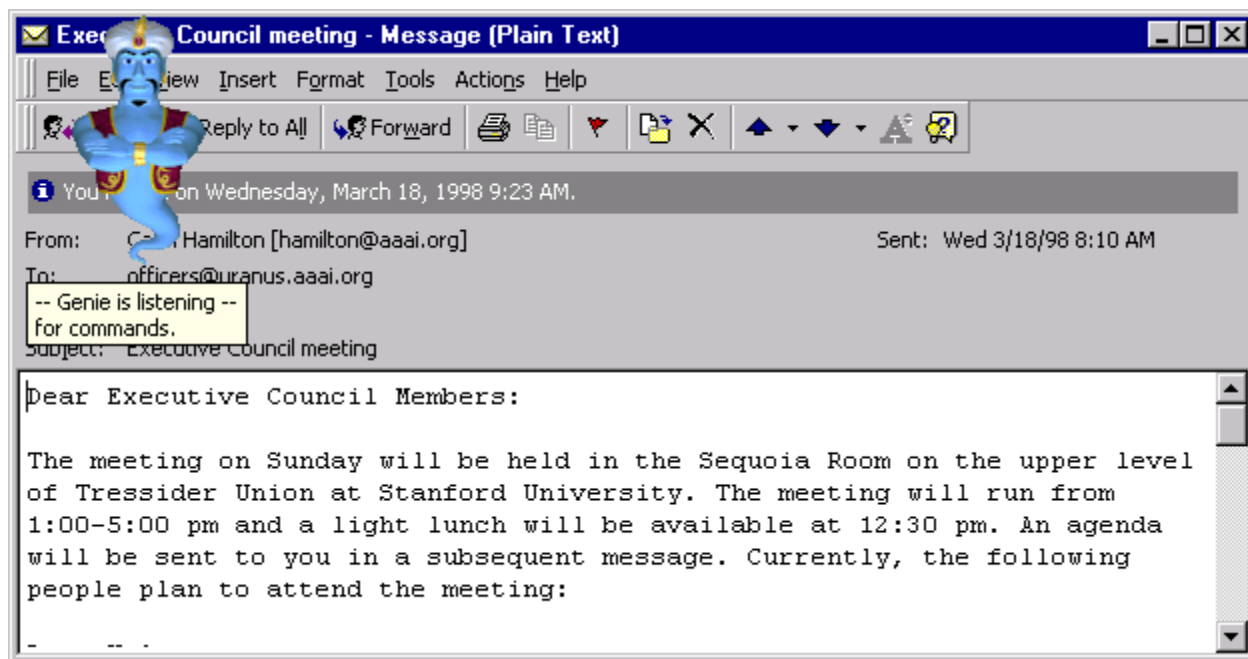
From: Robert Croft Sent: Tue 9/22/98 8:25 PM
To: Eric Horvitz
Cc:
Subject: Planning for session

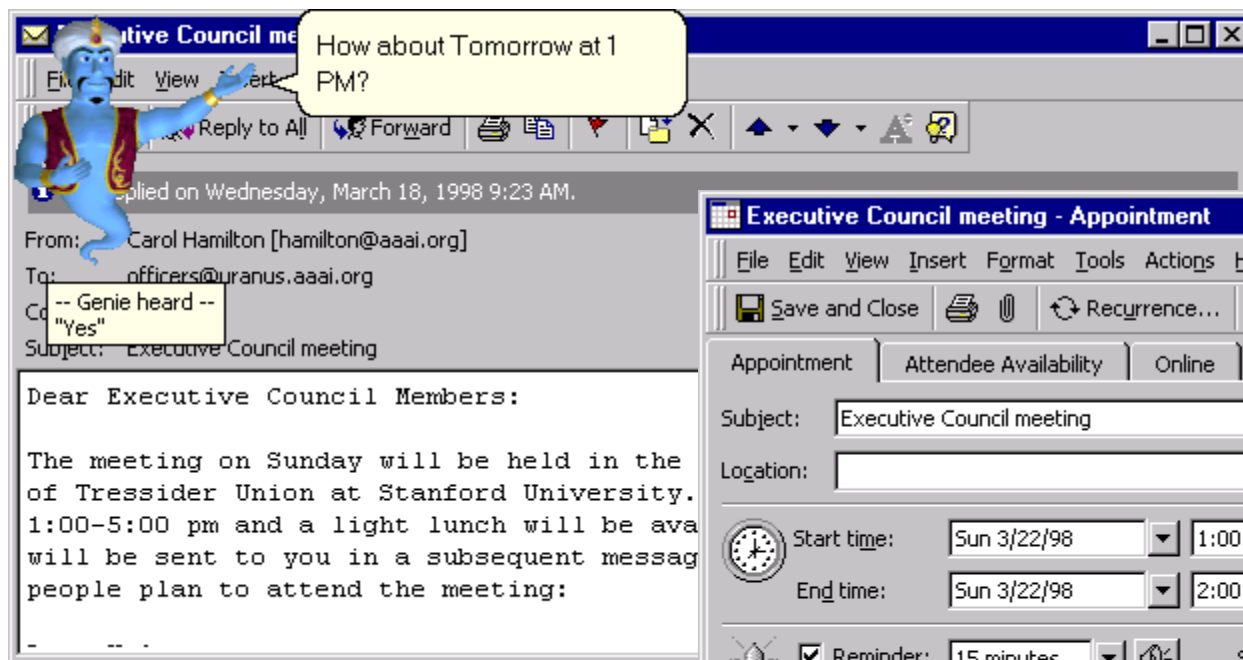
I'd like to catch up on plans for the conf. session on decision making. How about speaking by phone sometime around 2pm on Fri? Looking forward to chatting.
-Robert

Getting the timing right

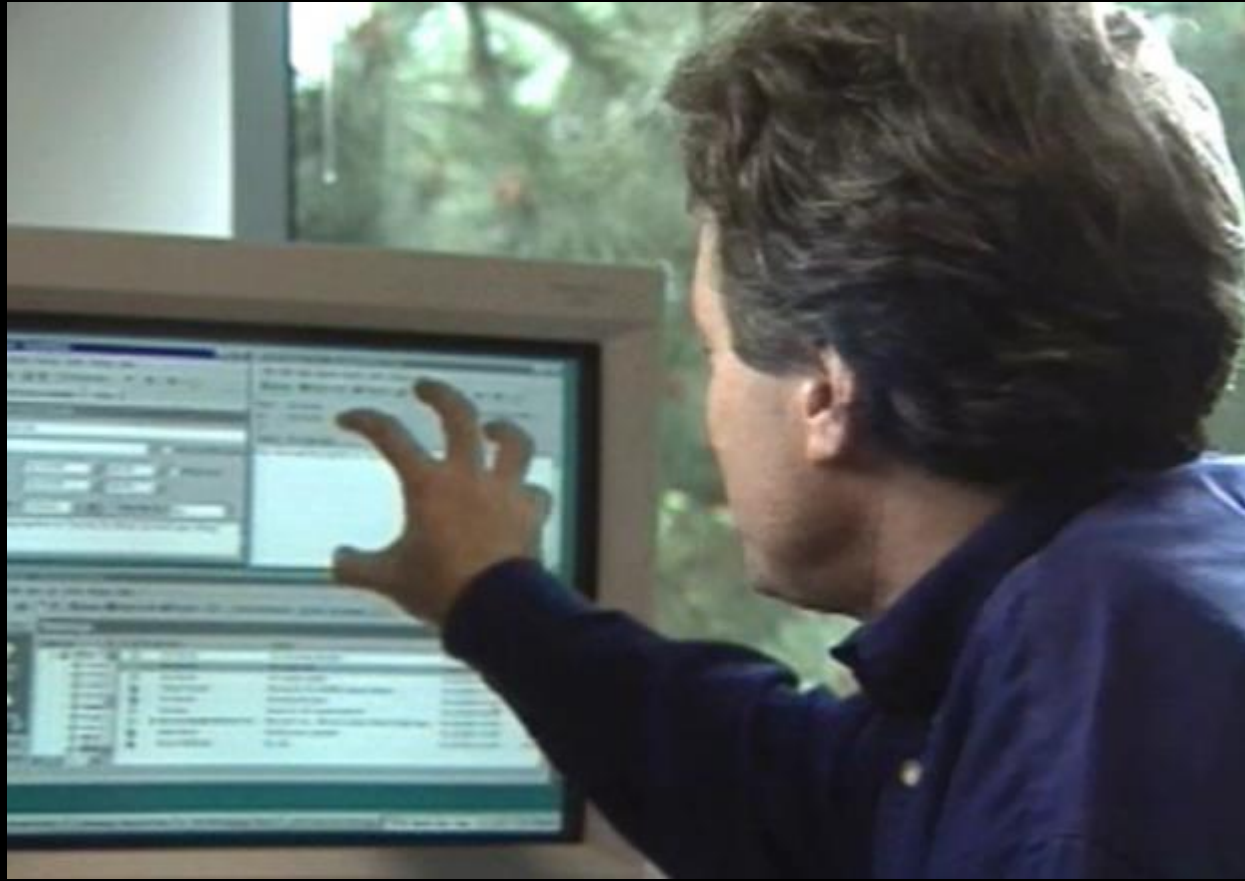








Video: Lookout system



TV commercial (1999)

Where do you
want to go today?

Eric, I'd like to discuss those business plans we
started talking about. How does meeting 2pm on
Saturday sound?

Thanks... Let me know...



Architecture for conversation (1999)

Extending mixed-initiative interaction
to hierarchies of contribution

H.. Paek. [A Computational Architecture for Conversation.](#) User Modeling 1999

Paek, H. [Conversation as Action Under Uncertainty.](#) UAI 2000

Bayesian Receptionist (2000)

"I need a ride."

User's Goal

Goal 1

Goal n

Level 0

VOI

Subgoal 11

Subgoal 1x

Level 1

VOI

Subgoal 1x1

Subgoal 1xy

Level 3

VOI

Decision Theory and Adaptive Systems

Bayesian Receptionist

DR10-4

Powered by

Tim Paek

Eric Horvitz



Platform
Version 1.0.0

Copyright
Company

Bayesian Receptionist (2000)

Can you elaborate on that?



"I need a ride."

User's Goal

I need a ride please.
 DECL1 NP1 PRON1* "I"
 VERB1* "need"
 NP2 DETP1 ADJ1*
 NOUN1* "ride"
 AVP1 ADV1* "please"
 CHAR1 "."

Goal 1

VOI

Subgoal 11

Subgoal 1x

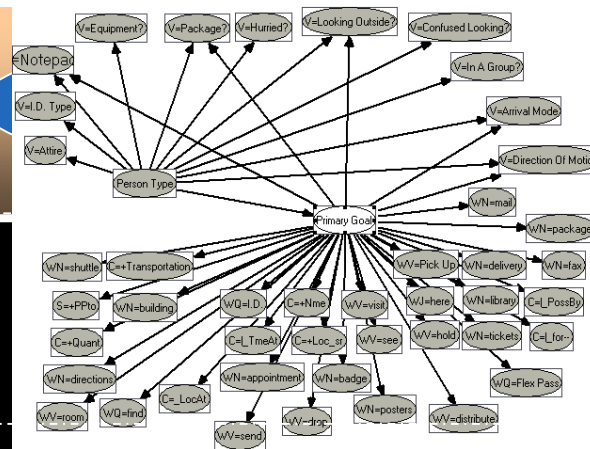
VOI

Subgoal 1x1

Subgoal 1xy

VOI

Level 3



Bayesian Receptionist (2000)

So you'd like a shuttle?



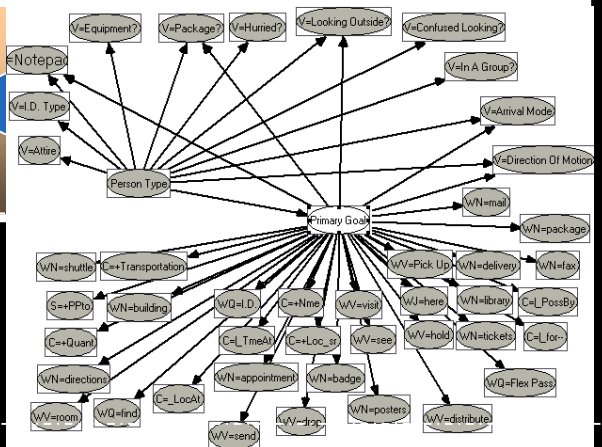
I need a ride please.
 DECL1 NP1 PRON1* "I"
 VERB1* "need"
 NP2 DETP1 ADJ1*
 NOUN1* "ride"
 AVP1 ADV1* "please"
 CHAR1 "."

"I need a ride."

User's Goal

Goal 1

VOI



Subgoal 11

Subgoal 1x

VOI

Subgoal 1x1

Subgoal 1xy

VOI

Level 3

Bayesian Receptionist (2000)

So you'd like a shuttle?



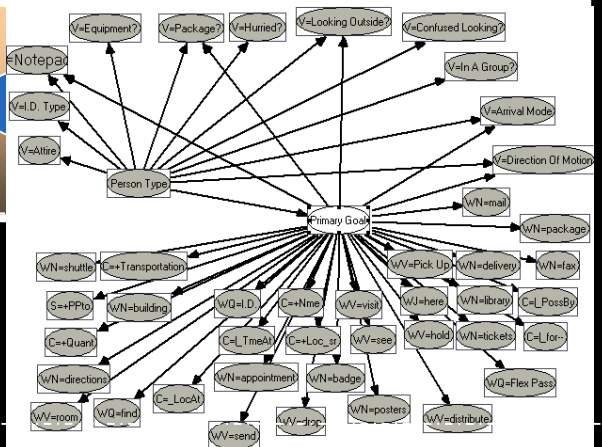
I need a ride please.
 DECL1 NP1 PRON1* "I"
 VERB1* "need"
 NP2 DETP1 ADJ1*
 NOUN1* "ride"
 AVP1 ADV1* "please"
 CHAR1 "."

"I need a ride."

User's Goal

Goal 1

VOI



Subgoal 11

Subgoal 1x

VOI

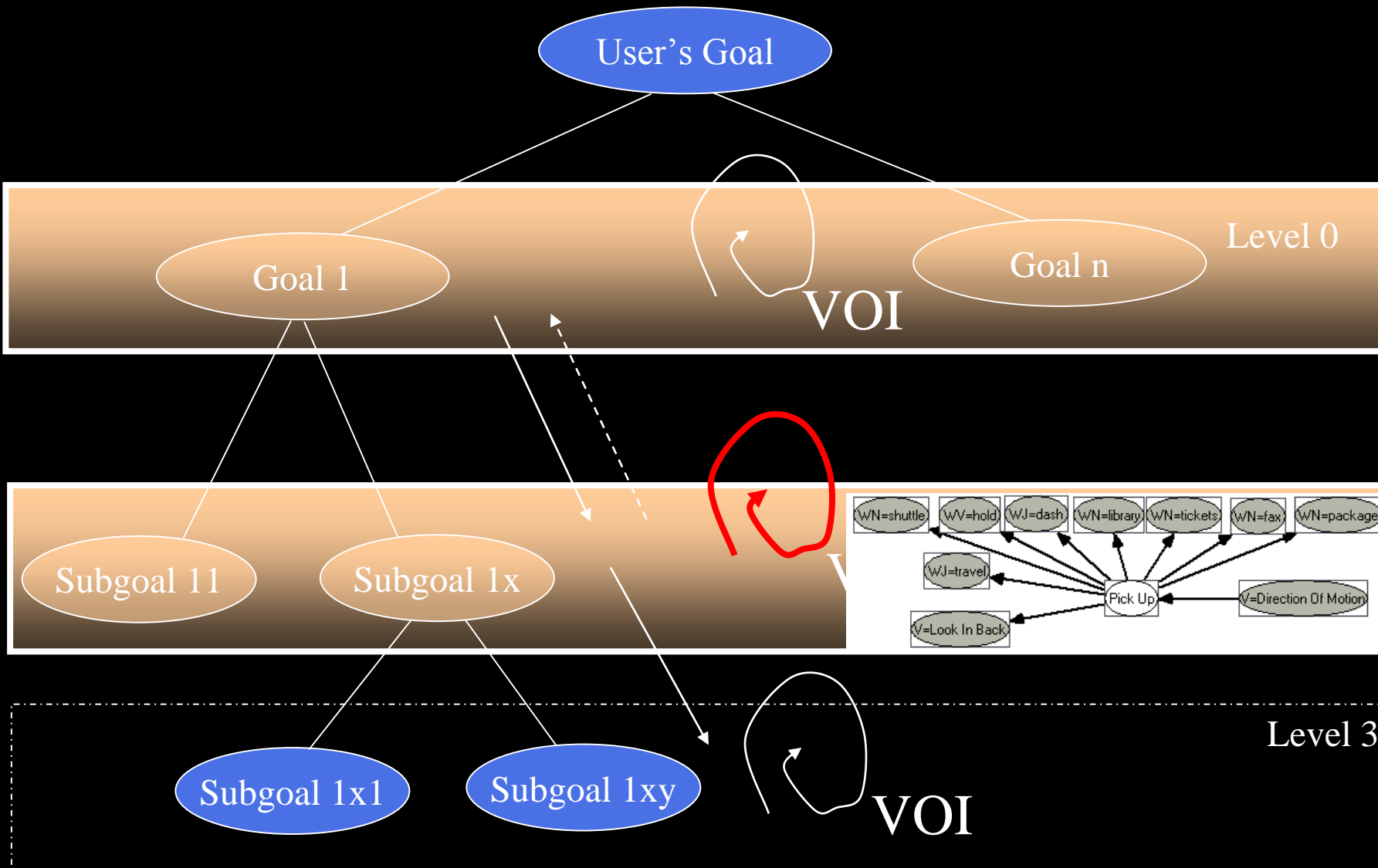
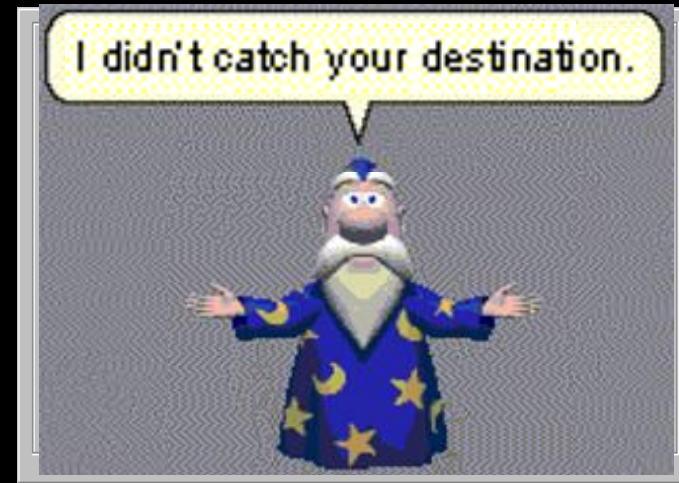
Subgoal 1x1

Subgoal 1xy

VOI

Level 3

Bayesian Receptionist (2000)

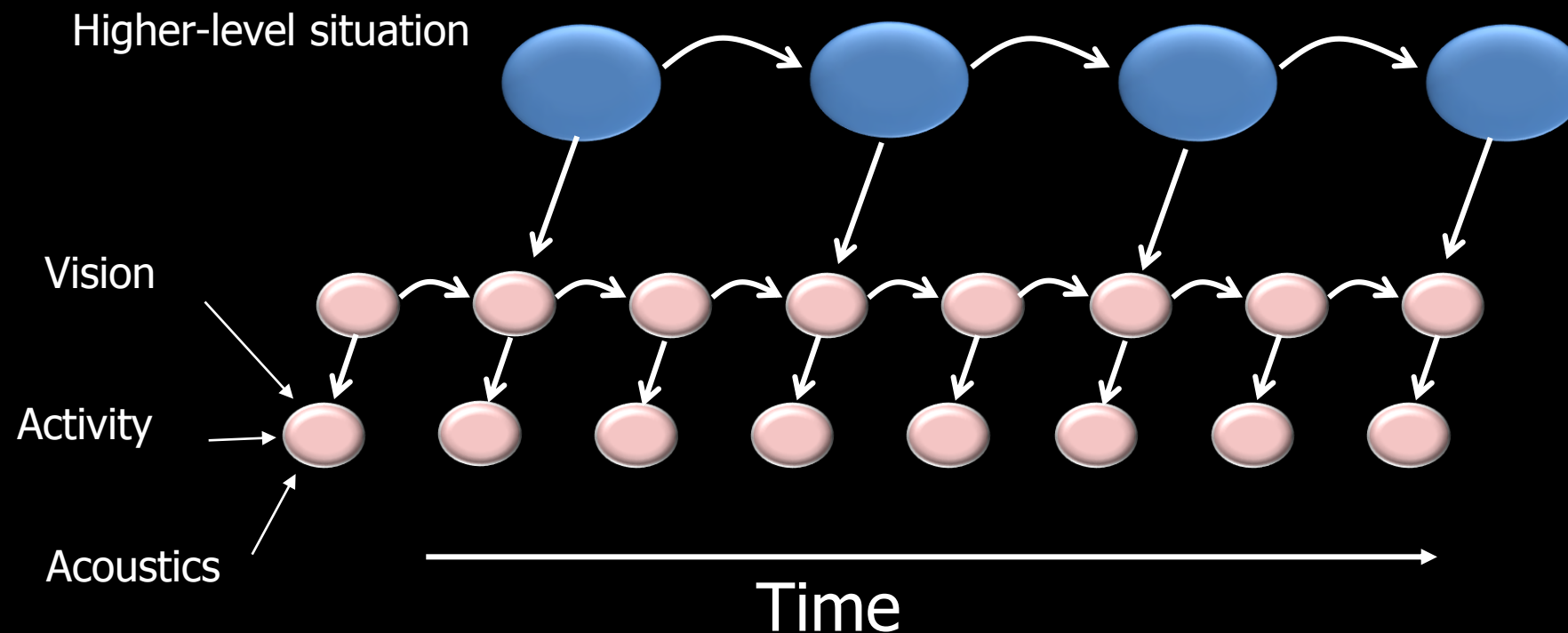


Advances in Core Capabilities

Core Fabric: Multisensory Fusion

Fuse vision, acoustics, activity with computer (Seer, ICMI 2002)

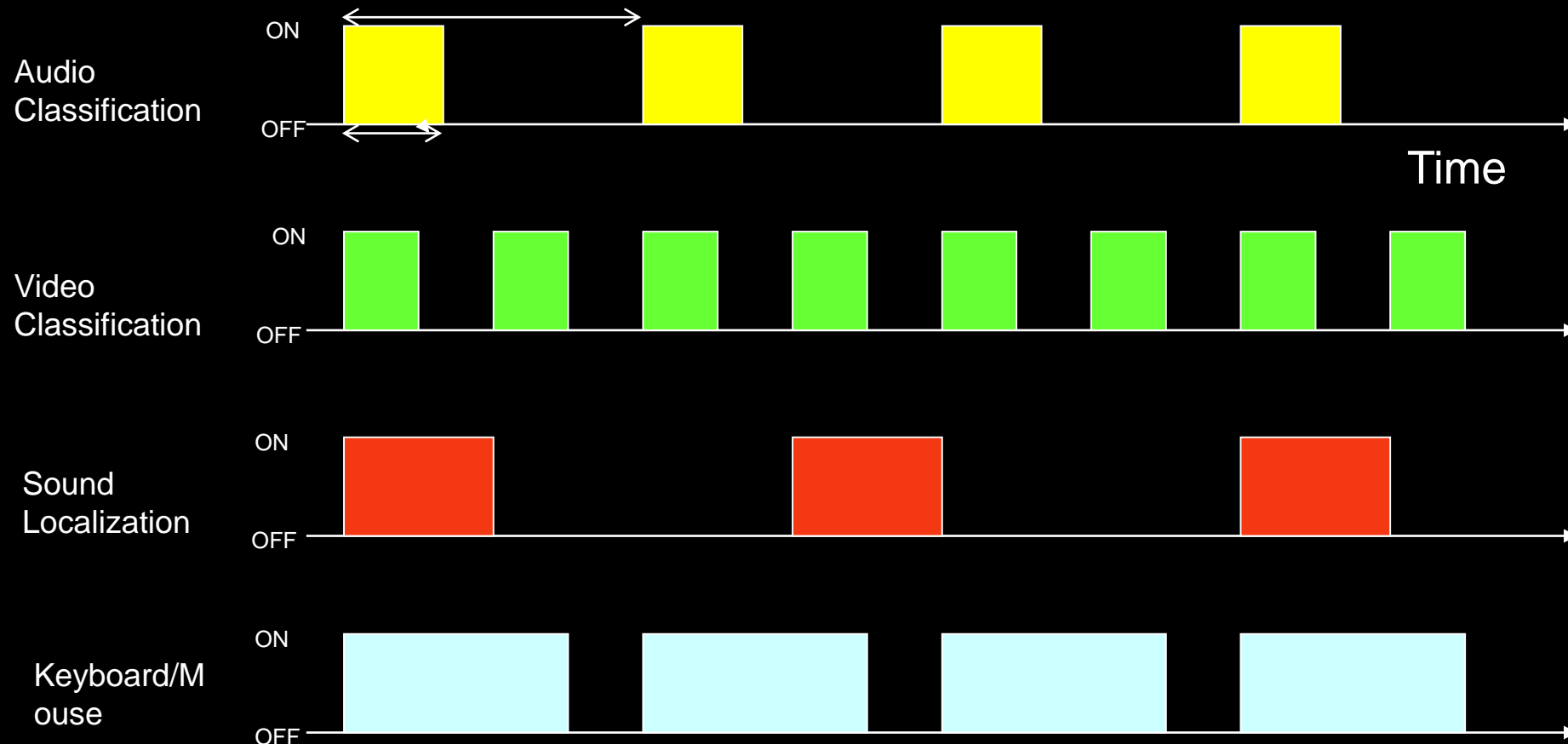
→ Representation, learning, inference



Core Fabric: Selective Perception

Guide computation to where it counts (S-SEER, ICMI 2003)

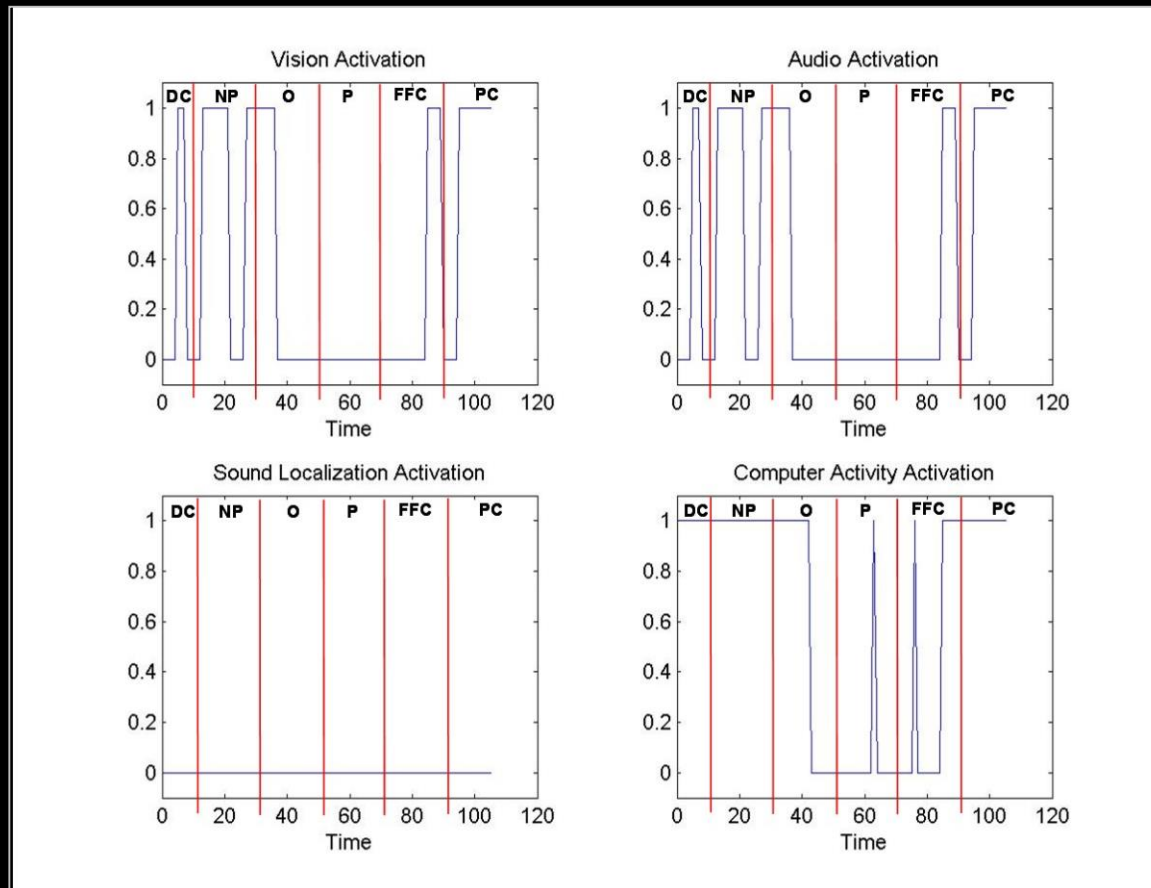
Compute expected value of information



Core Fabric: Selective Perception

Guide computation to where it counts (S-SEER, ICMI 2003)

Compute expected value of information



DC: Distant Conversation
NP: Nobody Present
O: Other
P: Presentation
FFC: F-F Conversation
WC: Working on computer
PC: Phone Conversation

Core Fabric: Tools for Multisensory Prototypes

The screenshot displays the Core Fabric software interface, which is used for multisensory prototyping. It is divided into two main sections: a control panel on the left and a data visualization area on the right.

Event Sources Panel:

- Ambient acoustics Running
- Visual analysis Running
- Desktop activity Running
- Application events Running
- System events Running

Tracking... Panel:

This panel displays four sub-panels related to visual tracking analysis:

- Top-left:** A video frame of a man with glasses. Two overlapping green bounding boxes are drawn around his head and face, indicating the tracking area.
- Top-right:** A graph titled "Tracking..." showing a white waveform at the bottom and several vertical green lines extending upwards, representing tracking events or confidence levels over time.
- Bottom-left:** A black frame showing a green outline of the tracked person's head and shoulders, with small white dots representing motion or feature tracking points.
- Bottom-right:** A grayscale frame showing a binary mask of the tracked person's head and shoulders, with a green bounding box overlaid.

Core Fabric: Tools for Multisensory Prototypes

[Video: Sensing Smartphone \(2000\)](#)



Core Fabric: Tools for Multisensory Prototypes

[Video: Surface computing \(2004\)](#)

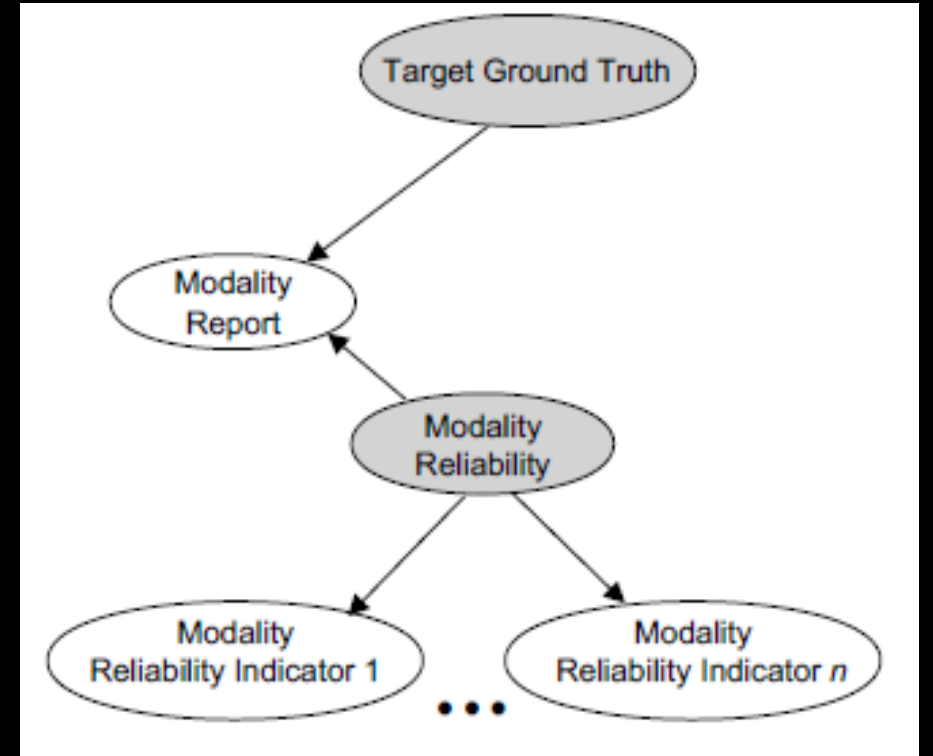
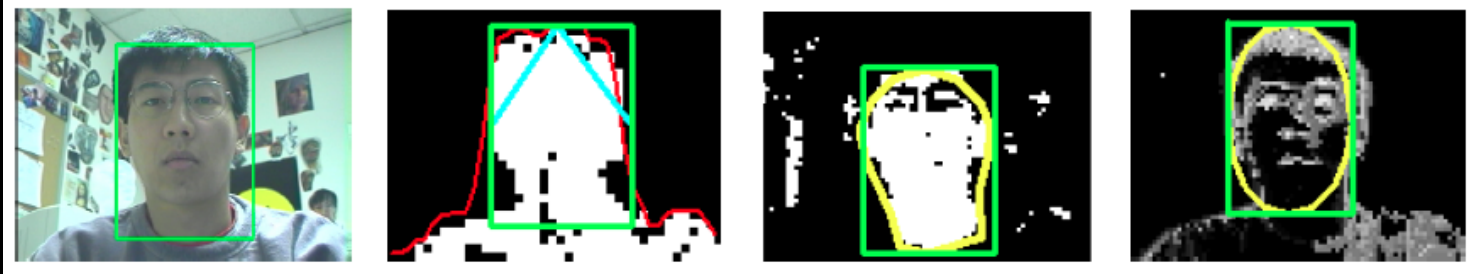


Wilson. PlayAnywhere: [A Compact Tabletop Computer Vision System](#), UIST 2005

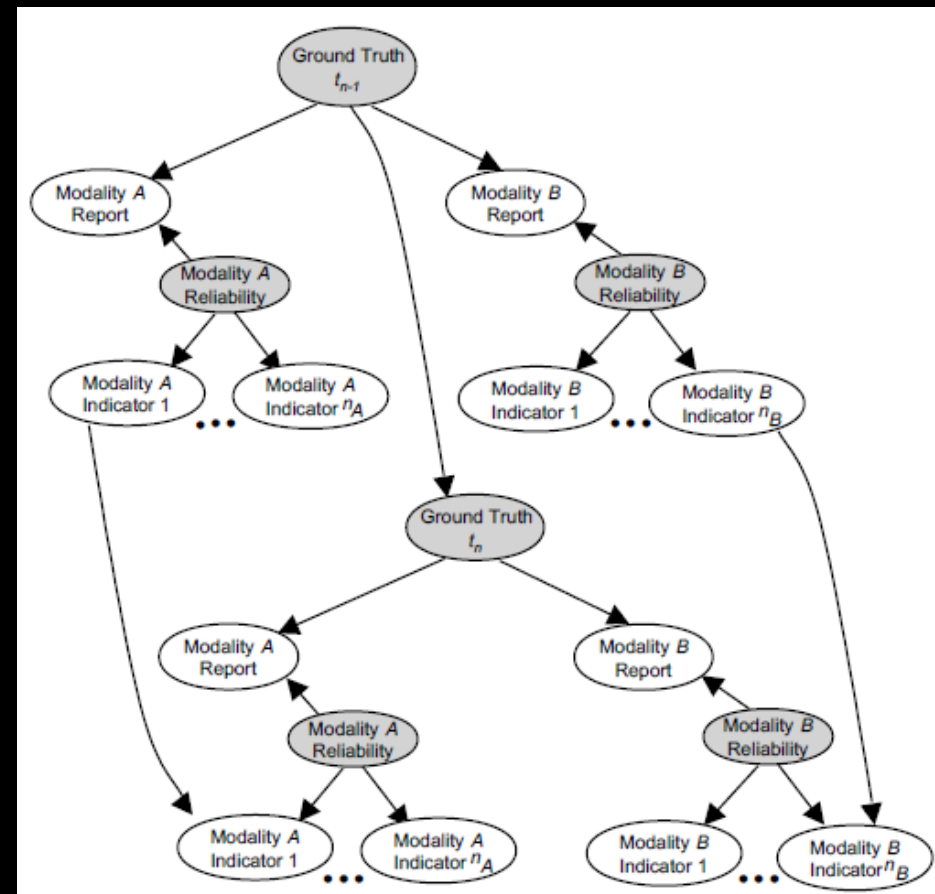
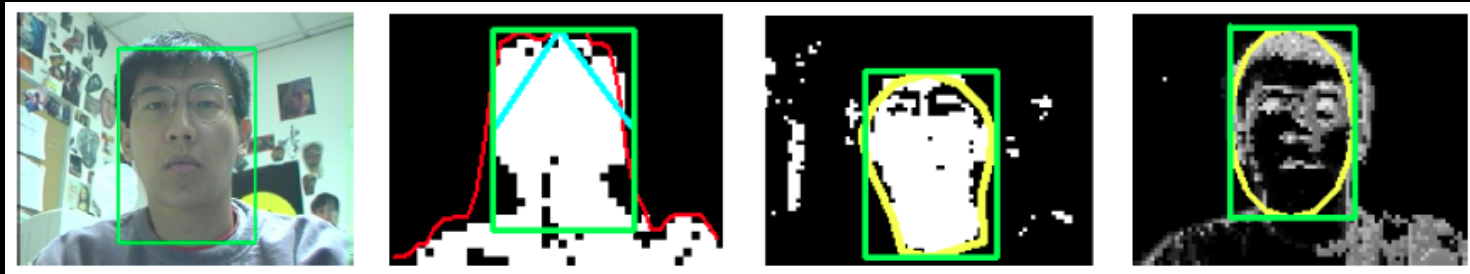
Wilson, Sarin. [BlueTable: Connecting Wireless Mobile Devices on Interactive Surfaces Using Vision-Based Handshaking](#), GI 2007

Olwal, Wilson. [SurfaceFusion: Unobtrusive Tracking of Everyday Objects in Tangible User Interfaces](#), GI 2008

Core Fabric: Probabilistic Fusion of Signals



Core Fabric: Probabilistic Fusion of Signals



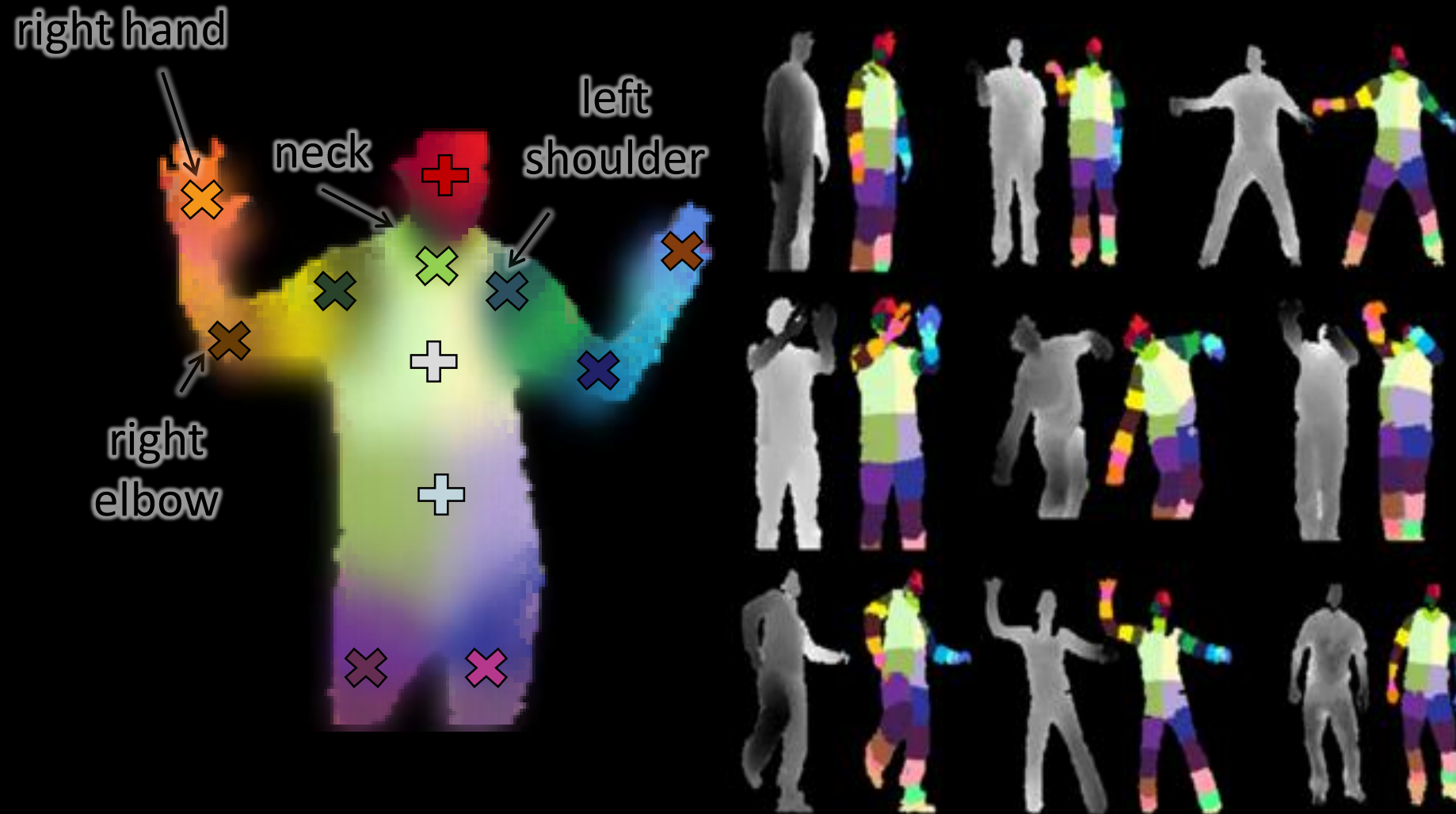
Core Advances in Perception



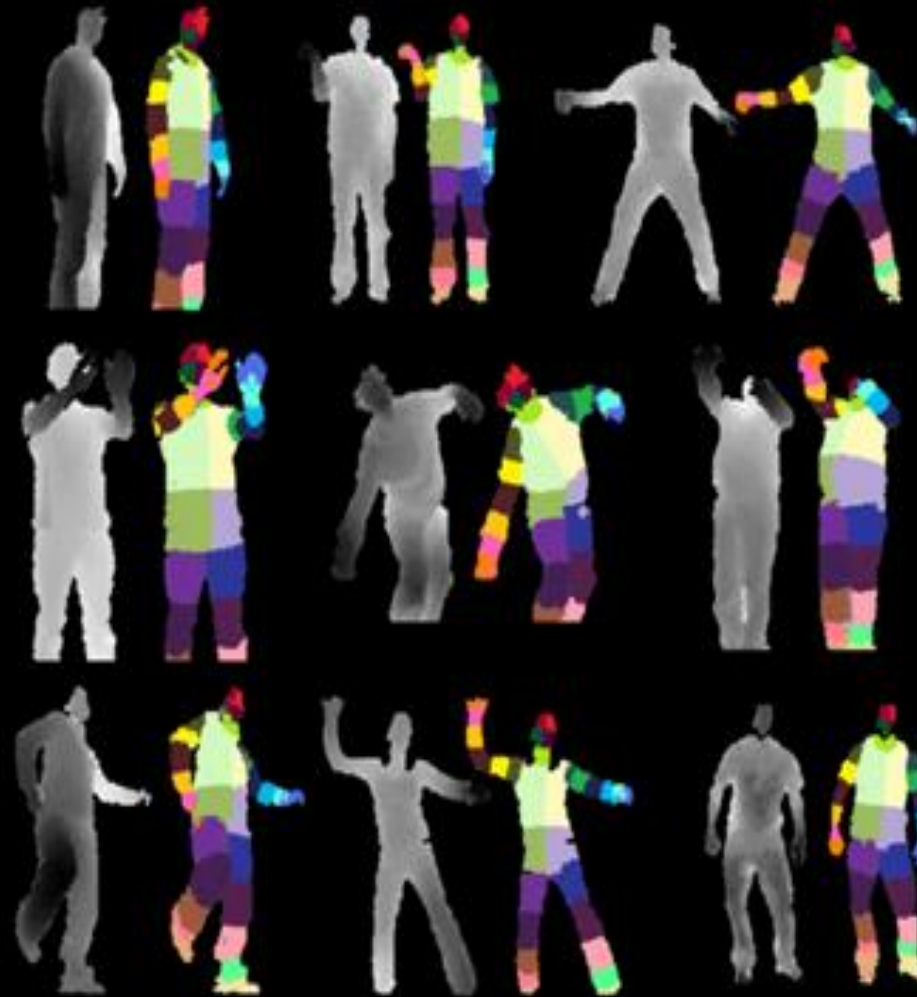
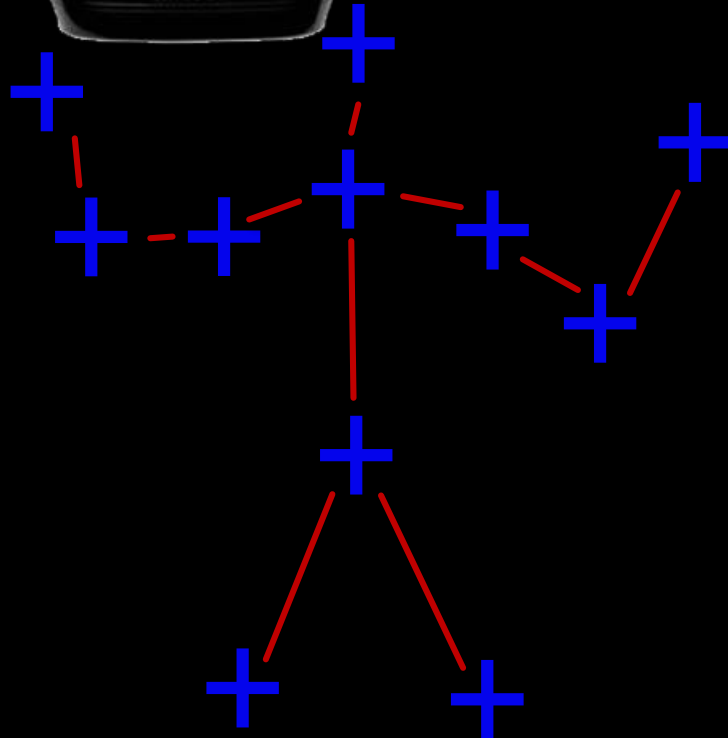
Core Advances in Perception



Core Advances in Perception



Core Advances in Perception



Core Advances in Perception

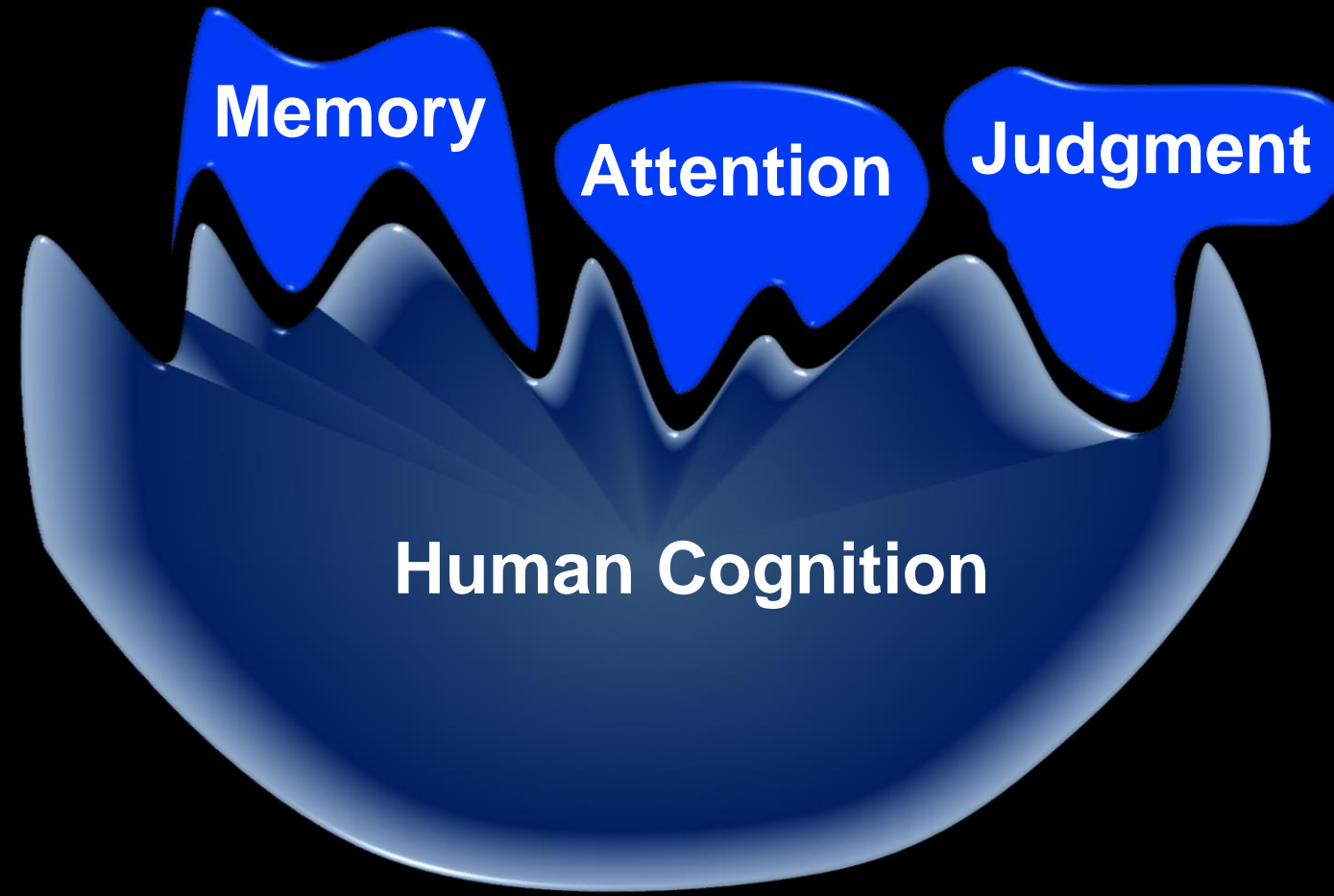
Power of data + CNNs

Conversational Speech: *Switchboard* challenge

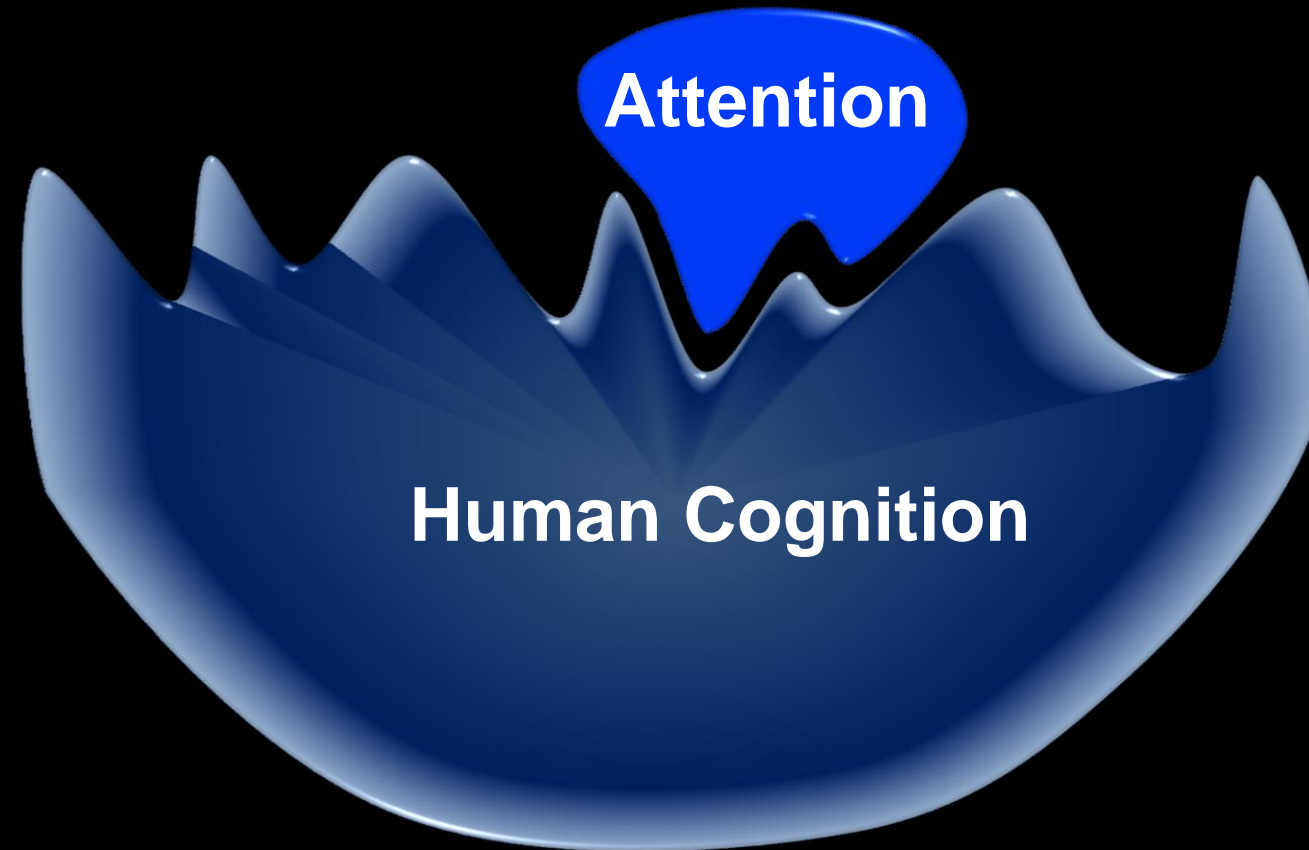


Understanding Human Cognition

Studies of Attention & Memory



Models of Attention



Predict Cost of Interruption

ICMI 2003

Interruption Workbench
Main

Set Time 4:28:44 PM

Cost of Interruption

High

Medium

Low

Current Costs

RT Call \$2.00

VAlert \$0.75

AVAlert \$1.50

Assess Costs

Assess scalar values with slider

Observed Events

4:28:44 PM	12-6:30pm
UserActivity	SingleAppFocus
No sound detected	No
Gaze at display	OUTLOOK.EXE

Stop X Go

H., Apacible. [Learning and Reasoning about Interruption](#). ICMI 2003

H., Apacible, Koch. [BusyBody: Creating and Fielding Personalized Models of the Cost of Interruption](#), CSCW 2004.

Predict Cost of Interruption

ICMI 2003

Interruption Workbench
Main

Set Time 4:28:25 PM

Cost of Interruption

High
Medium
Low

Current Costs
RT Call \$0.50
VAlert \$0.15
AVAlert \$0.25

Assess Costs

Assess scalar values with slider

Observed Events

4:28:26 PM	12-6:30pm
UserActivity	MultipleApps
Conversation detected	No
Gaze at display	wbtest.exe

Stop X Go

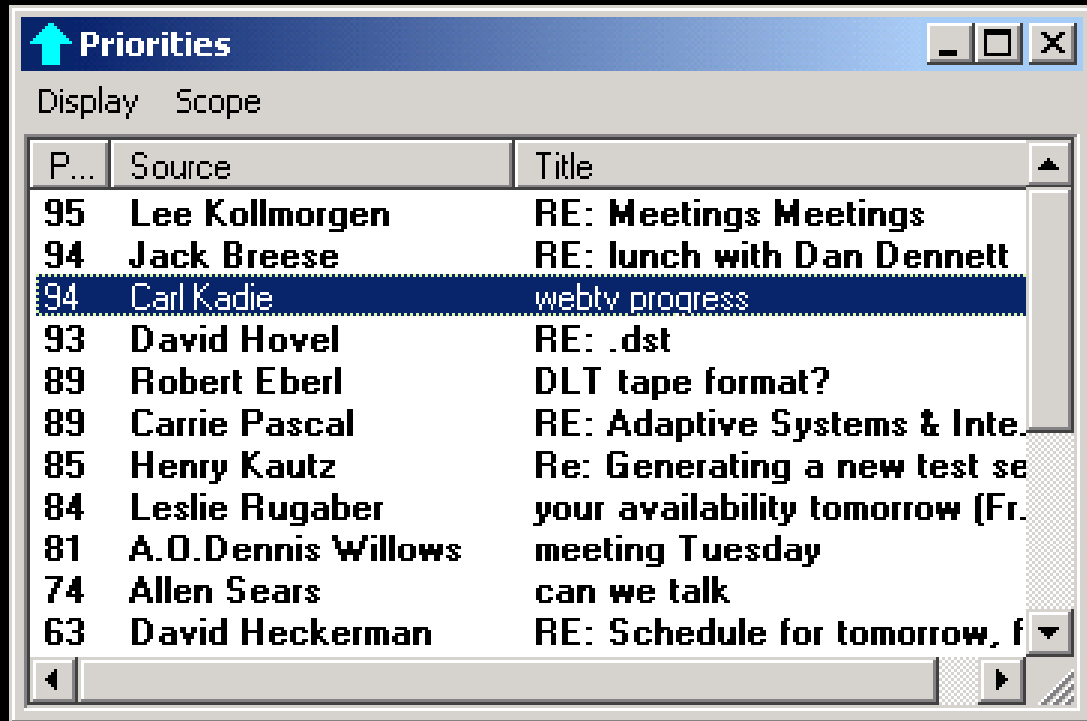
H., Apacible. [Learning and Reasoning about Interruption](#). ICMI 2003

H., Apacible, Koch. [BusyBody: Creating and Fielding Personalized Models of the Cost of Interruption](#), CSCW 2004.

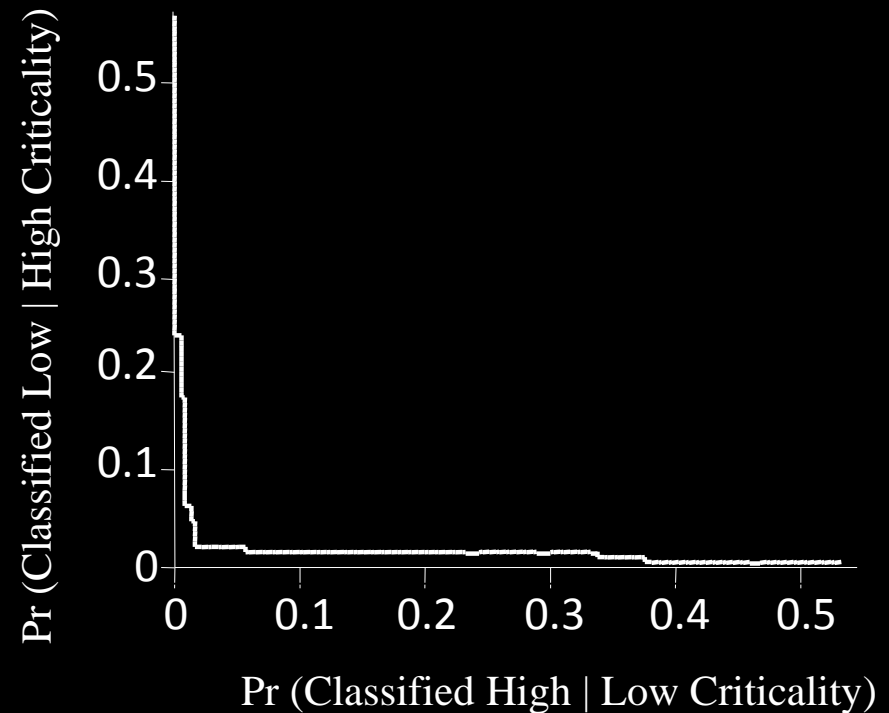
Leveraging Models of People

Priorities (1999)

Learn to sort & route email by urgency

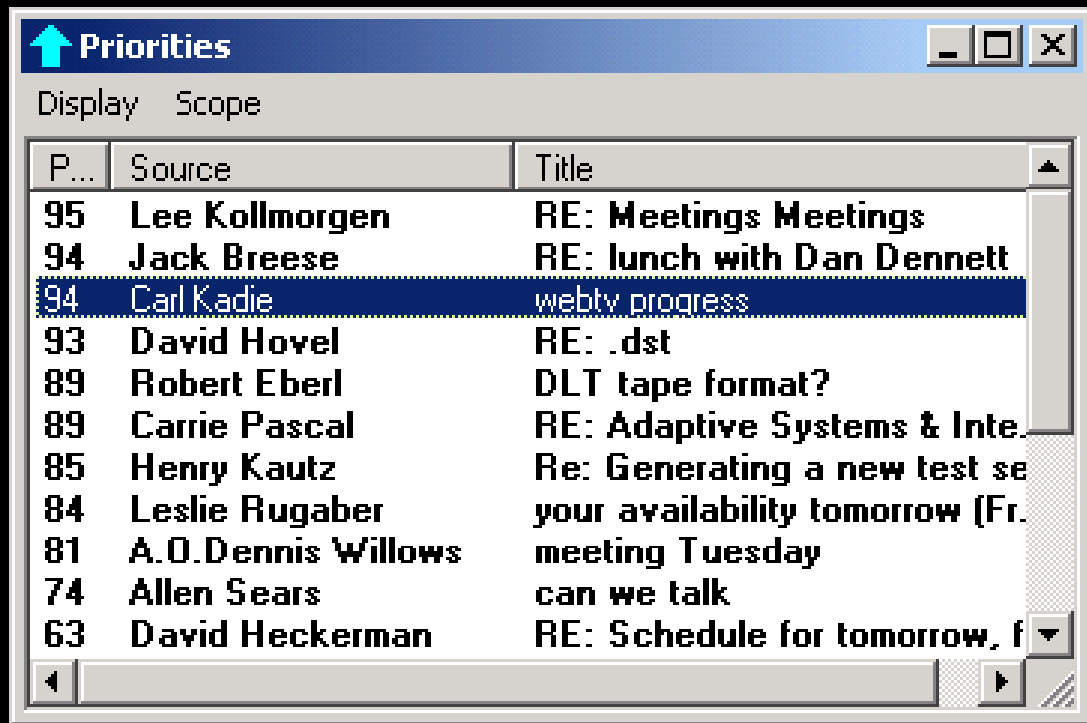


P...	Source	Title
95	Lee Kollmorgen	RE: Meetings Meetings
94	Jack Breese	RE: lunch with Dan Dennett
94	Carl Kadie	webtv progress
93	David Hovel	RE: .dst
89	Robert Eberl	DLT tape format?
89	Carrie Pascal	RE: Adaptive Systems & Inte.
85	Henry Kautz	Re: Generating a new test se
84	Leslie Rugaber	your availability tomorrow (Fr.
81	A.O.Dennis Willows	meeting Tuesday
74	Allen Sears	can we talk
63	David Heckerman	RE: Schedule for tomorrow, f



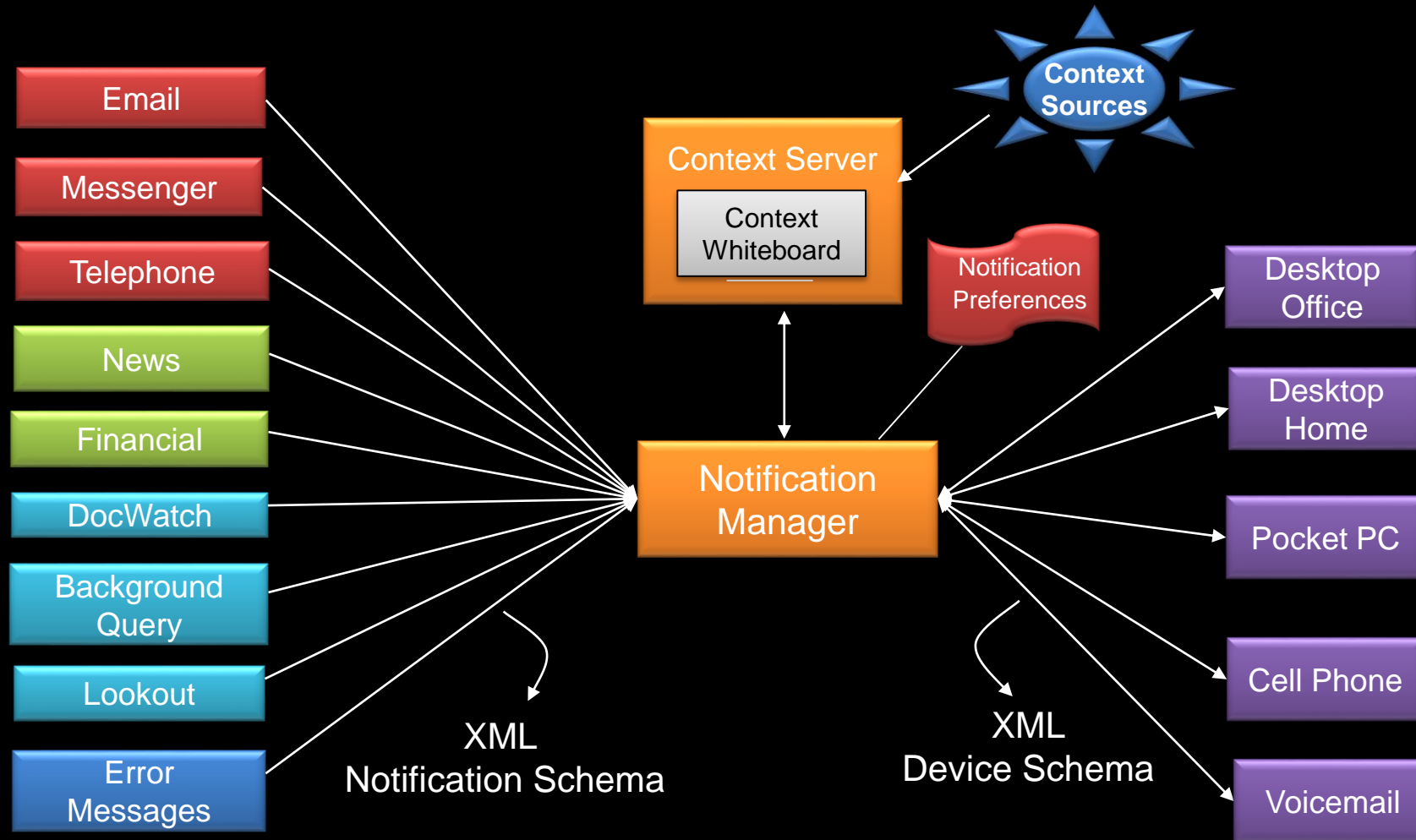
Priorities (1999)

Learn to sort & route email by urgency



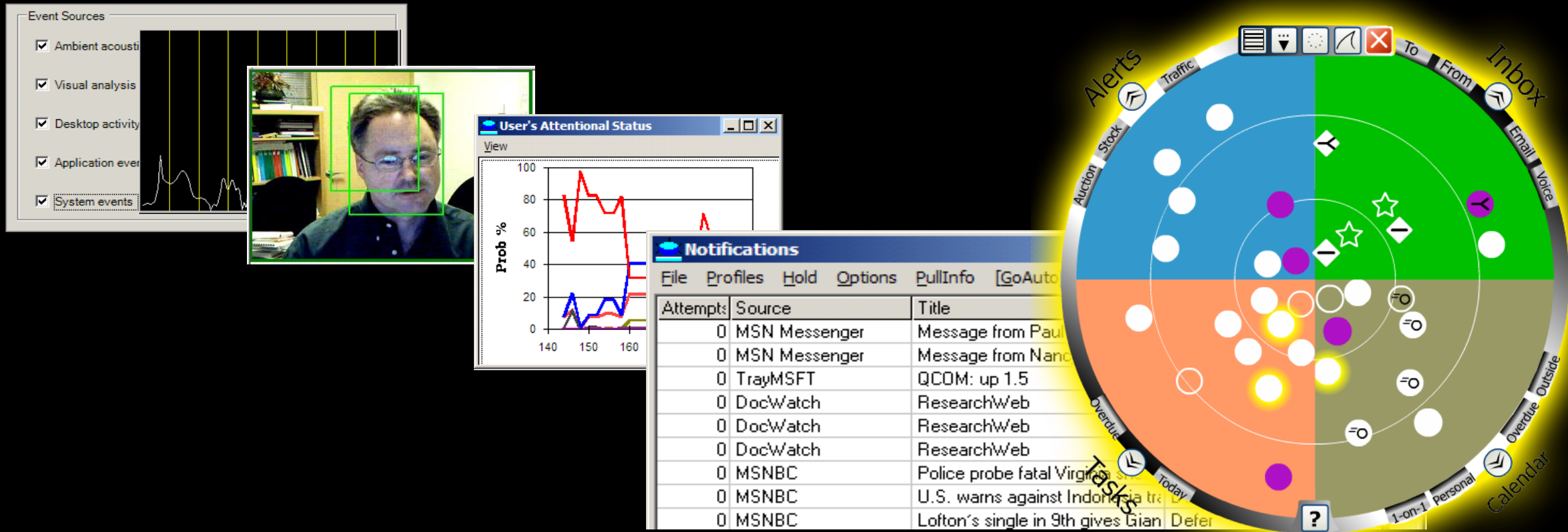
Notification Platform (2000)

Generalize to multiple sources & endpoints



Notification Platform (2000)

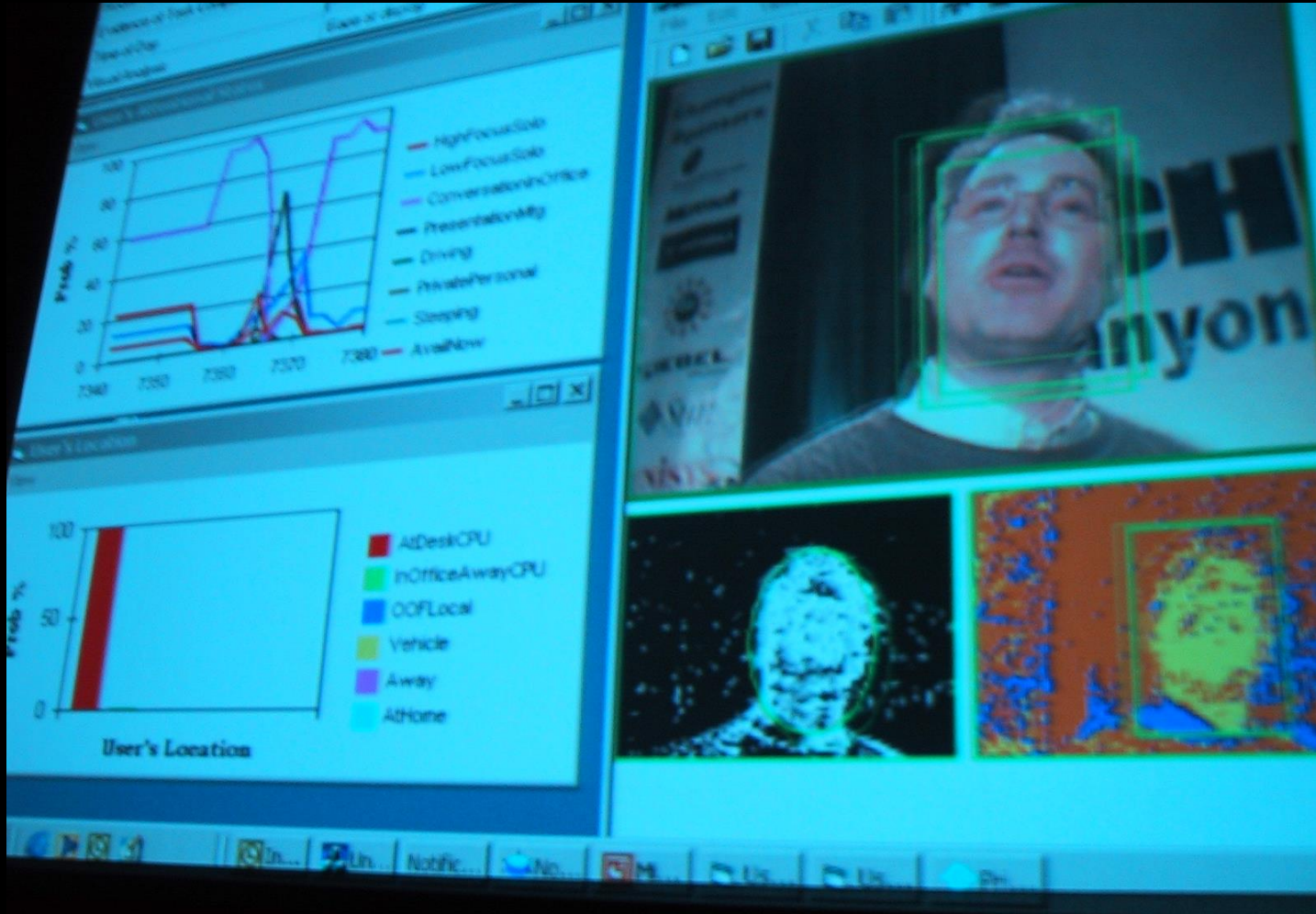
Generalize to multiple sources & endpoints



H, Kadie, Paek, Hovel. [Models of Attention in Computing and Communications: From Principles to Applications](#), CACM 46(3). 2003.

van Dantzich, Robbins, H., Czerwinski, [Scope: Providing Awareness of Multiple Notifications at a Glance](#). AVI 2002.

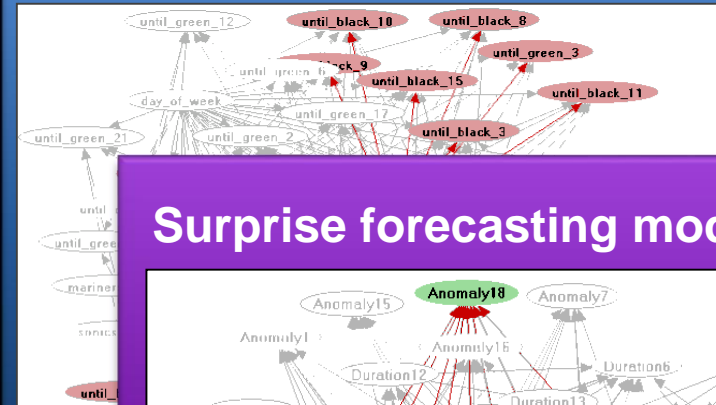
Video: Gates keynote & demo, CHI 2001



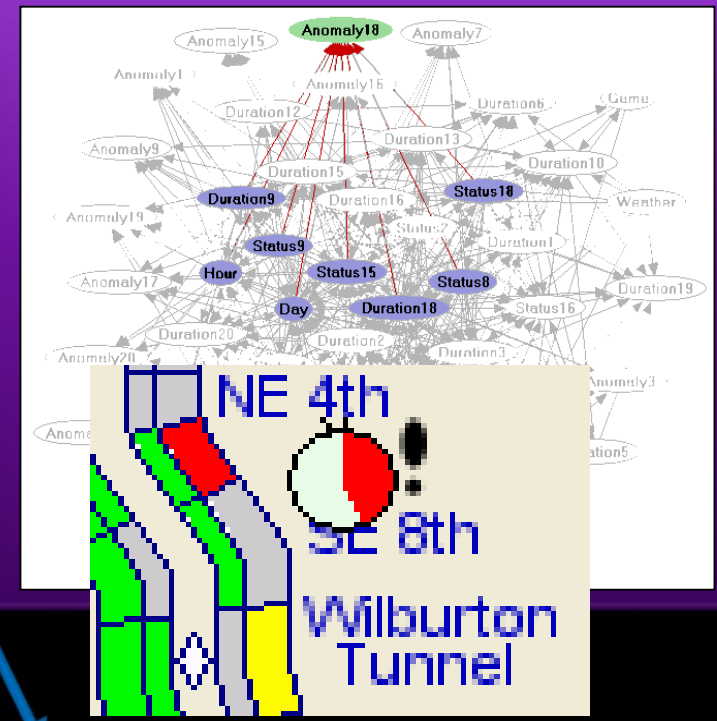
Models of Surprise



Base-level predictions about traffic

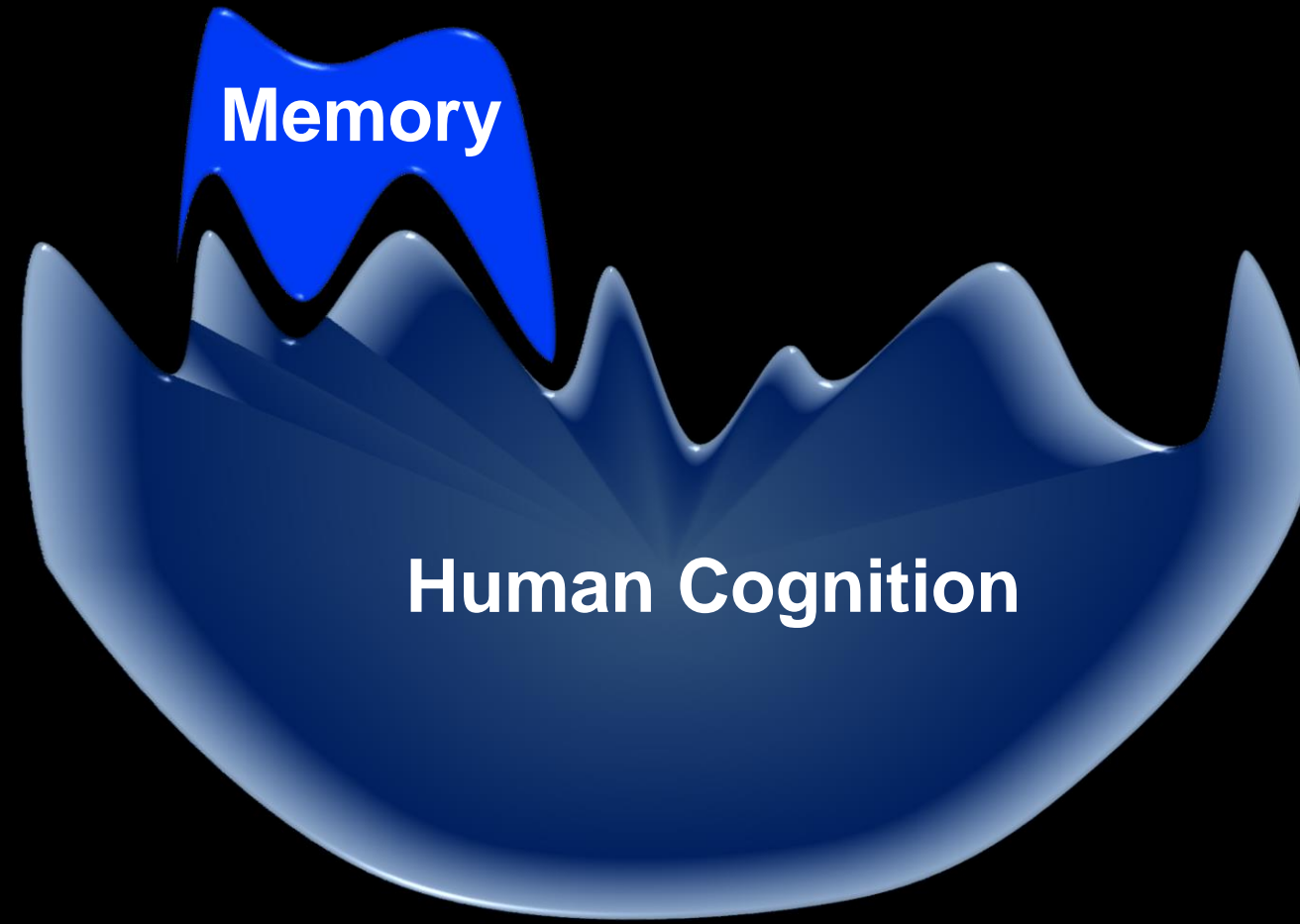


Surprise forecasting models



H., Apacible, Sarin, Liao. [Prediction, Expectation, and Surprise: Methods, Designs, and Study of a Deployed Traffic Forecasting Service](#), UAI 2005.

Models of Memory

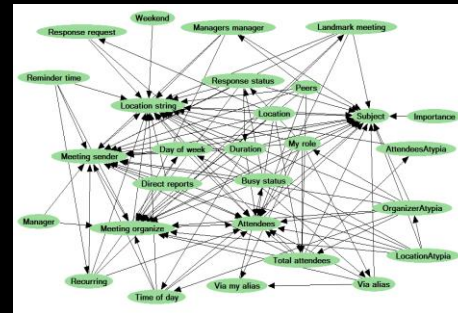


Models of Memory Landmarks

Lifebrowser (2004)

Events
TAB Meeting - October 21-22, 2002
Amir Aczel, 10/21, 'Entanglement: The G
TAB 20' - Nuria Oliver: The Challenge
Brainstorm speed from 802.11
LA working group
Lunch Eric/BryanMi RE: InfoAgent
TAB Meeting - October 21-22, 2002
Follow-up on Notification research
UW CSE Colloquium - 10/22/02 - "Trac
Isat Irvine
ISAT Fall Meeting 10/23-24/02 *REMIND
LA Schema Design Group
Amy Bruckman-- Talk about the design
Media & Machine Learning seminar: Li D
Ejovi Nuwere, 10/23, "Hacker Cracker: A
Dan Ling's Direct Report Meeting
Dan Ling's Extended Staff Meeting
NLPRead - Basu
Dan Ling's Group Managers Meeting - Oct
Recurrent ASI focus meetings
Eric Horvitz x62127 "Meeting"
Weekly get togethers, catch up
ASI Perception & Interaction meetings
Eric Horvitz x62127 "Recurring mtgng"
Horvitz/Ling 1:1
Building Large-scale Ontologies by Unsup
TOCHI paper
10/25/2002 A Machine Learning Approac
1:1 w/ Gina
RE: MSN Content Filtering Brownbag talk

Selective memory



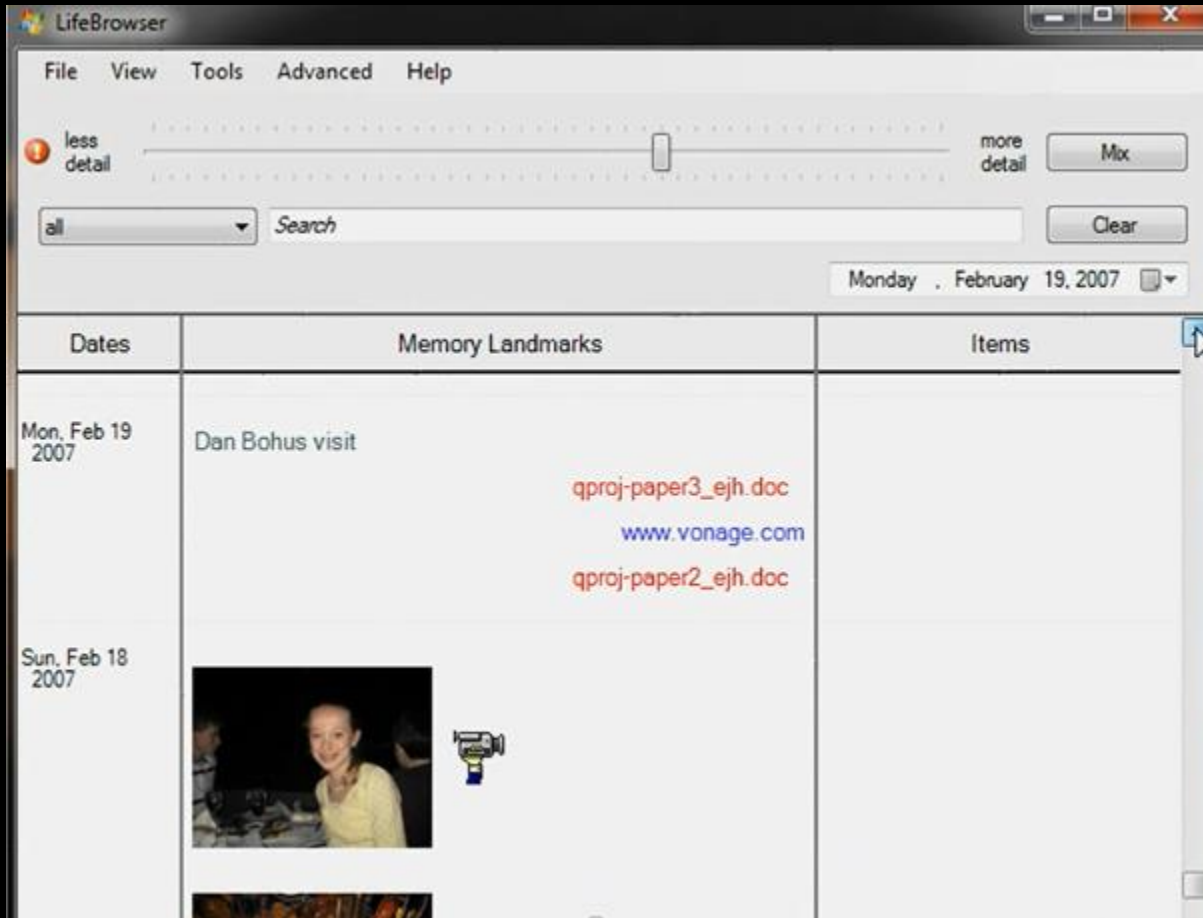
Machine learning to predict memory landmarks

Date	Events	Desktop Activity
Oct 21 2002		
Mon		Local Bestcom for Smart cacm-picture-fodder.ppt
Tue		cacm_final.doc
Wed	Isat Irvine ISAT Fall Meeting 10/23-24/02	prefetchbib.txt readme_priorities.txt smart ambient companion smart ambient companion overlay_UI.ppt MS177850.1v3redline1-f abstract.doc
Thu	Horvitz/Ling 1:1	junk_filter.ppt icmi2002.ppt strobe.ppt
Sat	DEF	2. ShuminEyeGaze-V[4] Organizing Against Spam
Sun		new pat proj.txt Organizing Against Spam Organizing Against Spam
Oct 28 2002		
Mon		iui.txt
Tue	David Hovel	bestcom_telephony talk.ppt
Wed	Bestcom presentation	telephone.ppt Copy of telephony.ppt

Models of Memory Landmarks

Lifebrowser (2004)

[Video: Lifebrowser](#)



Rich timeline of predicted memory landmarks:

- Meetings
- Photos/videos
- Activities
- Locations


Multimodal training data

Models of Memory Landmarks

Lifebrowser (2004)

[Video: Lifebrowser](#)

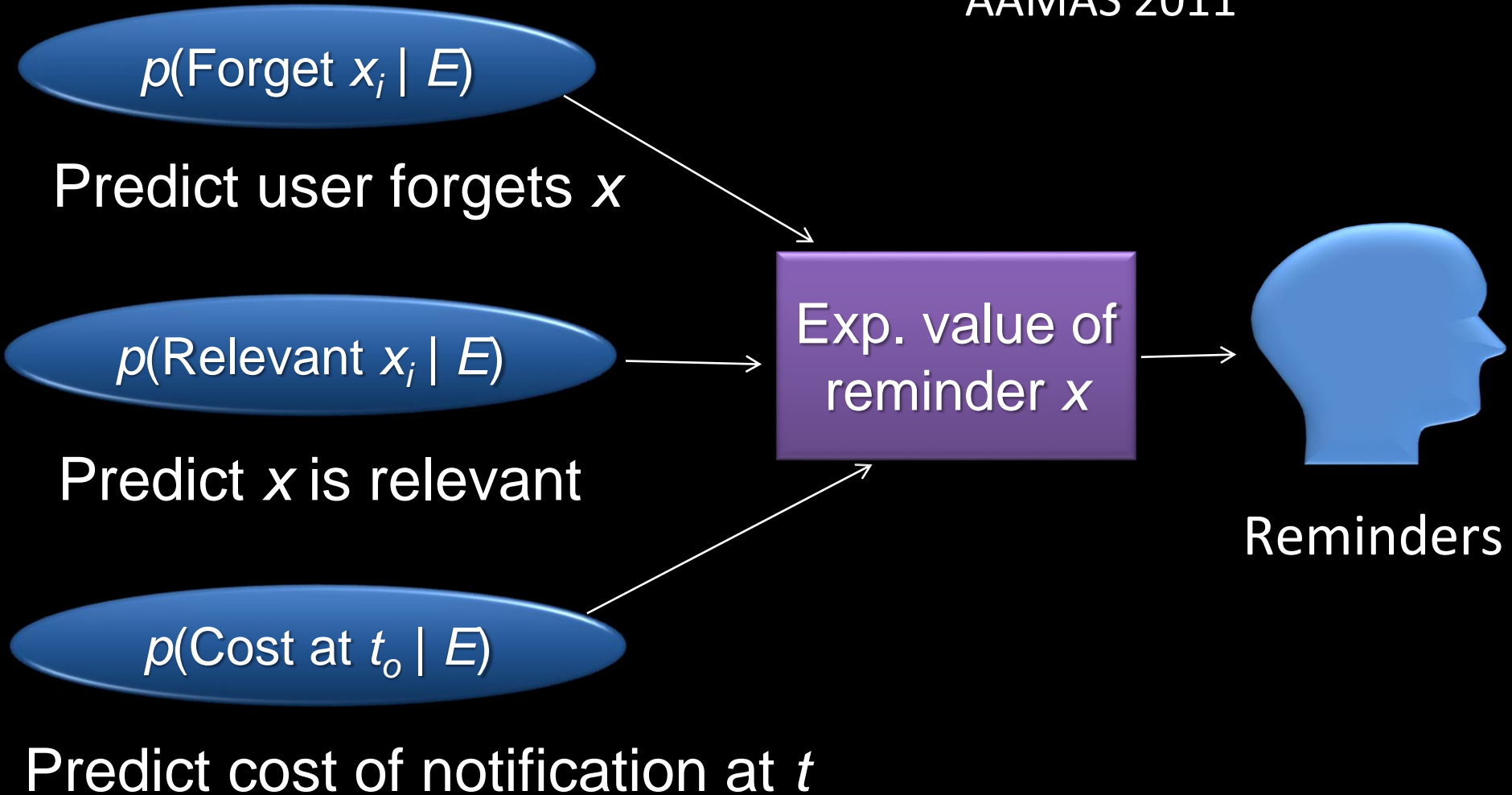
The screenshot shows the Lifebrowser application window. At the top is a menu bar with 'File', 'View', 'Tools', 'Advanced', and 'Help'. Below the menu is a 'less detail' slider and a 'more detail' button. A search bar contains the word 'Search' and a 'Clear' button. The date 'Monday, February 19, 2007' is displayed. The main content area is a table with three columns: 'Dates', 'Memory Landmarks', and 'Items'.

Dates	Memory Landmarks	Items
Mon, Feb 19 2007	Dan Bohus visit	qproj-paper3_ejh.doc www.vonage.com qproj-paper2_ejh.doc
Sun, Feb 18 2007		



Forgetting & Reminding: *Jogger*

AAMAS 2011

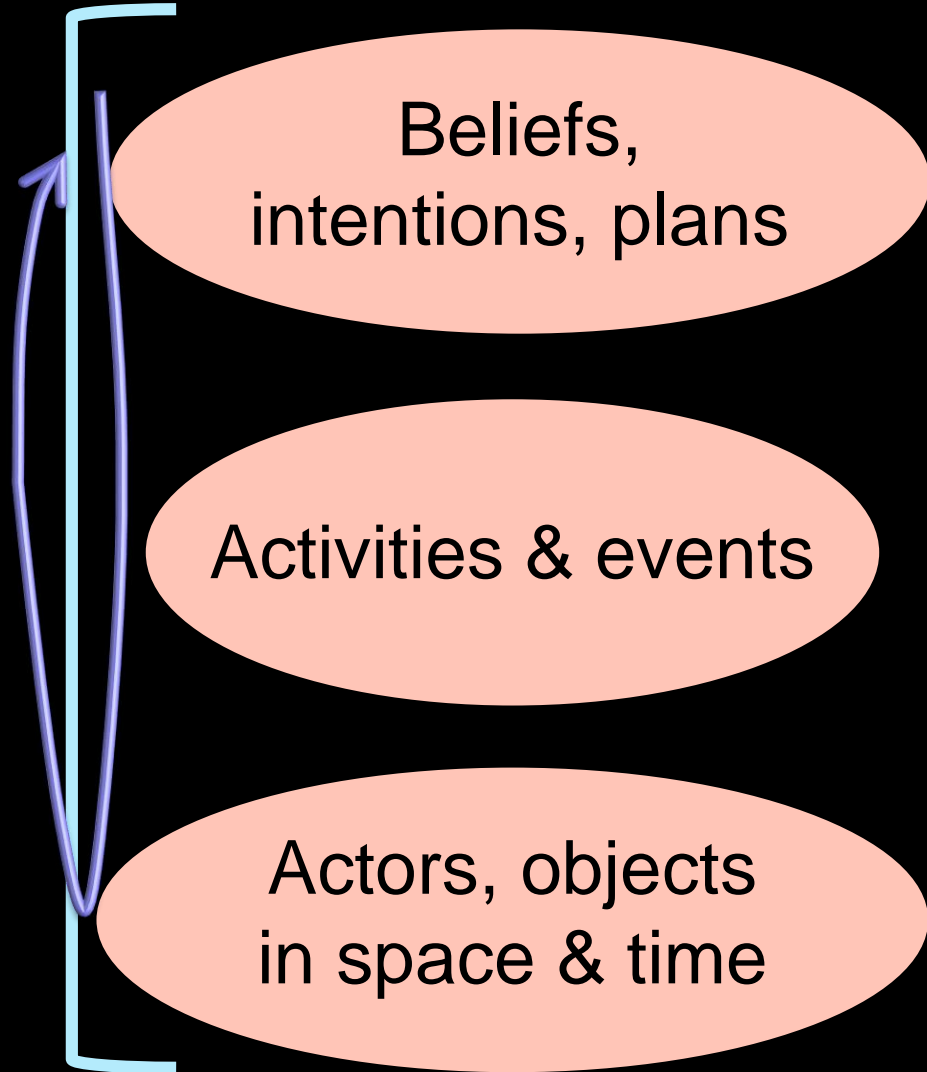
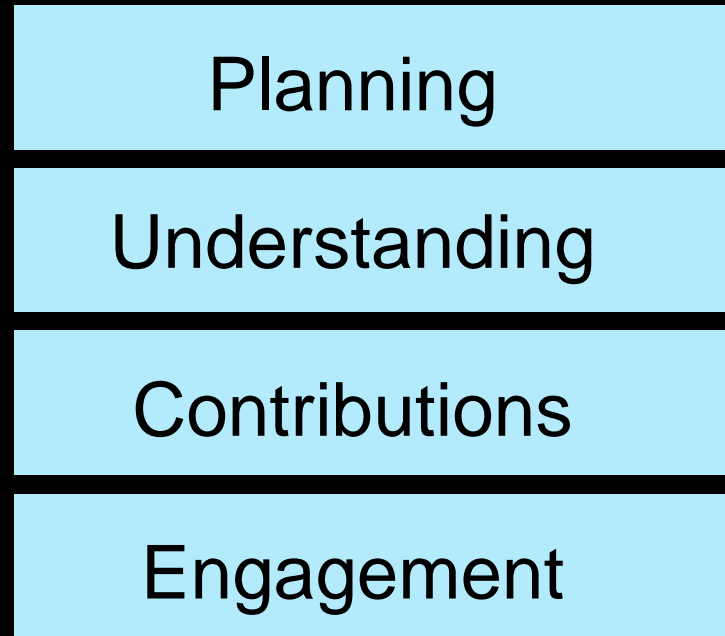
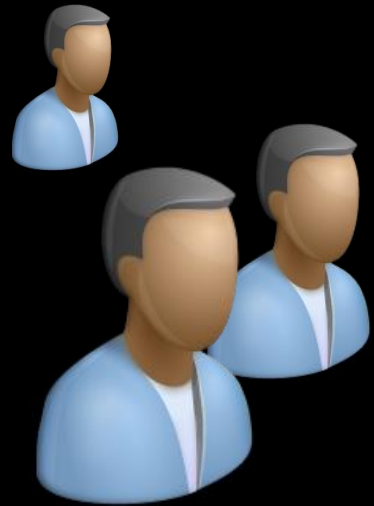


Toward Deeper Collaborations

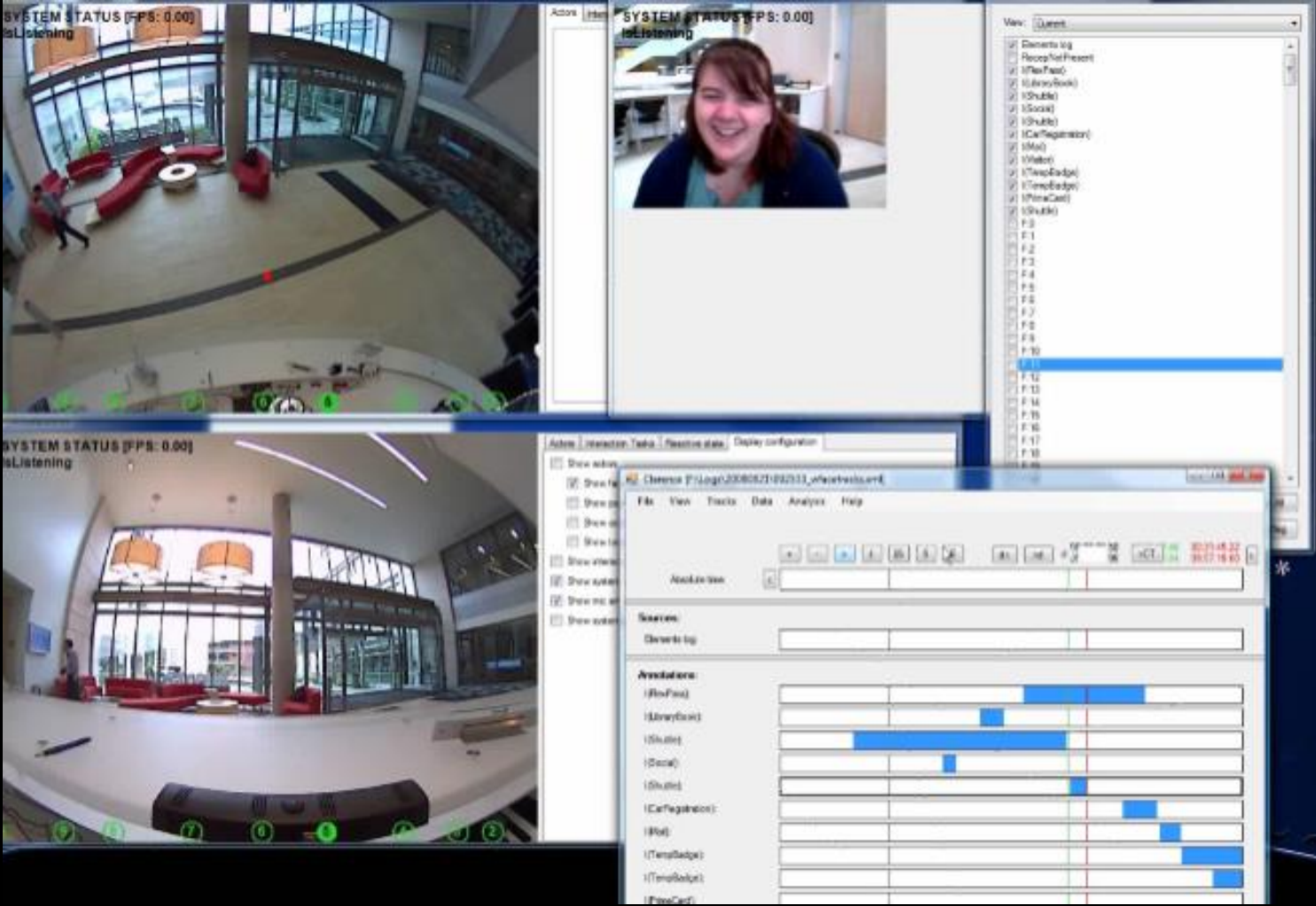
In our Lifetimes?



Situated Interaction



Situated Interaction Project



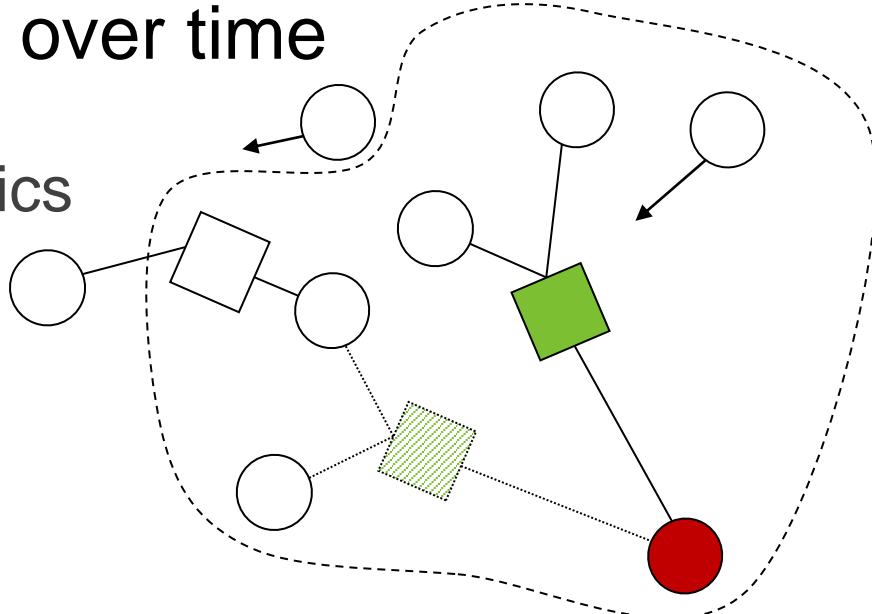
Study: Tasks undertaken by receptionists

Situated Interaction Project

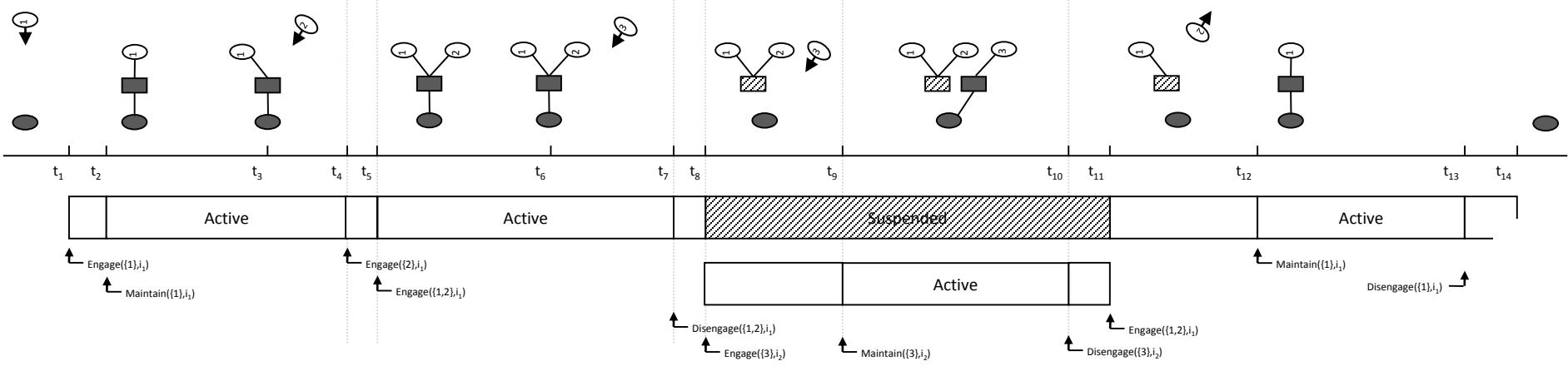
Entities, relations, intentions over time

Track conversational dynamics

Make turn-taking decisions



- system
- user
- active interaction
- suspended interaction
- other interaction





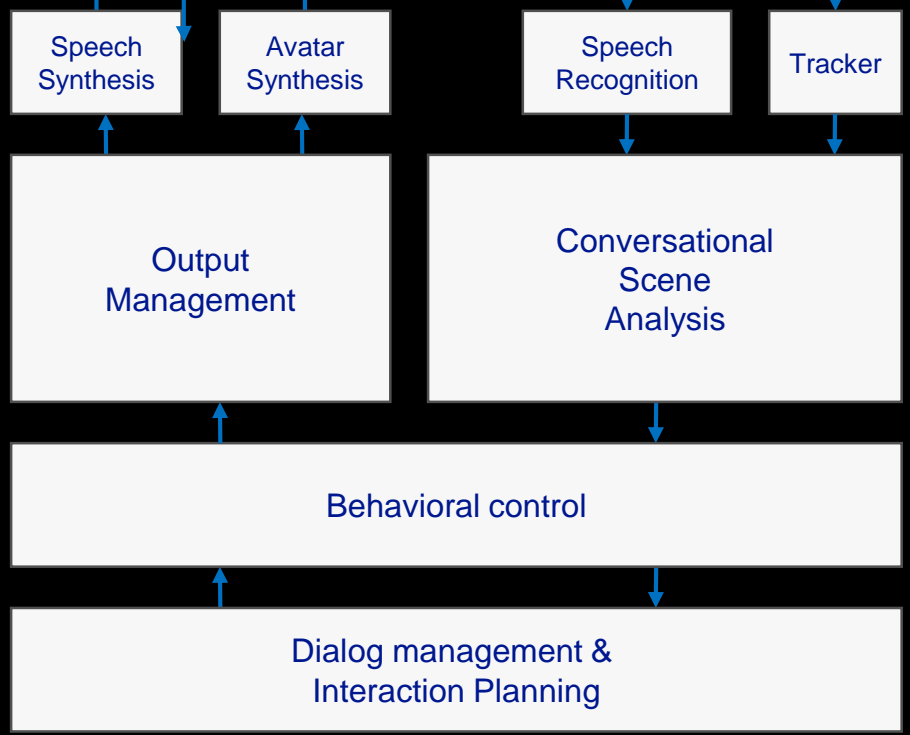
wide-angle camera

Kinect microphone array

touch screen

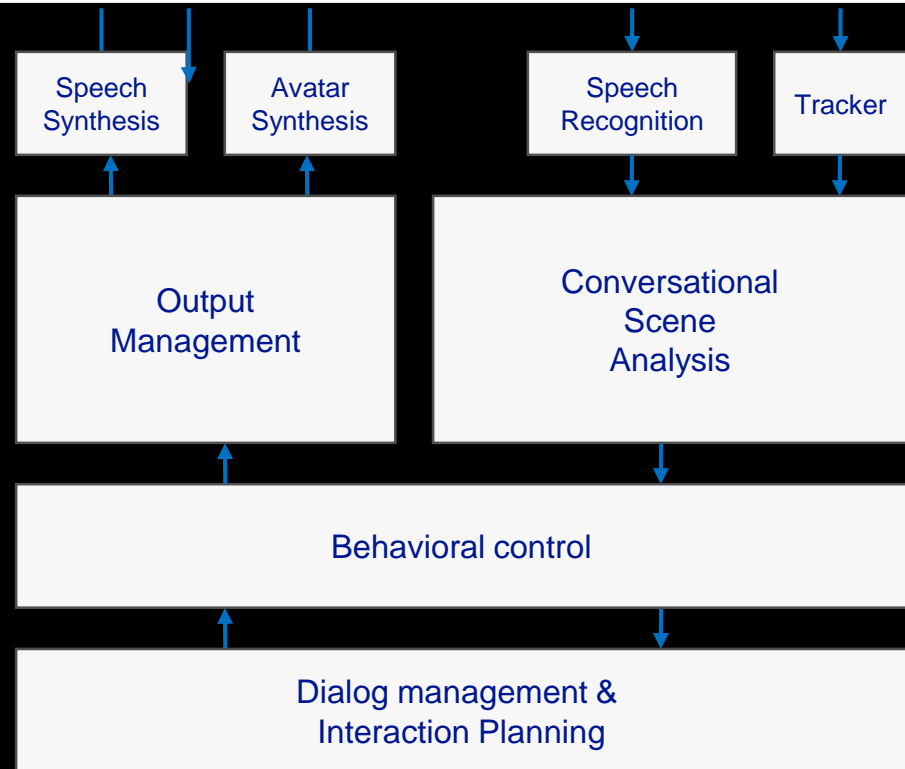
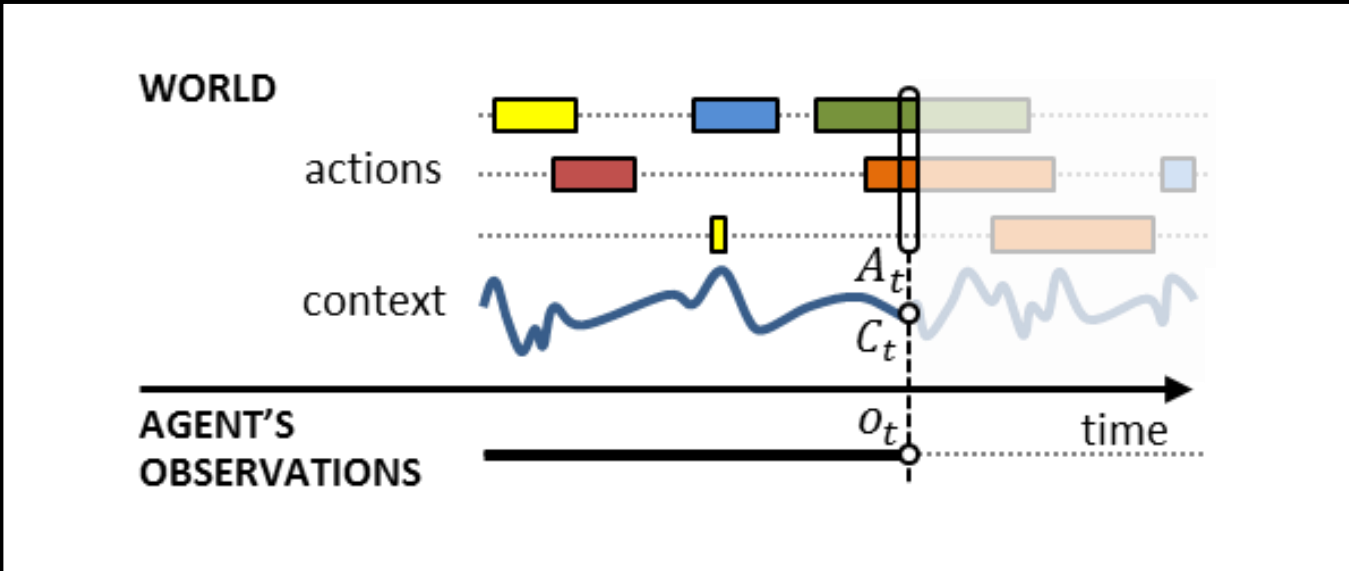
speakers

multi-core PC





multi-core PC



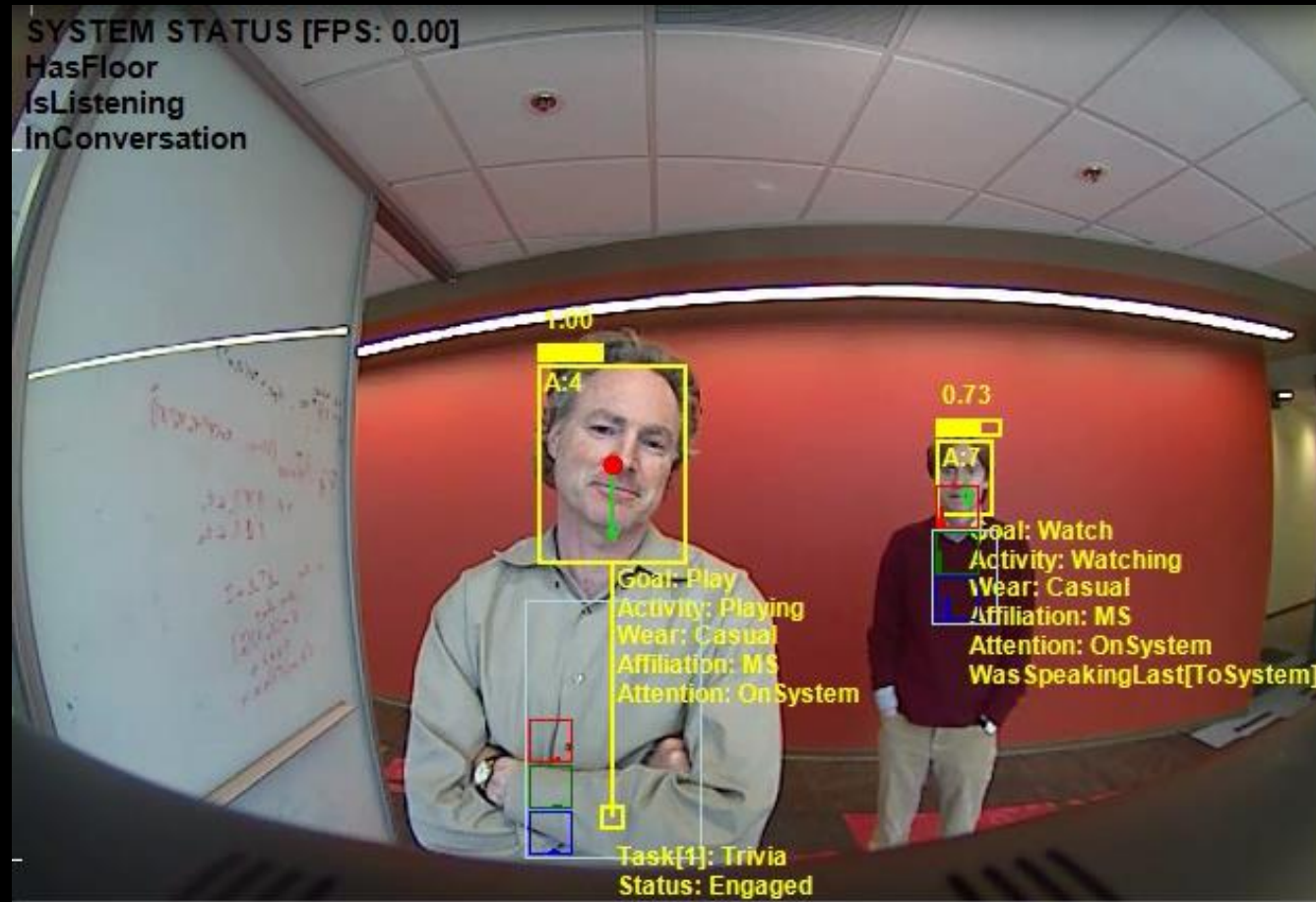
The Receptionist

Video: The Receptionist

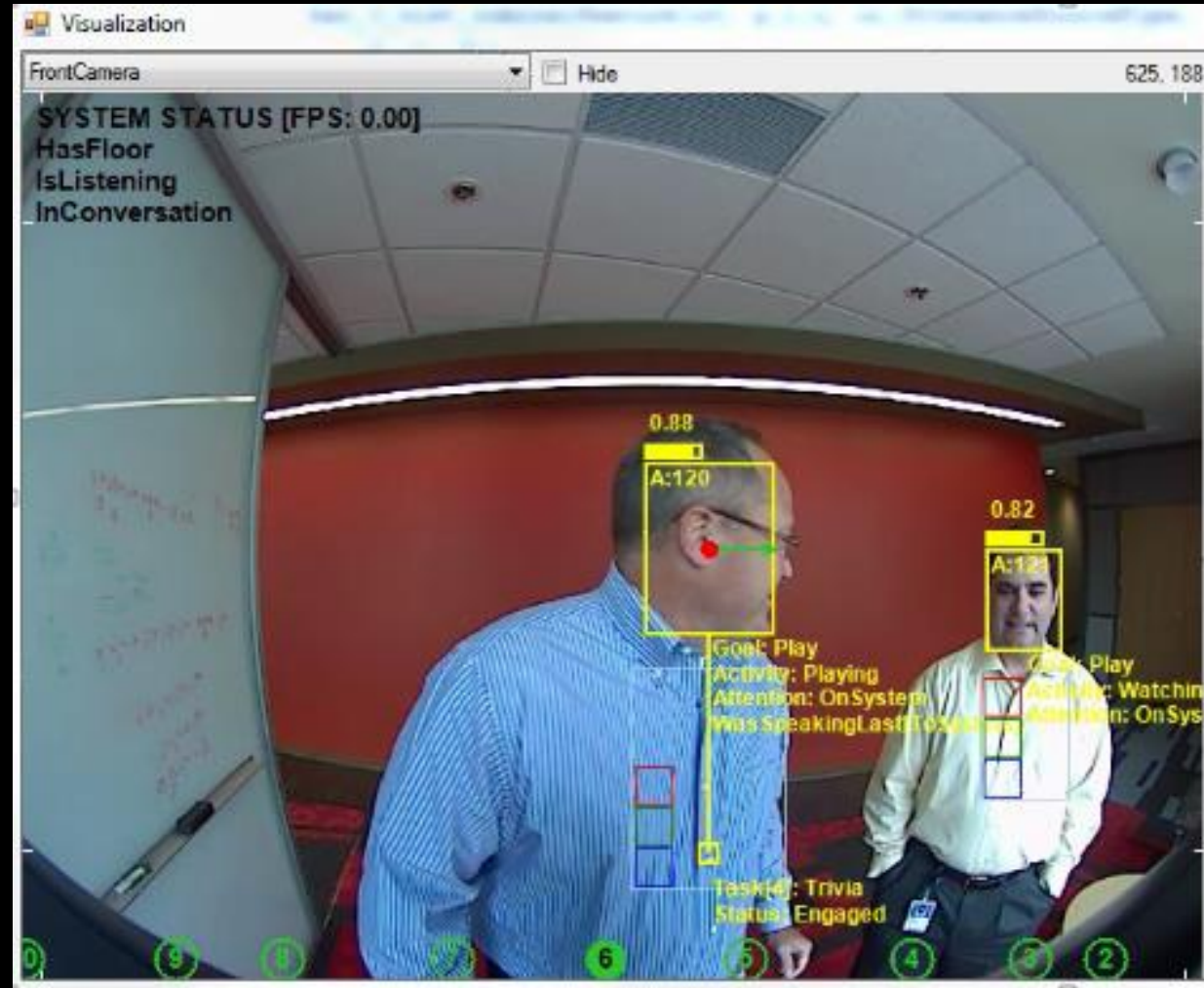


Studies of Engagement

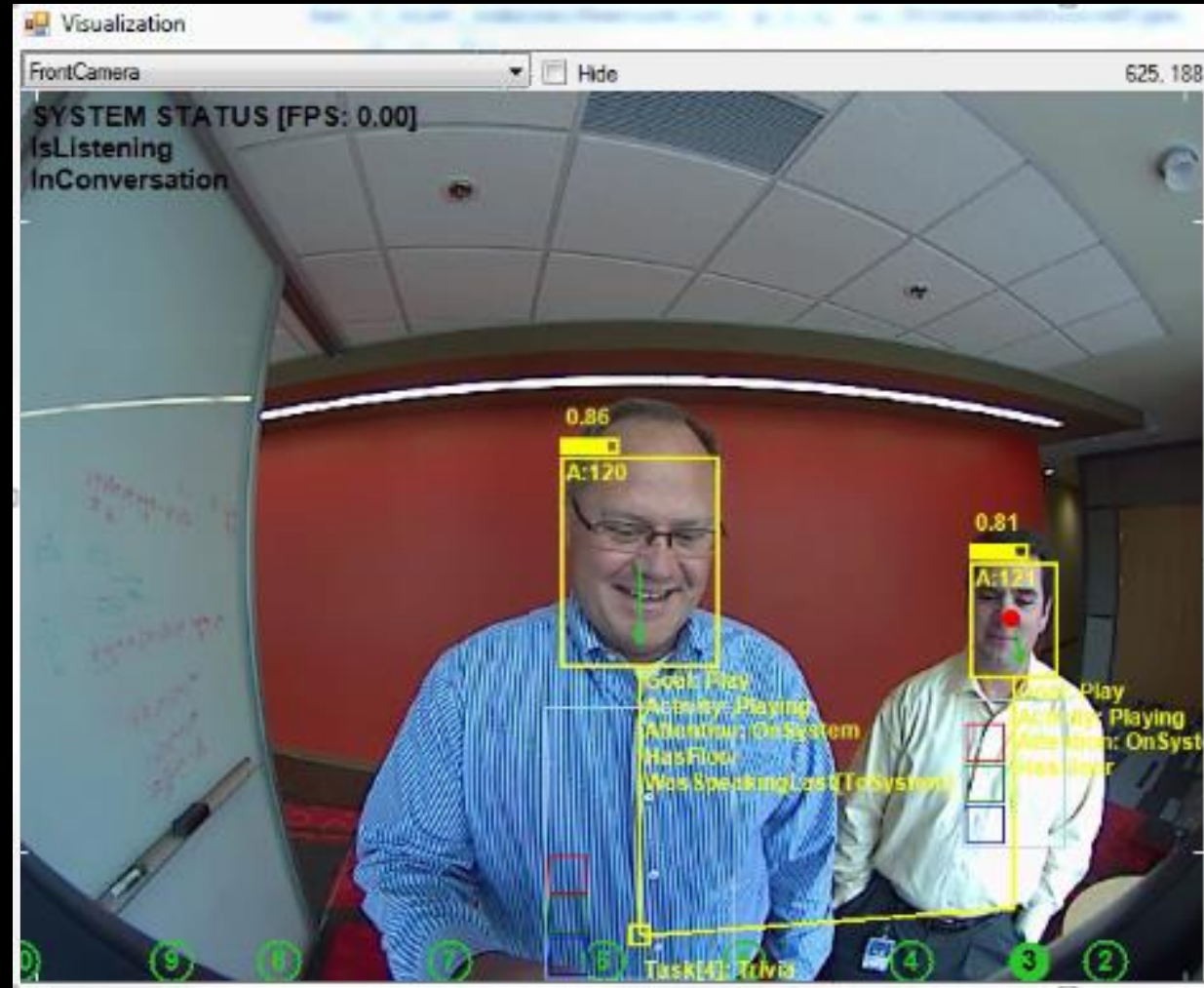
[Video: Multiparty engagement](#)



Studies of Engagement ...in the Open World











Studies of Engagement ...in the Open World

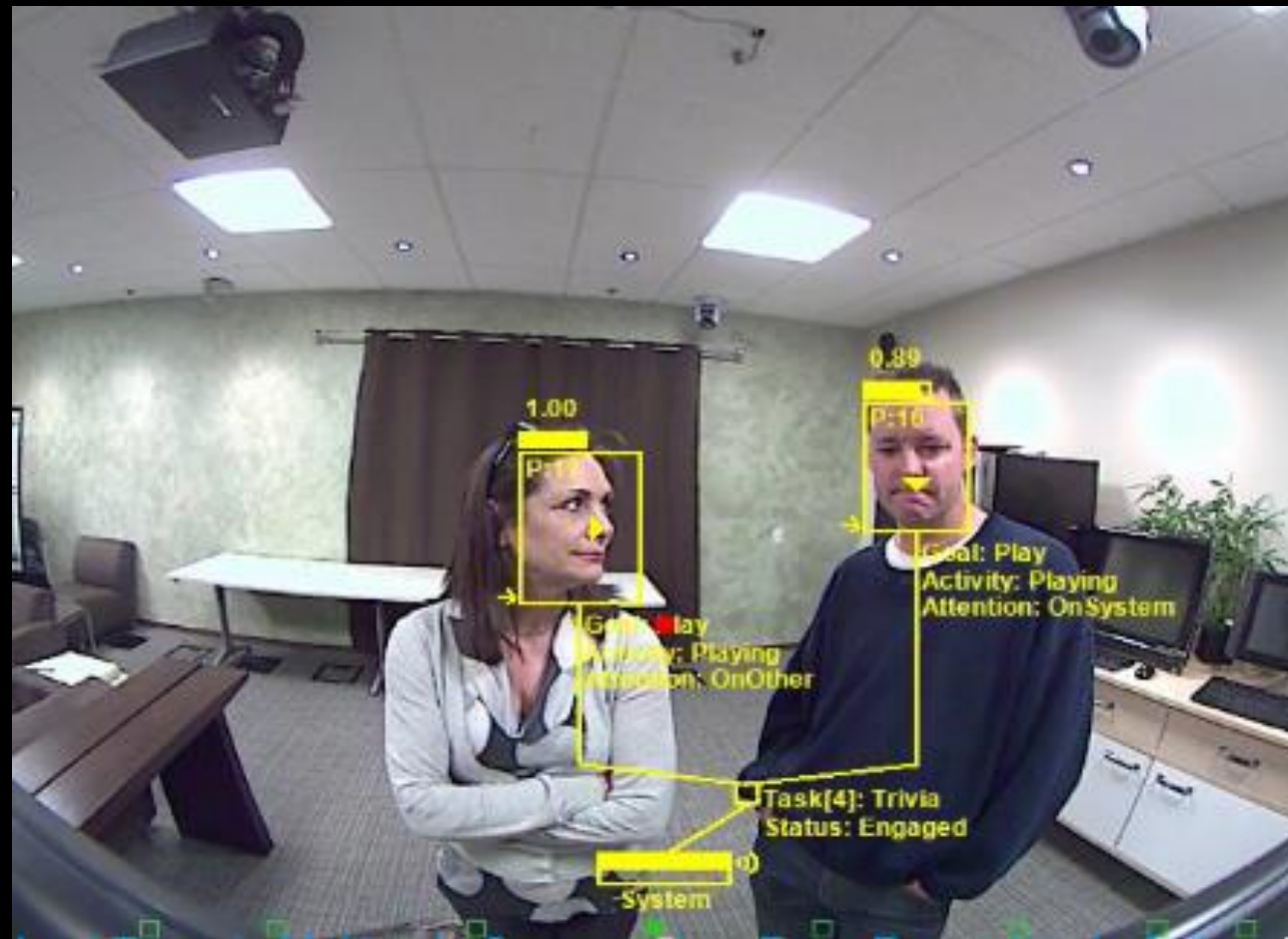


Decisions about Turns in Multiparty Collaboration

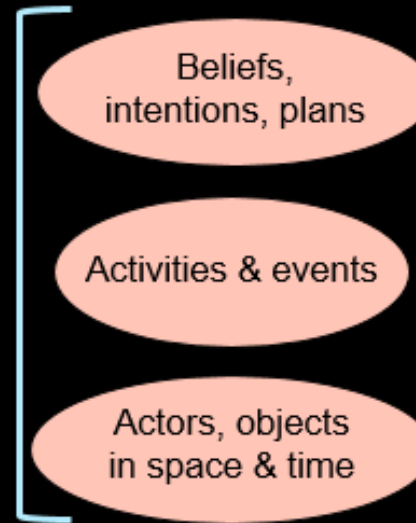
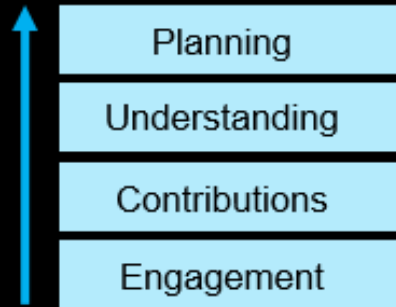
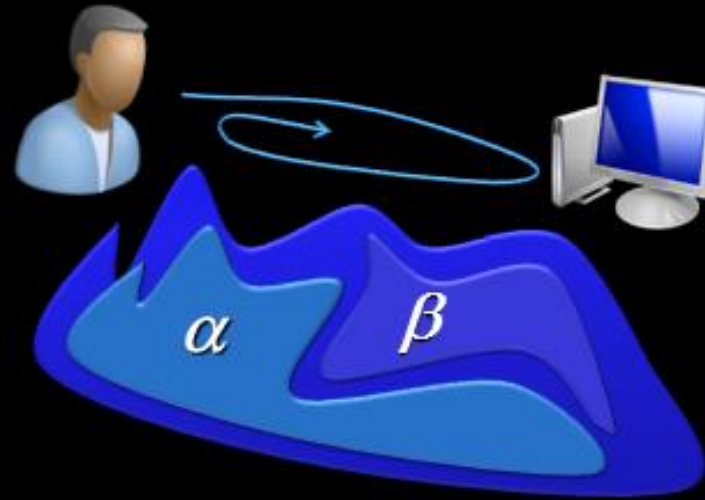
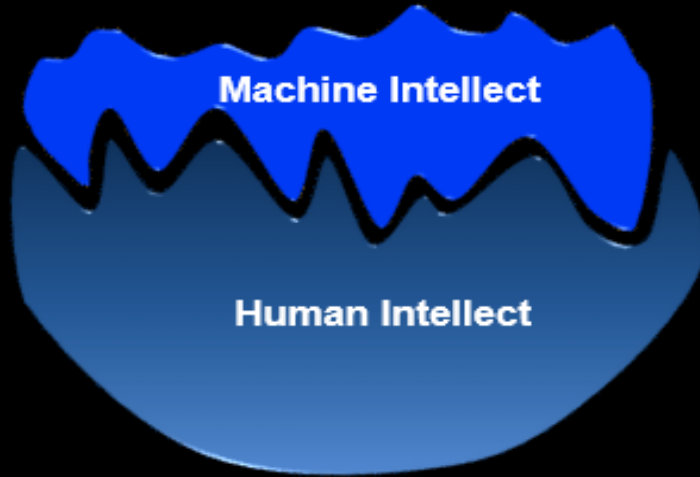


Decisions about Turns in Multiparty Collaboration

-  P: arrow indicates direction of attention
-  P: P has floor
-  P: P is the target of the floor release
-  P: P is releasing the floor
-  P: P is trying to take the floor (performs TAKE action)
-  P: P is speaking
-  P: P is an addressee
-  indicates system's gaze direction



Looking to the Future: Directions



New Applications & Services

The Assistant



Face ID

Vmail

Calendar

Room acoust.

Email

Location

Multiparty Engagement & Dialog



Prediction about *presence*

Prediction of *cost of interruption*

Prediction about *forgetting*

Prediction of *message urgency*

The Assistant

[Video: Approaching the Assistant](#)



The Assistant ...in the Open World

[Video](#)



Ecosystem of Collaborating Intelligences

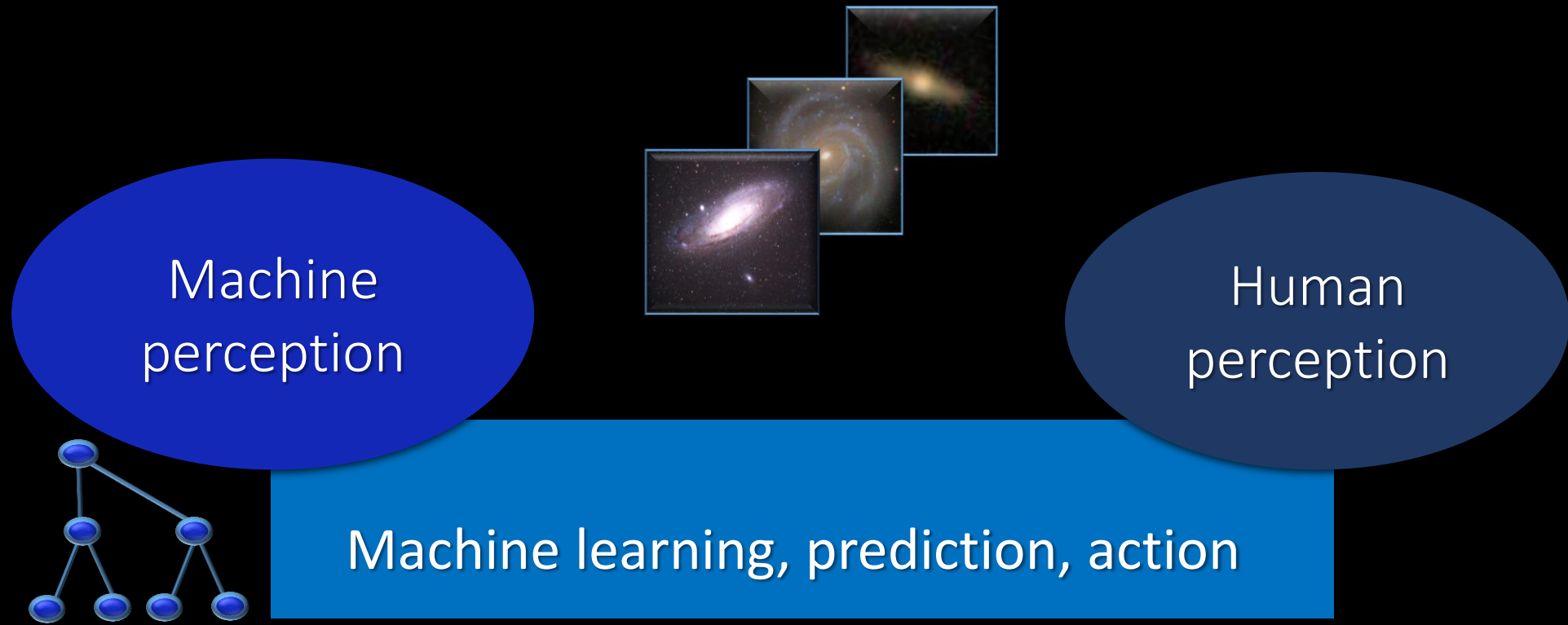
[Video](#)



New Types of Coordination

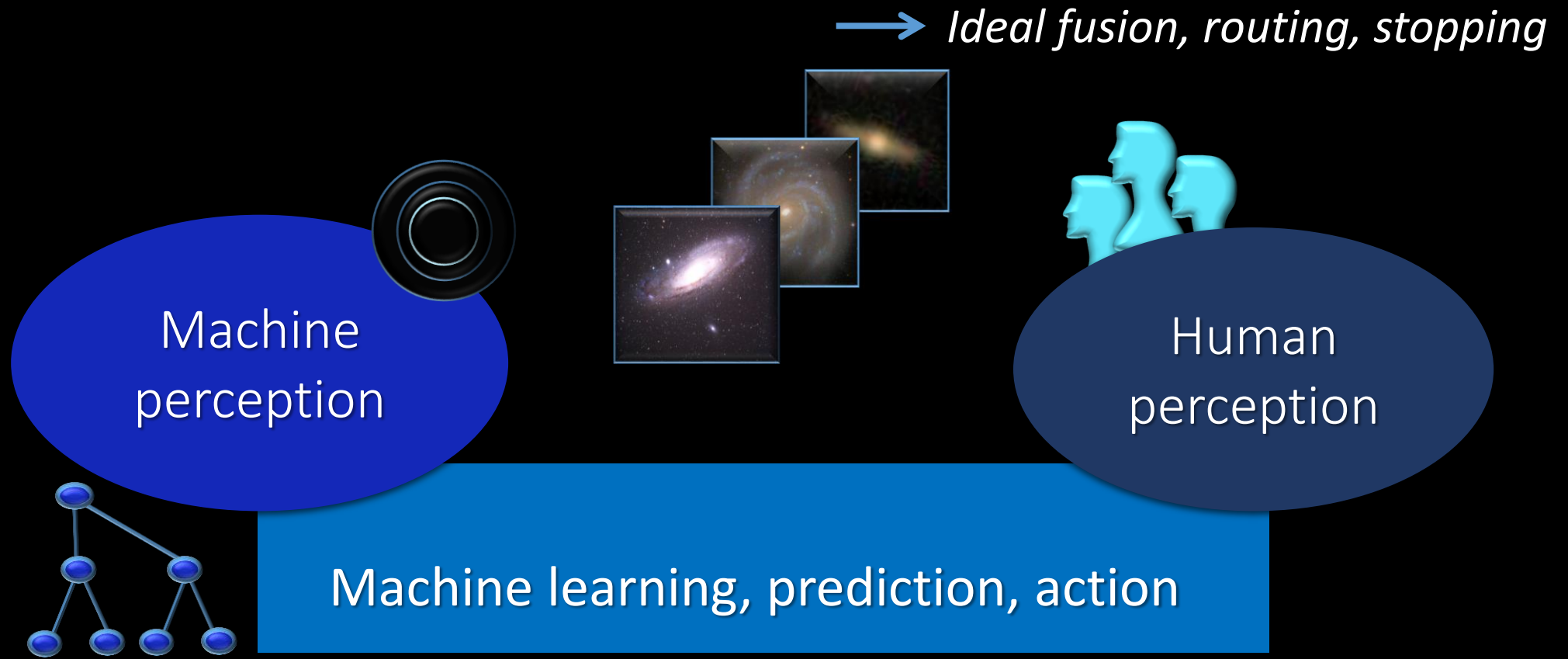
Ideal Fusion of Human & Machine Intellect

Example: Labeling Sloan Digital Sky Survey



Ideal Fusion of Human & Machine Intellect

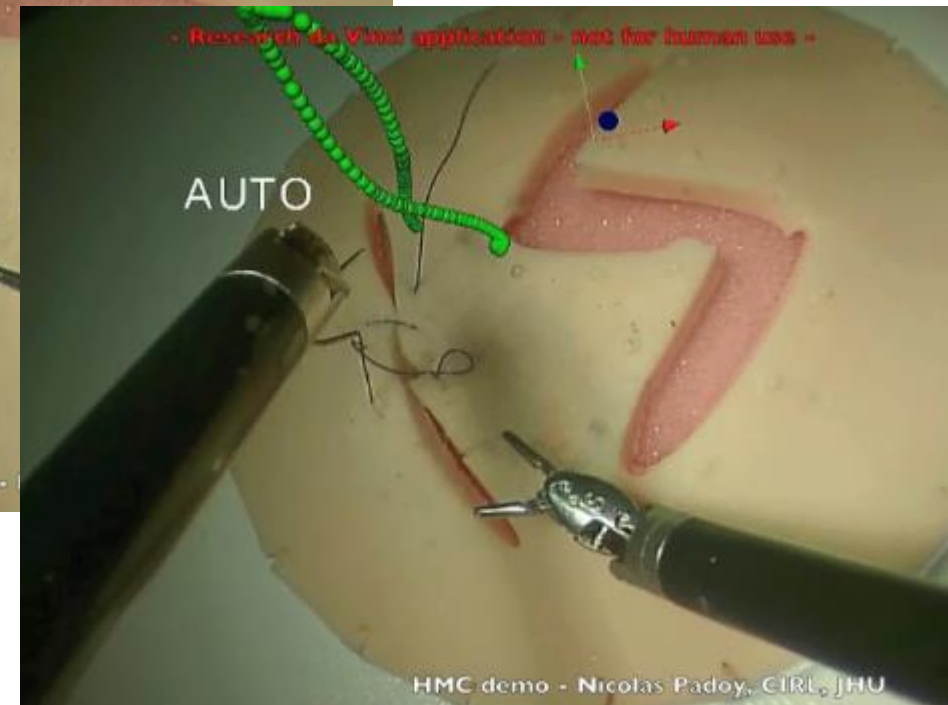
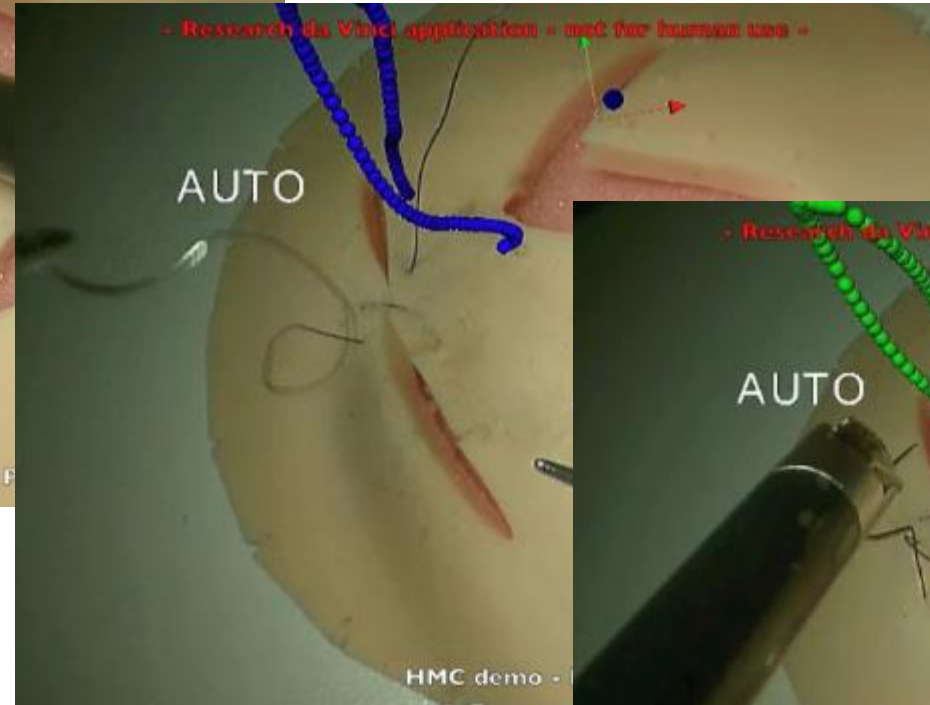
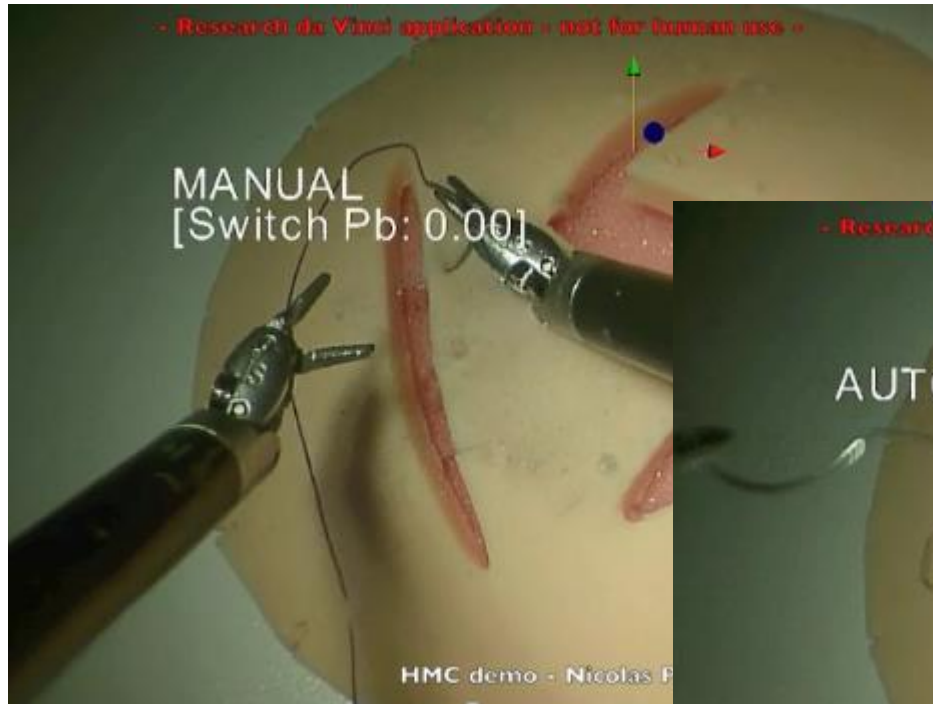
Example: Labeling Sloan Digital Sky Survey



Mix of Initiatives on Physical Tasks



Mix of Initiatives in Surgery



Mix of initiatives on road

Example: Tesla Autosteer



Mix of initiatives on road

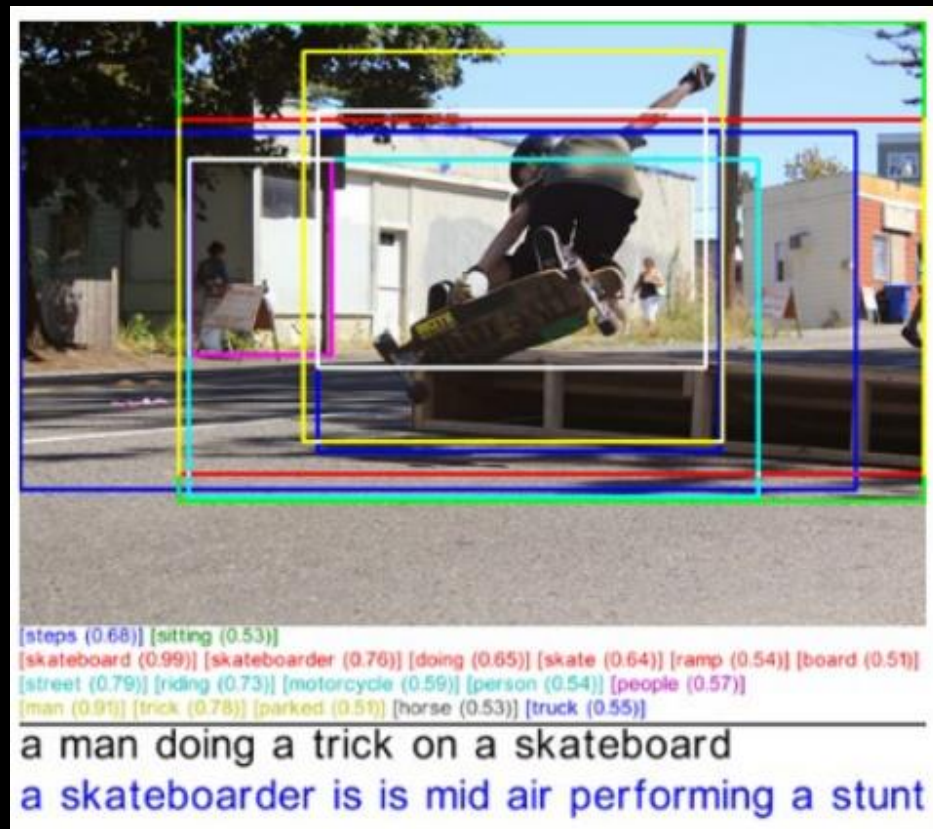
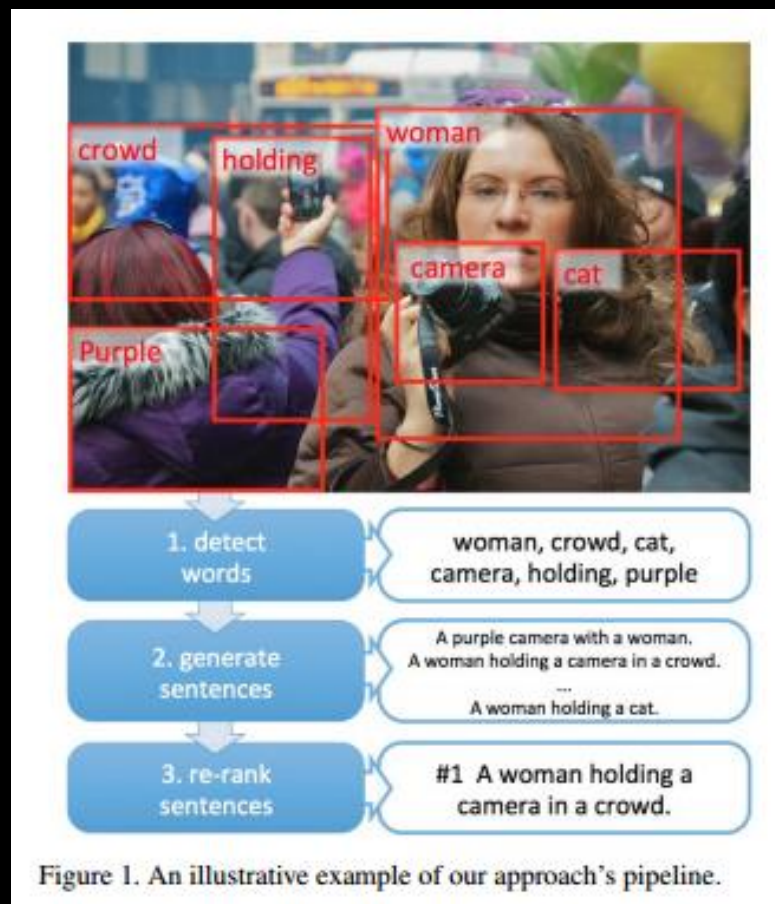
Example: Tesla Autosteer

Autosteer is no longer steering Model S confidently.
Take over steering immediately.

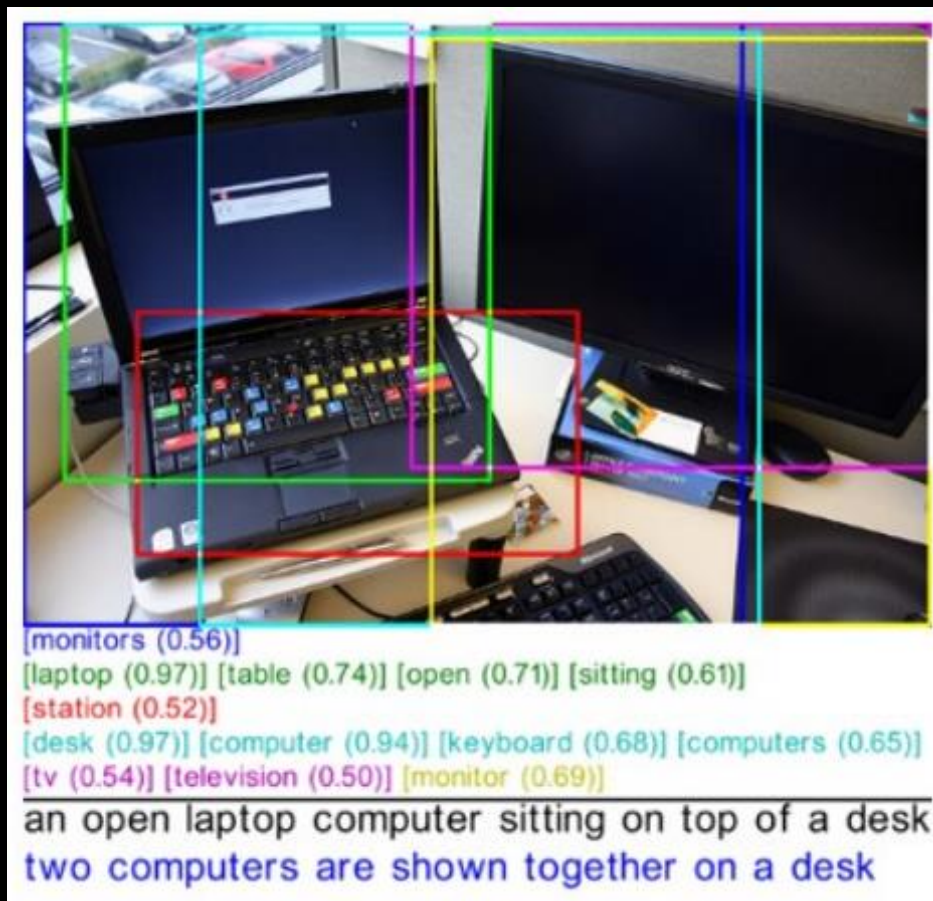


Advances in Perceptual Capabilities,
Competencies, and Pipelines

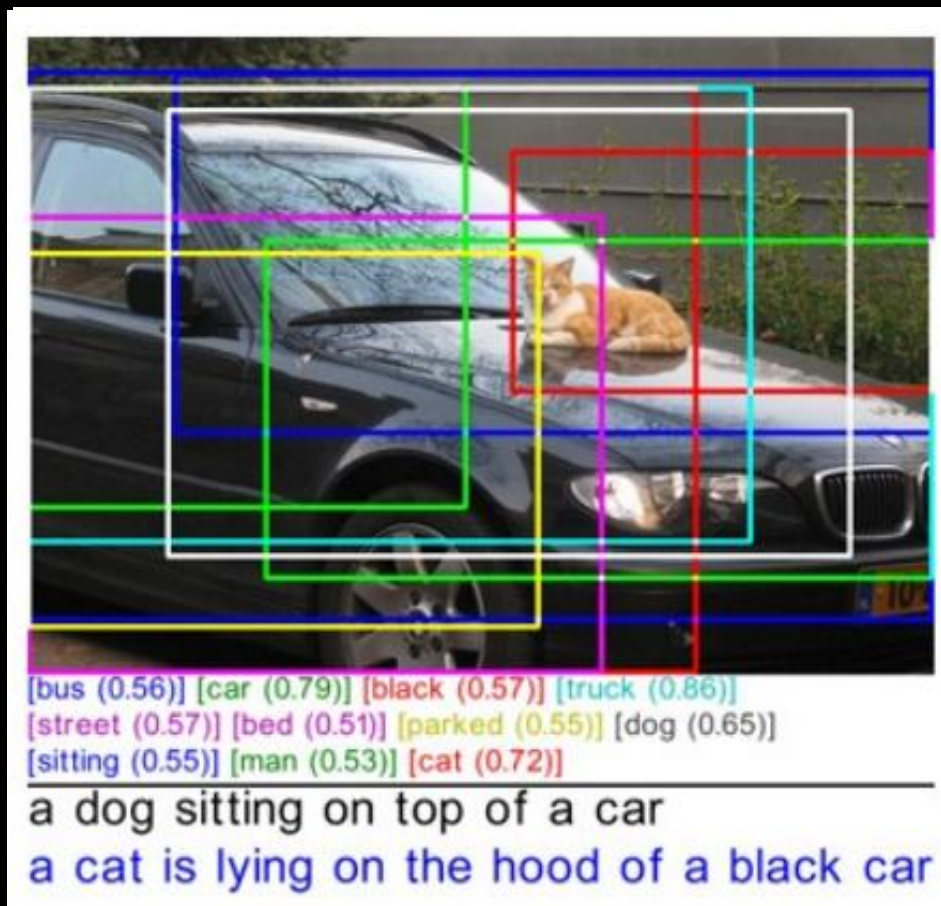
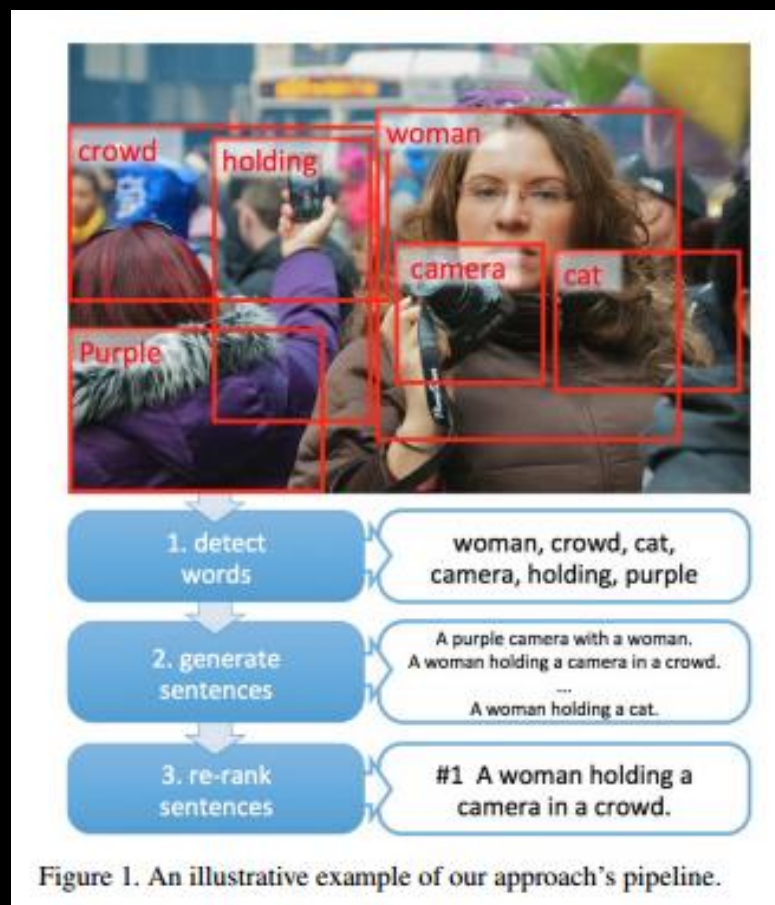
Advances in Perceptual Capabilities & Pipelines



Advances in Perceptual Capabilities & Pipelines

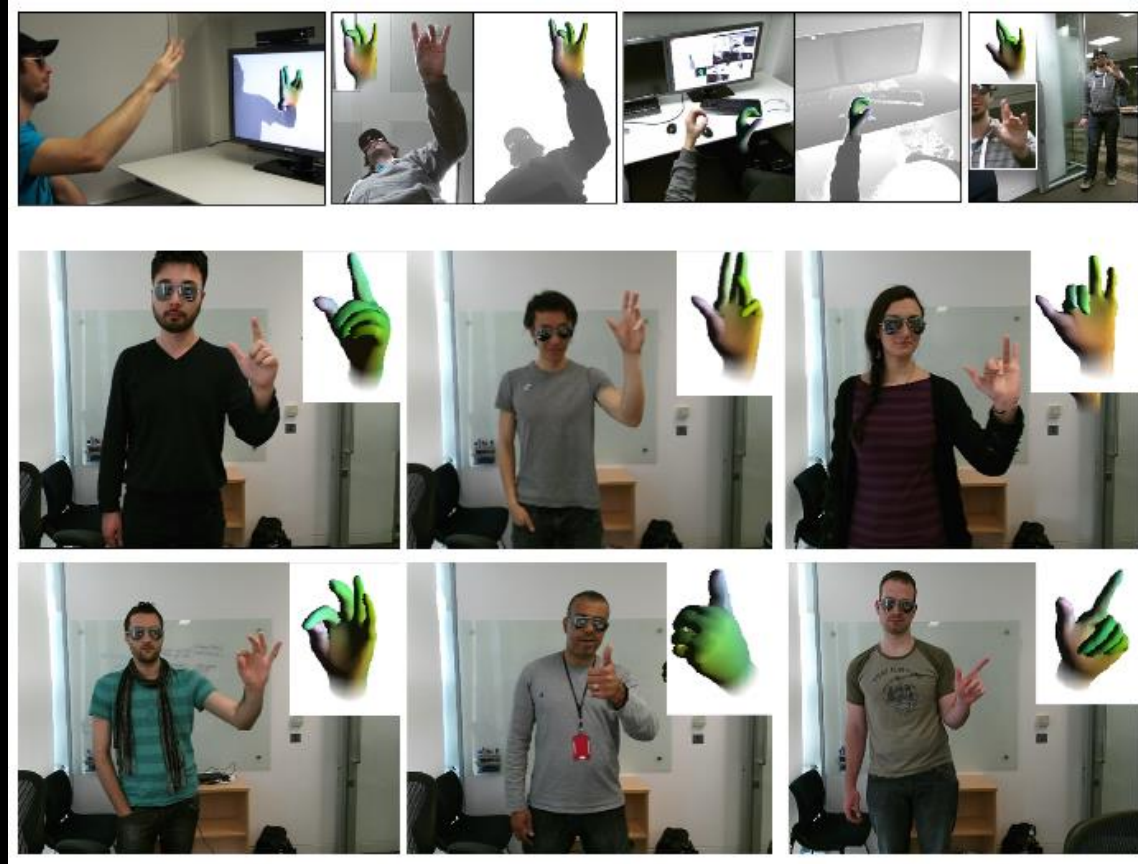


Advances in Perceptual Capabilities & Pipelines

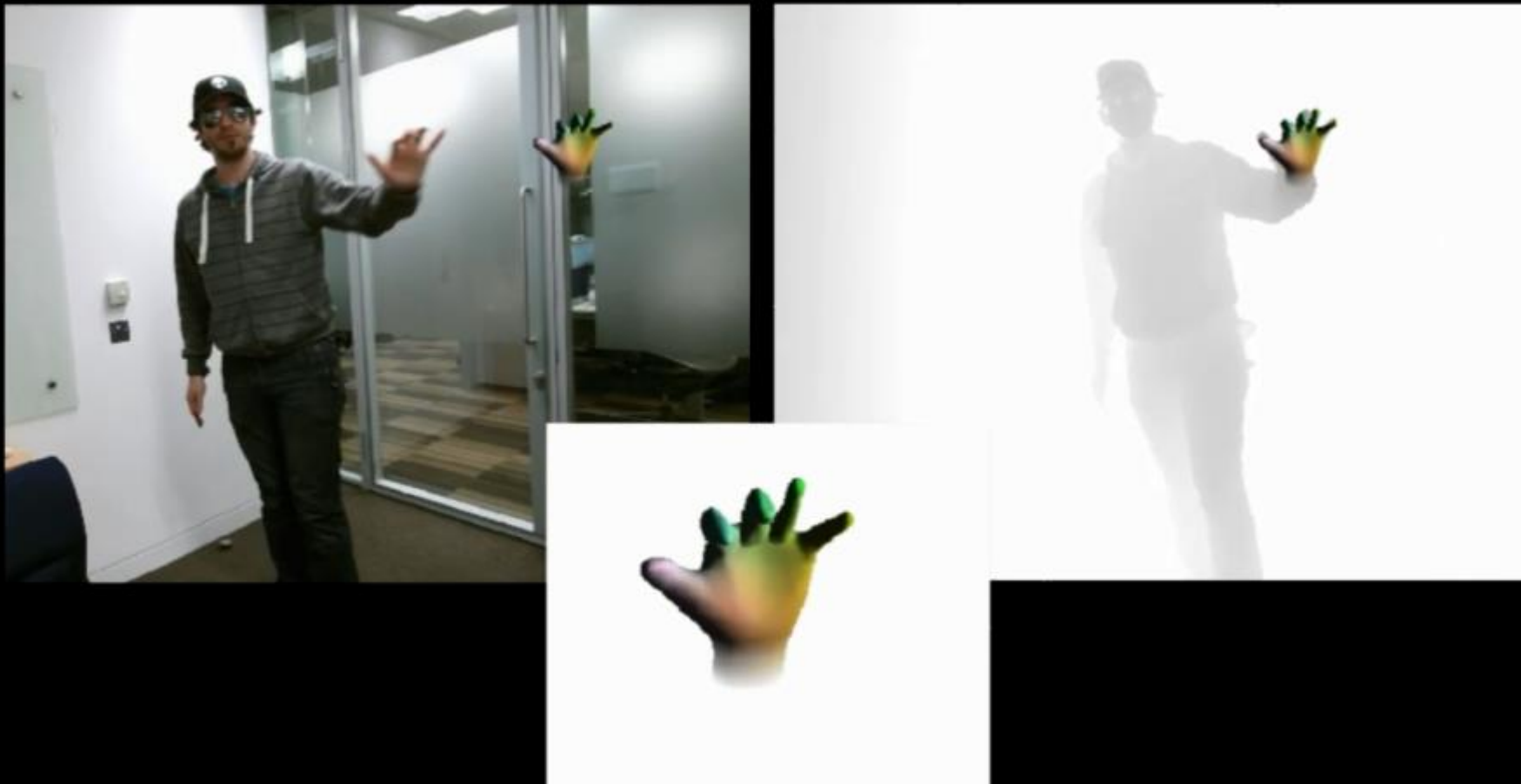


New Interactive Sensing & Capabilities

Example: Real-time hand tracking



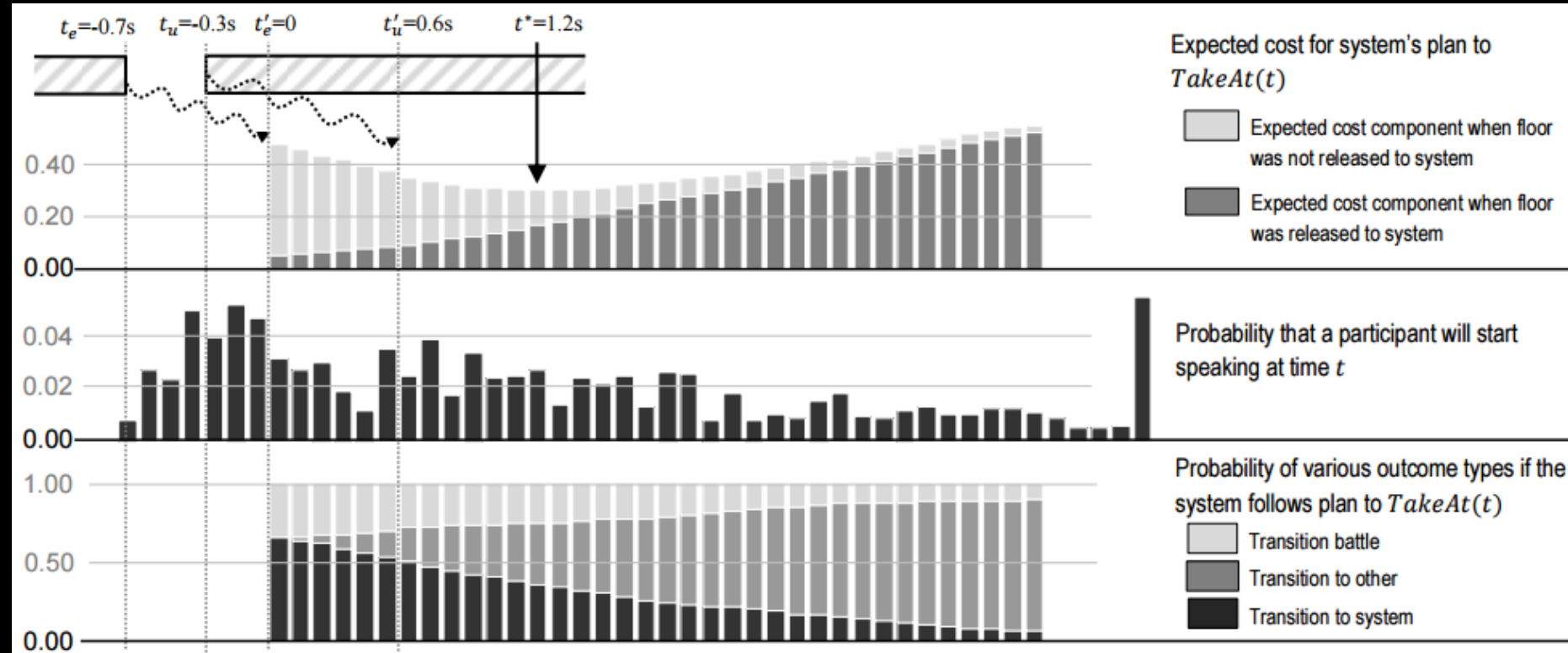
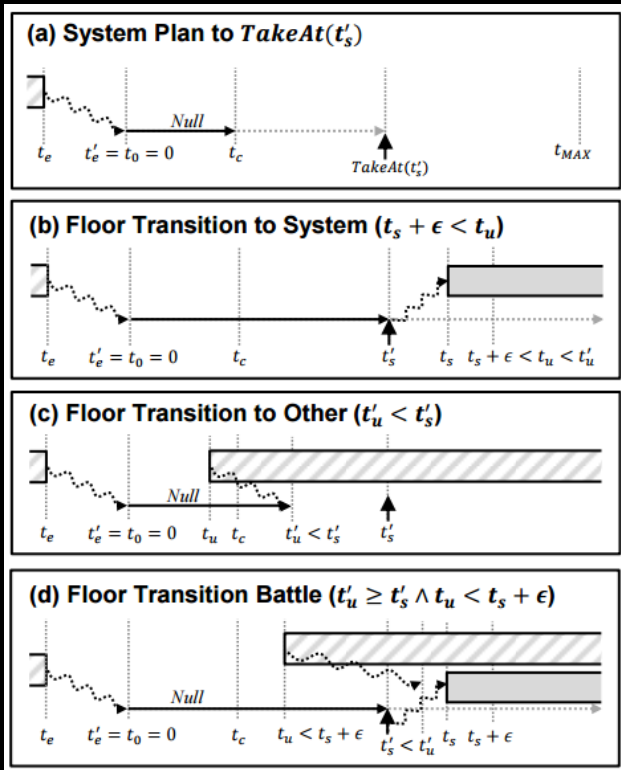
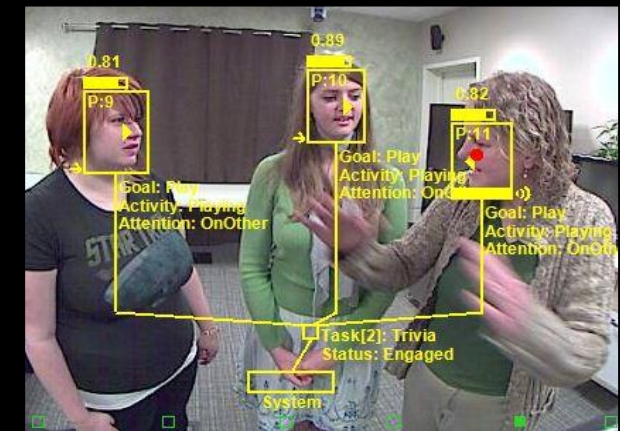
Video: Recognizing Subtleties of Hand Pose



Toward Fluid Natural Dialog & Coordination

Challenge: Timing of Dialog Actions

Dialog decisions under uncertainty



Challenge: Natural Backchannel

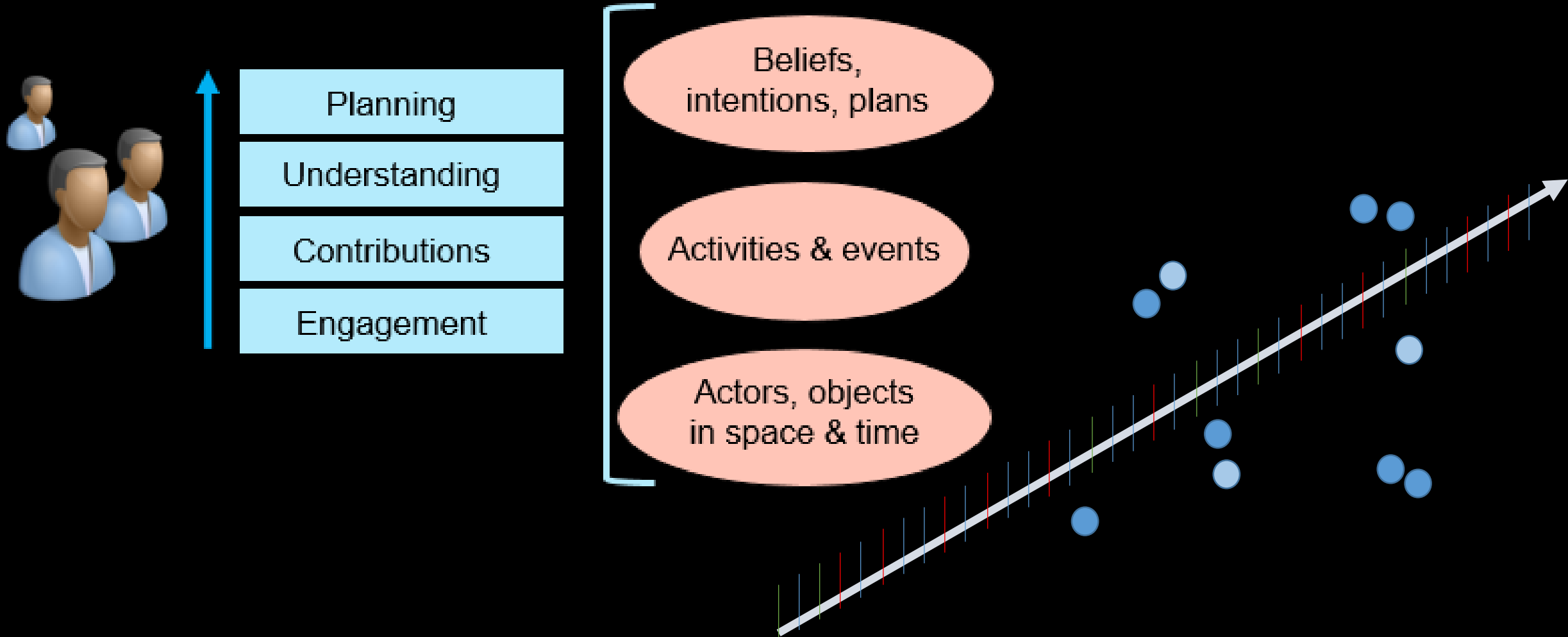
Video

ICMI 2014

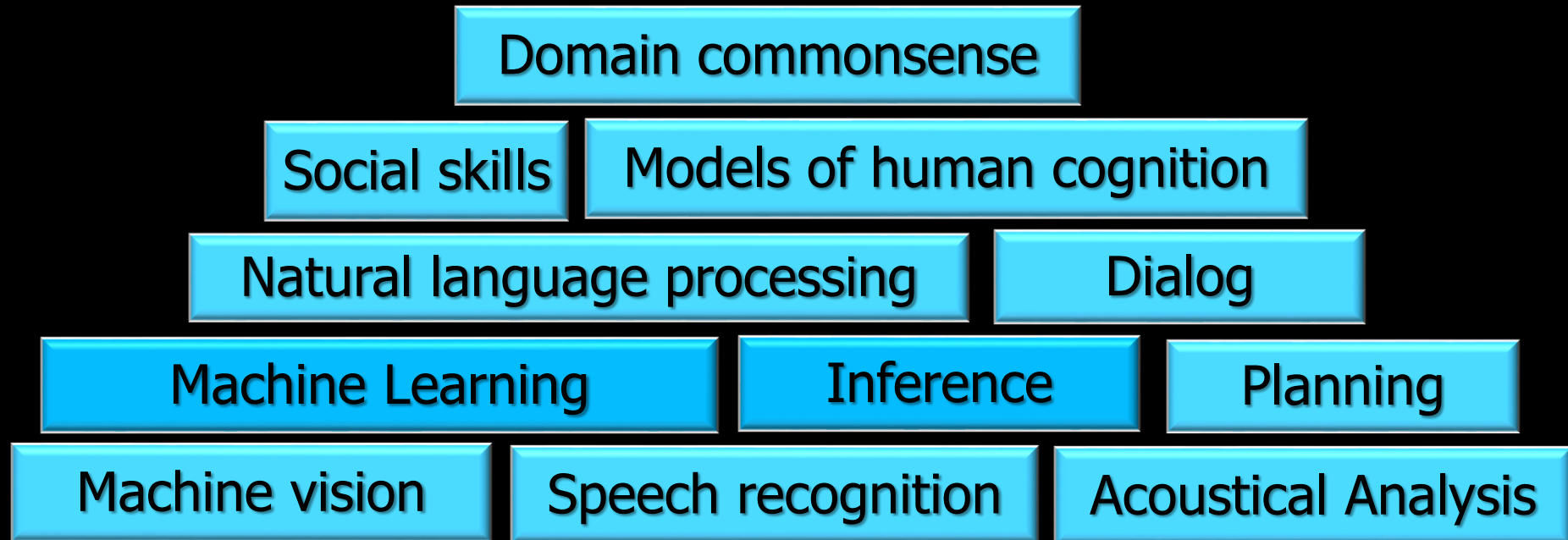


A Grand AI Challenge: General Situated Collaboration

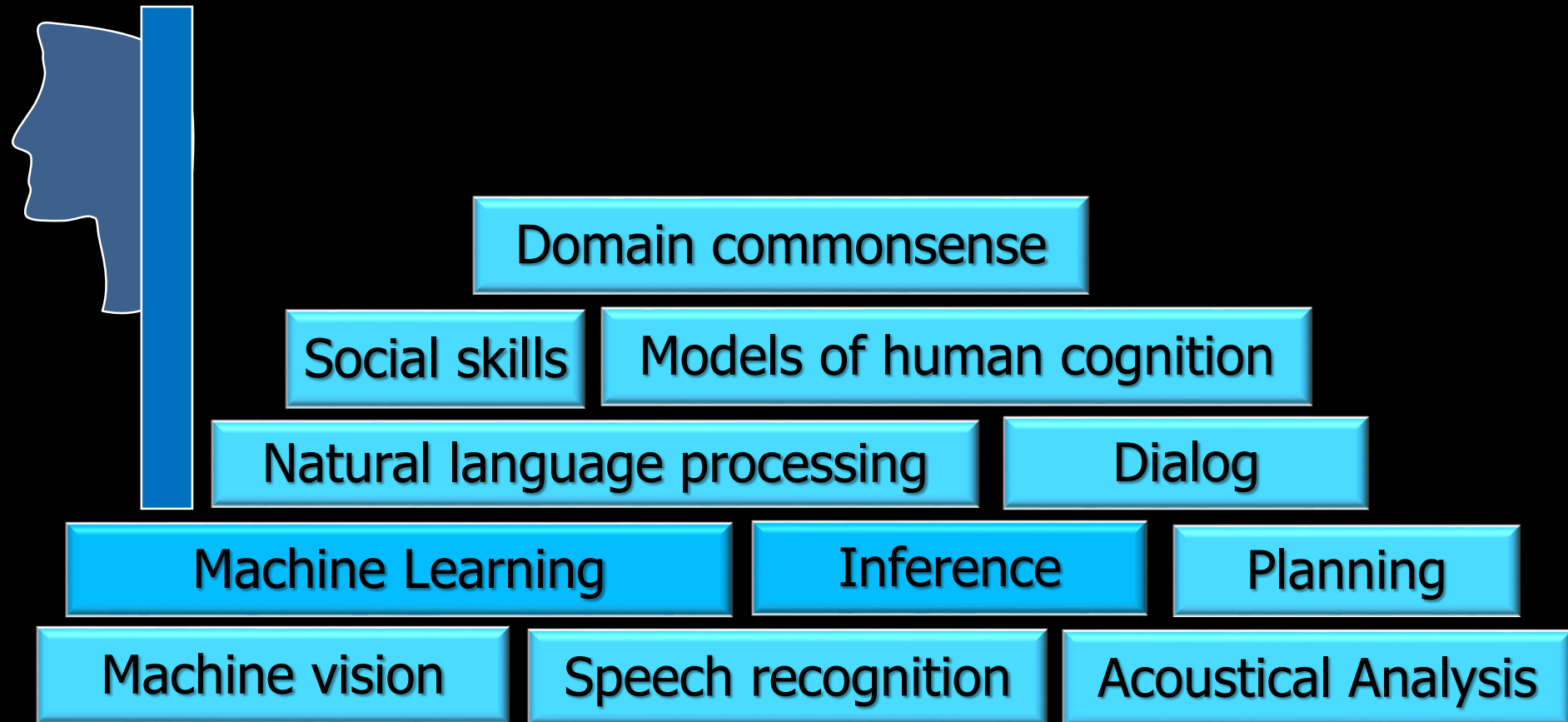
General Situated Collaboration



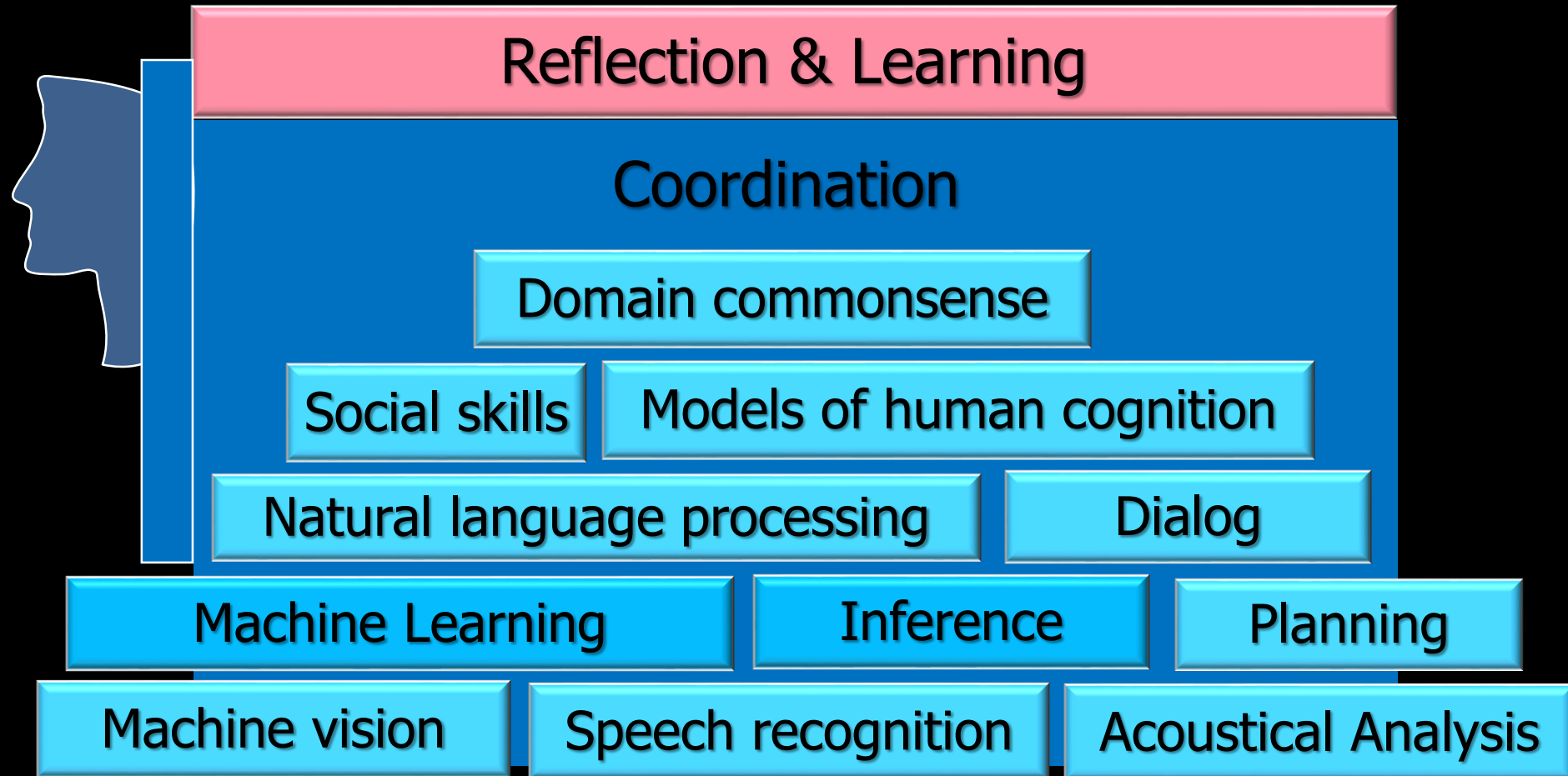
General Situated Collaboration



General Situated Collaboration



General Situated Collaboration



Critical Enablers:
Tools, Platforms, Infrastructure

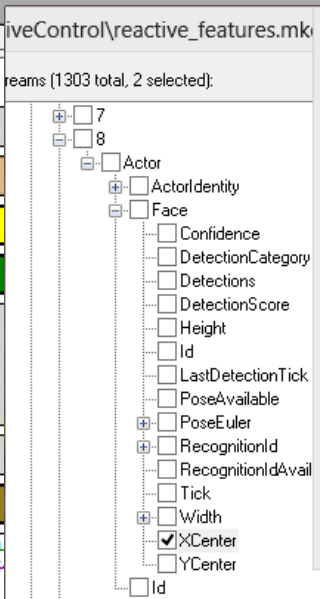
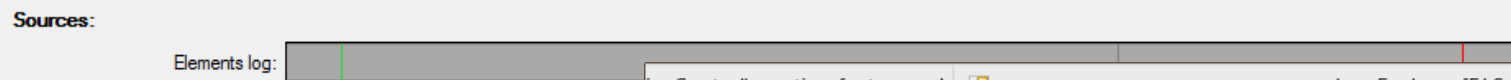
Open session folder + - > || IIS S E M x d< >d >CT

Clear <None> Snap

00:00:58.465 00:01:24.412
 00:55:19.999 00:56:18.464 00:56:44.412
 14:32:00.768 14:32:59.233 14:33:25.180

View: Current Save

- RFID Events
- Speech Synthesis
- Floor Behaviors
- Floor State
- Recognition(Recognition-CFG)
- Gui Events
- GazeControl



Log Explorer [F:\Sessions\FaceConfidence\Pass\OutsideEricsoffice\asi-si-05\20130522\155130_A_0000\Clarence.xml]

File View Tracks Data Analysis Help

Open session folder + - > || IIS S E M x d< >d >CT

Clear Vision source Snap

Absolute time: < >

Common.ExtendedMemory:

Floor Behaviors:

GazeControl:

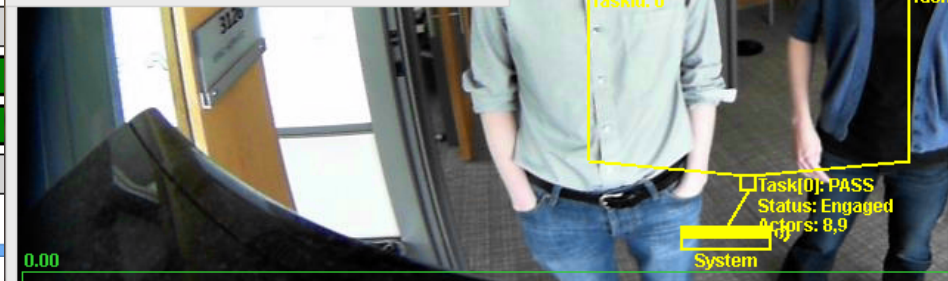
Reactive FS:

AAU:

Beryllium.SubStream:ConversationalSceneAnalysis.SubStream:S

Min Y: 350.00 Max Y: 750.00 P Dot

Close



Train and Evaluate M

Define Learning Problem Construct Training Dataset Train Model Run/Evaluate Model

Select folder R C:\LogExplorer

faceconfidence.lpd

Learning Problem Structure:

Problem type: BinaryClassification for: EachTickInInterval Binary classification at every tick within

Interval definition

Interval definition: WhenFeatureStreamExists Predictions are made during an interval when an interval feat

Interval FS (IFS): Nitrogen.VisionProcessor.MultiFaceTrackingSensor.Data.*.FaceTrackingSensorData.Id

Features definition

Features: [...].HeadRegionFGDensity.AbsoluteCentering(0).5.IntervalMean(-10.0)
 [...].HeadRegionFGDensity.AbsoluteCentering(0).5.IntervalMean(-20.0)
 [...].HeadRegionFGDensity.AbsoluteCentering(0).5.IntervalMean(-50.0)
 [...].HeadRegionFGDensity.AbsoluteCentering(0).5.IntervalMean(-100.0)
 [...].Height
 [...].Height.Delta.Abs.IntervalMax(-2.0)
 [...].Height.Delta.Abs.IntervalMax(-5.0)
 [...].Height.Delta.Abs.IntervalMax(-10.0)
 [...].Height.Delta.Abs.IntervalMax(-20.0)
 [...].Height.Delta.Abs.IntervalMax(-50.0)

81 feature(s) selected from vision\visionprocessors\processor1\vision_features.

Label definition

Label type: Binary

Enabling Fast-Paced Prototyping

[Video: Hackathon project on sight for the blind](#)

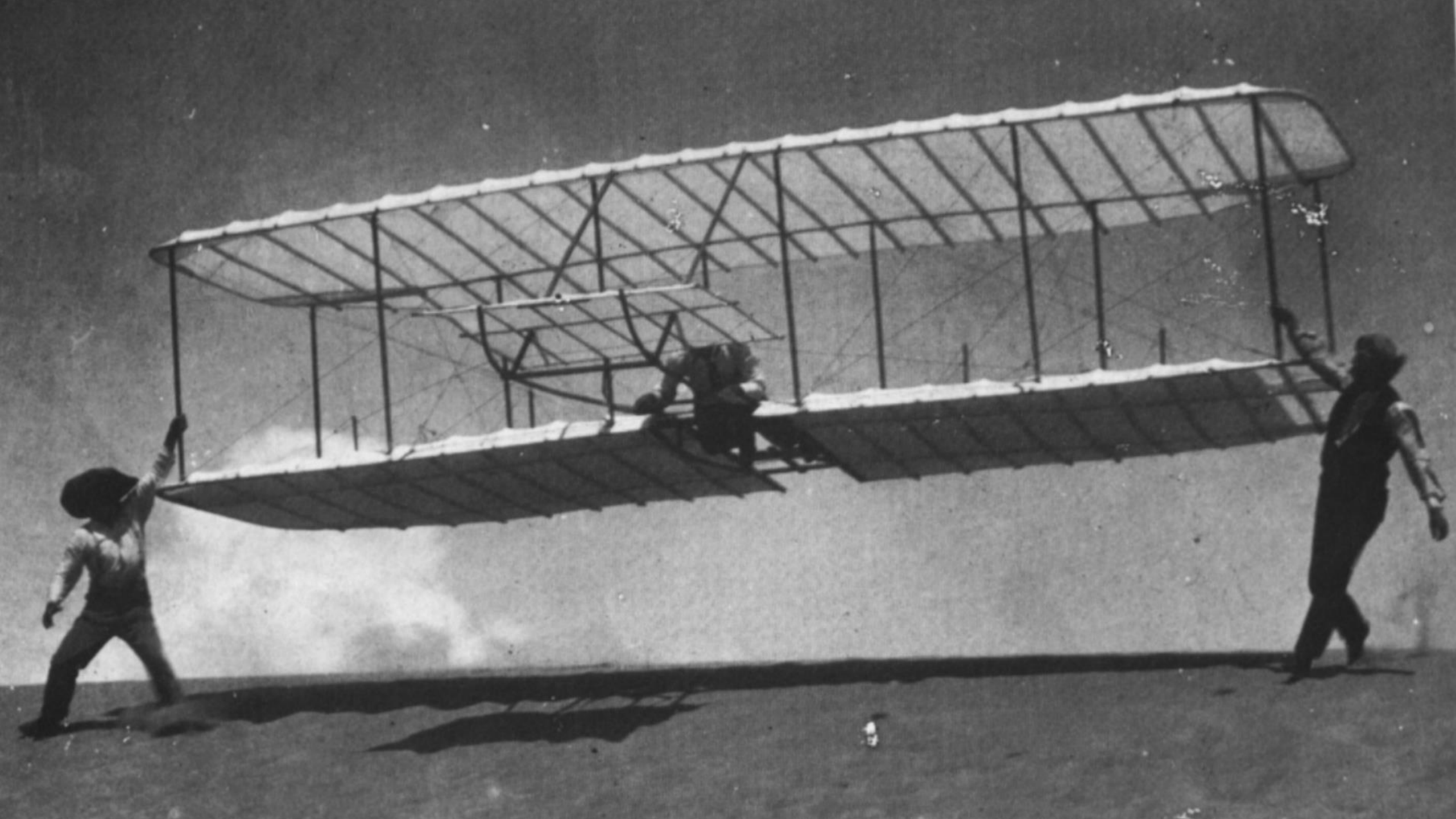


Tools enable fast-paced exploration and prototyping

Getting off the ground



Critical Connections & Collaborations











Dan Bohus



Tim Paek



Ece Kamar



Zicheng Liu



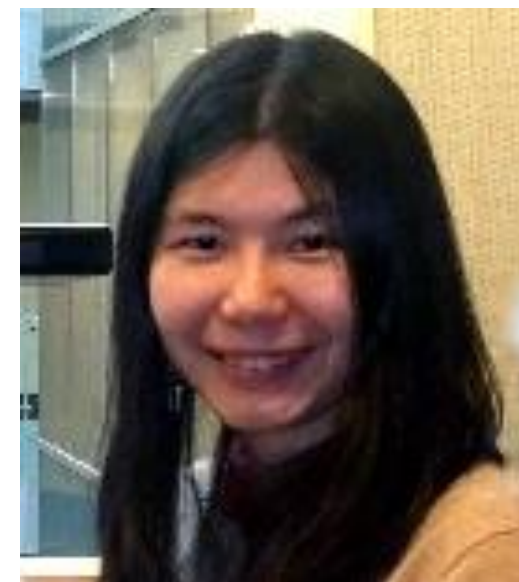
Stephanie Rosenthal



Tomislav Pejsa



Sean Andrist



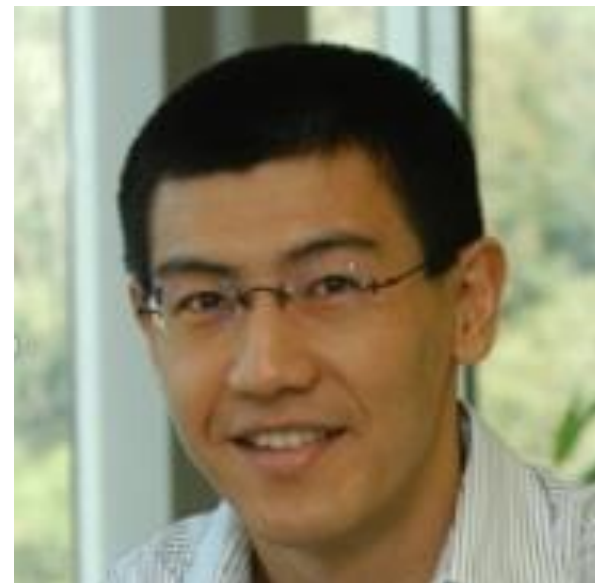
Zhou Yu



Nuria Oliver



Ashish Kapoor



Kentaro Toyama



John Krumm



Meg Mitchell



Jamie Shotton



Jack Breese



David Heckerman



Susan Dumais



Merrie Morris



Ed Cutrell



Tessa Lau



Ken Hinckley



Andy Wilson



Hrvoje Benko



Jeff Peirce



Anne Loomis Thompson



Paul Koch



Raman Sarin



Mihai Jalobeanu



Nick Saw



Richard Hughes



Carl Kadie



David Hovel



Andy Jacobs



Johnson Apacible



Michael Shwe



Matthew Barry



George Robertson



Shamsi Iqbal



Mary Czerwinski



Dan Robbins



Joe Tullio



Andrea (and Monica & Chad)



Michael Cohen



James Mahoney

