# Al and Machine Vision

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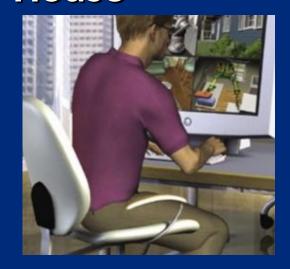
School of Engineering National Autonomous University of Mexico, UNAM

**AISIS2019** 

# OUTLINE

- Introduction
- Traditional Robotics Architectures
- Reactive Robotics Architectures
- Probabilistic Robotics Architectures
- Hybrid Robotics Architectures
- A System to Operate Mobile Robots (VIRBOT)
- Video

# Service Robots in an Intelligent House



A Robot in Every
Home:
Overview/The
Robotic Future. Bill
Gates, Scientific
American (2008)

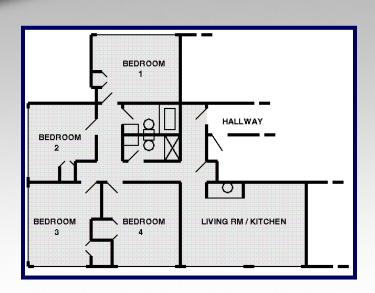
# Introduction

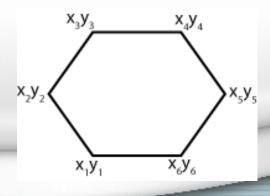


#### Features:

There is representation of the environment, with a symbolic representation of the objects in each room.

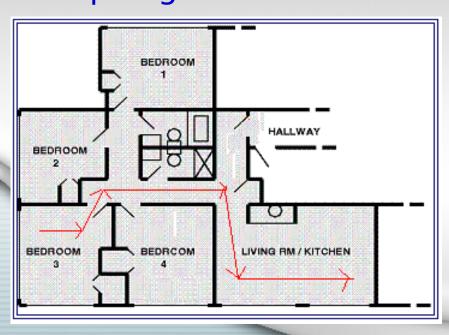
These are represented by polygons where they have their vertices Xi, Yi, ordered clockwise. These polygons separate the occupied space and the free space where the robot can navigate.



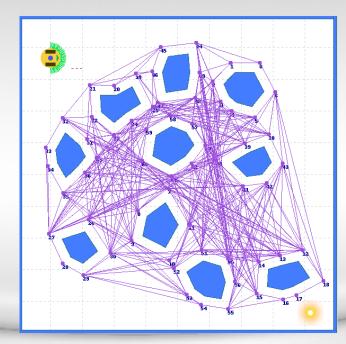


#### Features:

Movements and actions are planned using traditional artificial intelligence techniques of searches in topological networks.



Global Path



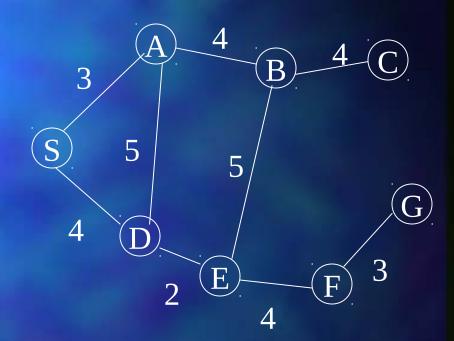
Local paths for each room

# The basic search problem: Given:

- Starting point (node)
- 2. The goal point (node)
- A map of nodes and connections

#### Goals:

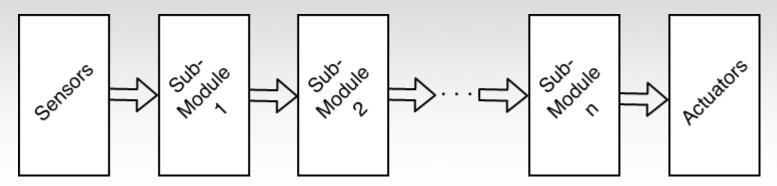
- Find some path or find the "best" path (maybe shortest)
- 2. Traverse the path



Depth-first Artificial Intelligence Hill climbing Some path Techniques to Search for: Breadth-first Some path Beam Best-first Optimal path British museum Optimal Path Branch and bound Search **A**\* Dijkstra

#### Features:

It has a serial organization, if one module fails the entire system fails.



This type of systems are not suitable for dynamic environments or for robots that have errors in movement and sensing.

The robot Shakey was the first example of this architecture, developed from approximately 1966 through 1972 in Stanford University.



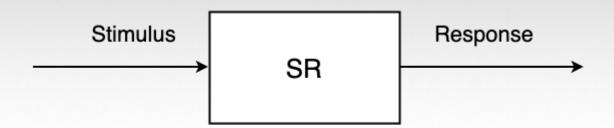
# Reactive Robotics Architectures

#### Features:

- Based on the behavior of insects.
- A representation of the environment is not necessary.
- It does not use action or movement planning.
- It is suitable for dynamic environments and with sensing errors.
- It is based on behaviors running in parallel.

# Reactive Robotics Architectures

Behaviors are represented using stimulusresponse or SR diagrams.



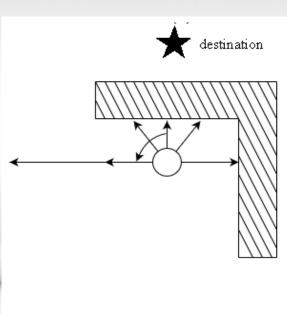
The output of each behavior must be instantaneous from the moment there is an entry. The behaviors are independent of each other. Behaviors can be designed using zero order logic, state machines, potential fields, neural networks, etc.

# Reactive Robotics Architectures Zero Order Logic

#### Features:

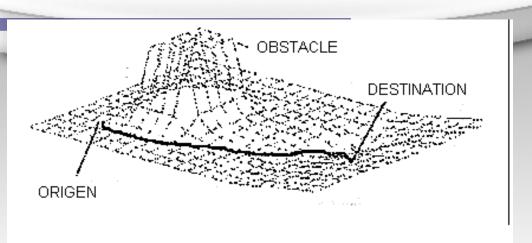
Values of the input sensors are checked and if they comply with a certain property, an output is generated, which lasts a certain time. These behaviors have no memory.

Example: If the light source is above the robot and there is an obstacle in front and on the right side, then the robot turns to the left.

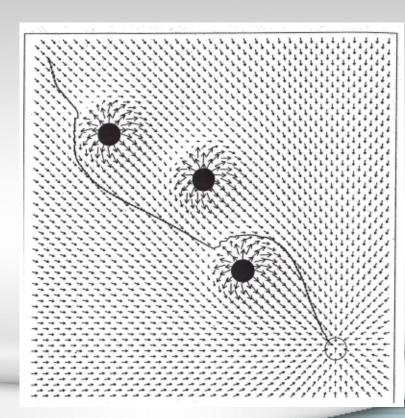


### Reactive Robotics Architectures

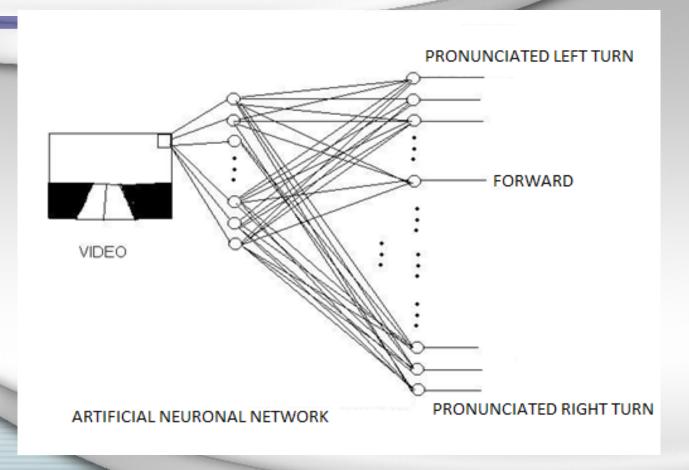
Potential attractive and repulsive fields



These behaviors have no memory.

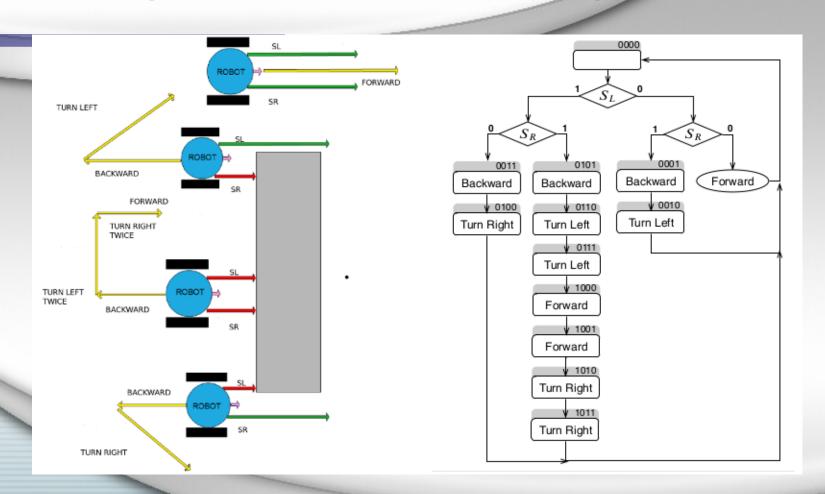


# Reactive Robotics Architectures Using Artificial Neural Networks



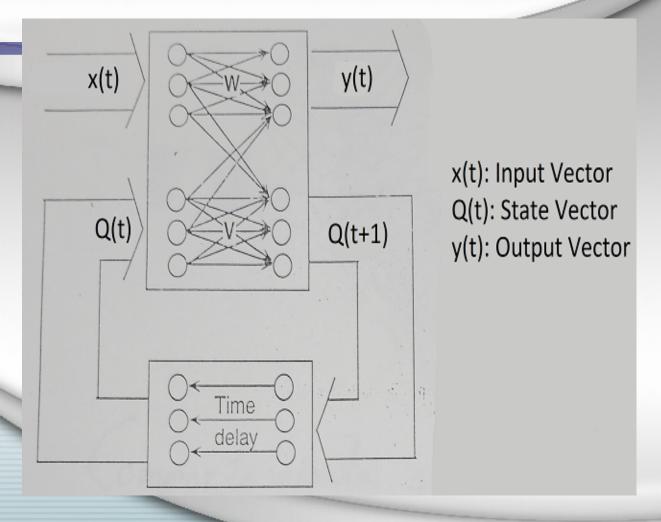
Reactive behaviors without memory using neural networks

# Reactive Robotics Architectures Using state machine algorithms



These behaviors have memory.

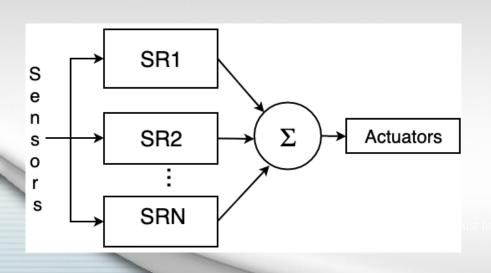
# Reactive Robotics Architectures Using Recurrent Artificial Neural Networks

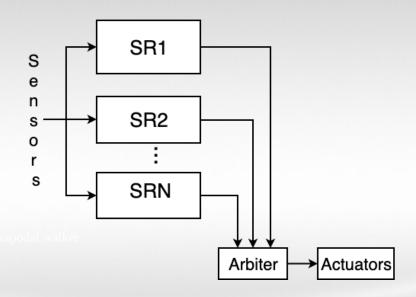


These behaviors have memory.

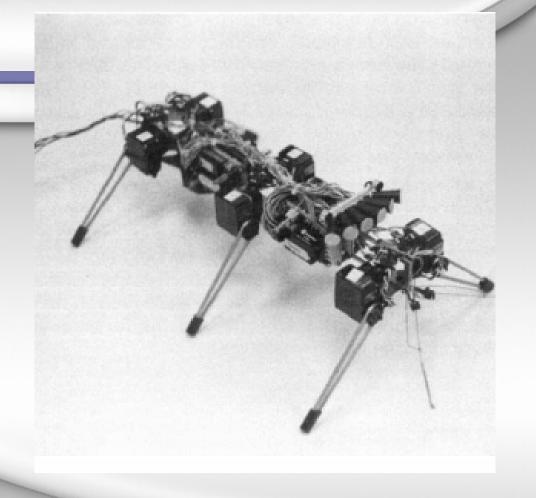
# Reactive Robotics Architectures

The SR can be combined in different structures by connecting them in parallel by adding the output of each of them or selecting one of the outputs using an arbiter.





# Reactive Robotics Architectures

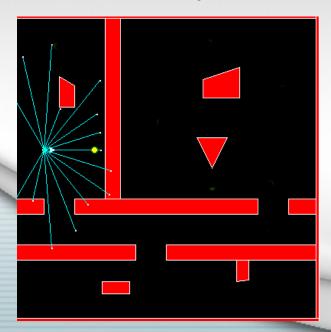


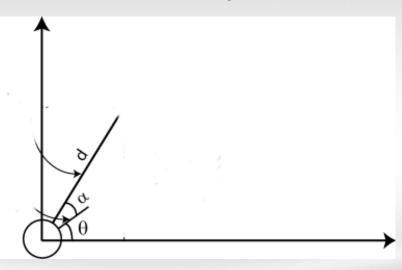
Genghis, a robust hexapodal walker, is an example of this architecture, developed by Rodney Brooks in the MIT in the 80's.

## Probabilistic Robotics Architectures

#### Features:

It is based on the concept that both the sensing of the environment that the robot makes, as well as its movements are dependent on random variables, which can be manipulated using probabilistic concepts.

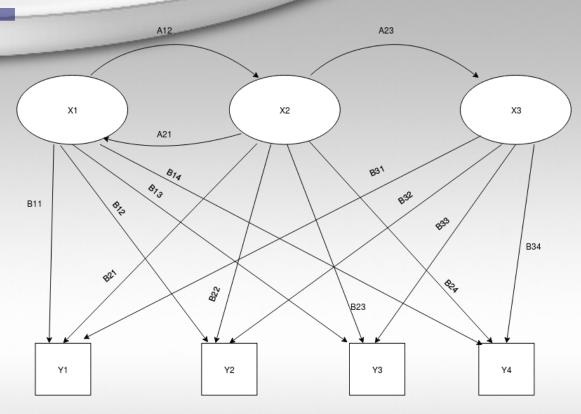




## Probabilistic Robotics Architectures

Hidden Markov Models (HMM), Particle Filters, Markov Decision Processes, etc. are used.

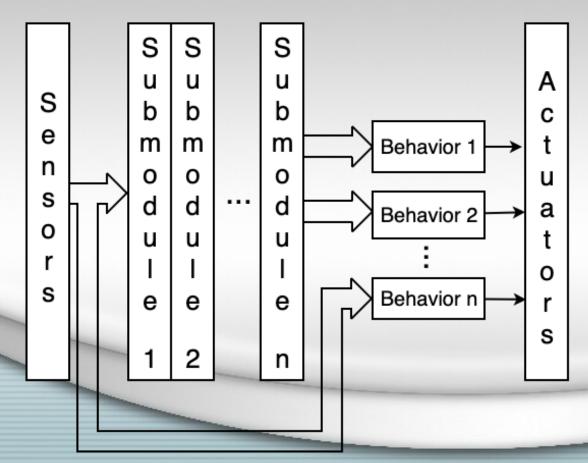




Stanley, an autonomous car created by Stanford University in 2005 under the direction of Sebastian Thrun, is an example of this architecture.

# Hybrid Robotics Architectures

Traditional, reactive and probabilistic architectures are combined to replace the deficiencies of each of them.

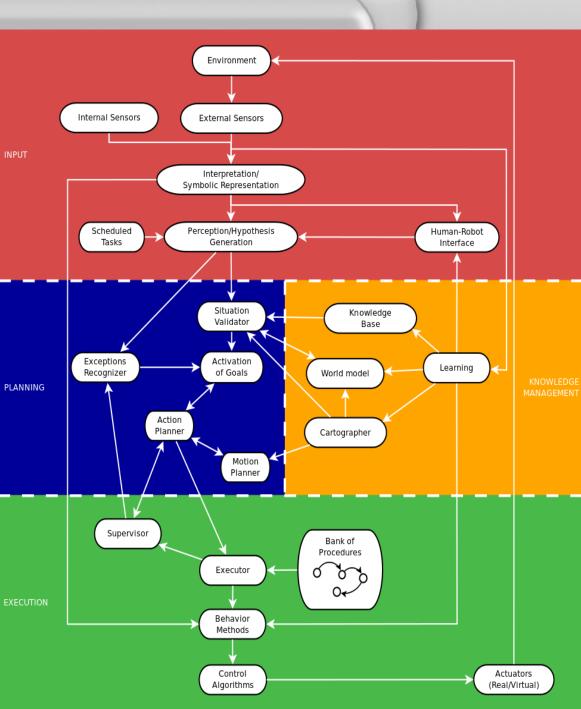


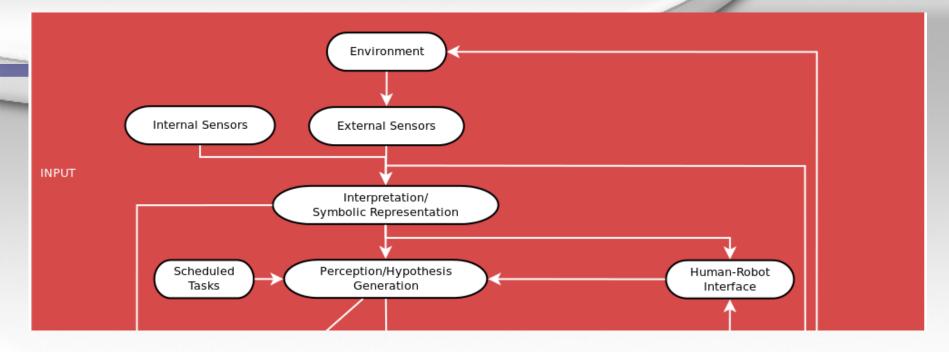
Hybrid model used with the Justina robot:

Virtual Real Robot

(ViRBot)

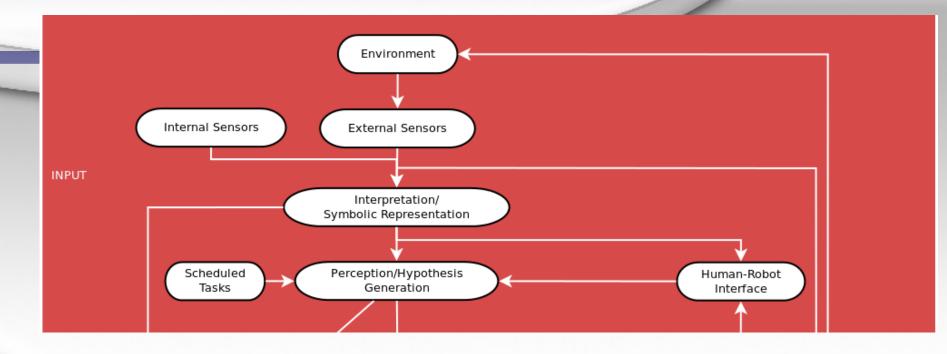






This layer process the data from the robot's internal and external sensors, they provide information of the internal state of the robot, as well as, the external world where the robot interacts.

In some of our robots designs they have lasers, sonars, infrared, microphones and stereo and RGB-D cameras.

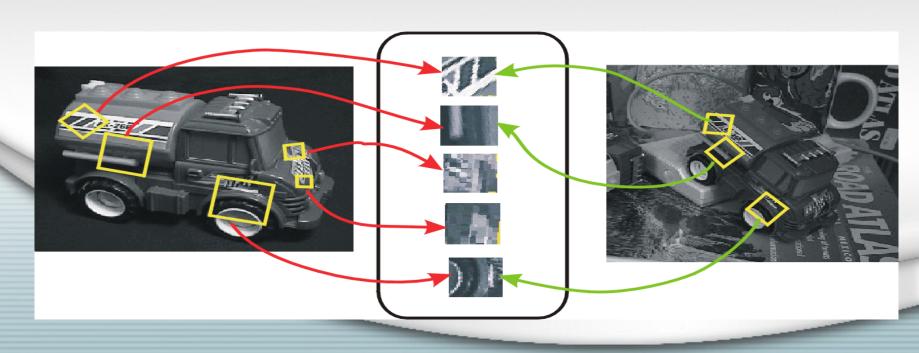


Digital signal processing techniques are applied to the data provided by the internal and external sensors to obtain a symbolic representation of the data, as well as, to recognize and to process voice and visual data.

Pattern recognition techniques are used to create models of the objects, places and the persons that interact with the robot.

## **Vision System**

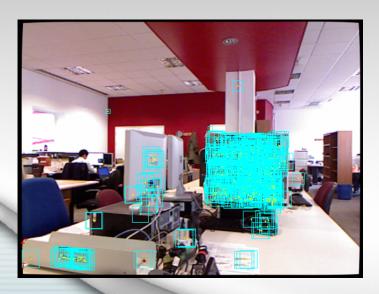
For the recognition of objects, people and places, using RGB-D cameras, vision systems that are robust to partial occlusions, scale and rotation changes are used



# Visual Description

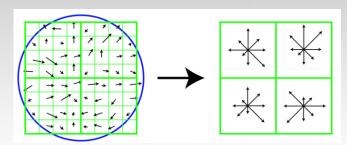
Detection

**Detector FAST** 



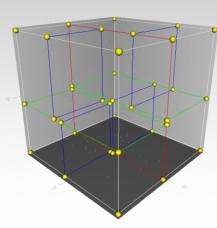
Description

**Descriptor SIFT** 

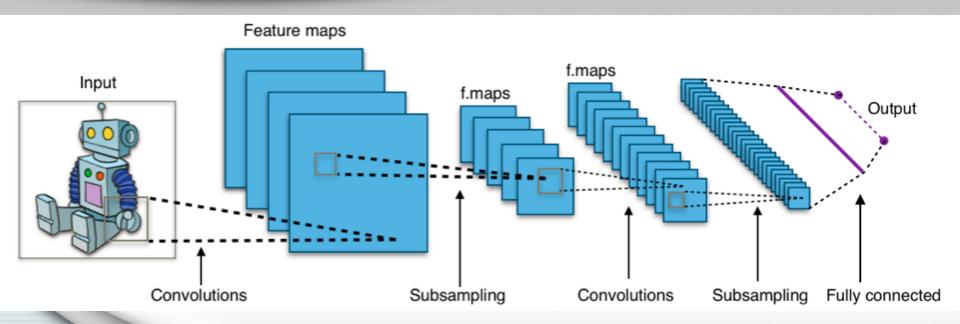


Storage

**KD Trees** 

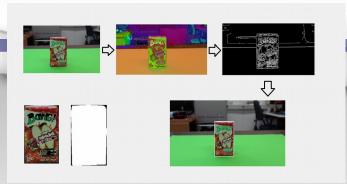


#### Convolutional neural network

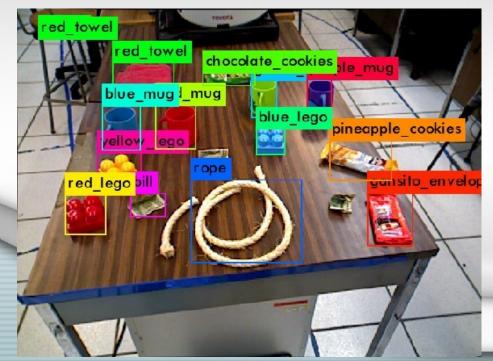


By Aphex34 - Own work, CC BY-SA 4.0, https://commons.wikimedia.org/w/index.php?curid=45679

Trainning New Objects in a Deep Neural Network Using YOLO (Edgar Silva)







# Finding persons and their actions in the environment using deep neural networks (Edgar Vazquez)

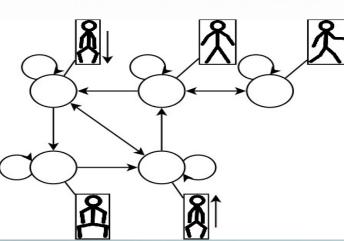






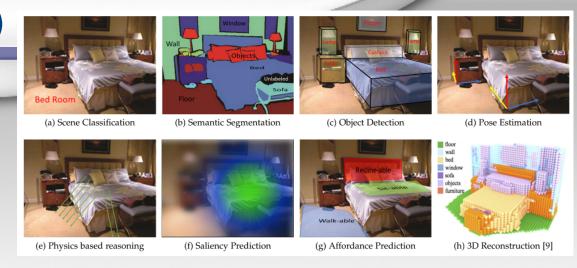


The Use of Hidden
Markov Models
(HMM) for the
Recognition of
Human Activities

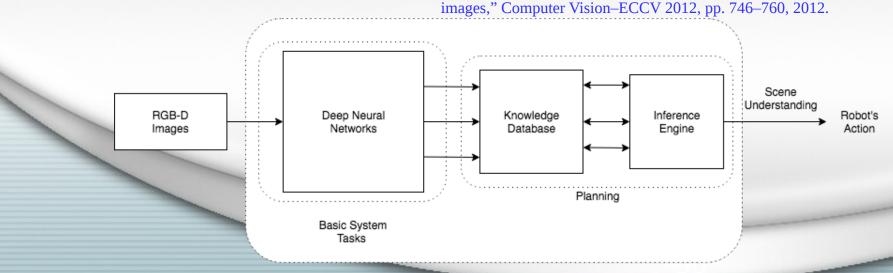


Scene Classification and Understanding

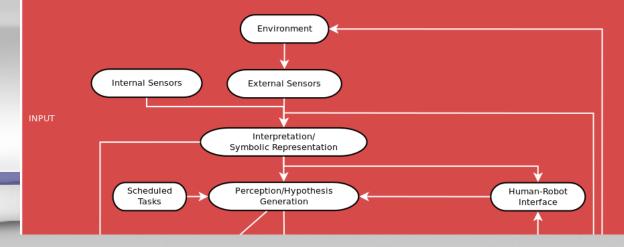
(Hugo Leon)



N. Silberman, "Indoor segmentation and support inference from rgbd images," Computer Vision–ECCV 2012, pp. 746–760, 2012.



Scene Understanding System



#### SCHEDULED TASKS

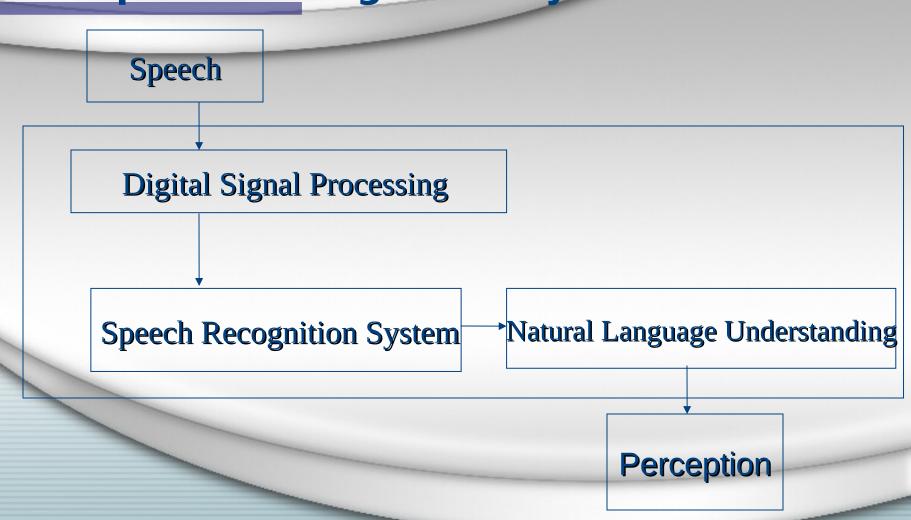
A set of tasks that the robot needs to perform in the time they were scheduled.

#### **HUMAN / ROBOT INTERFACE**

Communication between the user and the robot can be through voice and manual gestures.

The robot responds using synthetic voice and simple facial expressions.

# INPUT LAYER HUMAN / ROBOT INTERFACE Speech Recognition System



# INPUT LAYER HUMAN / ROBOT INTERFACE

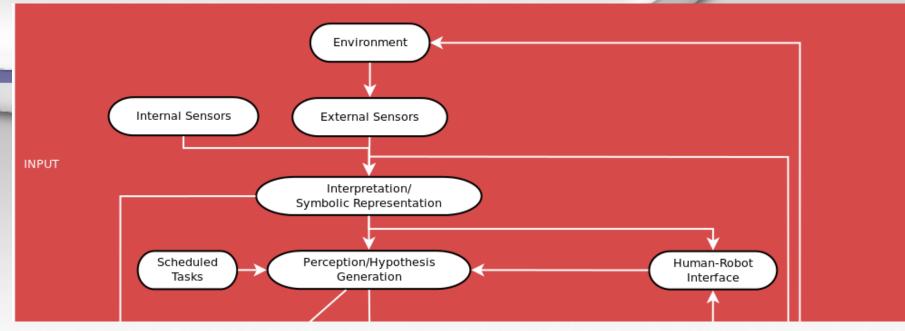
Natural Language Understanding

- \* "Robot, give the newspaper to Dad"
- \* "Please bring me the newspaper that is there" (Dad is giving the order to the robot)

Both phrases are represented using the following Conceptual Dependency primitive:

(ATRANS (ACTOR Robot) (OBJECT newspaper)
(TO Dad) (FROM newspaper-place))

With this representation a planner makes an action plan to achieve what the robot is being asked for.

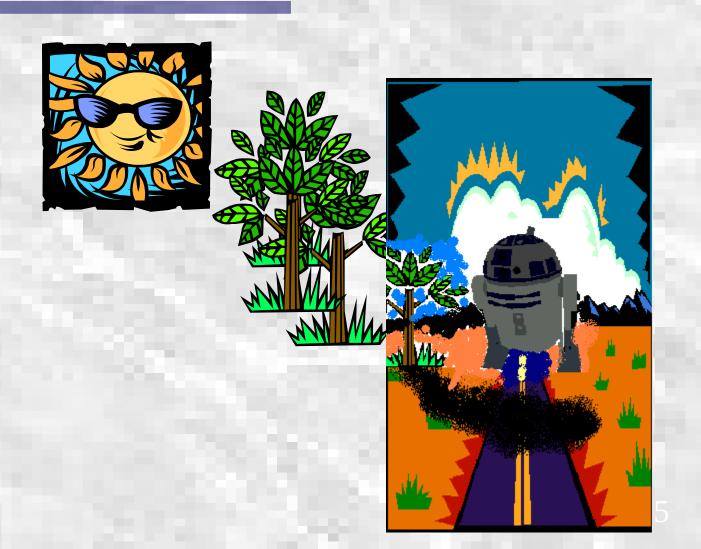


Digital signal processing techniques are applied to the data provided by the internal and external sensors to obtain a symbolic representation of the data.

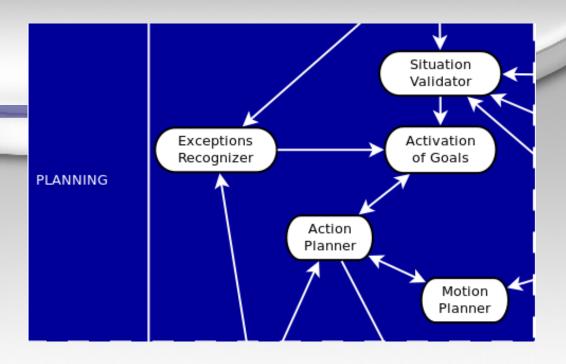
With the symbolic representation, this module generates a series of beliefs, that represent the state of th environment where the robot interacts.

#### **PERCEPTION**

Example: In the following figure, the symbolic representation generates the beliefs: "there is a hole in front of the robot" or "there is a shadow in front of the robot"

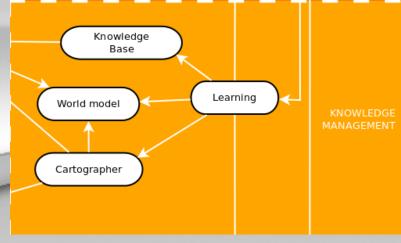


#### **PLANNING LAYER**



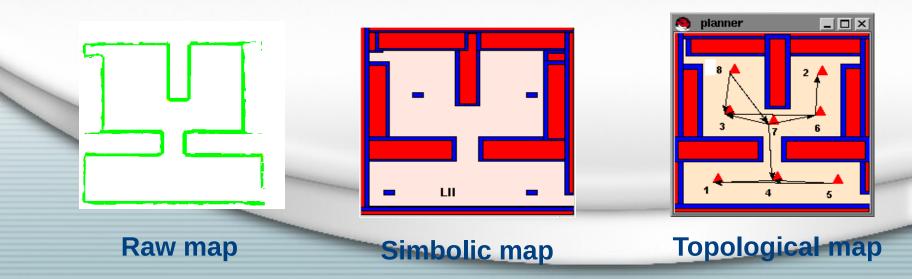
The beliefs generated by the perception module are validated by this layer, it uses the Knowledge Management layer to validate them, thus a situation recognition is created.

#### **KNOWLEDGE MANAGMENT LAYER**



#### Cartographer

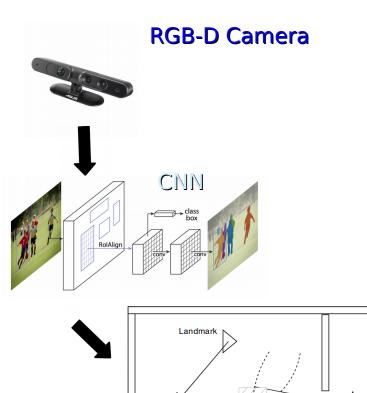
This layer has different types of maps for the representation of the environment, they are created using SLAM techniques.



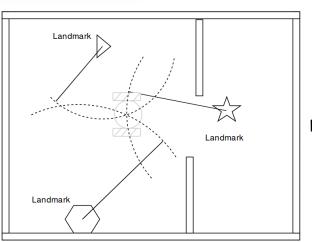
# KNOWLEDGE MANAGMENT LAYER Cartographer

Estimation of the robot's pose using the Kalman

**Filter** 



The Kalman filter and deep neural networks are used to estimate the robot's position and orientation (Diego Cordero)



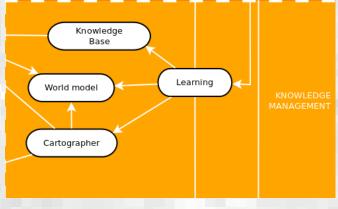
Eje y

(x, y)

0

#### **KNOWLEDGE MANAGMENT LAYER**

#### **WORLD MODEL**



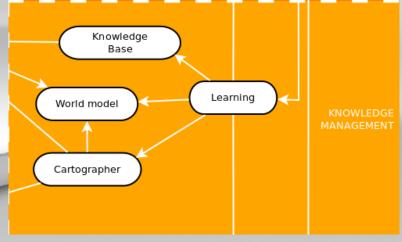
There is a representation of the objects, people and places where the robot interacts and the relationships that exist between them. There are 5 structures that represent objects, rooms, furniture, humans and the robot

```
(Human
                                    (Furniture
                                                                  (Object
  (name Mother)
                                       (name kitchen-table)
                                                                    (name newspaper)
  (room studio)
                                       (room kitchen)
                                                                    (room outside)
  (zone couch)
                                       (zone left-side)
                                                                    (zone outside-door)
                                       (pose 0.2 2.3 1.0)
                                                                    (pose 0.5 1.3 0.1)
  (objects book)
                                                                    (possession nobody)
                                       (use eating)
  (pose 1.8 2.0 0.5)
                                                                    (use information)
                                       (attributes fixed)
  (locations main-bedroom)
                                                                    (locations living kitchen)
                                                                    (attributes movable)
```

All this information is updated by the input layer and by the actions of the robot.

#### **KNOWLEDGE MANAGMENT LAYER**

**KNOWLEDGE BASE** 



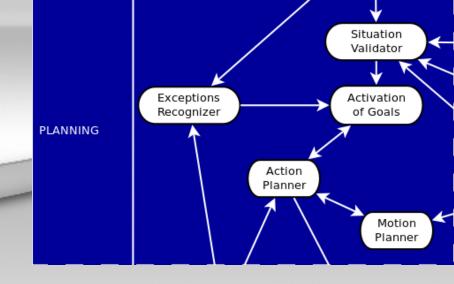
Using a rule-based system, CLIPS (NASA), robot knowledge is represented. This is represented by production rules, which correspond to the actions that the agent would do if certain conditions are met.

For the previous R2R2 example the following rule would be activated:

Shadow Rule {
 If there are trees around the robot's path and it is a clear day then there will be a shadow in the path.

#### **PLANNING LAYER**

Situation Validator



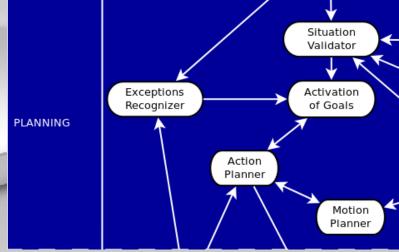
In the previous example, the cartographer does not report a hole in the area in front of the robot and the representation of knowledge reports a shadow.

Then, with these facts the new situation is that there is no danger and that the robot must continue towards its destination.

#### **PLANNING LAYER**

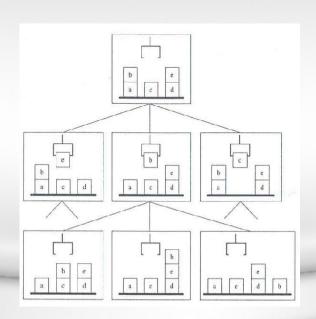
**Activation of Goals** 

Given a situation recognition, a set of goals are activated to solve it.



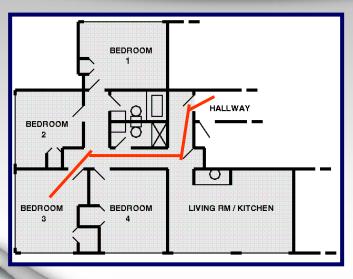
#### **Action Planner**

Action planning finds a sequence of physical operations to achieve the activated goals.



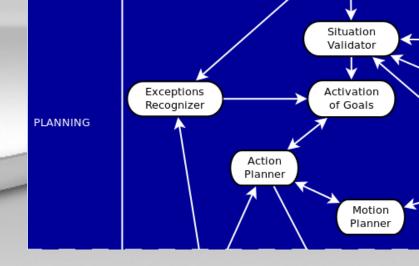
### **PLANNING LAYER**

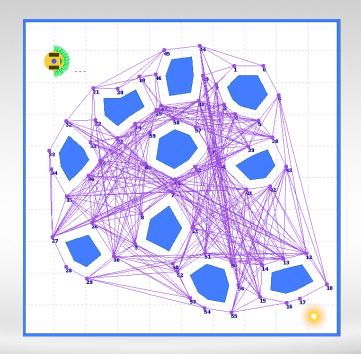
**Motion Planner** 



**Global Path:** 

Path between rooms.

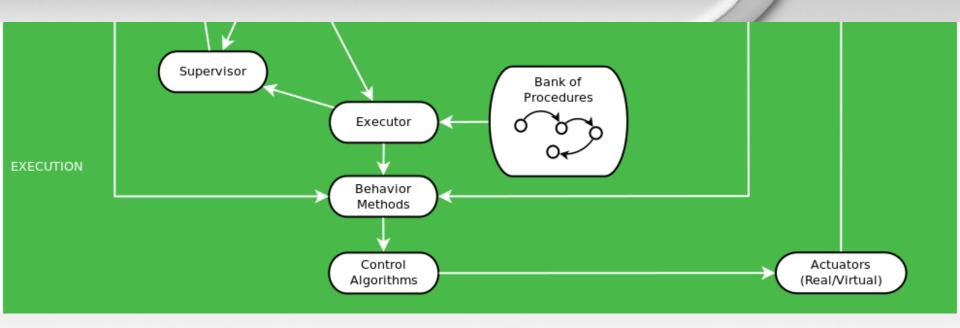




**Local Path:** 

Path inside each room.

#### **EXECUTION LAYER**



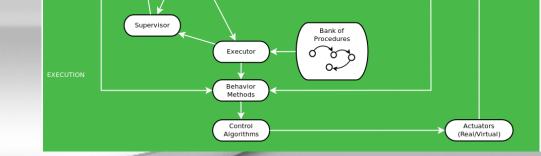
This layer executes the actions and movements plans and it checks that they are executed accordingly.

A set of hard-wired procedures, represented by state machines, are used to partially solve specific problems, finding persons, object manipulation, etc.

The executor uses these bank of procedures to execute a plan.

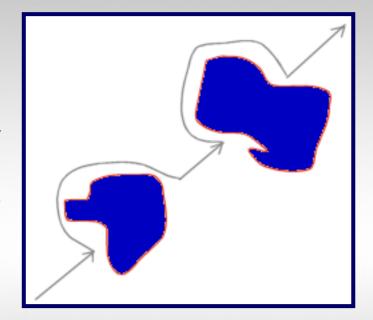
#### **EXECUTION LAYER**

#### **Behavior Methods**



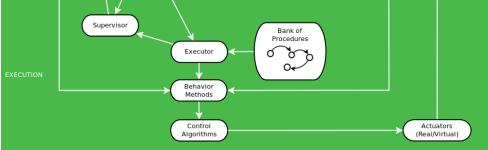
Behaviour methods are used to avoid obstacles not contemplated by the movements planner.

The behaviour methods are state machines, potential fields and neural networks.



### **EXECUTION LAYER**

CONTROL ALGORITHMS

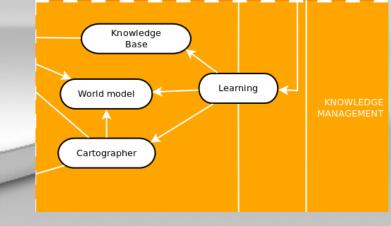


Control algorithms, like PID, are used to control the operation of the virtual and real actuators.



### KNOWLEDGE MANAGMENT LAYER

Learning



Genetic algorithms and programming

Probabilistic methods:

Markov chains

Bayesian classifiers.

Clustering (K-means, Vector Quantization)

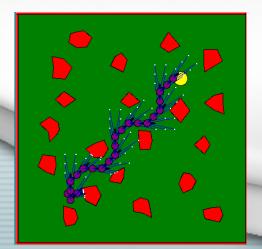
**Artificial Neural Networks** 

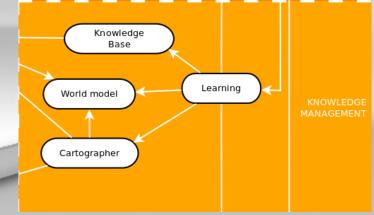
Reinforcement Learning

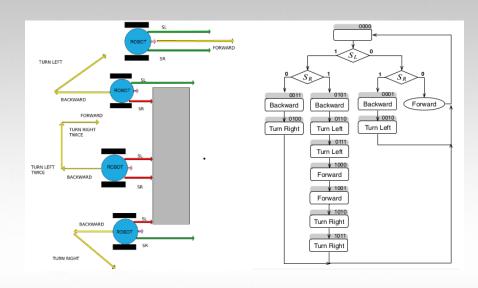
# KNOWLEDGE MANAGMENT LAYER Learning

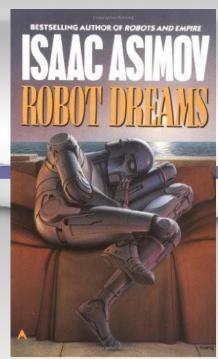
Genetic algorithms and programming

The goal is to use an optimization algorithm, as genetic algorithms (GA), to find the best robot behaviors to avoid obstacles while they tried to reach a destination.









#### **Robot Learning Using Simulators**

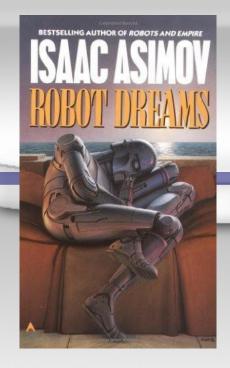
With simulated images the robot is trained to navigate in new environments while it is in resting mode.

Gazebo 3D robot simulator integrated with a physics engine (Oscar Fuentes)



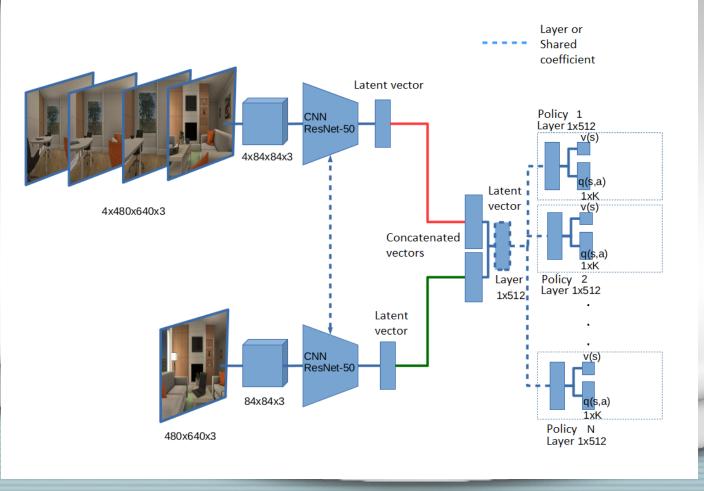


The House Of inteRactions THOR, Allen Institute for Artificial Intelligence (Adrian Sarmiento)



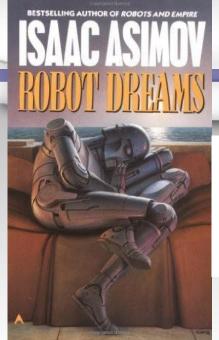
#### **Robot Learning Using Simulators**

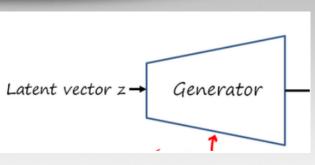
THOR Simulator used to do MDP reinforcement learning for robot's movement. (Adrian Sarmiento)



#### Image Synthesis with Generative Adversarial Nets (GAN)

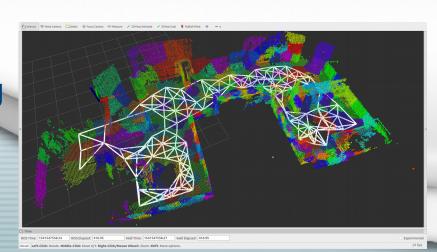
With synthetic images the robot is trained to navigate in new environments while it is in resting mode. (Future Work)







Training Path

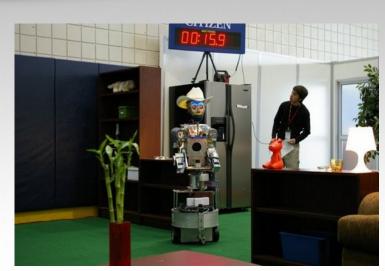


The generator creates synthetic images of the environment.

### Robots



Robot TX8 (1999)



Robot TPR8 (2006)



Robot PACK-ITO (2009)

### Robots

Kinect Upper Manipulator Sensor Mechatronic Head Sound Speakers Hokuyo Rangefinder Mobile\_ Base Lower Manipulator Gripper





Robot AL-ITA (2011)

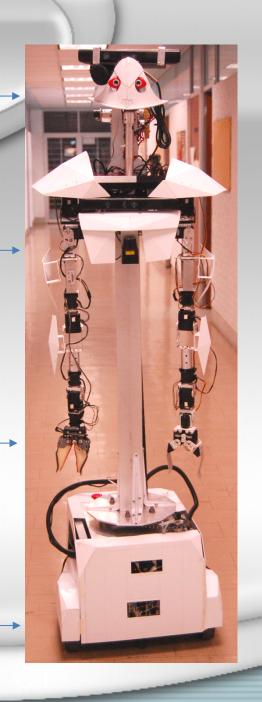
Robot JUST-INA (2012 - ...)

Robot Takeshi Toyota (2018 - ...)

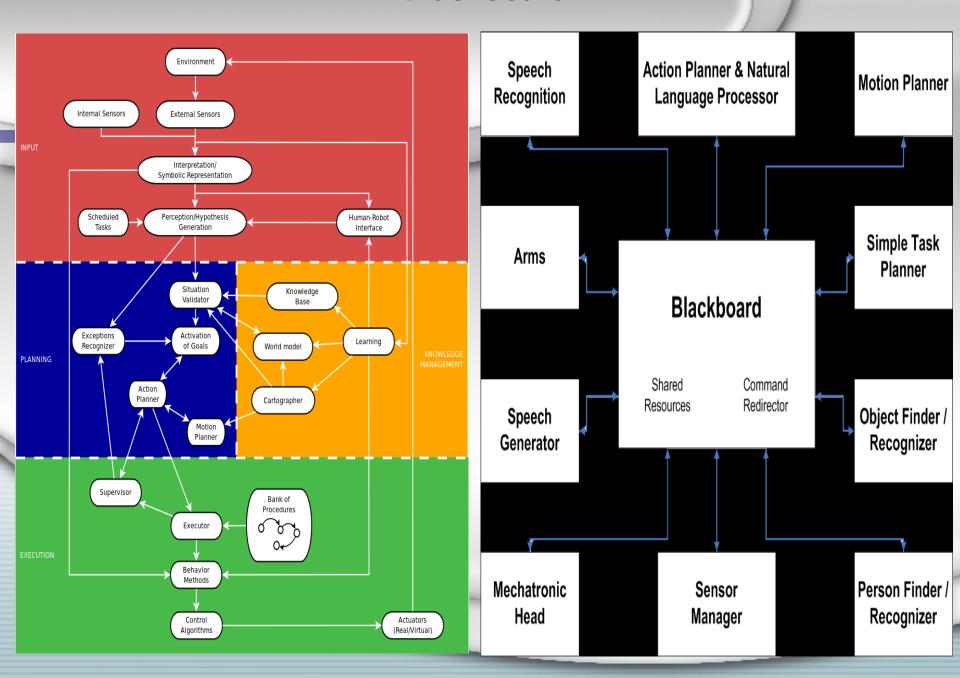
## Robot Justina

- Mechatronic Head (Pan and Till)
  - Kinect
  - Stereo Cameras
  - Microphone

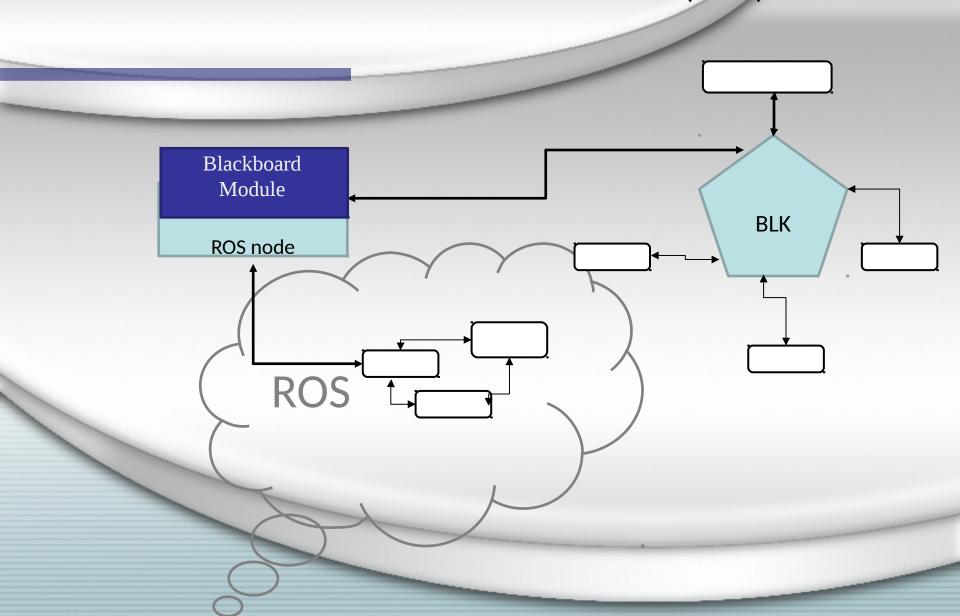
- Torso
  - Kinect
  - Laser Hokuyo
- Two arms (7 DoF)
- Mobile Base



#### Blackboard



### BLACKBOARD ROBOT OPERATING SYSTEM (ROS)



### RoboCuP @Home Participation

2007 Atlanta, USA, Third Place

2018 Montreal, Canada, Second Place

2019 Sydney, Australia, Second Place



Justina in China, 2015

# Video



# Robocup@Home 2014 Qualification Video

Justina

A General Purpose Service Robot

by PUMAS@HOME



# Video

# pumas@home Qualification Video 2017







## Al and Machine Vision

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