

# Picked by a robot Behavior Trees for real world robotic applications in logistics

Magazino GmbH

Landsberger Str. 234 80687 München T +49-89-21552415-0 F +49-89-21552415-9

info@magazino.eu www.magazino.eu





# What is Magazino? Flexible, mobile picking robots for your warehouse

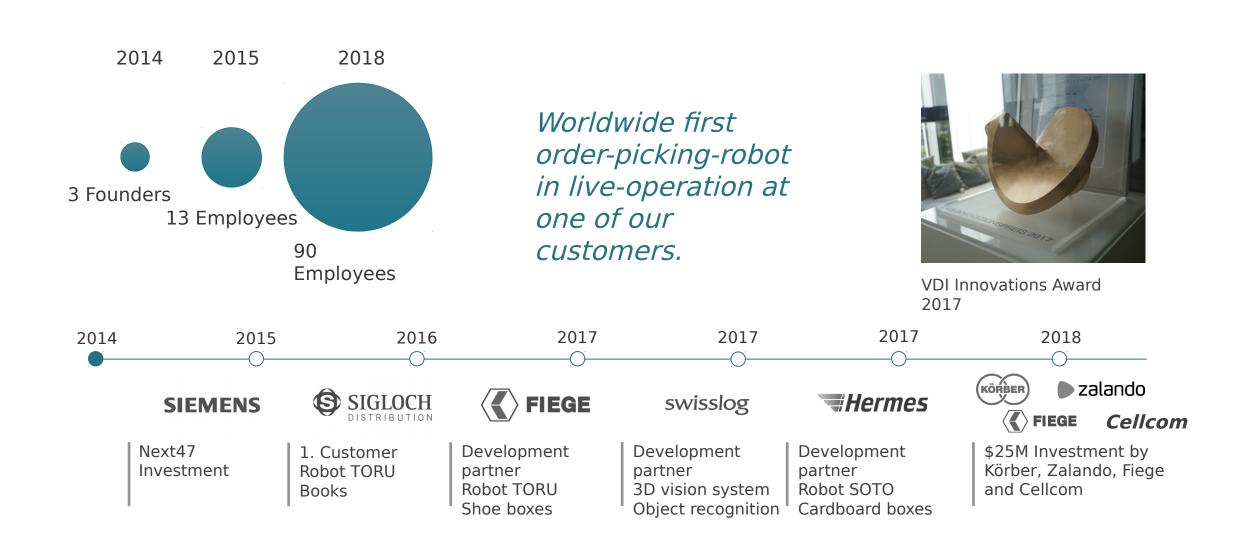




# Customers and partners

#### These companies trust Magazino





# Problems in the fulfillment sector Uncertainties set limits for automation

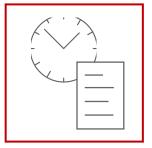




Highly automated and fast production at Audi today



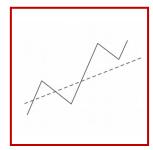
Almost completely manual intralogistics in the same factory today



Short contract periods



Unergonomic tasks



Handling order peaks



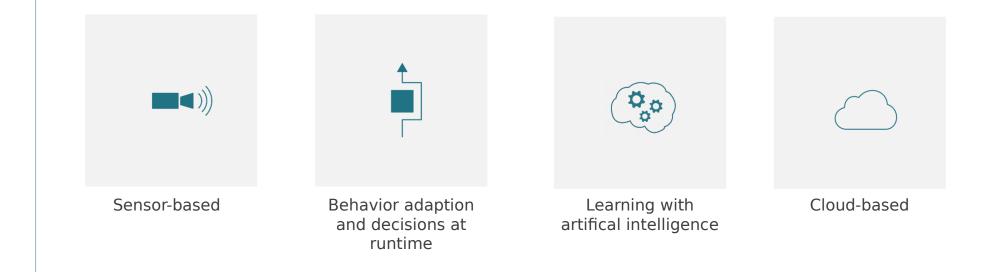
Lack of qualified personnel

# Robotics Technologies Comparison A huge step compared to traditional robotics





- + High precision & performance
- Repetitive, predefined jobs
- Deterministic tasks



# Approaches by the automation industry

#### Concepts at work right now



Concept



Man-to-goods

Products





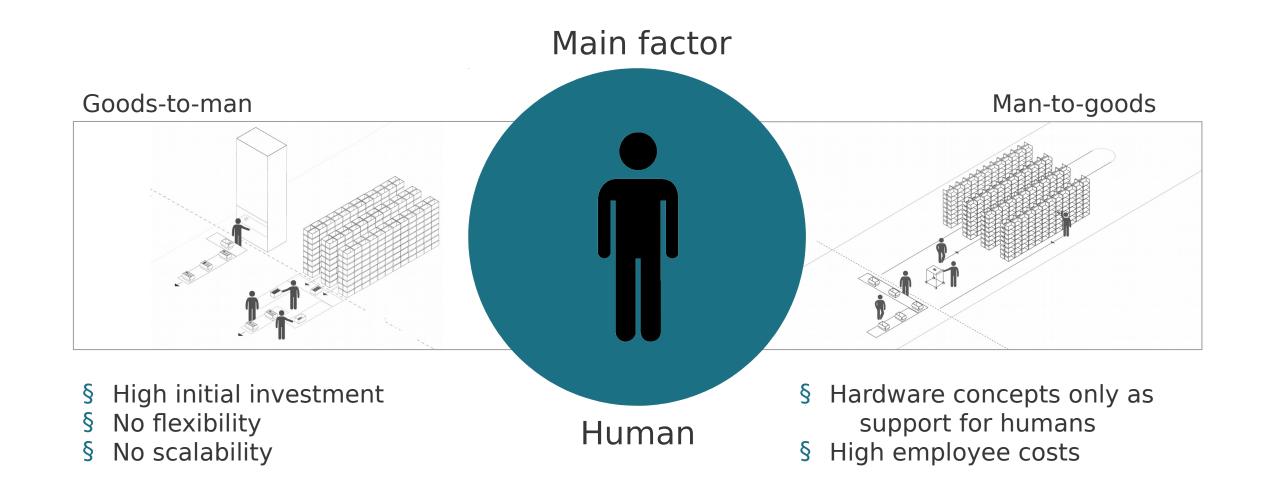
Manufacturer





# Rigid concepts Why these concepts are not the final solution





# Cooperative robots for intralogistics Magazino's solution for fulfillment and production supply





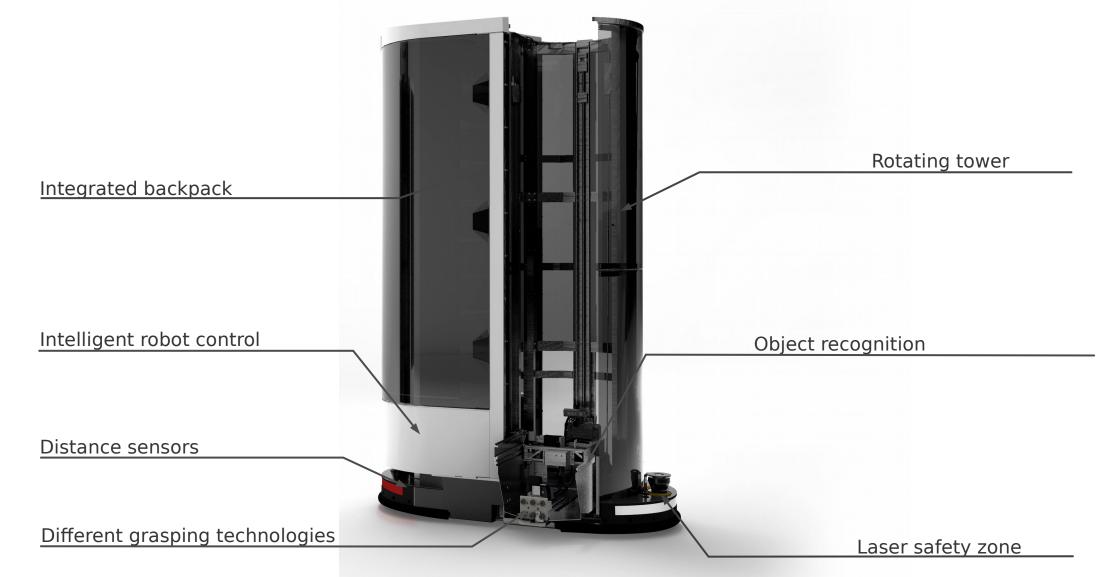




# TORU Pick-by-Robot

## TORU The robot for the E-commerce sector





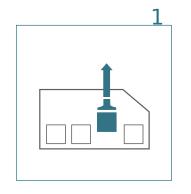




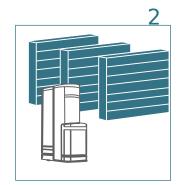
# Advantages of TORU



#### Flexible automation to save pick-costs



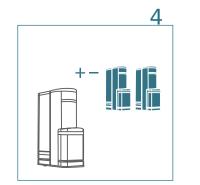
Item-specific handling



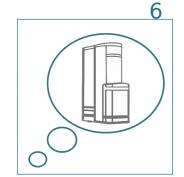
Integration into existing warehouse



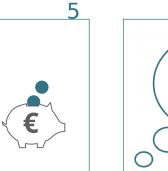
Working parallel to Flexibility humans



Reduced laborand processcosts



New logistics concepts possible





# SOTO The robot for production supply





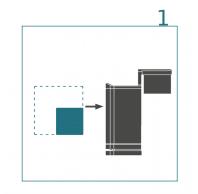




# Advantages of SOTO



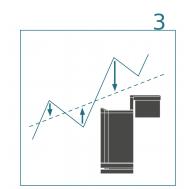
#### Saving costs through automated production supply



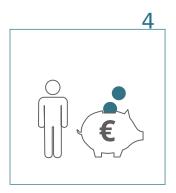
Flexibile gripping



Support for unergonomic tasks



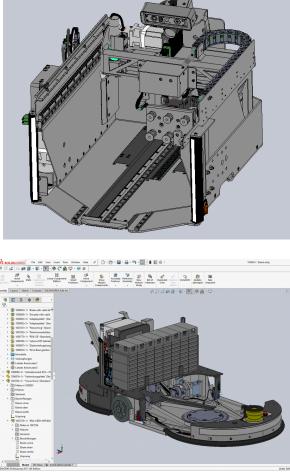
Lower stock because of Justin-time delivery



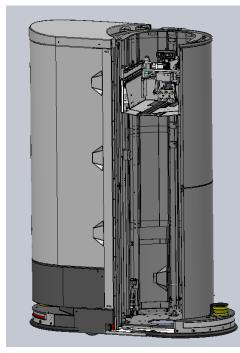
Reduced laborand processcosts

# Mechanical design

• The entire robot is designed internally by Magazino engineers

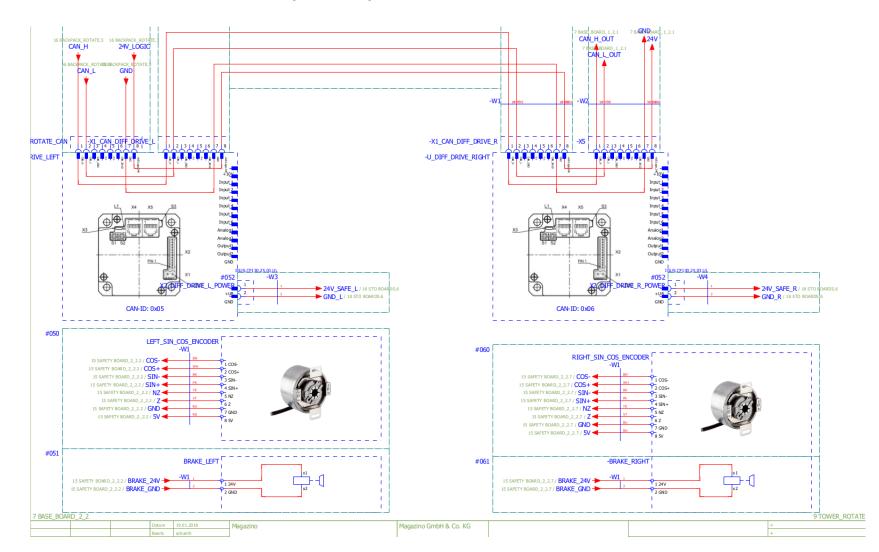






# Electronic design

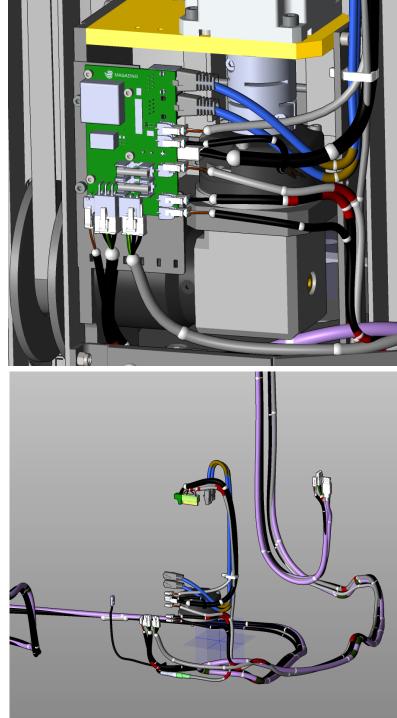
• Robot uses custom PCBs to dispatch power and interface with hardware



# Electronic design

- The 3D mechanical drawing is augmented with all the cables
- Collisions, lengths and maximum bending are included
- PCB size and connectors placements are added in the CAD



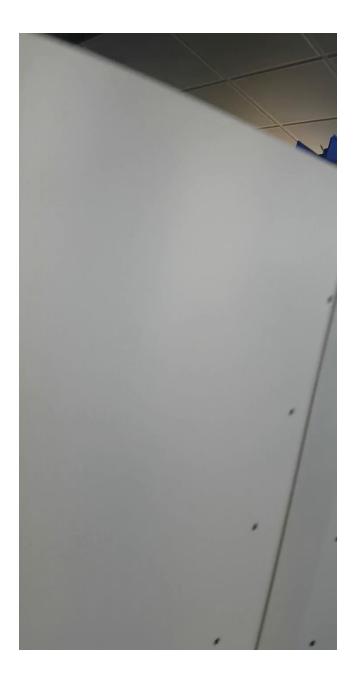


# Magazino robots are built internally

We have a production department where robots are built and tested







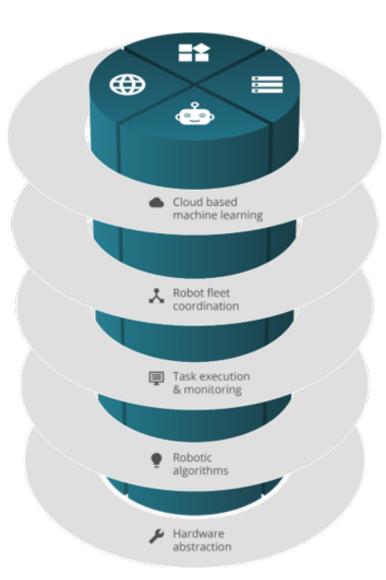
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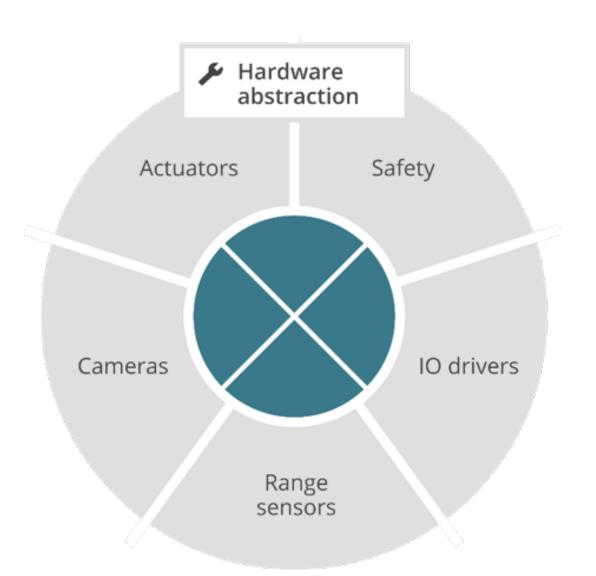
# Software architecture (ACROS)

A unique framework architecture for perception-guided engineering that is generalizable to other robots and environments



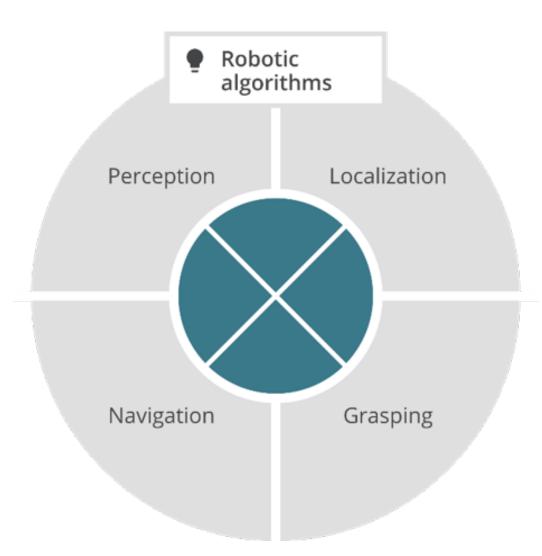
## Hardware abstraction

A broad range of drivers decouples the upper software layers from the hardware, allowing the use of many different components



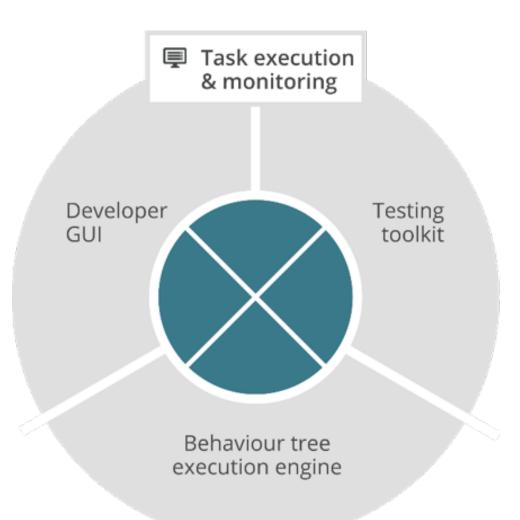
# **Robotics algorithms**

A suite of algorithms for interpreting sensor data provides the components for engineering robot applications

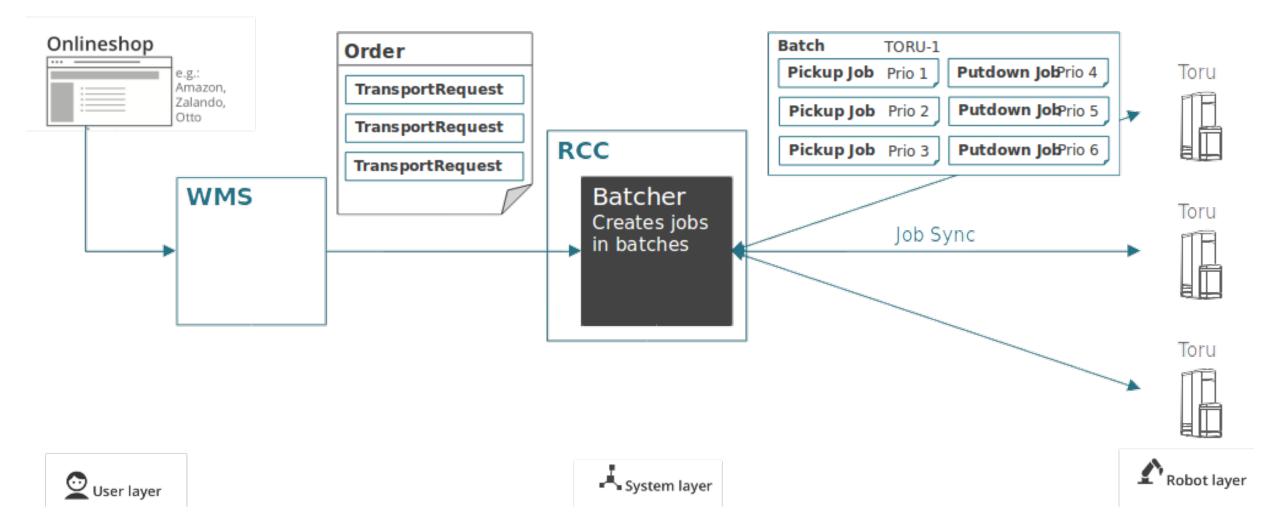


# Task execution and monitoring

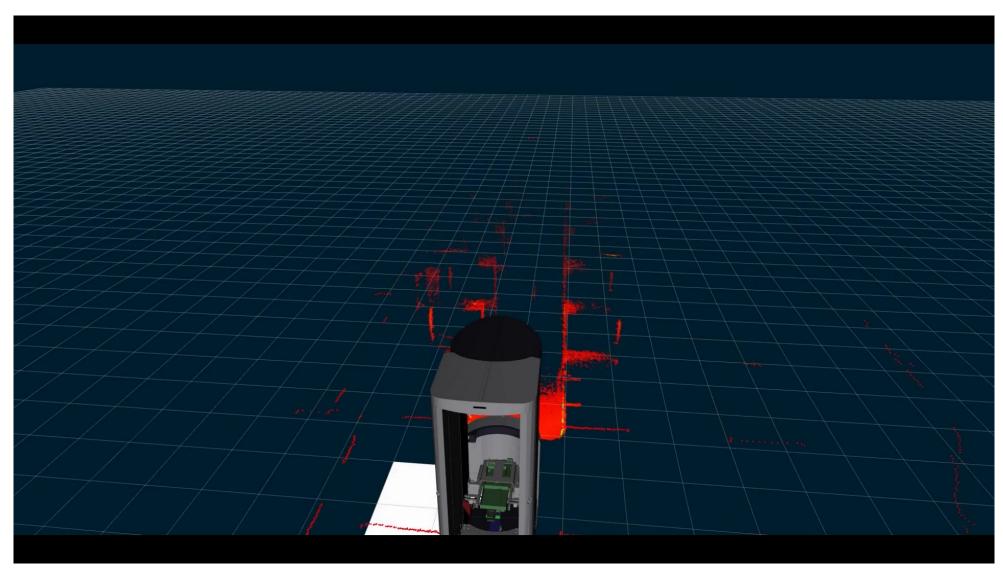
Behavior Trees support the efficient modeling, execution, and supervision of highly reactive perception-guided robot applications



#### From WMS to robot Robot Control Center (RCC) controls robots by task allocation and prioritization



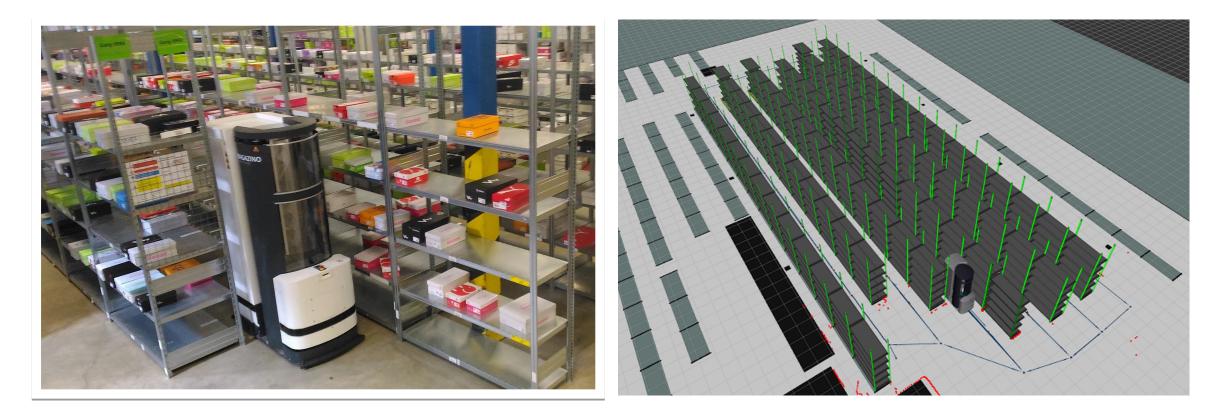
## Perception/Grasping: How does the robot see the world?



# How to deal with the problem? Behavior Trees for real world robotic applications in logistics

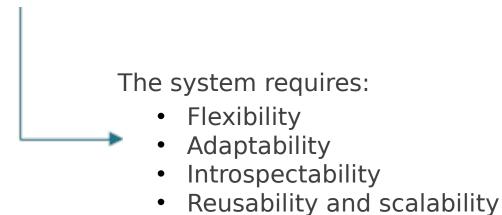
#### The Robotic Problem

- Robots work in warehouses where humans work
- Robots are requested to move objects around (move *I* from *A* to *B*)



## A simple problem but...

- Enormous amount of situations to be faced
- Different customers to handle
- Complaints coming from customers
- Multiple type of robots



We were looking for an executor able to cope with such requirements.

#### **Behavior Trees**

A Behavior Tree (BT) is a mathematical model of plan execution used in computer science, robotics, control systems and video games. They describe switchings between a finite set of tasks in a modular fashion. Their strength comes from their ability to create very complex tasks composed of simple tasks, without worrying how the simple tasks are implemented.

wikipedia.org

# Origin of Behavior Trees and Literature

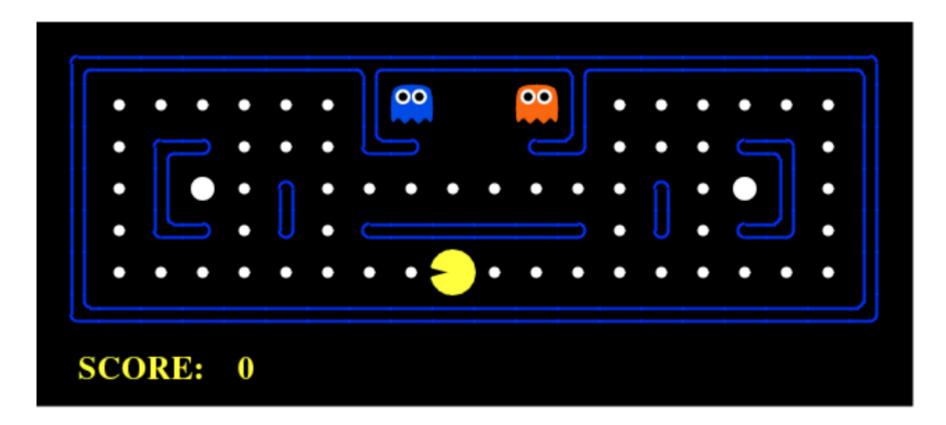
- BTs originate as tool to model the behavior of NPCs
- They have been used in games such as Halo, Bioshock, and Spore
- First paper in literature:
  - Handling Complexity in the Halo 2 AI, Isla D., GDC 2005

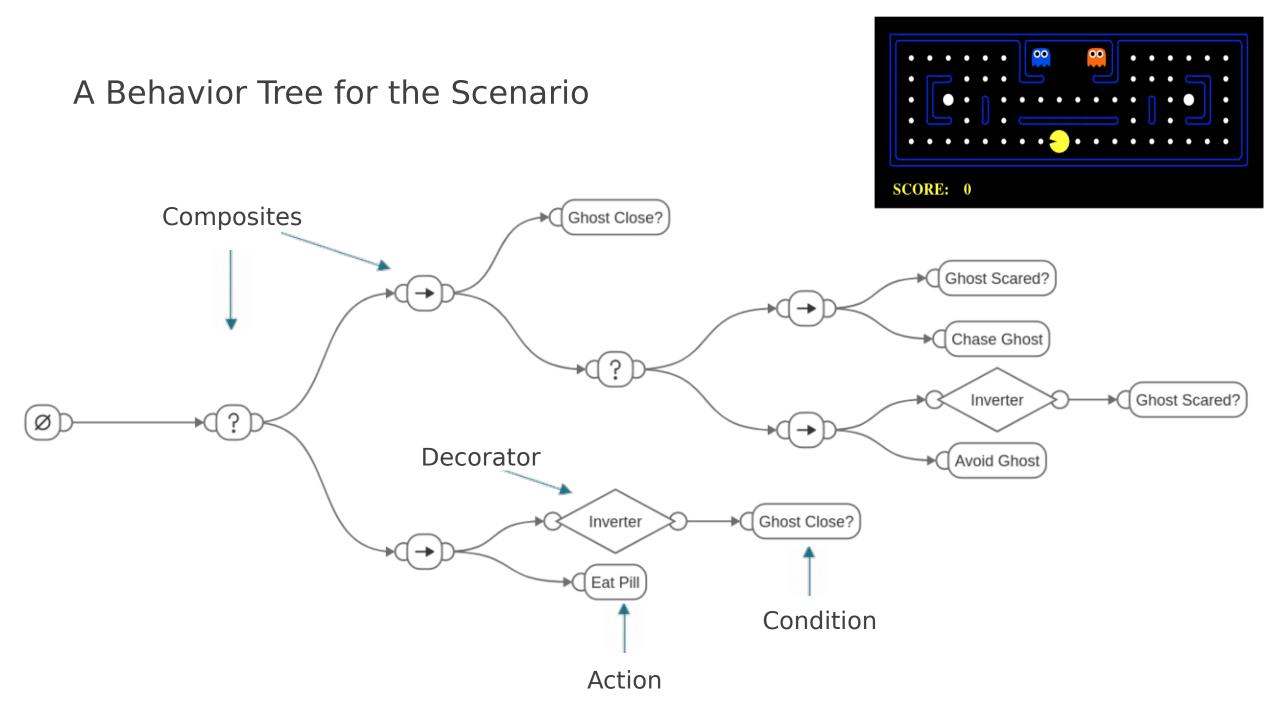
- In robotics:
  - Towards a Unified Behavior Trees Framework for Robot Control, Marzinotto et al., ICRA 2014
  - Controlling Process of Robots Having a Behavior Tree Architecture, Tenorth, European patent 2016
- A good summary paper:
  - Behavior Trees in Robotics and AI, Colledanchise and Ögren, arXiv preprint 2017

# Main Concepts of BTs

- BTs are directed rooted trees where:
  - Internal nodes (the ones with children) are called *control flow nodes* 
    - *Decorator* if only one child
    - *Composite* if multiple children
  - Leaf nodes (the ones without children) are called *execution nodes* 
    - Action if the node describes an action to be executed
    - *Condition* if the node describes a condition to be verified
- Use the terminology of parent and children nodes
- The root node is the only one without parents

# A Simple Case Scenario





# How is a Behavior Tree Executed?

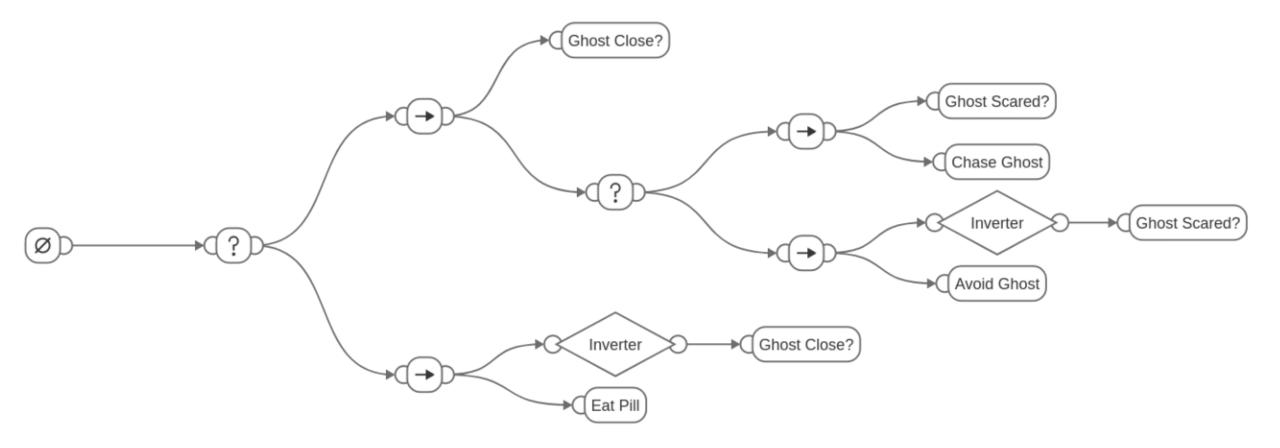
- A BT starts its execution from the root node
- The root generates signals called ticks with a given frequency
- The ticks are propagated to the children following specific rules
- The child returns to the parent:
  - Running, if its execution is under way
  - Success if it has achieved its goal
  - Failure otherwise

Node type	Symbol		ol	Succeeds	Fails	Running
Fallback		?		If one child succeeds	If all children fail	If one child returns Running
Sequence		$\rightarrow$		If all children succeed	If one child fails	If one child returns Running
Parallel		$\Rightarrow$		If $\geq M$ children succeed	If $> N - M$ children fail	else
Action		text		Upon completion	If impossible to complete	During completion
Condition		text		If true	If false	Never
Decorator		$\diamond$		Custom	Custom	Custom

• Nodes can share information using a blackboard

#### Our Behavior Tree Execution

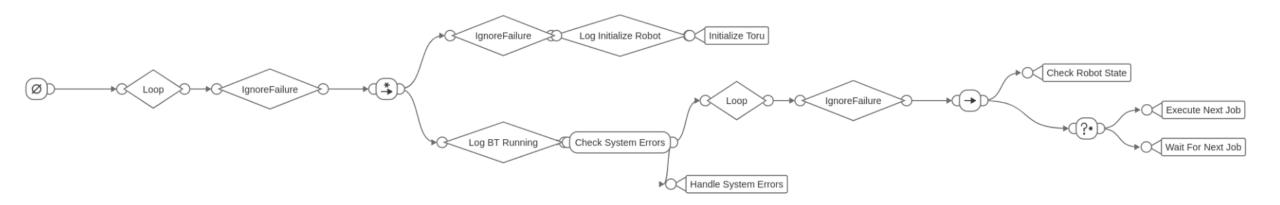
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Action		text		Upon completion	If impossible to complete	During completion
Condition		text		If true	If false	Never
Decorator		$\Diamond$		Custom	Custom	Custom



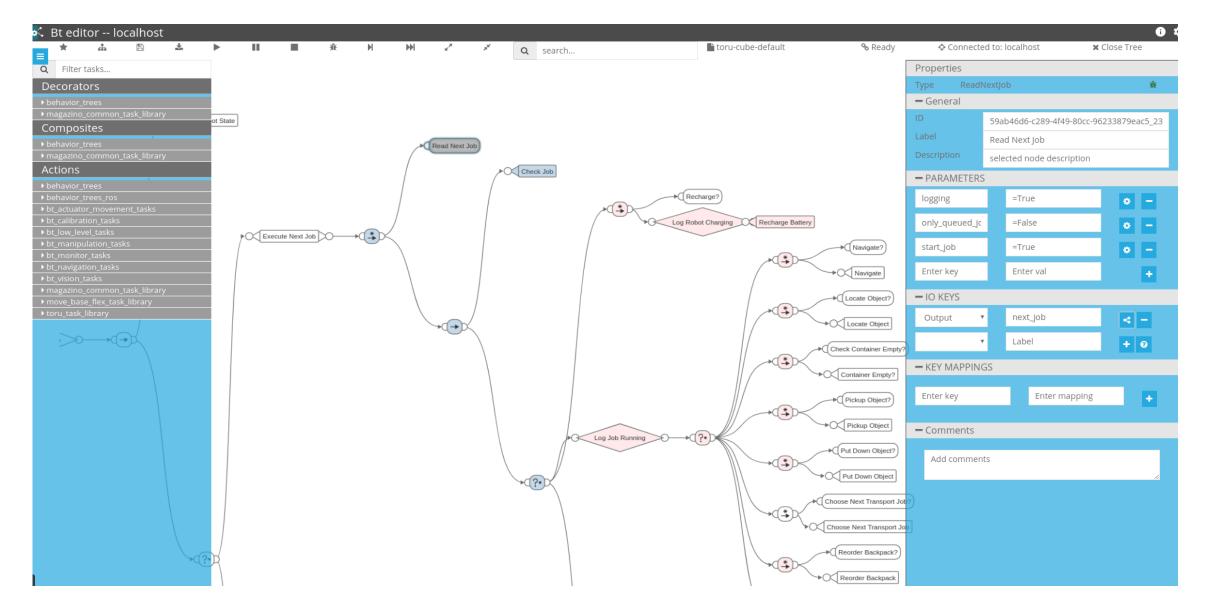
### Behavior Trees at Magazino

- New execution semantics
  - Memory Nodes
  - Parallel One, Parallel Selector
  - Recovery
  - Check System Errors
  - ...
- ROS integration (Often conditions as topic listeners, actions as action clients)
- Copied and scoped variables
- Subtrees
- Watchdogs
- ...

A More Robotic Behavior Tree



## **Behavior Tree Editor**



An application of Behavior Trees

# Avoid replanning

Video navigation1

#### Why Behavior Trees?

- In comparison to Finite State Machines, BTs are much easier to adapt:
  - new branches can be integrated into a BT by adding a single connection
  - FSMs require connections for all permitted task transitions
- As Petri Nets are alternatives to FSMs emphasizing concurrency, BTs emphasize modularity
- Variables are copied and scoped, which is more manageable than having global variables
- BTs have a natural graphical representation that can be used for:
  - editing robot behavior without programming
  - visualizing the resulting behavior specification
  - inspecting the state of the control program at execution time
  - debugging behavior faults
- BTs are reactive to events: cheks at every tick instead of checking at the end of actions
- More pragmatic than planning: shortcuts can be applied more easily

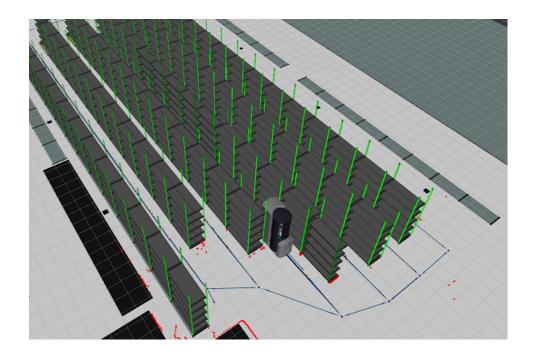
#### Drawbacks of Behavior Trees

- BTs operate in a recursive manner. Computationally, this could produce stack overflows
- For each tick, a large number of checks might have to be performed over the state spaces
- Different subtrees in the tree might require different frequencies
- Hard to model mutually dependent parallel actions that share information
- Less powerful but more manageable than other execution frameworks (e.g., CRAM)

# Summary

#### Logistic environments full of:

- Enormous amount of scenarios to be faced
- Different customers to handle
- Complaints coming from customers
- Multiple type of robots



We were looking for an executor able to cope with multiple requirements

Behavior Trees gives us:

- Flexibility
- Adaptability
- Introspectability
- Reusability and scalability

# We are looking for talents!

Software/Robotics

Software Architect in Python

Autonomous Navigation Engineer

Robot UI and Frontend Developer

Robot Software Enthusiast

Student Intern

... and others!





Thank you for your attention

Your contact person at Magazino



Dr. Guglielmo Gemignani Teamlead Behaviors & Reasoning Mail: gemignani@magazino.eu

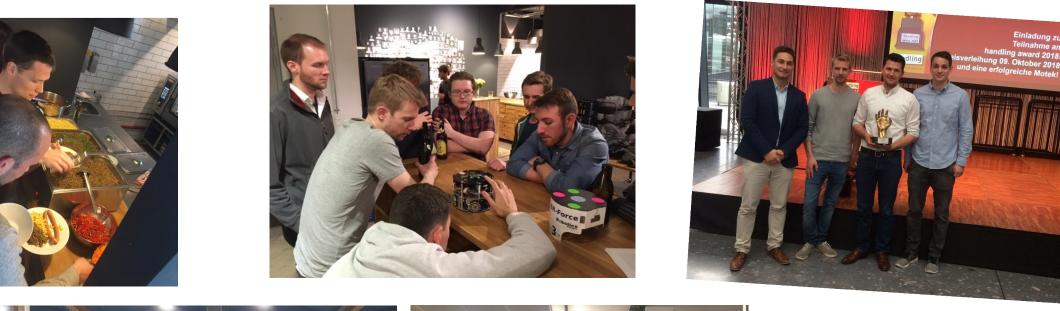




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# Insights of Magazino









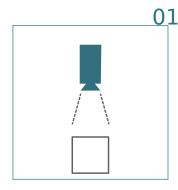
#### The KADO Vision System





Erkannte Objekte WildeRauke Zitronenmelisse Liebstöckel Basilikum Koriander Advantages of Kado





Recognize and meausure

Optimized grasping points



Recognition without teachingin objects



Easy and transparent organization

# Robots move from production to testing area Full integration testing of hardware and software

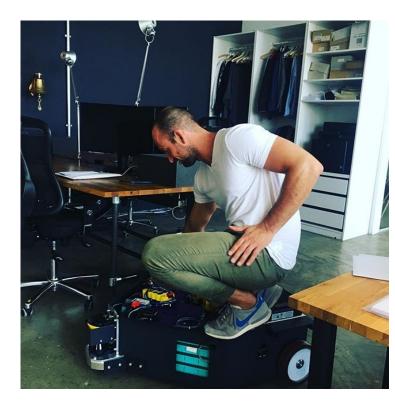
- Reproduction of customer environment
- Automatic update of robot software over wifi
- Fake customer server sends requests to the robot
- New robots are tested using stable software
- New software is tested using a stable robot (confirmed to have working hardware)





# Prototyping

- Hardware robots released every 4 months
- Electrical PCB and cabling released every 2 months
- Firmware running on PCB released every month
- Software released weekly
- Customer robots receives software updates every two weeks





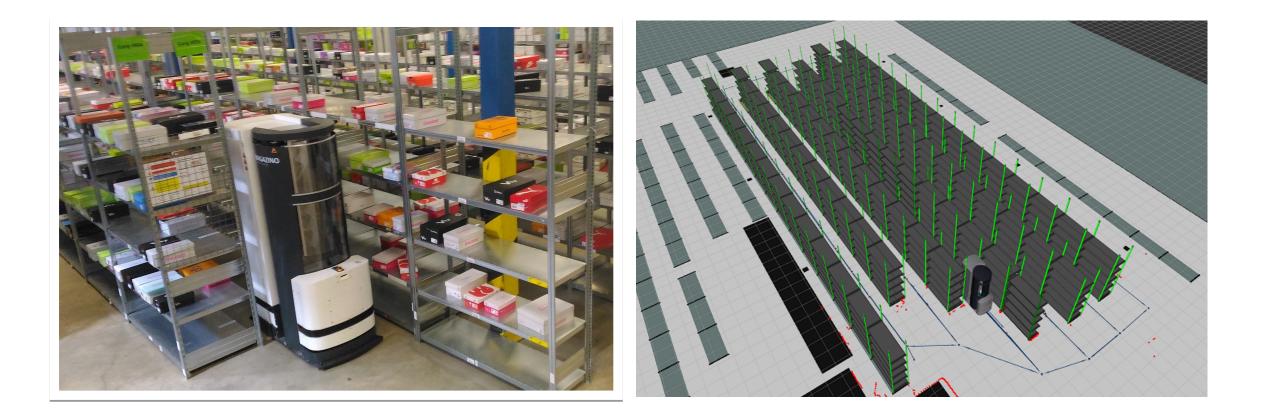


#### Cartographer: active collaboration between Google, Lyft, Magazino and Fetch



#### Remote robot visualization

- Robots live in a virtual world which is a replica of the customer warehouse
- The 3D visualization of the robot world is accessible over internet
- You can follow robots remotely! (let's try a live demo)



## **Customer statistics**

#### We collect data about speed and errors from every customer

