

Is symbolic AI still relevant?

A view from the automated planning trenches

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Current Trends in Artificial Intelligence 2

17 November 2017



We live in interesting times...

“The rise of powerful AI will be either the best or the worst thing ever to happen to humanity. We do not know which.”

Stephen Hawking

“With artificial intelligence we are summoning the demon. In all those stories where there’s the guy with the pentagram and the holy water, its like – yeah, he’s sure he can control the demon. Doesn’t work out.”

Elon Musk

“AI watchdog needed to regulate automated decision-making, say experts: Algorithms can make bad decisions that have serious impacts on people’s lives, leading to calls for a third party body to ensure transparency and fairness.”

The Guardian, 2017-01-27



THE MOMENT THE COMPUTERS
CONTROLLING OUR NUCLEAR
ARSENALS BECAME SENTIENT

Judgment Day - <https://xkcd.com/1626/>

Automated planning

Automated planning

A technology for autonomous **decision making**.

Heavily based on **symbolic reasoning**.

Automated planning

What is it?

Why is it useful?

Where is it going?

Is it still relevant?

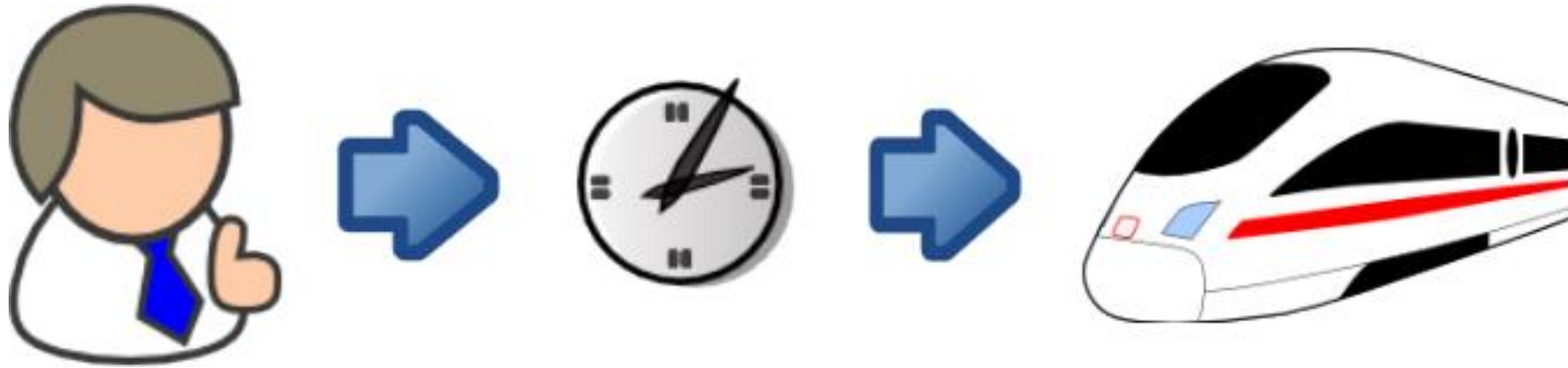


Case study: the JAMES robot bartender – <http://james-project.eu/>

R. Petrick and M.E. Foster. Planning for social interaction in a robot bartender domain, ICAPS 2013

What is planning?

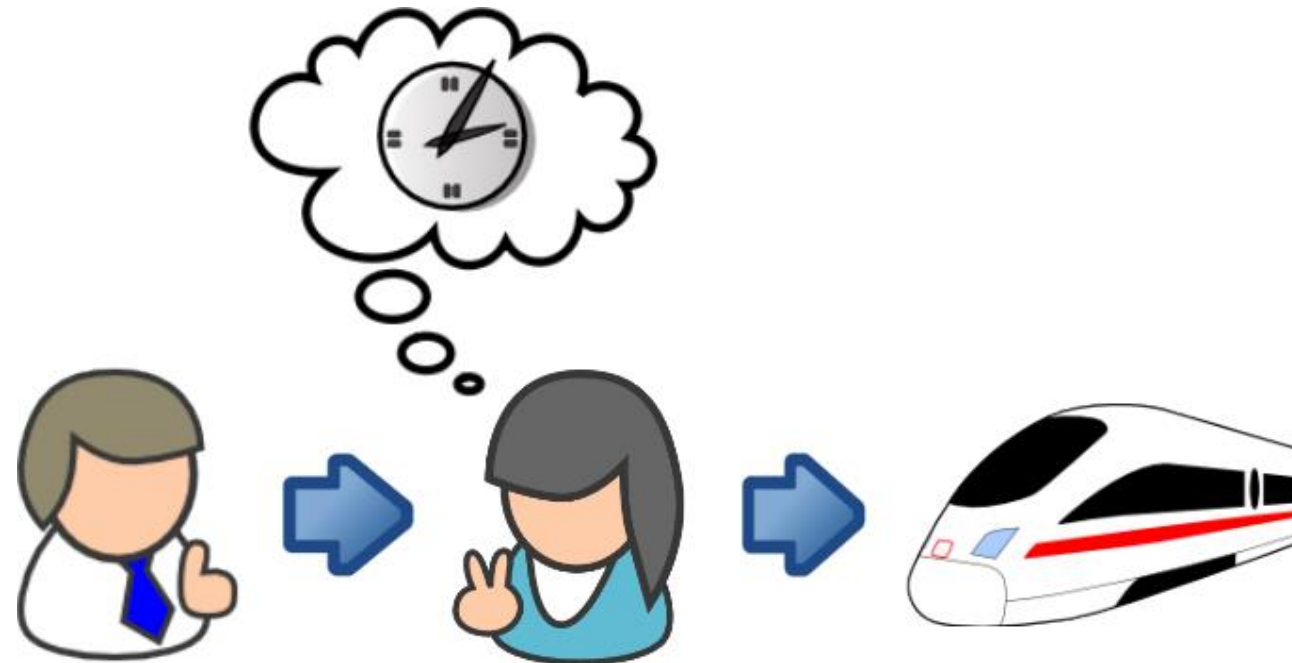
“I want to take the train from Copenhagen to Hamburg.”



Go to the station, buy a ticket, check the departure board for track information, go to the track, board the train, . . .

What is planning?

"I want to take the train from Copenhagen to Hamburg."



Go to the station, buy a ticket, ask someone for track information, go to the track, board the train, . . .

What is planning?



Photo: Universität Bielefeld / JAMES project

What is planning?

Two people, A and B, each individually approach the system.

System (to A): How can I help you?

Person A: A pint of cider, please.

Person C approaches and attracts the attention of the system by gesturing.

System (to C): Just a moment please.

System: (Serves A)

System (to B): What will you have?

Person B: A glass of red wine.

System: (Serves B)

System (to C): Thanks for waiting. How can I help you?

Person C: I'd like a pint of bitter.

System: (Serves C)

What is planning?

What should I do? When should I do it?

Humans are pretty good at this task.

Can an AI system make these decisions?
It's a tough problem computationally...

What is automated planning?



What is automated planning?

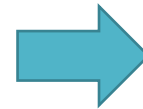
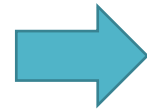
What can
the system
do?

What does
the world
look like?

What are
the goals?

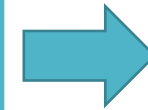
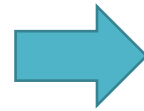


What is automated planning?



1. Go to the station
2. Buy a ticket
3. Check the departure board for track information
4. Go to the track
5. Board the train
6. ...

What is automated planning?



1. Greet the customer
2. Ask the customer for a drink
3. Acknowledge the drink order
4. Pick up the correct bottle
5. Serve the customer
6. End the transaction

Photo: Universitaet Bielefeld / JAMES project

How can we represent a planning problem?



Photo: fortiss GmbH / JAMES project

Planning problems

- A planning problem consists of:
 1. A representation of the properties and objects in the world and/or the agent's knowledge, usually described in a logical language,
 2. A set of state transforming actions,
 3. A description of the initial world/knowledge state,
 4. A set of goal conditions to be achieved.
- A **plan** is a sequence of actions that when applied to the initial state transforms the state in such a way that the resulting state satisfies the goal conditions.

Representation

- Actions

<code>greet(?a)</code>	greet agent ?a
<code>ask-drink(?a)</code>	ask agent ?a for a drink order
<code>ask-drink-next(?a)</code>	ask the next agent ?a for a drink order
<code>serve(?a, ?d)</code>	serve drink ?d to agent ?a
<code>bye(?a)</code>	end an interaction with agent ?a
<code>wait(?a)</code>	tell agent ?a to wait
<code>ack-order(?a)</code>	acknowledge the order of agent ?a
<code>ack-wait(?a)</code>	thank agent ?a for waiting
<code>ack-thanks(?a)</code>	acknowledge agent ?a's thanks
<code>inform-drinklist(?a, ?t)</code>	inform agent ?a of the available drinks of type ?t

- Properties

<code>seeksAttn(?a)</code>	agent ?a seeks attention
<code>visible(?a)</code>	agent ?a is visible
<code>inGroup(?a) = ?g</code>	agent ?a is in group ?g
<code>inTrans = ?a</code>	the robot is interacting with ?a
<code>request(?a) = ?d</code>	agent ?a has requested drink

...

Representation

```
action greet(?a : agent)
```

```
  preconds:
```

```
    K(inTrans = nil) &  
    K(!ordered(?a))
```

```
  effects:
```

```
    add(Kf, inTrans = ?a)
```

```
action ask-drink(?a : agent)
```

```
  preconds:
```

```
    K(inTrans = ?a) &  
    K(!ordered(?a))
```

```
  effects:
```

```
    add(Kf, ordered(?a)),  
    add(Kv, request(?a))
```

```
action serve-drink(?a : agent, ?d)
```

```
  preconds:
```

```
    K(inTrans = ?a) &  
    K(ordered(?a)) &  
    Kv(request(?a)) &  
    K(request(?a) = ?d)
```

```
  effects:
```

```
    add(Kf, served(?a))
```

```
action bye(?a : agent)
```

```
  preconds:
```

```
    K(inTrans = ?a) &  
    K(served(?a))
```

```
  effects:
```

```
    add(Kf, inTrans = nil)
```

Reasoning about action

Kf: handEmpty, onTable(bottle1), onTable(bottle2),
!empty(bottle1)

Kw: empty(bottle2)

Action: grasp(bottle1)

Kf: inHand(bottle1), onTable(bottle2),
!handEmpty, !onTable(bottle1), !empty(bottle1)

Kw: empty(bottle2)

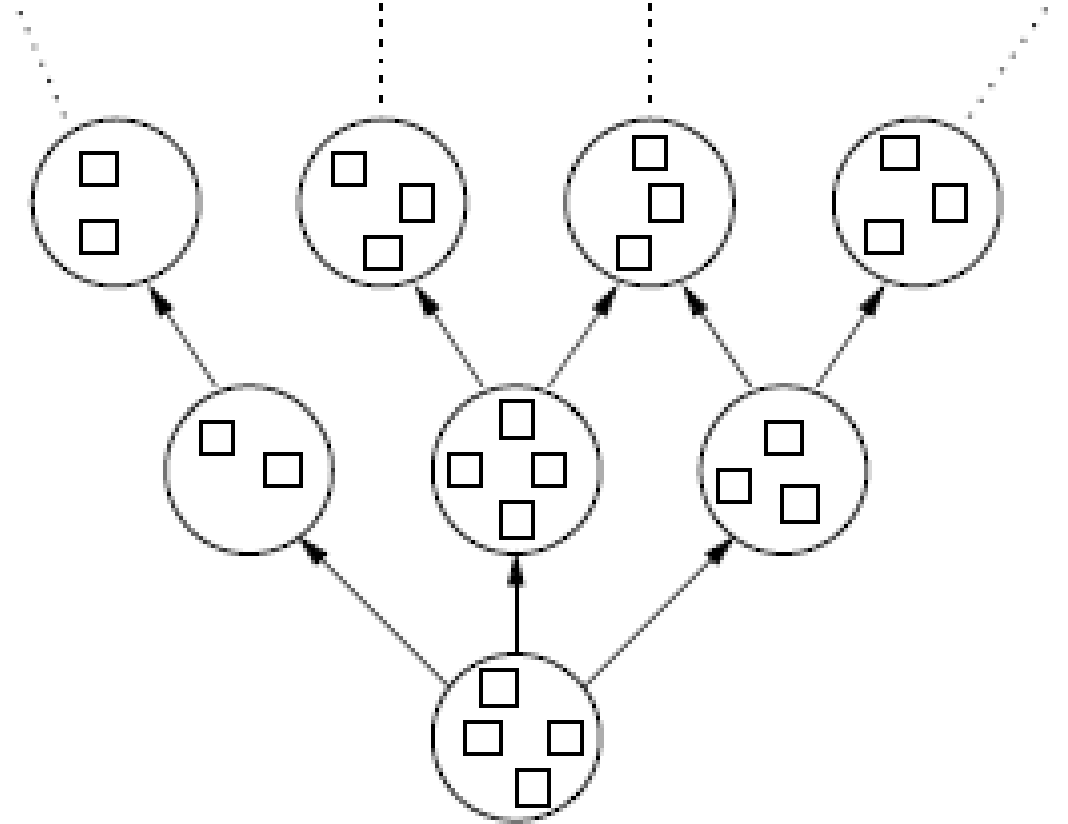
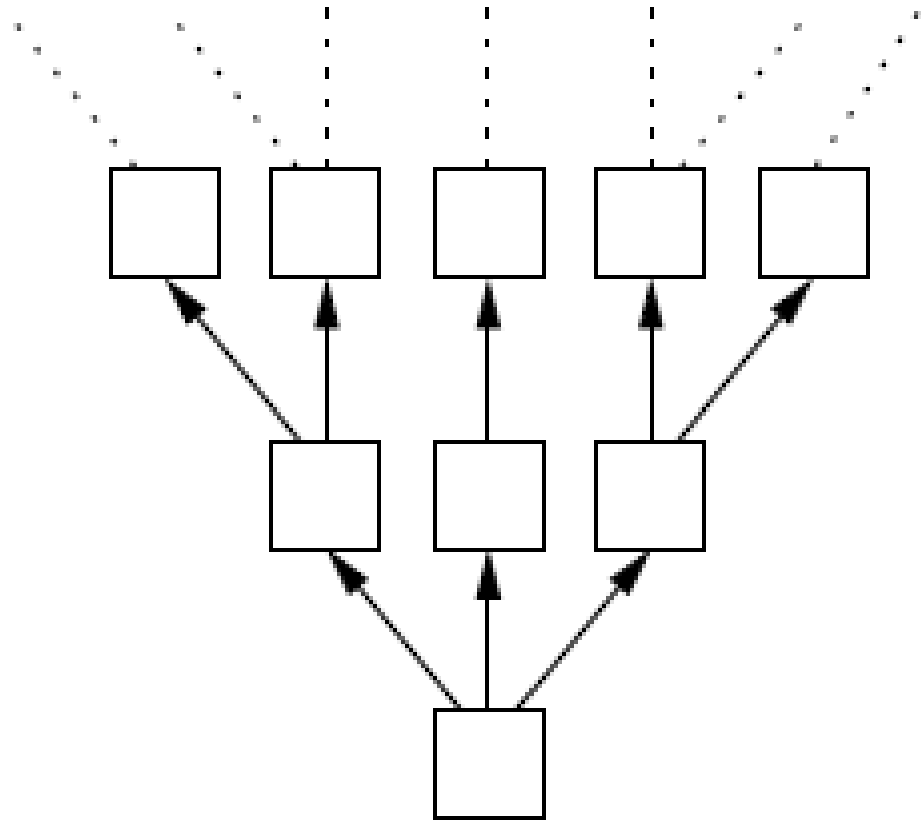
Action: senseWeight(bottle1)

Kf: inHand(bottle1), onTable(bottle2),
!handEmpty, !onTable(bottle1), !empty(bottle1)

Kw: empty(bottle2)

Kv: weight(bottle1)

Planning



Planning

```
greet(a1),  
ask-drink(a1),  
ack-order(a1),  
serve(a1,request(a1)),  
bye(a1).
```

```
[Greet agent a1]  
[Ask a1 for drink order]  
[Acknowledge a1's order]  
[Give the drink to a1]  
[End the transaction]
```

```
wait(a2),  
greet(a1),  
ask-drink(a1),  
ack-order(a1),  
serve(a1,request(a1)),  
bye(a1),  
ack-wait(a2),  
ask-drink(a2),  
ack-order(a2),  
serve(a2,request(a2)),  
bye(a2).
```

```
[Tell a2 to wait]  
[Greet a1]  
[Ask a1 for drink order]  
[Acknowledge a1's order]  
[Give the drink to a1]  
[End a1's transaction]  
[Thank a2 for waiting]  
[Ask a2 for drink order]  
[Acknowledge a2's order]  
[Give the drink to a2]  
[End a2's transaction]
```

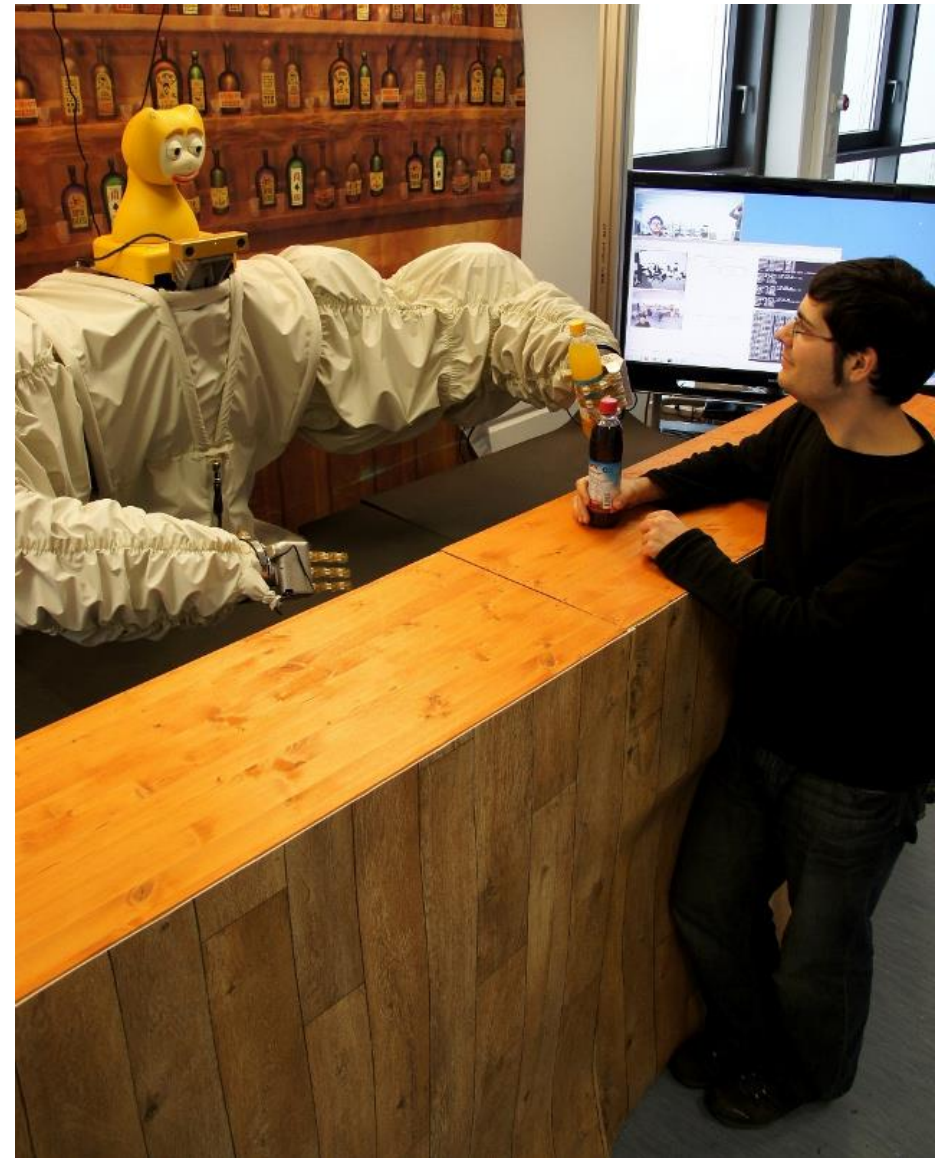


Photo: fortiss GmbH / JAMES project

Planning



Three customers:

A1 and A2 in group G1

A3 is alone (singleton group G2)

Bartender serves members of G1 in sequence, then deals with G2.

Other social behaviour:

- First-come/first-served ordering
- All orders are acknowledged immediately
- If a new customer arrives while the bartender is occupied, it nods at them and serves them later

Social behaviour is based on the observation of bartenders in real bars (Huth et al., 2012); see Foster et al. (2013) for details on the planning domain.

wait(A3, G1)

greet(A1, G1)

ask-drink(A1, G1)

ack-order(A1, G1)

ask-drink(A2, G1)

ack-order(A2, G1)

serve(A1, request(A1), G1)

serve(A2, request(A2), G2)

bye(A2, G1)

ack-wait(A3, G2)

ask-drink(A3, G2)

ack-order(A3, G2)

serve(A3, request(A3), G3)

bye(A3, G2)

Tell G2 to wait (with a nod)

Greet group G1

Ask A1 for drink order

Acknowledge A1's order

Ask A2 for drink order

Acknowledge A2's order

Give the drink to A1

Give the drink to A2

End G1's transaction

Acknowledge G2's wait

Ask A3 for drink order

Acknowledge A3's order

Give the drink to A3

End G2's transaction

Photo: fortiss GmbH / JAMES project

Automated planning research



How do we model problems?

How do we generate plans efficiently?

How do we apply planning to (real-world) problems?

Trend 1: inside the box



An explosion of new planners, new algorithms, new modelling languages

International Planning Competitions

1st International Planning Competition held in 1998

- 5 competitors
- Deterministic track
- Many plans 30-40 steps long, some over 100 steps

<http://www.icaps-conference.org/index.php/Main/Competitions>

International Planning Competitions

8th International Planning Competition held in 2014

- Deterministic track: over 60 planners competed across 5 subtracks
- Learning track: 11 planners competed
- Probabilistic track: 8 planners competed

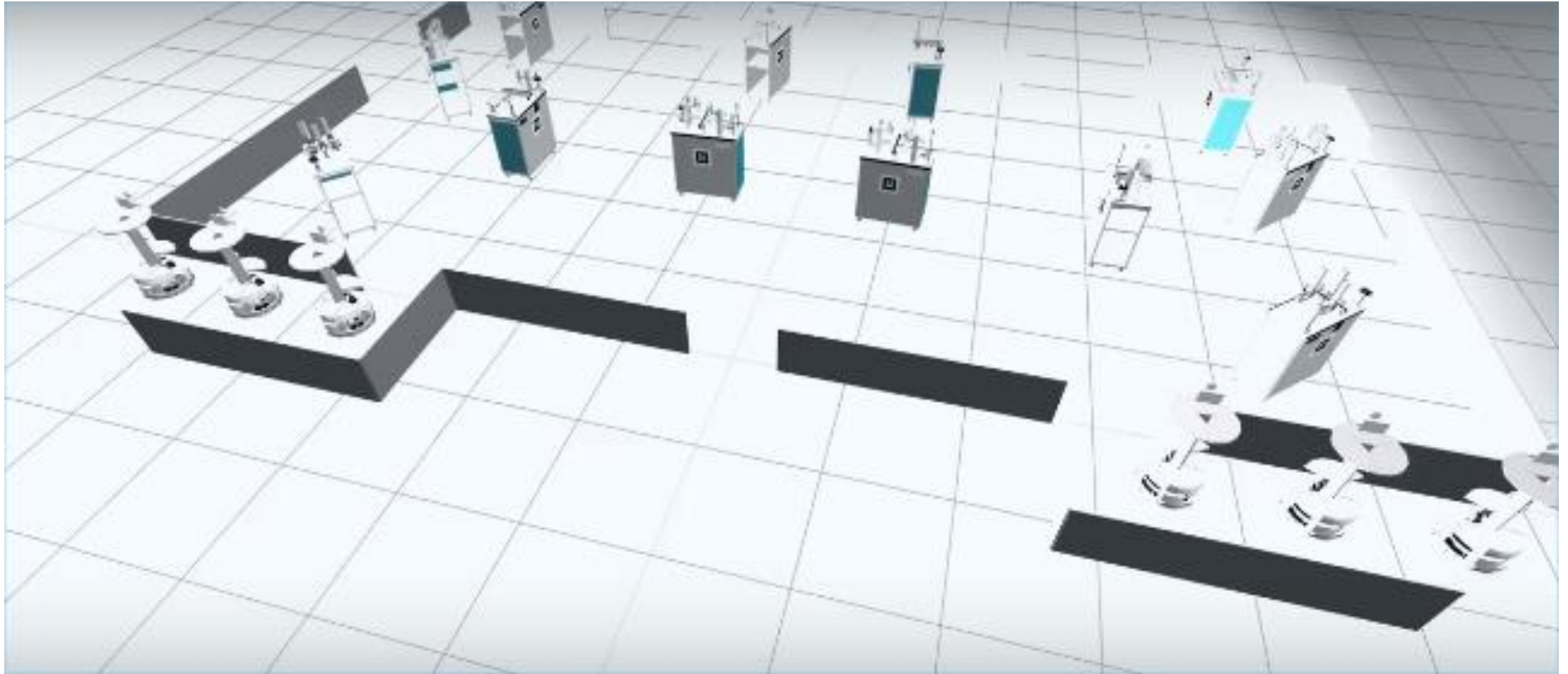
Distributed and Multiagent planning competition: 8 competitors

Unsolvability planning competition: 11 planners

RoboCup Logistics League Planning Competition: 5 teams

<http://www.icaps-conference.org/index.php/Main/Competitions>

Logistics League Planning Competition



<http://www.robocup-logistics.org/sim-comp>

Trend 2: outside the box



Domain/problem acquisition + applications

Machine learning + planning

Learning planning actions

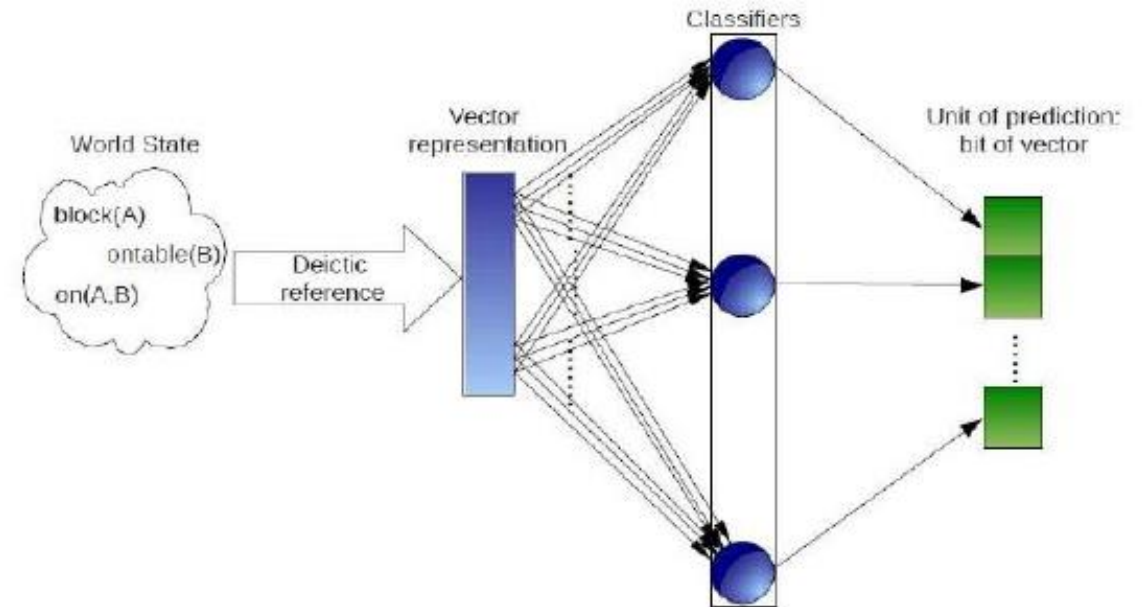
Can we learn the symbolic structure of actions?

Learning domain knowledge

Can we learn how the world is structured?

Learning control knowledge

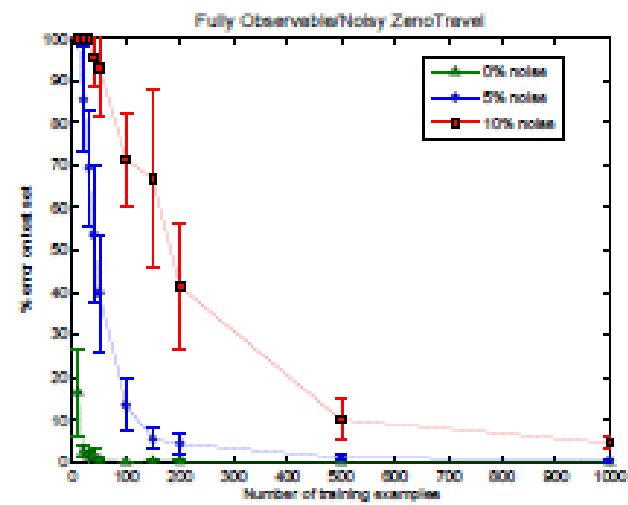
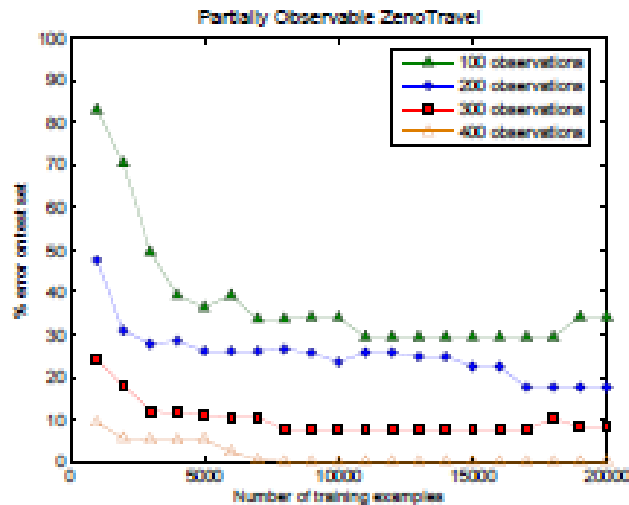
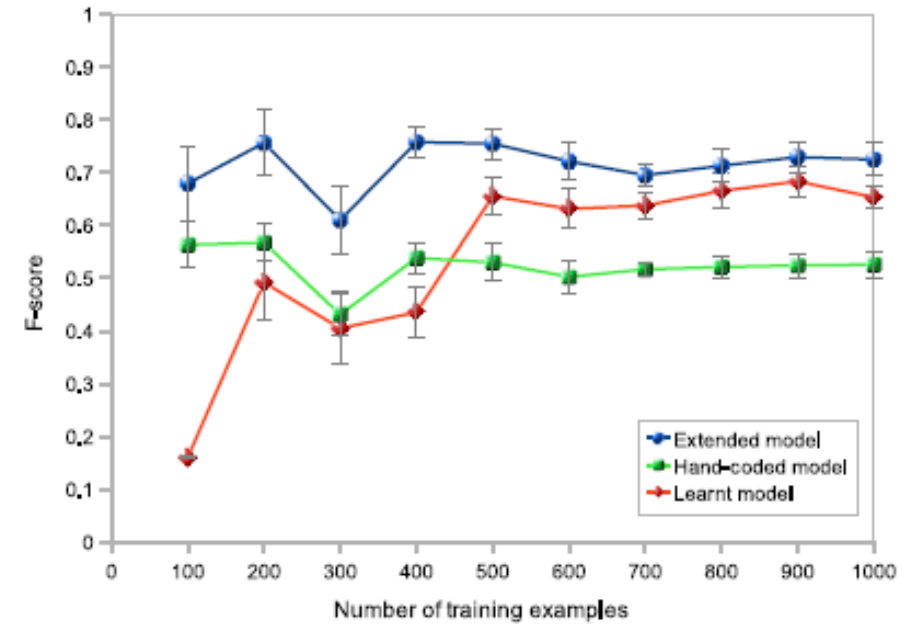
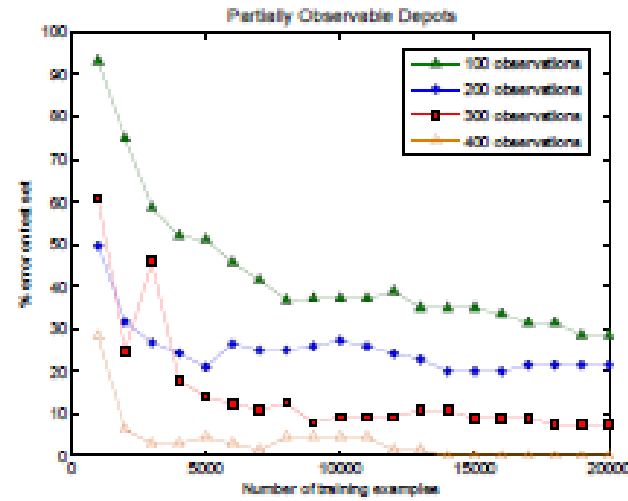
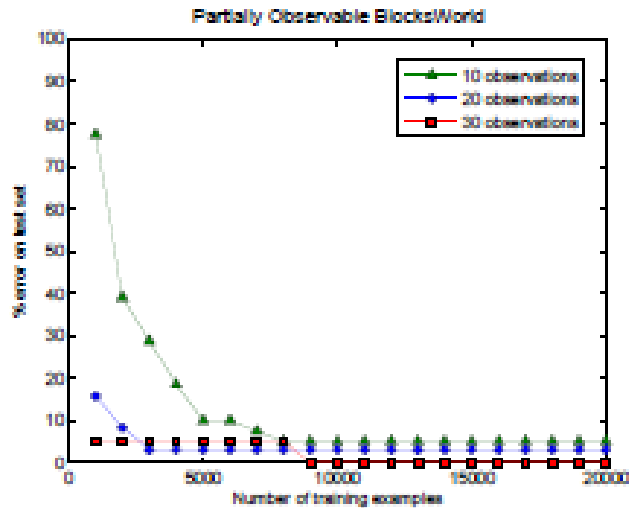
Can we improve the quality/efficiency of generated plans?



```
(:action move
:parameters (?m ?l - location)
:precondition (is_at ?m)
:effect (and (is_at ?l) (not (is_at ?m))          (0.9)
  (forall (?x - portable) (when (in ?x)
    (and (at ?x ?l) (not (at ?x ?m))))))
  no change          (0.09)
  noise              (0.01).
```

K. Mourão, L. Zettlemoyer, R. Petrick, and M. Steedman. Learning STRIPS Operators from Noisy and Incomplete Observations, UAI 2012

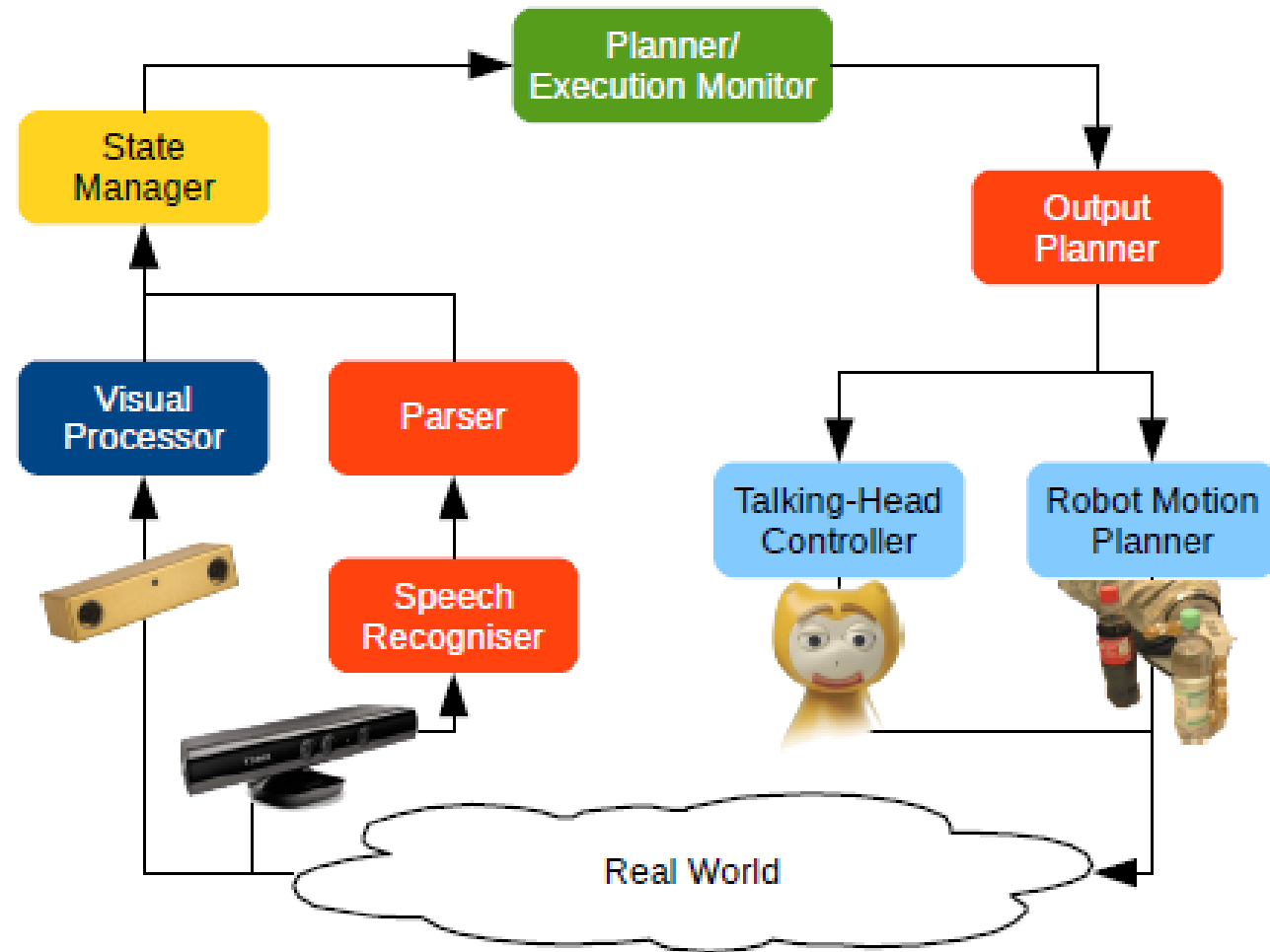
Machine learning + planning



K. Mourão, R. Petrick, and M. Steedman. Learning Action Effects in Partially Observable Domains, ICAPS Workshop on Planning and Learning, 2009

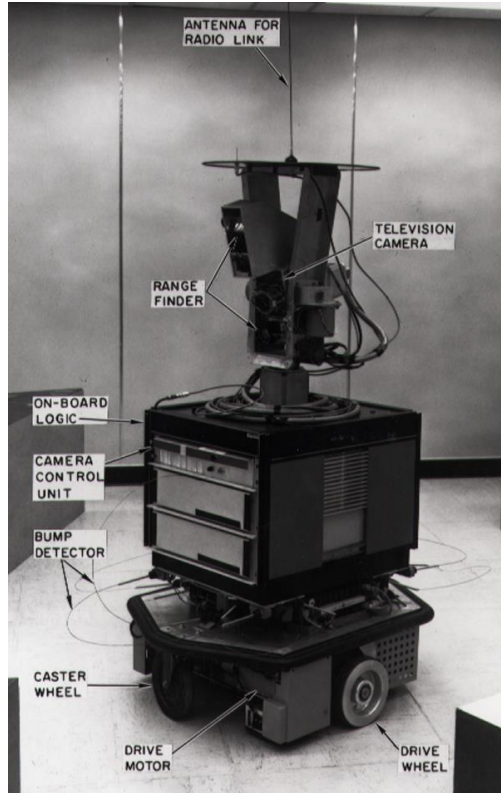
K. Mourão, L. Zettlemoyer, R. Petrick, and M. Steedman. Learning STRIPS Operators from Noisy and Incomplete Observations, UAI 2012

Applications



R. Petrick and M.E. Foster. Planning for social interaction in a robot bartender domain, ICAPS 2013

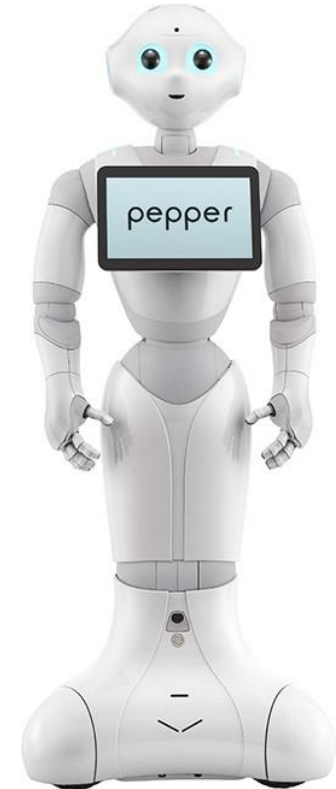
Robotics



Shakey - Photo: SRI International



Valkyrie - Photo: NASA



Pepper - Photo: Softbank Robotics

AI doesn't necessarily mean robots! Robots don't necessarily mean AI!

Robotics and AI

robot apocalypse

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About 1,400,000 results (0.37 seconds)

Robot Apocalypse - What If? - xkcd
<https://what-if.xkcd.com/5/> ▼
Robot Apocalypse. What if there was a **robot apocalypse**? How long would humanity last? —Rob Lombino. Before I answer this question, let me give you a little ...

AI takeover - Wikipedia
https://en.wikipedia.org/wiki/AI_takeover ▼
AI takeover refers to a hypothetical scenario in which artificial intelligence (AI) becomes the dominant form of intelligence on Earth, with computers or robots effectively taking control of the planet away from the human race. Possible scenarios include a takeover by a superintelligent AI and the popular notion of a **robot uprising**.
Plausibility of risk · Advantages of superhuman ... · Advantages of humans over ...

5 Real Life Incidents That Prove the Robot Apocalypse is Coming
[moneyinc.com](https://moneyinc.com/Technology) › Technology ▼
The word '**robot**' is something that most of us are very familiar with. It is used in all kinds of contexts throughout society. For example, it is not just m...

Images for robot apocalypse



The image block contains five small, square thumbnails. From left to right: 1. A close-up of a metallic, humanoid robot head with glowing red eyes. 2. A similar metallic robot head, possibly from the Terminator franchise. 3. A group of blue, humanoid robots in a dark, industrial setting. 4. A close-up of a metallic robot head with a glowing red eye. 5. A person in a white lab coat and red tie, surrounded by a swarm of small, white, bird-like flying robots.

JAMES robot bartender



[JAMES video](http://james-project.eu/) – For more information about JAMES, visit the project website at <http://james-project.eu/>

STAMINA robot



[STAMINA video](http://stamina-robot.eu/) – For more information about STAMINA, visit the project website at <http://stamina-robot.eu/>

JAMES robot bartender “Version 2”



[JAMES V2 video](http://james-project.eu/) – For more information about JAMES, visit the project website at <http://james-project.eu/>

Interesting times...



Science Teaches Us How to Get Served at a Crowded Bar

Techniques like flashing a money roll or waving do not fare as well as this simple two-step approach.

[f](#) [t](#) [m](#)

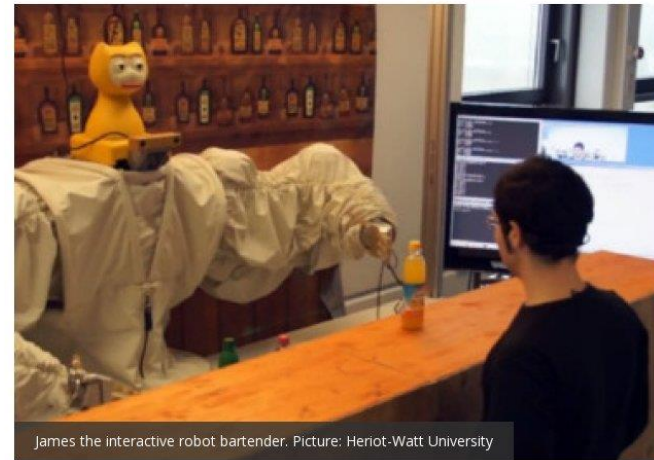
[Slate video - How to Get Served at a Crowded Bar](#)



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Super-robots that could fix your love life



by **JOHN-PAUL HOLDEN**
johnpaul.holden@edinburghnews.com

They are the stuff of sci-fi nightmares - villainous machines working to enslave mankind in a dystopian future.

Published on the
15 February
2014
09:27

[Edinburgh Evening News - 2014-02-15](#)

Picks of the day



Video

NEWSEYE
Local Video News

Ruth Davidson:
Viewing postal ballots
01:04

Nicola Sturgeon
launches leadership bid
02:12

Police investigate
shootings
00:43

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Applications

Robotics consortium in offshore technology funding boost

8 November 2017 | Scotland business

f t s Share



A consortium of five universities is to spend up to £36m in developing robotic and artificial intelligence (AI) technologies for use in harsh offshore environments.

[BBC News - 2017-11-08](#)

ORCA: Offshore Robotics for Certification of Assets

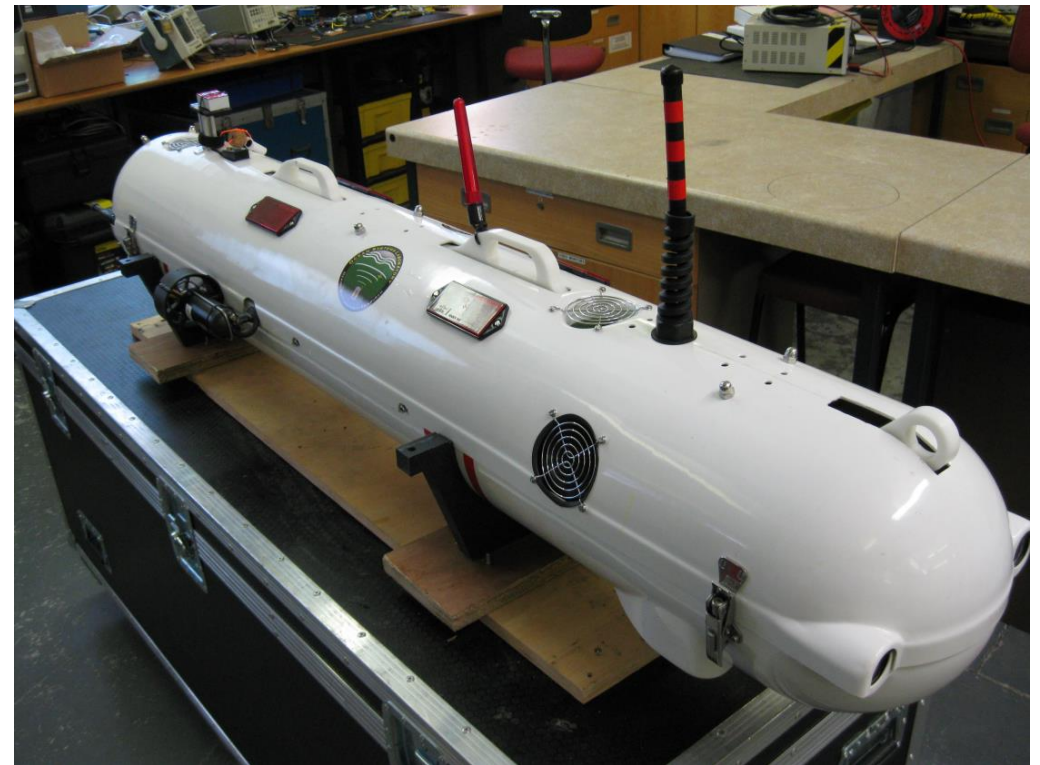


Photo: Ocean Systems Lab, Heriot-Watt University

Trend 3: explaining the box



Explainable planning: why is the system doing what it's doing?

Explainable planning

```
action grasp(?o : object)
  preconds:
    K(handEmpty) &
    K(onTable(?o))
  effects:
    add(Kf, !handEmpty),
    add(Kf, !onTable(?o)),
    add(Kf, inHand(?o))
    Kf: handEmpty, onTable(bottle1), onTable(bottle2),
        !empty(bottle1)
    Kw: empty(bottle2)
  Action: grasp(bottle1)
    Kf: inHand(bottle1), onTable(bottle2),
        !handEmpty, !onTable(bottle1), !empty(bottle1)
    Kw: empty(bottle2)
```

Why was an action chosen?

What would happen if another action was applied?

What is the system trying to achieve?

What does the system believe about the world?

...

EPSRC project: Start Making Sense

Cognitive and affective confidence
measures for explanation generation
using epistemic planning

Summary

Symbolic AI + automated planning still have an important role to play as a technology for decision making

Trends

1. Better tools
2. More connections with machine learning
3. Focus on real-world applications
4. Contributions to explainable systems