

Support to Decisions AI Technology, Knowledge-Based Systems, Agent-Based Modeling

### Amedeo Cesta

Consiglio Nazionale delle Ricerche

Institute for Cognitive Sciences and Technologies http://www.istc.cnr.it/group/pst





# **ISTC-CNR:** a CNR Institute

Institute for Cognitive Science and Technology @ CNR - National Research Council of Italy



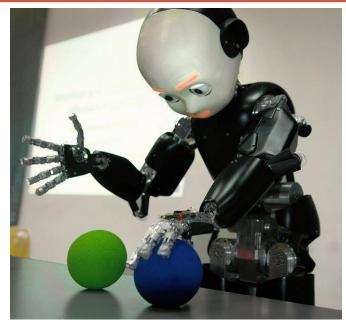




#### Indirizzo:

Via S. Martino della Battaglia, 44 I-00185 Rome, Italy http://www.istc.cnr.it/

### Robotics & AI @ CNR-ISTC









### A set of my interests ...



Interactive systems

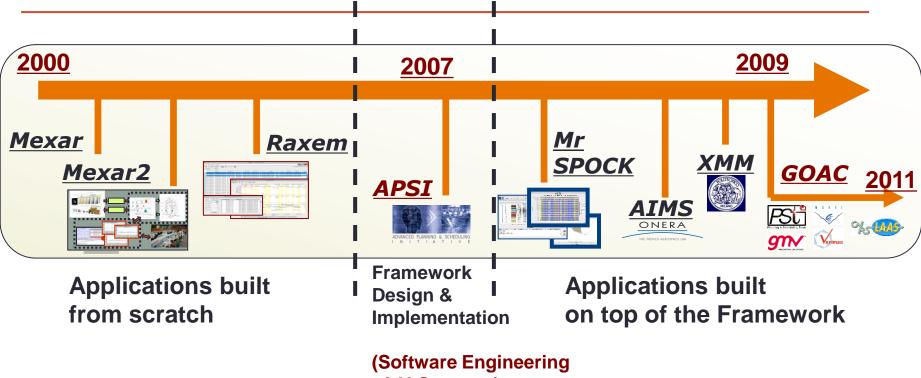
### Autonomous systems







### An example: the collaboration with ESA



of Al Systems)

International leadership in planning software for on-ground mission operations support



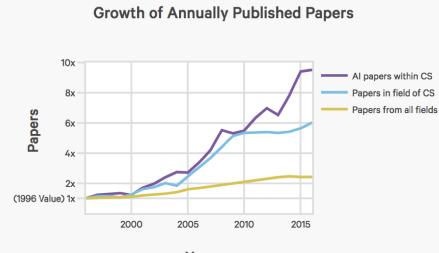
### A report on AI performances (http://aiindex.org)

← → C △ ▲ https://aiindex.org ∴ Apps ★ Bookmarks   Luropean Commis	🕫 http://tv.repubblic 🛃 🔞 ICT Results - EU 🥂 Abbreviations and 🚺 QoLT.org 🌓 CSCI	☆         Image: Contraction of the sector of the sec
artificial intelligence index	Mission	2017 Report Team Data
	We curate the latest data and trends on artificial intelligence in one place.	
	Read the 2017 Al Index Report         English       by the Al Index team         Chinese       translation by ByteDance & Synced	Artificial intelligence index
		2017 Annual Report
	ndicators gathered from ts of the field	

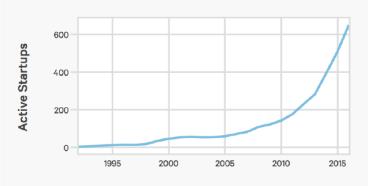
The idea of having an evolving report on «the state of AI»

#### Download from the same link the 2018 edition !!

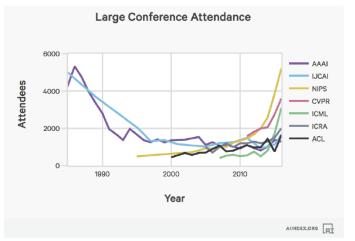
### Some indicators of a healthy sector



Year



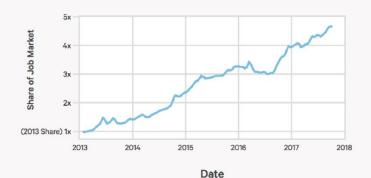
#### Startups Developing AI Systems



#### Shifting Focus

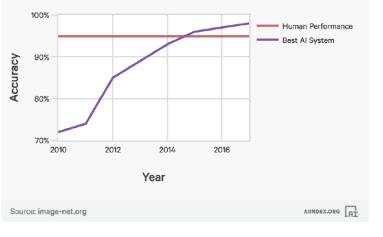
These attendance numbers show that research focus has shifted from symbolic reasoning to machine learning and deep learning.

#### Share of US Jobs Requiring AI Skills (Indeed.com)



### Comparison with humans ...

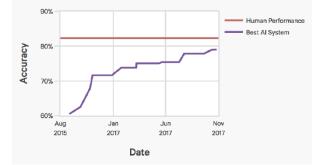
#### **Object Detection, LSVRC Competition**

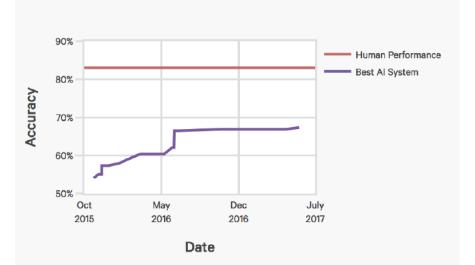


2.5%

<u>Error rates for image labeling</u> have fallen from 28.5% to below 2.5% since 2010.

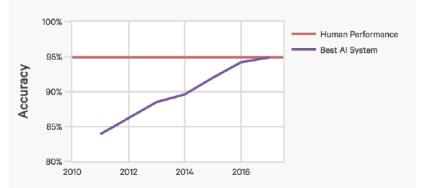
Question Answering, SQuAD v1.1





Visual Question Answering, VQA 1.0

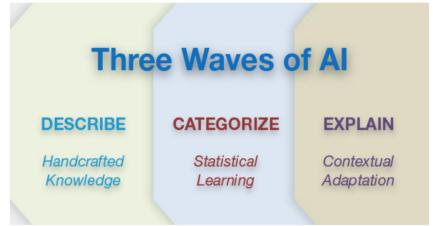
#### Speech Recognition, Switchboard HUB5'00



### A very recent talk from DARPA

### A DARPA Perspective on Artificial Intelligence

John Launchbury Director I2O, DARPA **DARPA** Perspective on AI



Courtesy : DARPA - https://www.darpa.mil/about-us/darpa-perspective-on-ai

# AI from key abilities

### Ability to process information



 Notional intelligence scale
 P

 perceiving learning abstracting reasoning
 within a a to create to plan

perceive rich, complex and subtle information learn within an environment abstract to create new meanings reason to plan and to decide

Artificial intelligence is a programmed ability to process information

### Reasoning-Based AI

### The first wave of AI









# Handcrafted Knowledge

# Reasoning-Based AI (2)

### The first wave of Al



Engineers create sets of rules to represent knowledge in well-defined domains

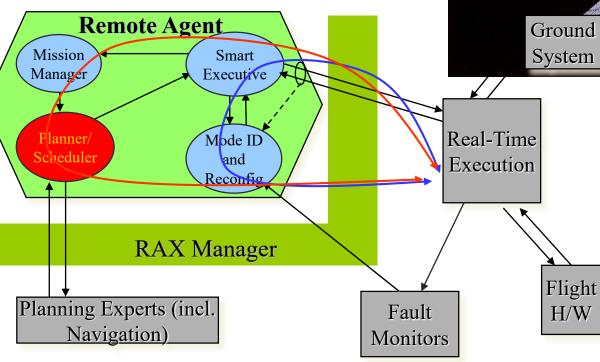


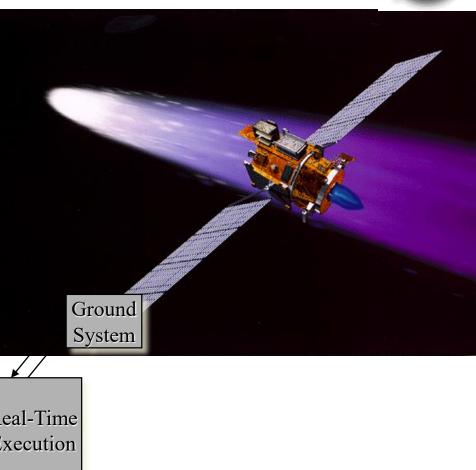
The **structure** of the knowledge is defined by humans The **specifics** are explored by the machine

### DS1 Remote Agent Experiment (circa 1999)



- Remote Agent Experiment
  - May 17-21, 1999
  - 65 Million miles from Earth
  - During Ballistic Cruise
- Remote Agent on DS1 wins NASA's 1999 Software of the Year

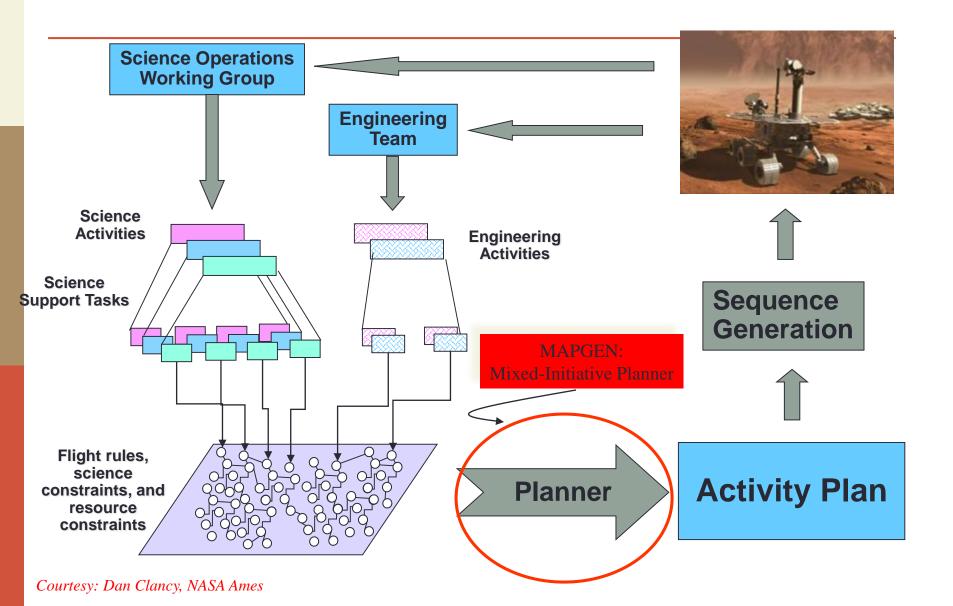




#### Courtesy: Kanna Rajan 2005



### Abstracted Command Cycle for MER



### MAPGEN in Surface Operations



 MAPGEN: First AI based System to control a spacecraft on the surface of another planet on January 15<sup>th</sup> 2004

Spirit:

- Nominal science operations from Sol 15 to 18
  - All planned activities from 16/17 executed on board
- Return to nominal science operations within 2-3 days
- Opportunity:
  - Informal use begins Sol 4/5
    - Commanded activities executed on board nominally
- Dual rover use of MAPGEN for the last 1000+ Sols!
  - Twice a day
  - Continued use for years …



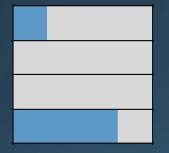
 Conservative Return on Investment (ROI) to NASA: 20% to 30% <u>additional science</u> returned per Sol, over a manual approach for plan <u>synthesis</u>

# Emphasis on Reasoning Aspects

# The first wave of Al



Perceiving Learning Abstracting Reasoning



Enables reasoning over narrowly defined problems

No learning capability and poor handling of uncertainty

### Limitations: slow scale up

### First wave stumbles



#### **2004** # completed: o



**2005** # completed: 5

DARPA Autonomous Vehicle Grand Challenge 140 miles of dirt tracks in California and Nevada

### Recent years in AI

### The second wave of AI







### Statistical Learning

### Emphasis on statistical models

### The second wave of AI

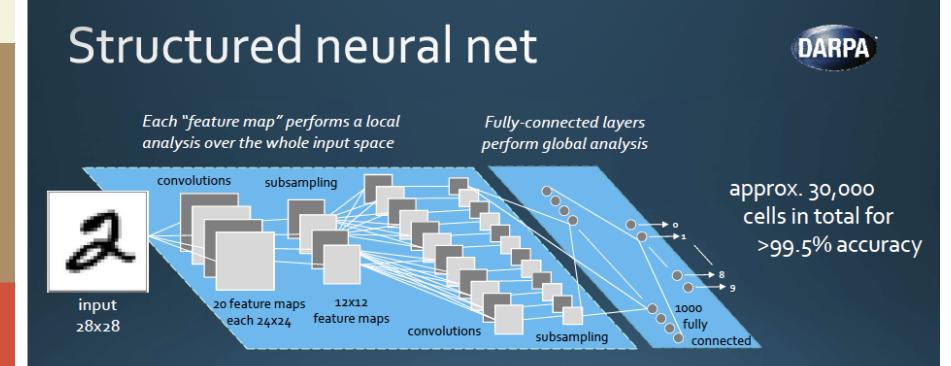


Engineers create statistical models for specific problem domains and train them on big data



Source: gobelluno.

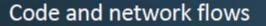
Main actors in data-science: the Machine-Learning «programmers» + the high-performance computing



Machine-learning "programmers" design the network structure with experience and by trial and error

### Great success for sure

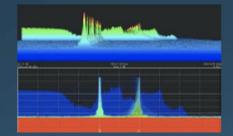
# Al technology is powerful





Observe real-time cyber attacks at scale





Overcome spectrum scarcity to meet wireless data demand

#### Autonomous platforms



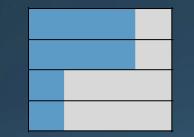
Reshape defense missions

### Assessment

### The second wave of AI



Perceiving Learning Abstracting Reasoning



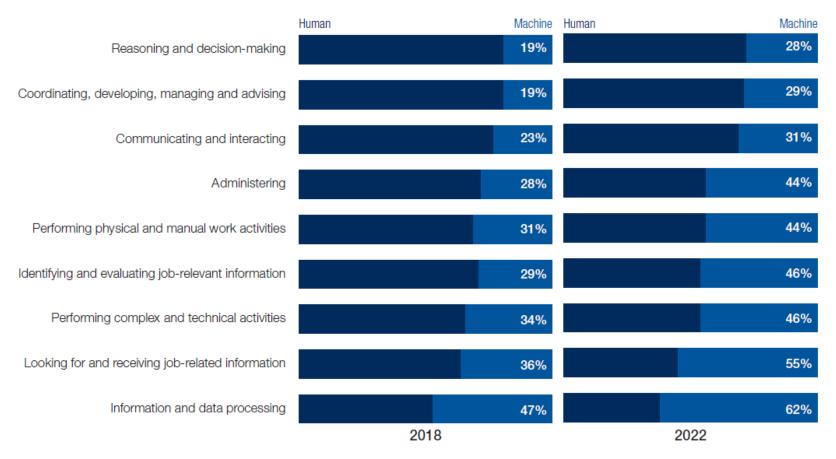
Nuanced classification and prediction capabilities

No contextual capability and minimal reasoning ability

# The Future of Jobs (report WEF 2018)

The Future of Jobs Report 2018

#### Figure 5: Ratio of human-machine working hours, 2018 vs. 2022 (projected)



Source: Future of Jobs Survey 2018, World Economic Forum.

# For this meeting purposes the current AI state-of-the-art can be of great help



- E.g., for the task of monitoring «status of things» current techniques may help a lot
- Predictive models (agent-based simulations, big data knowledge discovery, use of other math-base models) allow to derive several sophisticated new data ....
- □ Then you can decide better ....

### But ...

### Challenges with second wave





#### Statistically impressive, but individually unreliable

### But ...

### Challenges with second wave



Inherent flaws can be exploited

### ... even worst !!

## Challenges with second wave



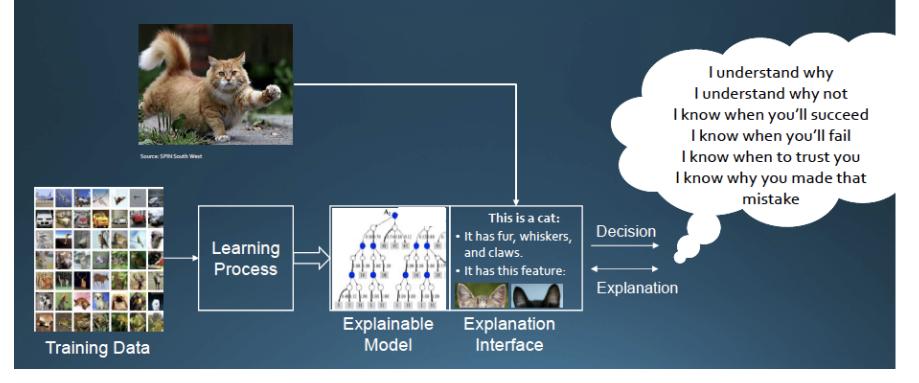
Internet trolls cause the AI bot, Tay, to act offensively

Skewed training data creates maladaptation

### One key problem ... «understand why(s)»

DARPA

### Models to explain decisions



# Their approach !!!!

 $\equiv$  EXPLORE BY TAG



DEFENSE ADVANCED RESEARCH PROJECTS AGENCY ABOUT US / OUR RESEARCH / NEWS / EVENTS / WORK WITH US / Q

Defense Advanced Research Projects Agency > News And Events

#### DARPA Announces \$2 Billion Campaign to Develop Next Wave of AI Technologies

DARPA's multi-year strategy seeks contextual reasoning in AI systems to create more trusting, collaborative partnerships between humans and machines

OUTREACH@DARPA.MIL 9/7/2018



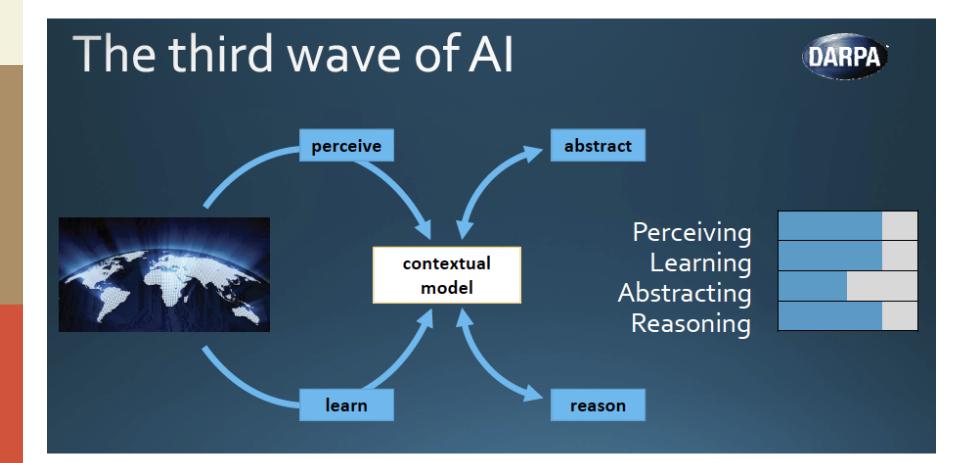
### The third wave ... hopefully

### The (future) third wave of AI

# **Contextual adaptation**

Systems construct contextual explanatory models for classes of real world phenomena

# The third wave ... hopefully (2)

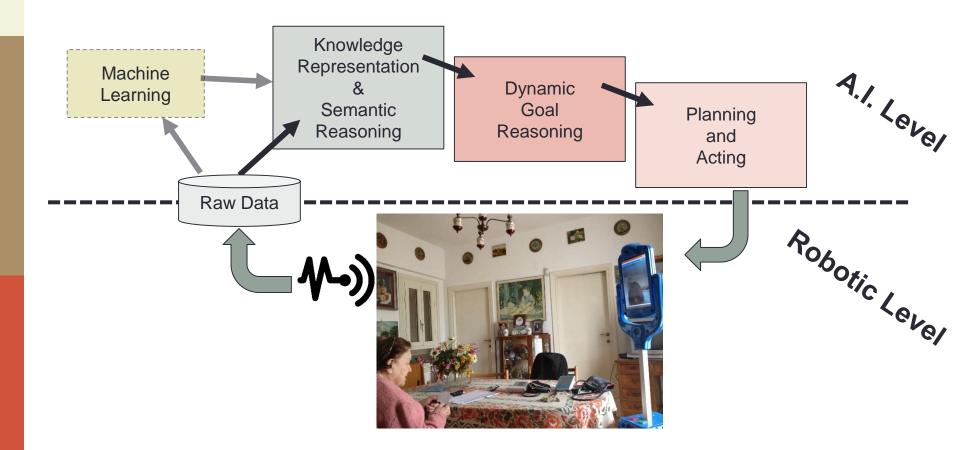


# My current research goals ...

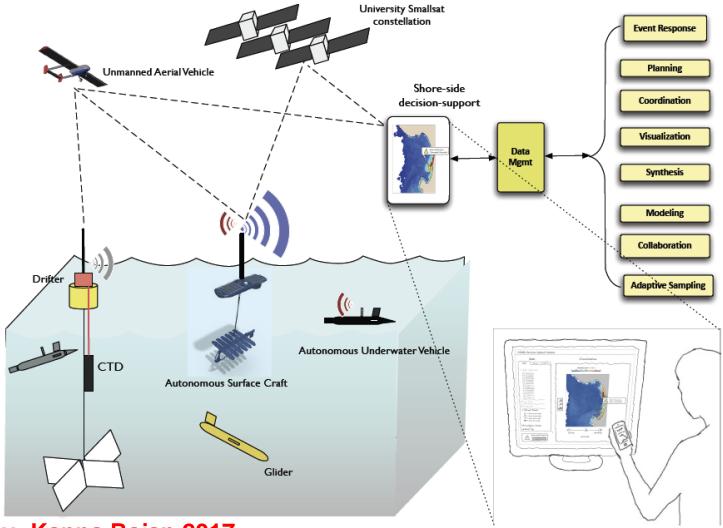
Assistive Robotics domain poses a important challenges

- continuous operation over time
- adaptable behaviors according to different user needs
- We are investigating possible connections between robust Knowledge-Based AI and new Data Science AI techniques
- We are pursuing a foundational step towards a Continuous Sense-Reason-Act loop to be deployed on top of cutting-edge robotic solutions

# The KoALA Approach



### A more focused scenario ...



#### Courtesy: Kanna Rajan 2017

### Support to better perform decision making

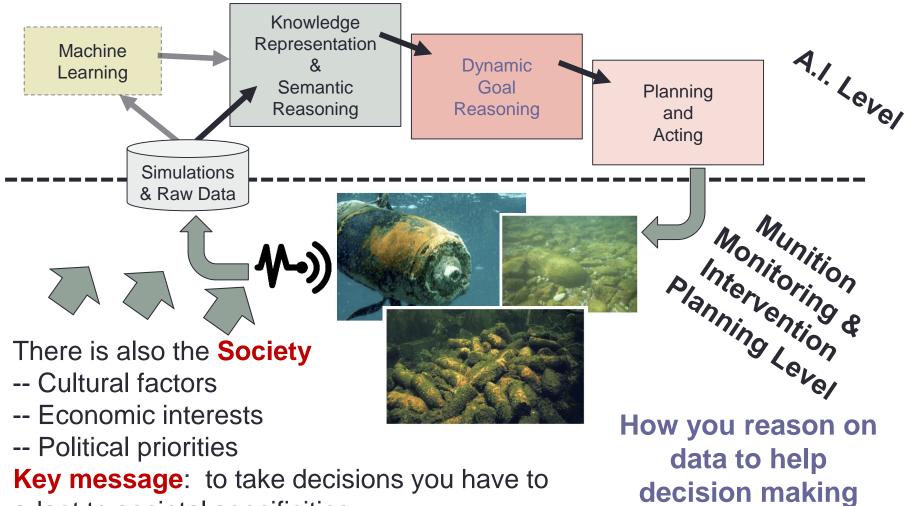
# Key strengths of ABM (Agent Based Modeling)

- Society is not an aggregate of indistinguishable particles. Modeling society for what it is: agents are not particles!
- Agent Based Generative Social Simulation (ABGSS):
- If you didn't grow it up, you're not explaining it
  - Rules out correlations
  - Extends on simple causation
- But looking for the simplest generative mechanism leads to *ad hoc* models

- Minds
  - Modeling not only the relation and social processes
  - But also the internal cognitive processes
  - Double modeling: simulations as the interaction between a model of the mind and a model of society



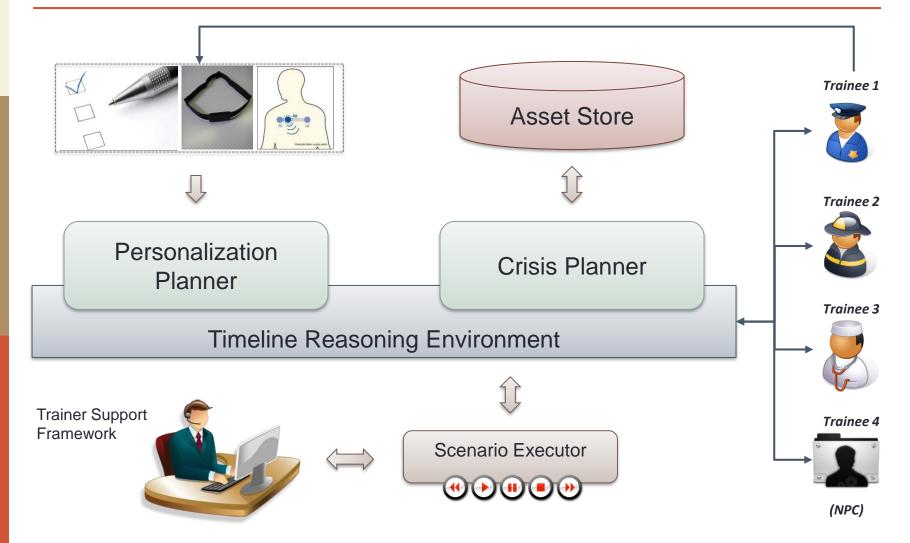
# Possible uses of KoALA elsewhere ...



adapt to societal specificities

here is a key aspect

# The PANDORA Training



### Interactive Lessons as Plan Execution



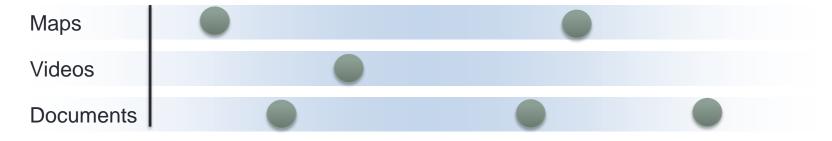
Maps

Videos

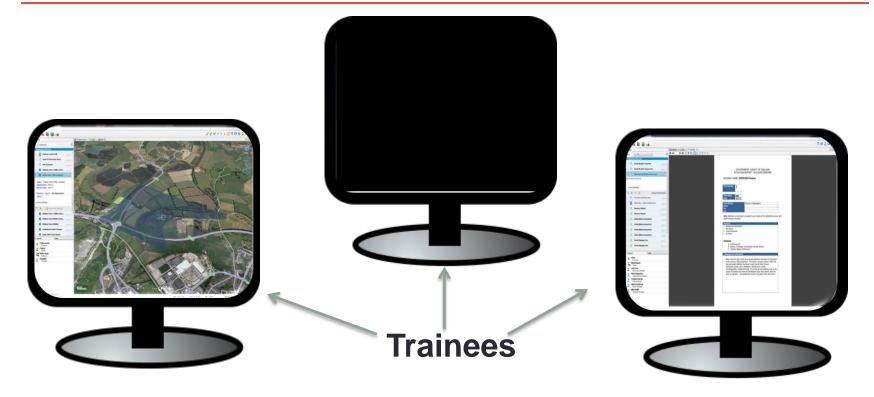
Documents

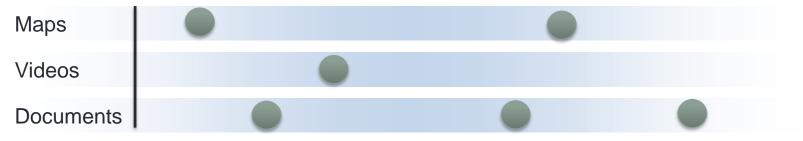
### Interactive Lessons as Plan Execution





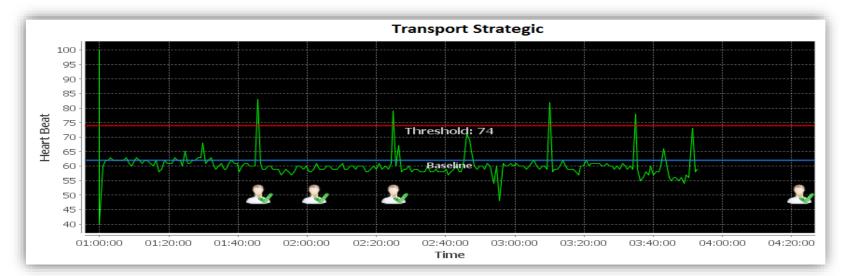
### Interactive Lessons as Plan Execution





### System Evaluation (EPC - York, UK Cabinet Office Experts 2012-13)







The workshop addresses scientific gaps and how research can bring substantial contributions for solutions and advances in knowledge

Munition in the sea

CNR-INM National Research Council of Italy Institute of Marine Engineering Via di Vallerano, 139, 00128 Rome

December 6-7, 2018

### Thanks !!!!

### Amedeo Cesta

Consiglio Nazionale delle Ricerche

Institute for Cognitive Sciences and Technologies http://www.istc.cnr.it/group/pst



Amedeo Cesta <amedeo.cesta@istc.cnr.it>

