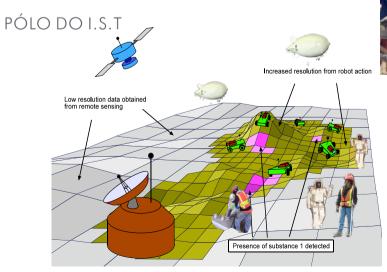


## A SYSTEMS THEORY APPROACH TO COOPERATIVE ROBOTICS AND SENSOR NETWORKS

Pedro U. Lima
Intelligent Systems Lab
Institute for Systems and Robotics
Instituto Superior Técnico
Lisbon, Portugal











#### most of the existing robotic task models

- are not based on formal approaches
- concern a small number of behaviors
- are tailored to the task at hand



## systems-theory-based task design methods for general robotic tasks can enable

systematic approach to modeling, analysis and design

**MOTIVATION** 

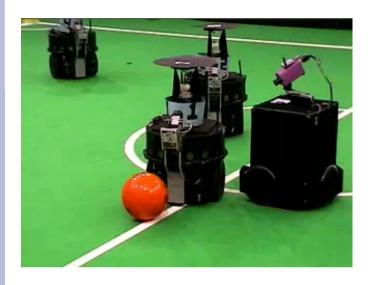
- scaling up to realistic applications
- analysis of formal properties
- design from specifications

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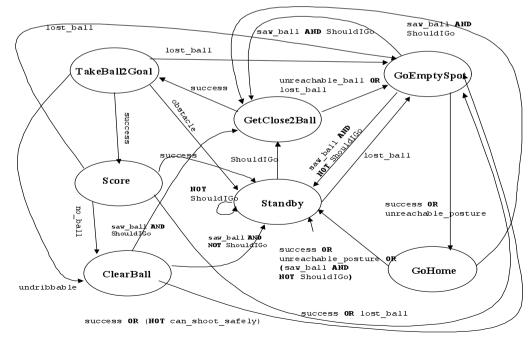




#### **MOTIVATION**



#### How to design the "right" behavior?





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#### **RELATION TO SIG TOPICS**

## coordination and cooperation among multiple types of robots also tackling

- common testbed, common research platform for benchmarking (RoboCup MSL)
- formal models and performance metrics (plan reliability, robustness)
- applications of network robot systems (search and rescue, urban scenarios, soccer robots)
- inclusion of humans in robot teams (Institutional Robotics)



#### **DISCRETE EVENT MODELS OF ROBOTIC TASKS**



### Finite State Automata

### Petri Nets



Formal Verification Tools available

Performance Analysis in the presence of uncertainties possible



#### PN MODEL OF ROBOTIC TASKS

(Lima et al, 1998) (Milutinovic, Lima, 2002)



- Places with tokens represent
  - predicates
  - primitive actions running
- State is distributed over the places with tokens



- Events assigned to transitions:
  - Controllable events: decision to start an action
  - *Uncontrollable events*: failure, environment change not provoked by the robot (could be by a teammate, or a human)
- Transition fires when it is enabled and the labeling event occurs



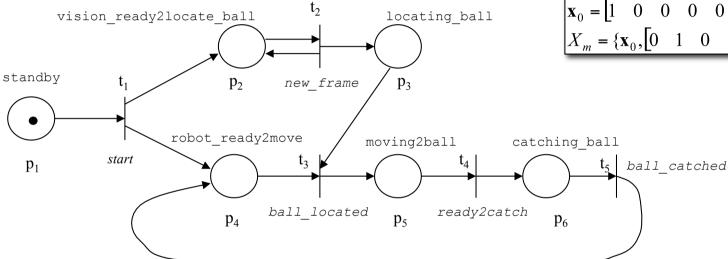
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#### PN MODEL OF ROBOTIC TASKS

#### Petri Nets (PN) Robotic Task Model



$$\mathbf{x} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$
 marking or state

#### **Generated and Marked Languages**

$$L(N) = \{\varepsilon, s, s \text{ nf } bl \text{ nf,...}\}$$
  
$$L_{m}(G) = \{\varepsilon, s, s \text{ nf } bl \text{ } r2c \text{ } bc\} \subseteq L(G)$$

#### Petri Net N

$$E = \{s, nf, bl, r2c, bc\}$$

$$l(t_1) = s, l(t_2) = nf, l(t_3) = bl, ...$$

$$\mathbf{x}_0 = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

$$X_m = \{\mathbf{x}_0, \begin{bmatrix} 0 & 1 & 0 & 1 & 0 & 0 \end{bmatrix}$$









#### MODELS FOR COOPERATIVE ROBOTS

#### RELATIONAL BEHAVIORS

temporary behaviors involving 2 or more team members e.g., group of friends moving to a location to meet there

**Messages between teammates** create new controllable events and predicates

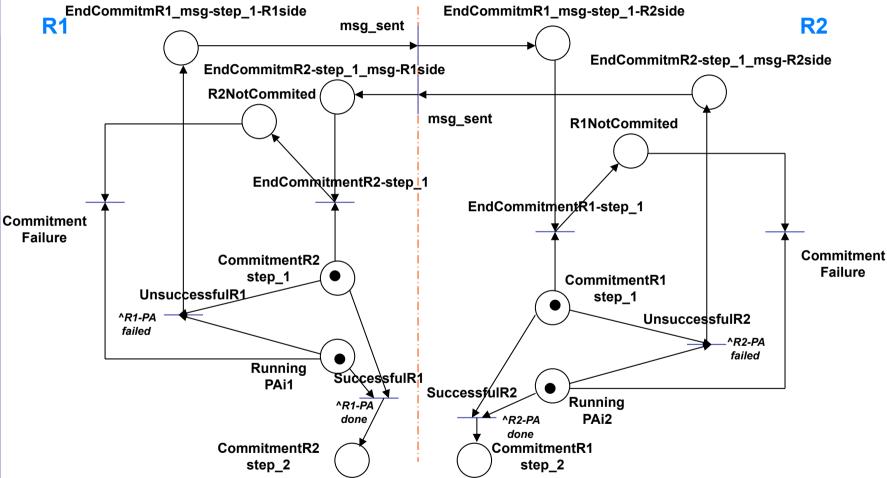
**Communication** is used for *commitments* and *synchronization* 

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#### MODELS FOR COOPERATIVE ROBOTS

#### **Commitments**



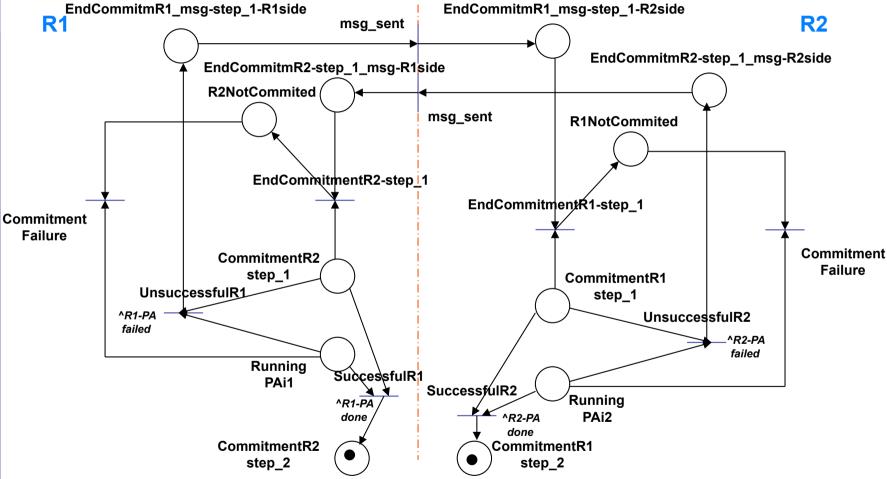
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#### **MODELS FOR COOPERATIVE ROBOTS**

#### **Commitments**



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#### **MODELS FOR COOPERATIVE ROBOTS**

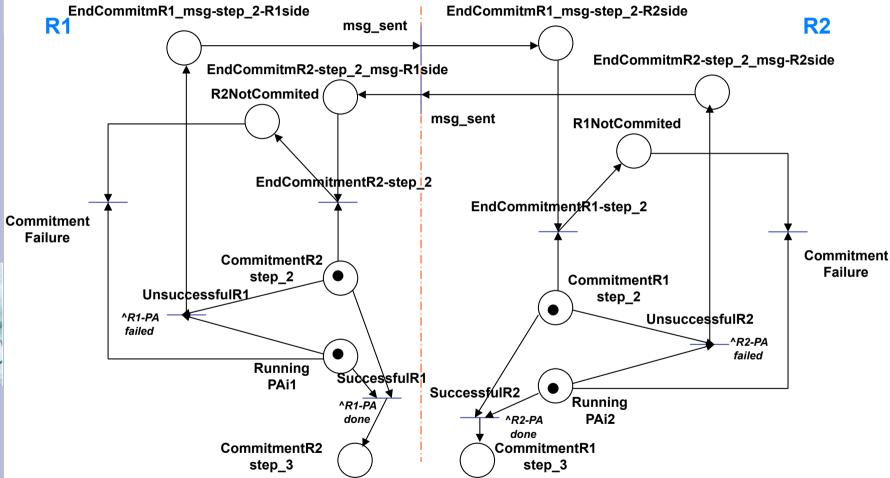
#### **Synchronization**



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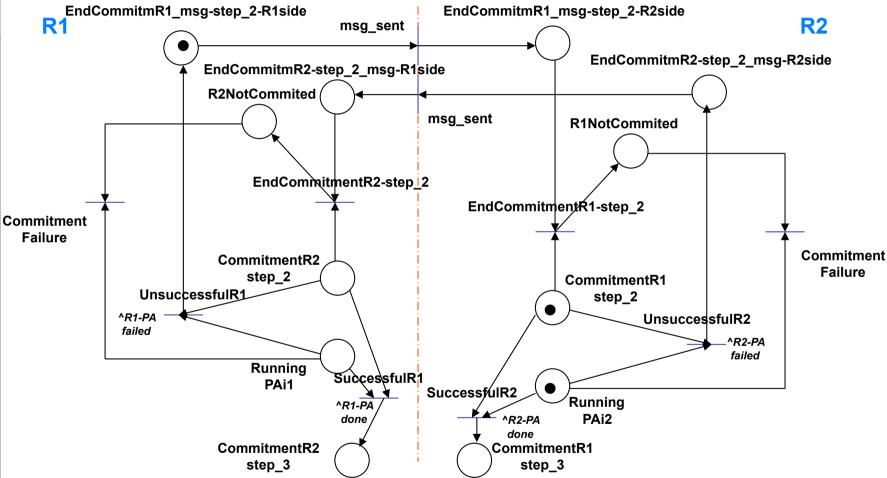
#### **MODELS FOR COOPERATIVE ROBOTS**



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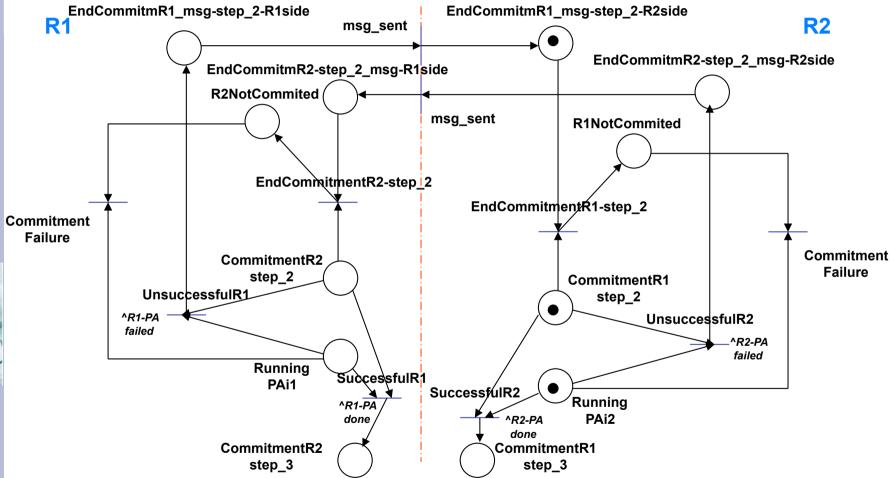


#### **MODELS FOR COOPERATIVE ROBOTS**



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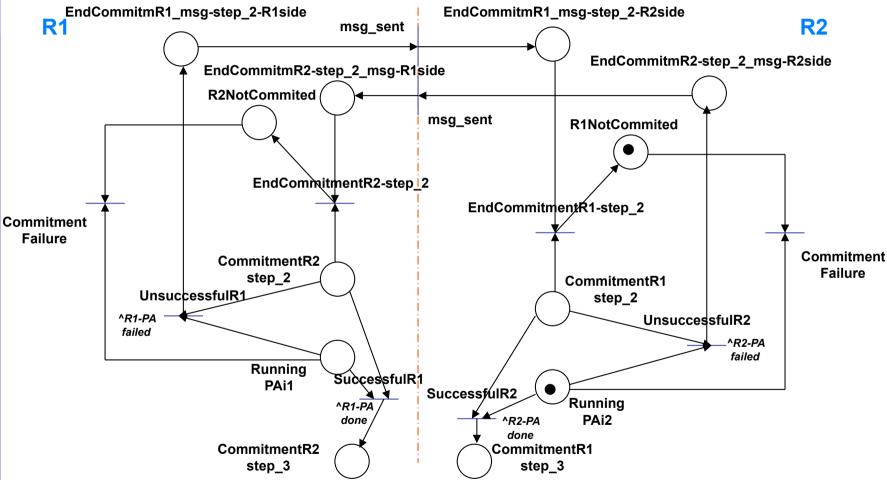
#### MODELS FOR COOPERATIVE ROBOTS



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#### MODELS FOR COOPERATIVE ROBOTS

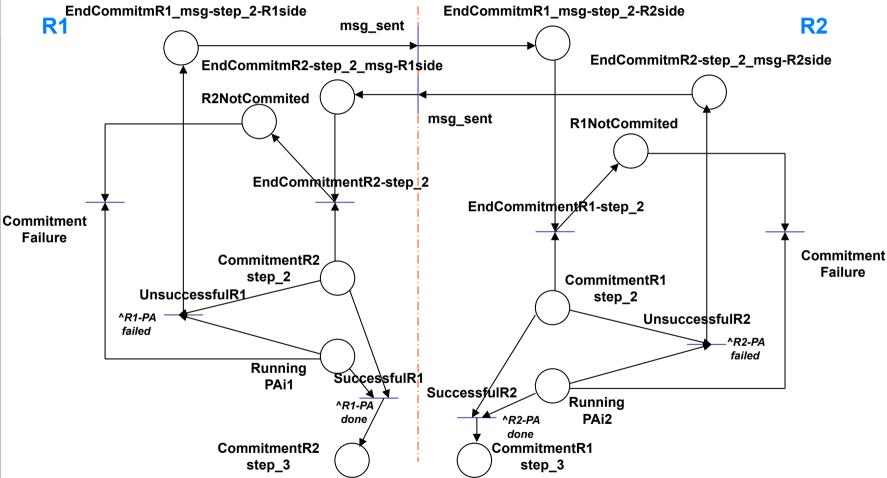




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#### MODELS FOR COOPERATIVE ROBOTS





### **EXAMPLE IN SOCCER ROBOTS**

**Programmed using Petri nets** 

#### **SYNCHRONIZATION**







Free Kick (simulated vs real)



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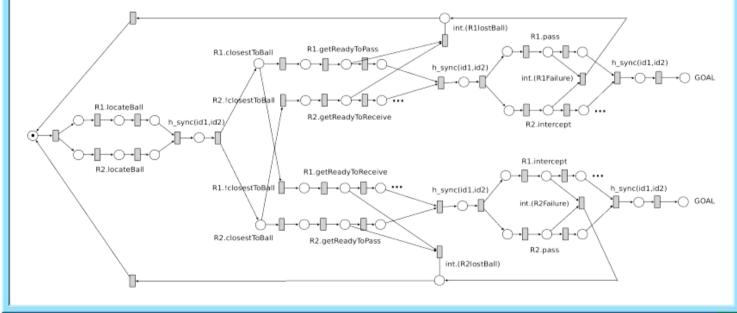
### **EXAMPLE IN SOCCER ROBOTS**

**Programmed using Petri nets** 

(Palamara et al, 2008)

#### **SYNCHRONIZATION**





**RELATIONAL BEHAVIOR - PASS** 



### **EXAMPLE IN SOCCER ROBOTS**

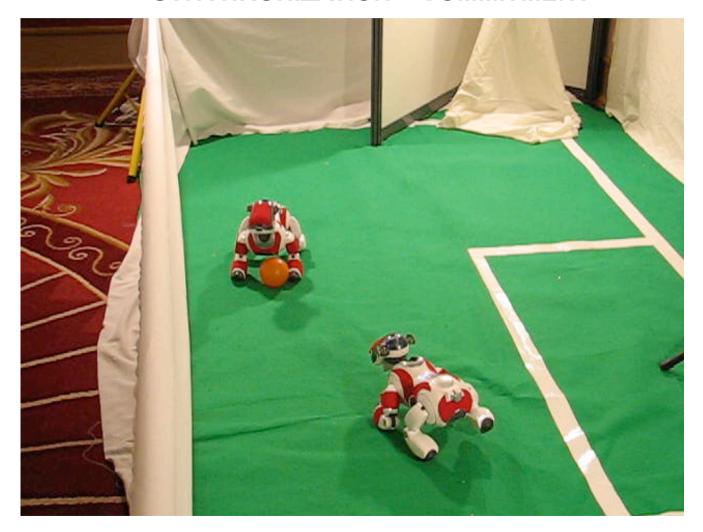
**Programmed using Petri nets** 

(Palamara et al, 2008)

#### **SYNCHRONIZATION + COMMITMENT**





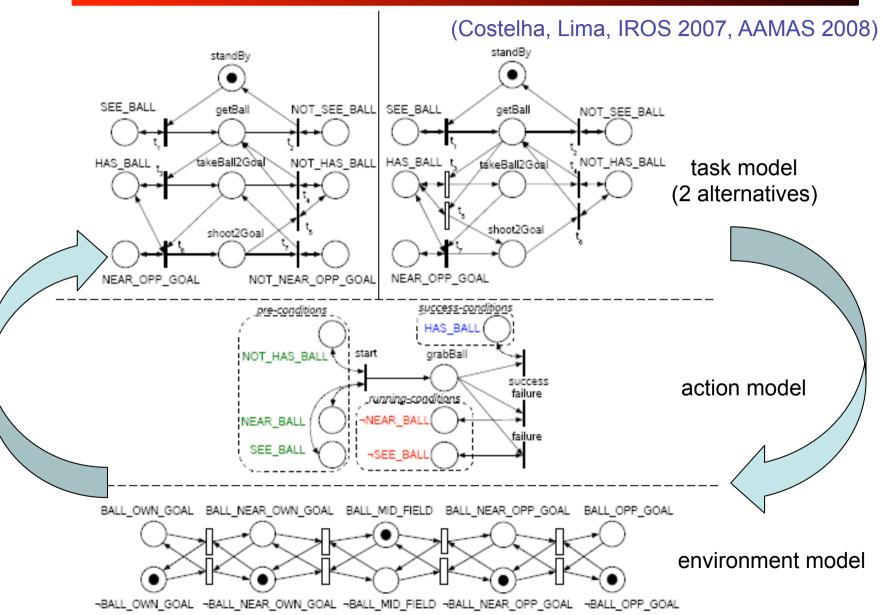


**RELATIONAL BEHAVIOR - PASS** 

### SUPERIOR TÉCNICO

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#### TASK + ENVIRONMENT MODEL



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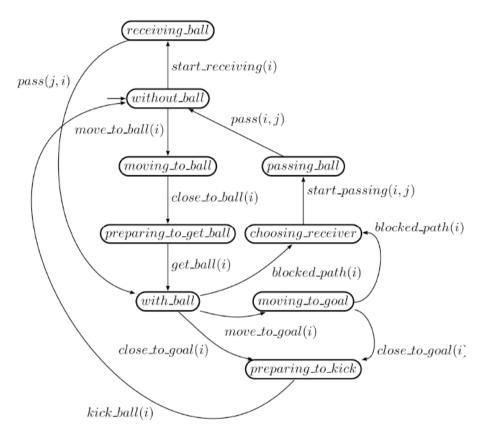


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#### DES SUPERVISION USING LOGIC SPECIFICATIONS

(Lacerda, Lima, 2008)



- model for 1 robot + environment
- several models can be composed
- controllable events are
  - start\_receiving
  - move\_to\_ball
  - pass
  - start\_passing
  - move to goal
  - kick\_ball
- unsupervised behavior enables several robots going to the ball or a robot start receiving a pass without a pass being made

temporal logic specifications disable those undesired behaviors

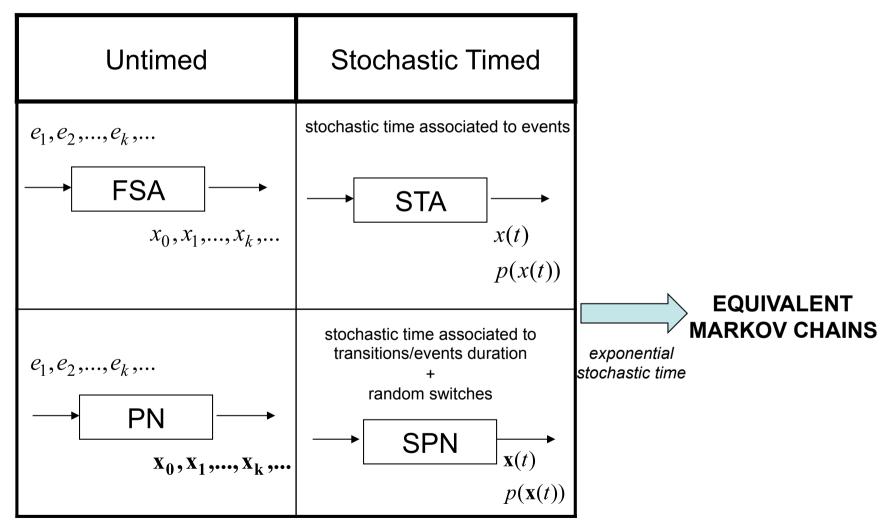
$$\varphi_1 = (G(\bigvee moving2ball(i) \lor \bigvee hasball(i)) \Rightarrow (X(\neg(\bigvee move\_to\_ball(i)))))$$
 
$$\varphi_{2,i} = ((\neg start\_receiving(i)) \land (G[(\bigvee start\_passing(j,i)) \Leftrightarrow (Xstart\_receiving(i))]))$$



#### **ROBOTIC TASK MODELS WITH UNCERTAINTY**













#### **ANALYSIS AND DESIGN**

#### Stochastic models enable answering *analysis* questions such as:

- what is the probability of success of a task plan?
- given a desired probability of success for the plan, what is the accumulated action cost (e.g., time, energy) to accomplish the task?
- what is the sensitivity of a plan to over- or under-estimation of the probability of success of one of its composing actions?

#### Stochastic models enable *designing* plans from specifications:

- given some desired probability of success, determine the plan that minimizes the accumulated action cost
- design a robust plan, in the sense of keeping its reliability above some threshold, in the presence of over-estimation of the probability of success of one of its composing actions?



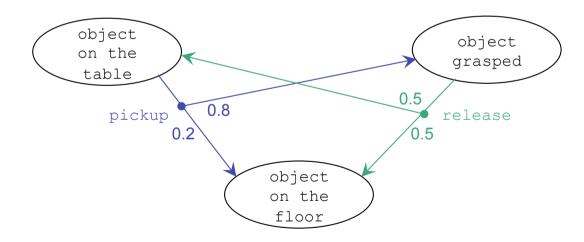




#### **ANALYSIS AND DESIGN**

- environment + controller composition
- stochastic model equivalent Markov Chain
- some of the events are controllable and represent decisions on starting actions controllable Markov Chain

#### MARKOV DECISION PROCESSES (MDP)



- effects of robot actions are uncertain but environment states are fully observable
- can be solved by Reinforcement Learning algorithms

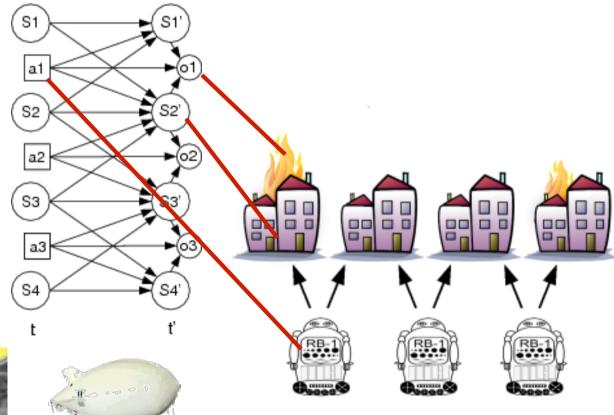
#### **DECENTRALIZED PLANNING UNDER UNCERTAINTY**

## APPLICATION TO COOPERATIVE PLAN EXECUTION IN SEARCH AND RESCUE

(Spaan, 2008)











#### **DECENTRALIZED PLANNING UNDER UNCERTAINTY**

### APPLICATION TO ACTIVE COOPERATIVE PERCEPTION

**EC FP7 URUS Project** 







Cooperative perception using:

- embedded and own sensors
- fusion techniques and technologies

Cooperative environment perception







#### **INSTITUTIONAL ROBOTICS**

- Decisions are not always necessarily based on rational principles,
   e.g., like with (PO)DMPs
- Inspiration from social sciences (namely Institutional Economics) to handle robotic collectives
- Robots are situated, embodied and social agents
- Their behavior is neither pre-programmed nor does it simply emerge
- Emergence is regulated by existing institutional norms
- By using institutional norms similar to those of humans, we expect this approach to simplify human-robot interaction, e.g., in search and rescue teams







#### **INSTITUTIONAL ROBOTICS**



physical properties



drivers must slow down and go left or right

BUT...

How to choose the appropriate direction not to crash one with the other?



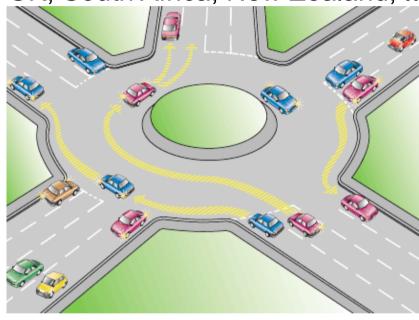
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#### **INSTITUTIONAL ROBOTICS**

Portugal, Spain, Germany, ...



UK, South Africa, New Zealand, ...



Convention (road code): go right





















#### CONCLUSIONS

## Systems-theory-based task design methods for general robotic tasks are promising concerning

- systematic approach to modeling, analysis and design
- analysis of formal properties and performance

#### To Be Proven

- scaling up to realistic applications
- design from specifications