



# Building Multiagent Systems: An Ontology-Driven Approach with SPADE

DSC Europe 2024

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This document  
and the accom-  
panying material  
are available  
online. 



# Introduction

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# Introduction

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Assistant Professor at the University of Zagreb **Faculty of Organization and Informatics**, and a member of the Artificial Intelligence Laboratory at UNIZG FOI.

Scientific interests mainly in:

- multiagent systems,
- semantic modelling,
- gamification,
- artificial intelligence,
- computer games.

# Introduction

One of the teachers of the following courses in Croatian or English:

- Multiagent Systems,
- Database Theory,
- Declarative Programming,
- Introduction to Artificial Intelligence,
- Introduction to Computer Games,
- Internet Security,
- Computer Game Development Platforms.

# Introduction

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Engaged in international activities and promoting international relations:

- Erasmus student at [Karl-Franzens University of Graz](#) (AT),
- Erasmus intern at [Jožef Stefan Institute](#) in Ljubljana (SI),
- Erasmus+ intern at [Elettra Sincrotrone](#) in Trieste (IT),
- 3-month research stay at [Universitat Politècnica de València](#) in Valencia (ES),
- ITEC student at [Centre for Development of Advanced Computing](#) in NOIDA (IN),
- 16-month research visit at [Universitat Politècnica de València](#) in Valencia (ES),

# Introduction

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Publications



Project activity



BSc and MA Mentees



# Agents and Multiagent Systems

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# Agents and Multiagent Systems

*[...] we require systems that can **decide for themselves** what they need to do in order to achieve the objectives that we delegate to them. Such computer systems are known as **agents**. Agents that must operate robustly in rapidly changing, unpredictable, or open environments, where there is a significant possibility that actions can **fail**, are known as **intelligent agents**, or sometimes **autonomous agents**.' [1]*

# Agents and Multiagent Systems

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What is an Agent?

# Agents and Multiagent Systems: What is an Agent?

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'An agent is anything that can be viewed as perceiving its environment through sensors and acting upon that environment through actuators.' [2, p. 54]

# Agents and Multiagent Systems: What is an Agent?

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# Agents and Multiagent Systems: What is an Agent?

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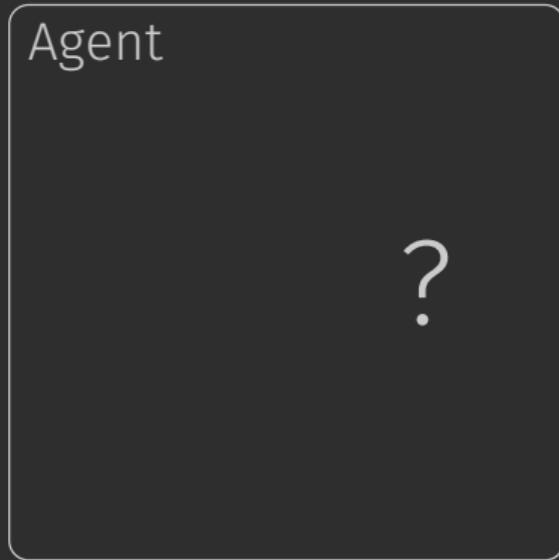
More specifically,

'An agent is a computer system that is situated in some environment, and that is capable of **autonomous** action in this environment in order to achieve its delegated objectives.' [1]

Agent

**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

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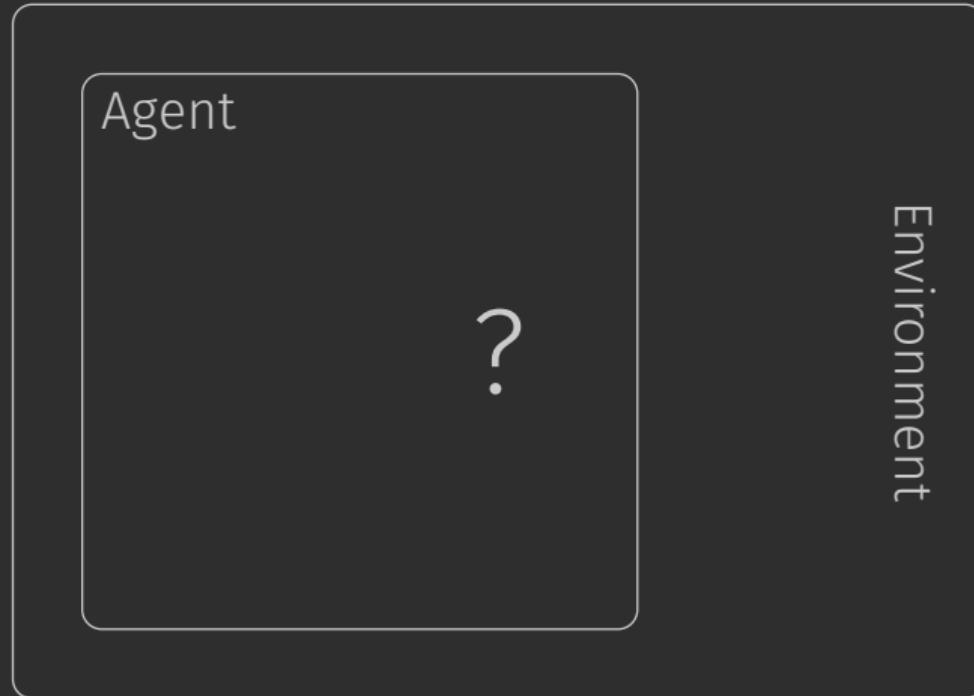


**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

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# Agents and Multiagent Systems

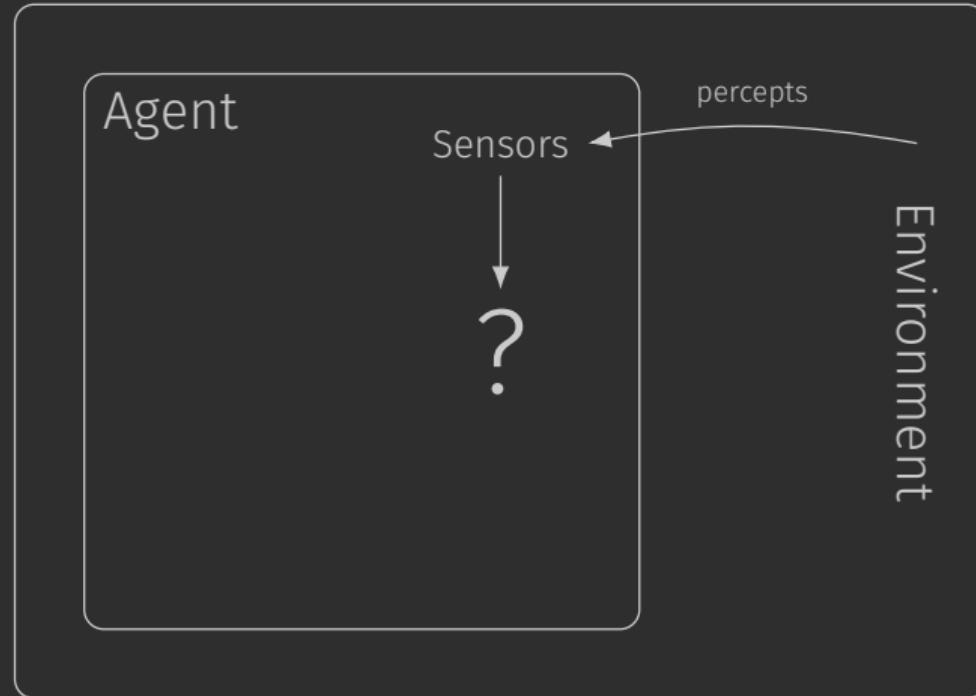
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**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

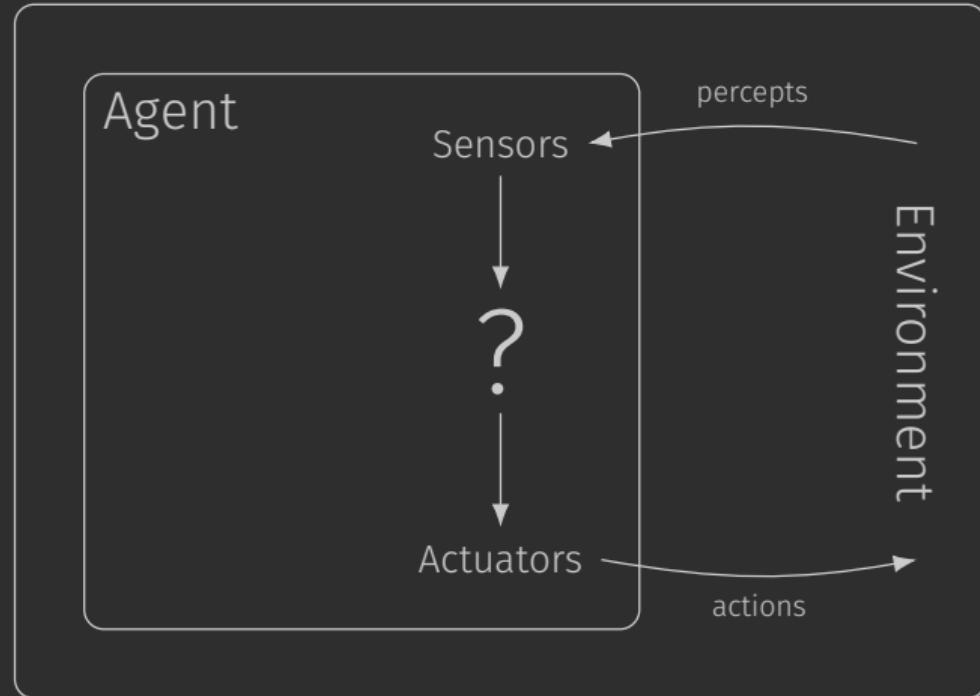
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# Agents and Multiagent Systems



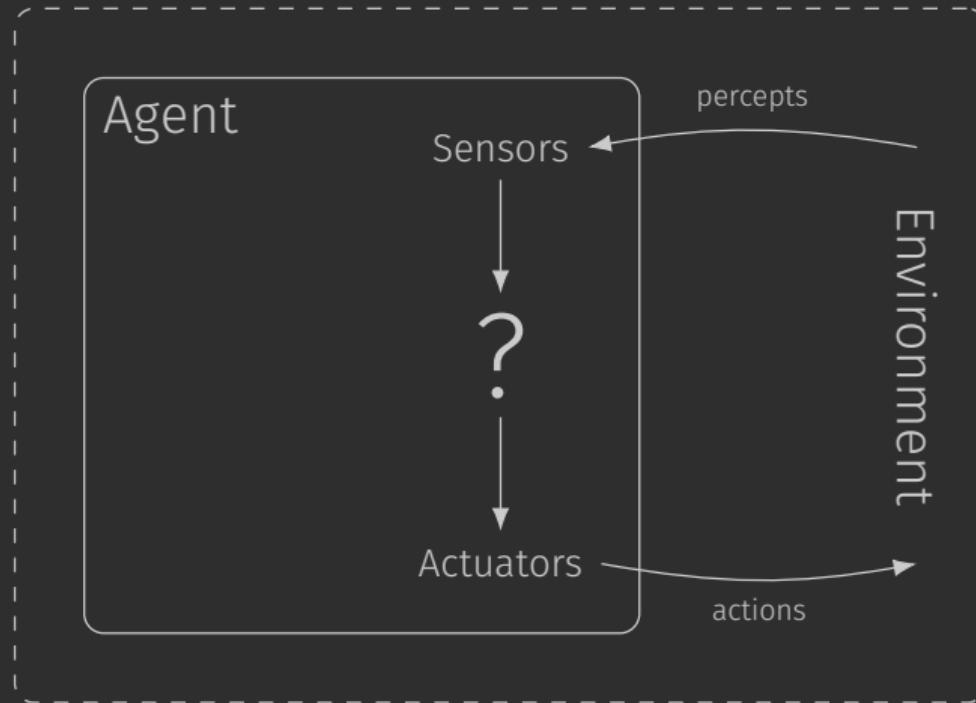
**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

# Agents and Multiagent Systems



**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

# Agents and Multiagent Systems



**Figure 1:** Visual definition of an artificial agent, based on [2, p. 55]

## Agents and Multiagent Systems

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$\text{Agent} \in \text{Multiagent System}$

## Agents and Multiagent Systems: Agent $\in$ Multiagent System

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A multiagent system (MAS) is a system wherein ‘[...] an agent must make decisions in environments that contain multiple actors.’ [2]

# Agents and Multiagent Systems: Agent $\in$ Multiagent System

---

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In more detail, a MAS is a system wherein [3]:

- each agent has incomplete information or capabilities for solving the problem and, thus, has a **limited viewpoint**;
- there is no system global **control**;
- data are **decentralized**;
- computation is **asynchronous**.

# Agents and Multiagent Systems: Agent $\in$ Multiagent System

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- there is no system global **control**;
- data are **decentralized**;
- computation is **asynchronous**.

Agents can be cooperative or competitive. Often modelled as organisations.

# Agents and Multiagent Systems

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## Implementing Agents

# Agents and Multiagent Systems: Implementing Agents

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Smart Python Agent Development Environment (SPADE) is a multiagent systems implementation platform written in Python and based on instant messaging using extensible messaging and presence protocol (XMPP).

# Agents and Multiagent Systems: Implementing Agents

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SPADE is a multiagent systems implementation platform written in Python and based on instant messaging using XMPP.

To be run and to communicate, a SPADE agent must be connected to an XMPP server using its JID comprising its name and the hostname of the server, e.g.:

alice @ localhost

# Agents and Multiagent Systems: Implementing Agents

The XMPP server of choice is Prosody.

- `docker-compose.yml` for running Prosody,
- `prosody.cfg.lua` for configuration that requires no user registration,
- generating or using SSL/TLS certificates.

Conda environment with all the required dependencies.



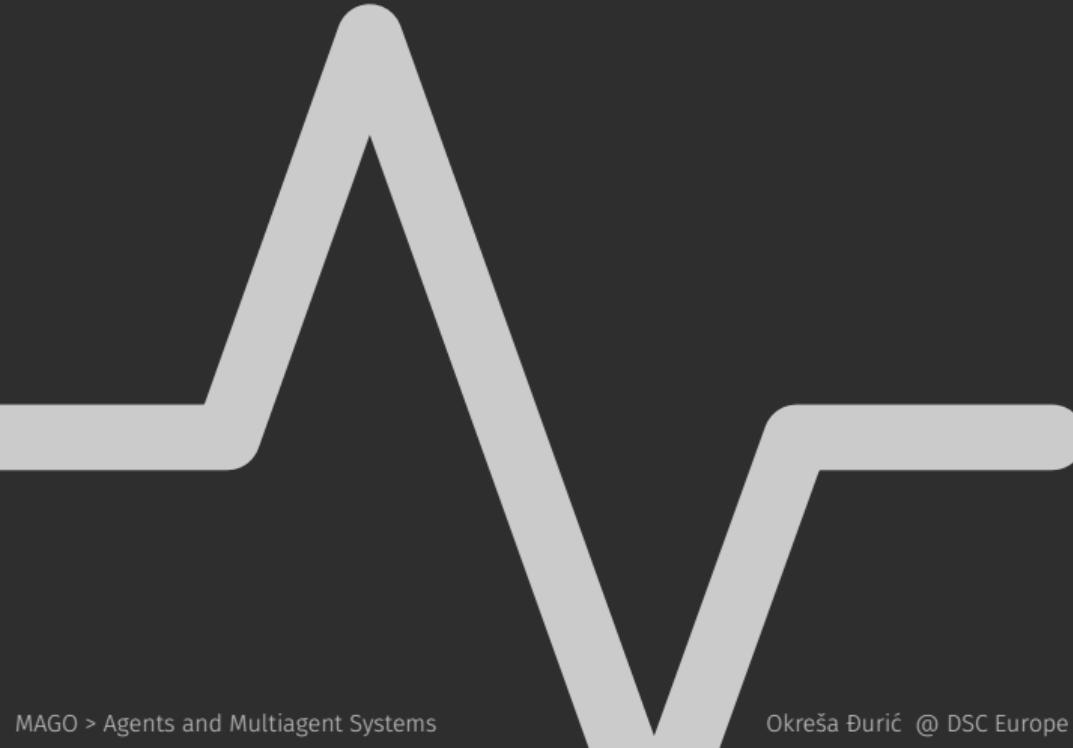
# Agents and Multiagent Systems: Implementing Agents

---

```
1 import spade
2
3
4 class DummyAgent(spade.agent.Agent):
5     async def setup(self):
6         print("Hello, world! I'm agent {}".format(str(self.jid)))
7
8
9     async def main():
10        dummy = DummyAgent("alice@localhost", "password")
11        await dummy.start()
12
13
14 if __name__ == "__main__":
15     spade.run(main())
```

---

Listing 1: Simple agent



ACTIVITY ➔

agent simple.py

# Agents and Multiagent Systems: Implementing Agents

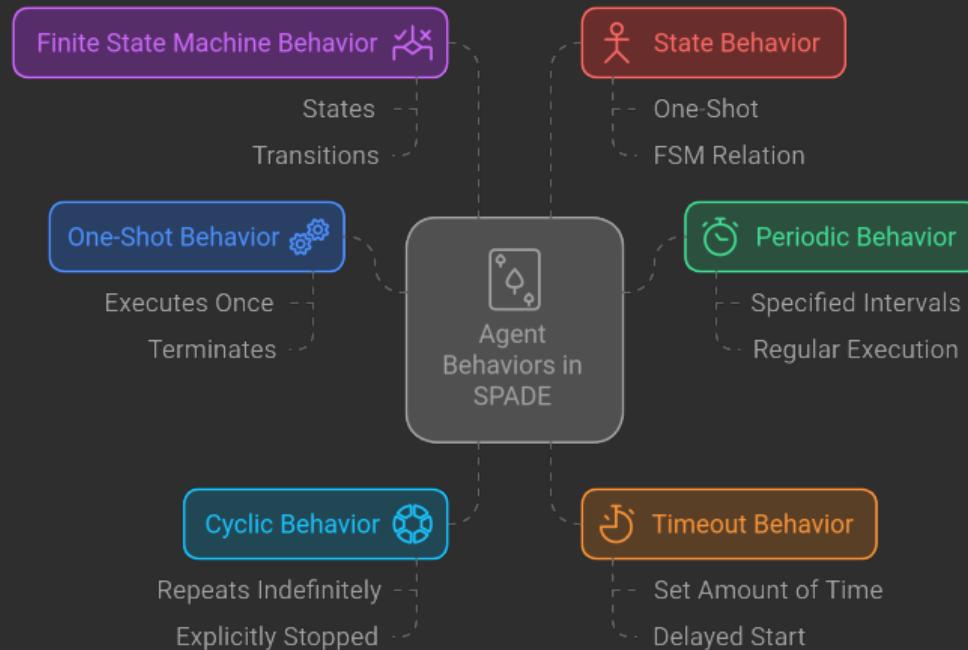


Figure 2: Different types of agent behaviours in SPADE

# Agents and Multiagent Systems: Implementing Agents

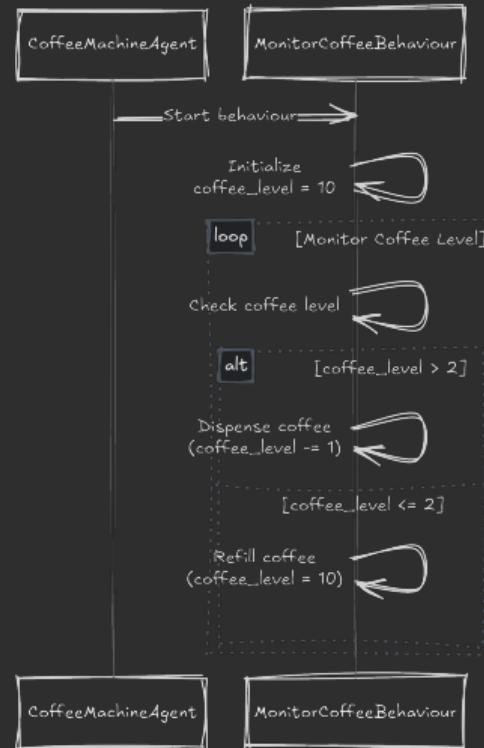
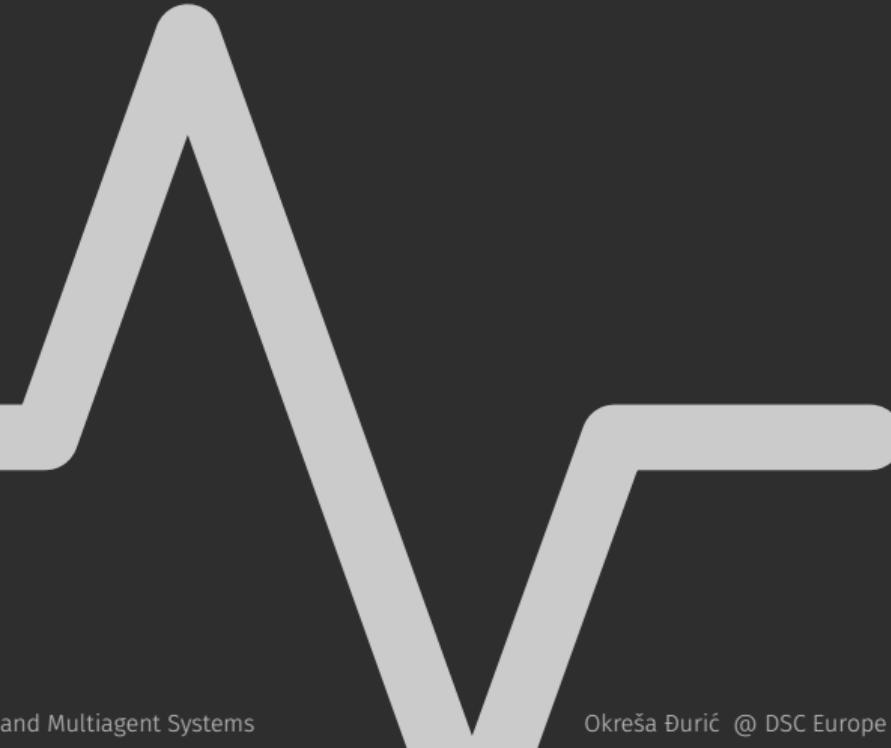


Figure 3: Visual representation of a simple coffee machine agent



ACTIVITY ➔

agent coffee.py

# Agents and Multiagent Systems: Implementing Agents

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```
7  class CoffeeMachineAgent(Agent):
8      class MonitorCoffeeBehaviour(CyclicBehaviour):
9          async def dispense_coffee(self):
10              await sleep(1)
11              self.coffee_level -= 1
12
13          async def refill_coffee(self):
14              self.coffee_level = 10
15              print("Coffee refilled to 10 cups.")
16              self.kill()
17
18          async def on_start(self):
19              print("Starting coffee monitoring . . .")
20              self.coffee_level = 10
21
22          async def run(self):
23              print(f"Current coffee level: {self.coffee_level} cups")
24
25          if self.coffee_level <= 2:
26              print("Low coffee level detected! Refilling coffee . . .")
27              await self.refill_coffee()
28          else:
29              print("Sufficient coffee level. Dispensing a cup . . .")
30              await self.dispense_coffee()
```

Listing 2: The coffee machine agent with a single behaviour

# Agents and Multiagent Systems: Implementing Agents

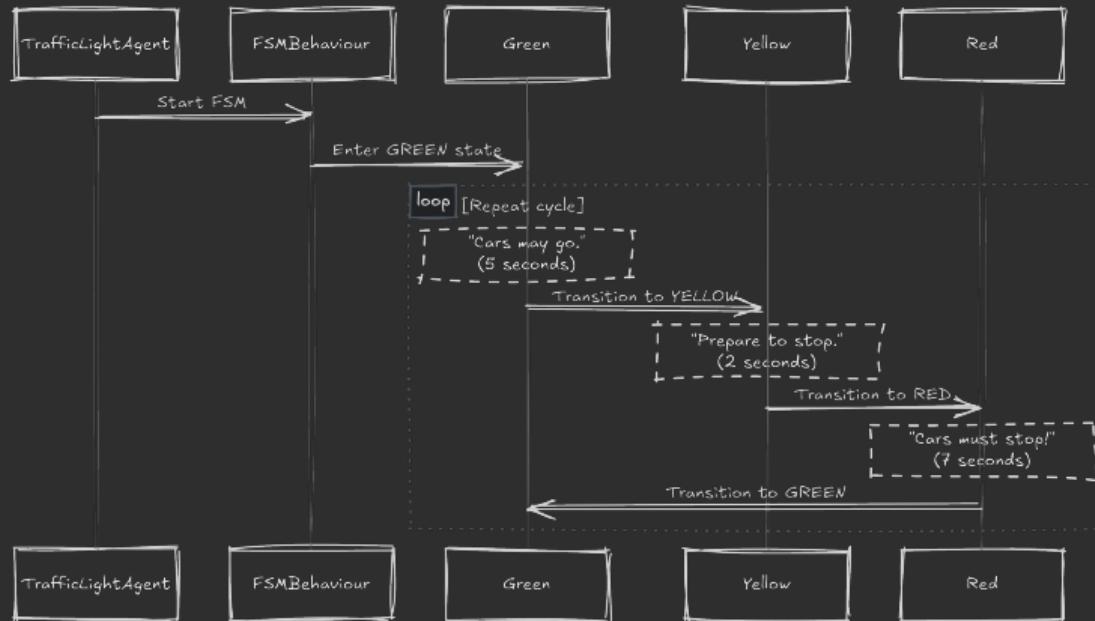
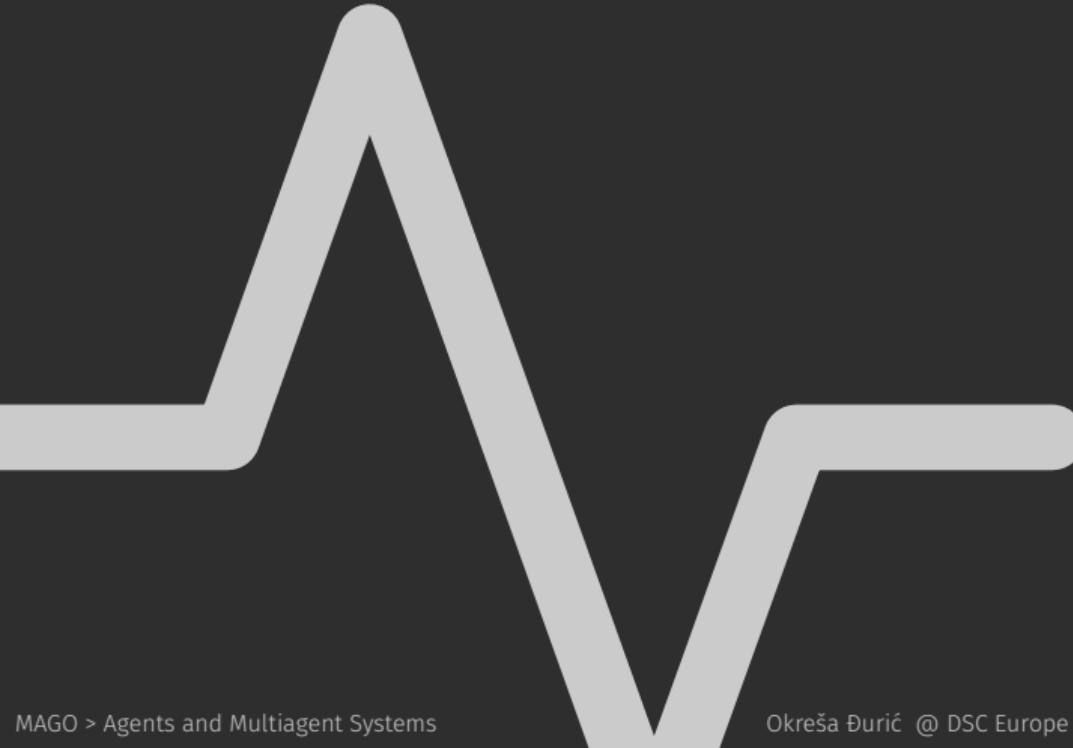


Figure 4: Visual representation of a traffic light agent with a finite state machine behaviour



ACTIVITY ➔

agent traffic light.py

# Agents and Multiagent Systems: Implementing Agents

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```
11  class TrafficLightFSMBehaviour(FSMBehaviour):
12      async def on_start(self):
13          print(f"Traffic Light FSM starting at
14              → initial state {self.current_state}")
15      async def on_end(self):
16          print(f"Traffic Light FSM finished at
17              → state {self.current_state}")
18          await self.agent.stop()
19
20  class GreenLightState(State):
21      async def run(self):
22          print("Green Light: Cars may go!")
23          await asyncio.sleep(5)
24          self.set_next_state(STATE_YELLOW)
25
26
27  class YellowLightState(State):
28      async def run(self):
29          print("Yellow Light: Prepare to stop!")
30          await asyncio.sleep(2)
31          self.set_next_state(STATE_RED)
```

---

```
34  class RedLightState(State):
35      async def run(self):
36          print("Red Light: Cars must stop!")
37          await asyncio.sleep(5)
38          self.set_next_state(STATE_GREEN)
39
40
41  class TrafficLightAgent(Agent):
42      async def setup(self):
43          fsm = TrafficLightFSMBehaviour()
44          fsm.add_state(name=STATE_GREEN,
45              → state=GreenLightState(), initial=True)
46          fsm.add_state(name=STATE_YELLOW,
47              → state=YellowLightState())
48          fsm.add_state(name=STATE_RED,
49              → state=RedLightState())
50          fsm.add_transition(source=STATE_GREEN,
```

Listing 3: Traffic light agent with finite state machine behaviour

# Agents and Multiagent Systems: Implementing Agents

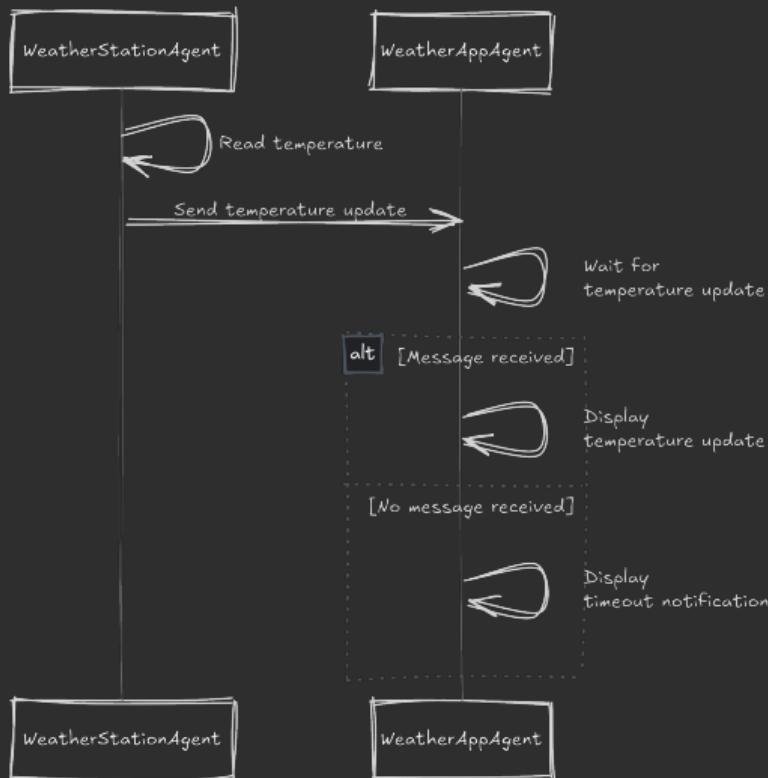
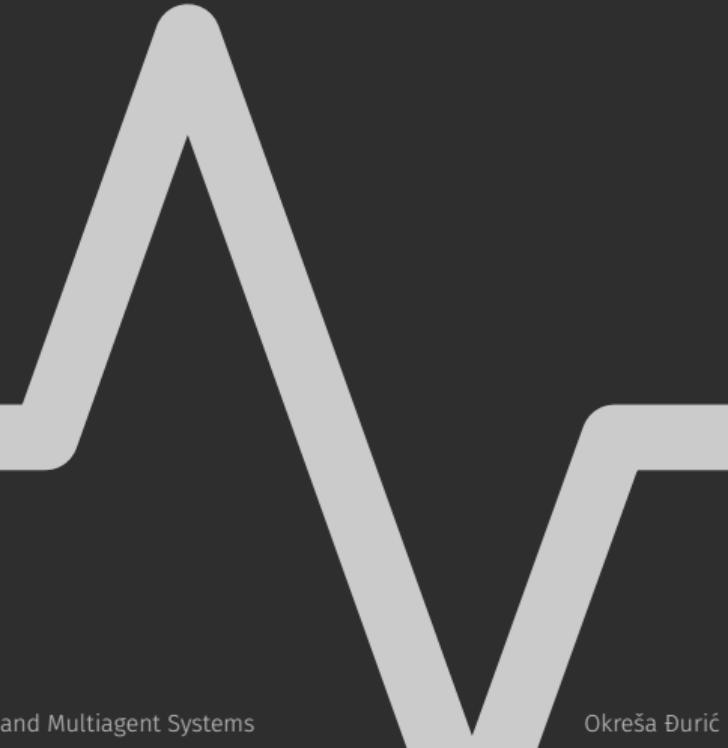


Figure 5: Visual representation of two communicating agents



ACTIVITY ➔

agent weather.py

# Agents and Multiagent Systems: Implementing Agents

---

```
9  class WeatherStationAgent(Agent):
10     class
11         ↪ SendWeatherUpdateBehaviour(OneShotBehaviour):
12             async def run(self):
13                 temperature = random.uniform(-10, 40)
14                 msg =
15                     ↪ Message(to="weather_app@localhost")
16                 msg.set_metadata("performative",
17                     "inform")
18                 msg.body = f"Current temperature:
19                     {temperature:.1f}°C"
20
21                 await self.send(msg)
22                 print(f"Weather update sent:
23                     {msg.body}")
24
25                 await self.agent.stop()
26
27         class
28             ↪ ReceiveWeatherUpdateBehaviour(OneShotBehaviour):
29                 async def run(self):
30                     print("Waiting for weather update...")
31                     msg = await self.receive(timeout=10)
32                     if msg:
33                         print(f"Weather update received:
34                             {msg.body}")
35                     else:
36                         print("No weather update received
37                             after 10 seconds.")
38
39             async def setup(self):
40                 behaviour =
41                     ↪ self.ReceiveWeatherUpdateBehaviour()
42                 template = Template()
43                 template.set_metadata("performative",
44                     "inform")
45                 self.add_behaviour(behaviour, template)
```

---

Listing 4: Agent communication example

# Ontologies

---

‘The word ontology means a particular theory of the nature of being or existence. The ontology determines what kinds of things exist, but does not determine their specific properties and interrelationships.’ [2, p. 290]

An ontology is a vocabulary of a chosen domain.

An ontology is a ‘formal specification of a shared conceptualisation’ [4], [5].

An ontology is a knowledge model.

# Ontologies

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An ontology is often described as a set of **triples**:

( subject , predicate , object )

where:

- subject and object are usually **concepts**, their individuals, or literals,
- predicate is an object or a data **property**.

An example:

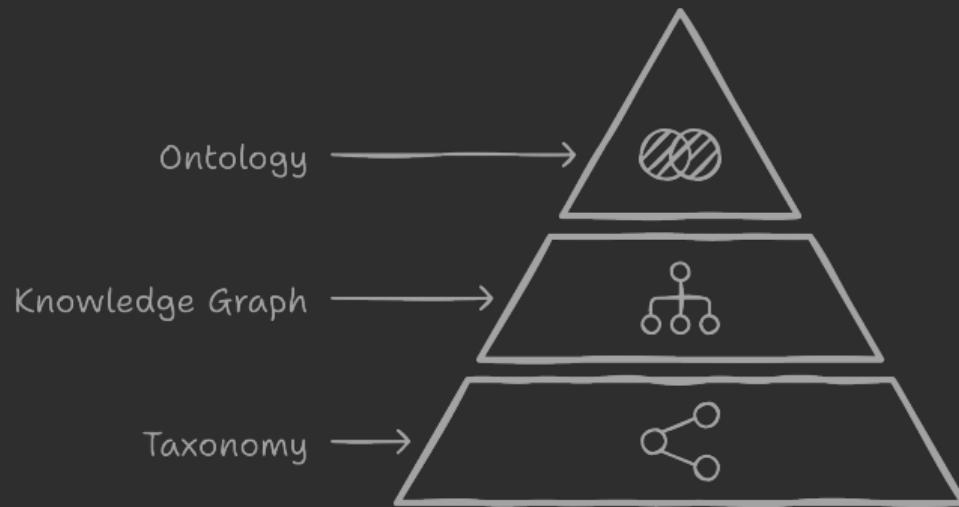
( a dog , can play with , a ball )

Common concepts related to ontologies:

**Resource description framework (RDF)** is a standard for representing data on the web using triples. It helps link and describe information so computers can understand relationships between different concepts.

**Web ontology language (OWL)** is a language for creating complex models of knowledge (i.e. ontologies) by defining relationships, classes, and rules. It extends RDF to enable reasoning, such as inferring new facts from given data.

# Ontologies



**Figure 6:** Hierarchical visualisation of information structures taxonomy, knowledge graph, and ontology

# Ontologies

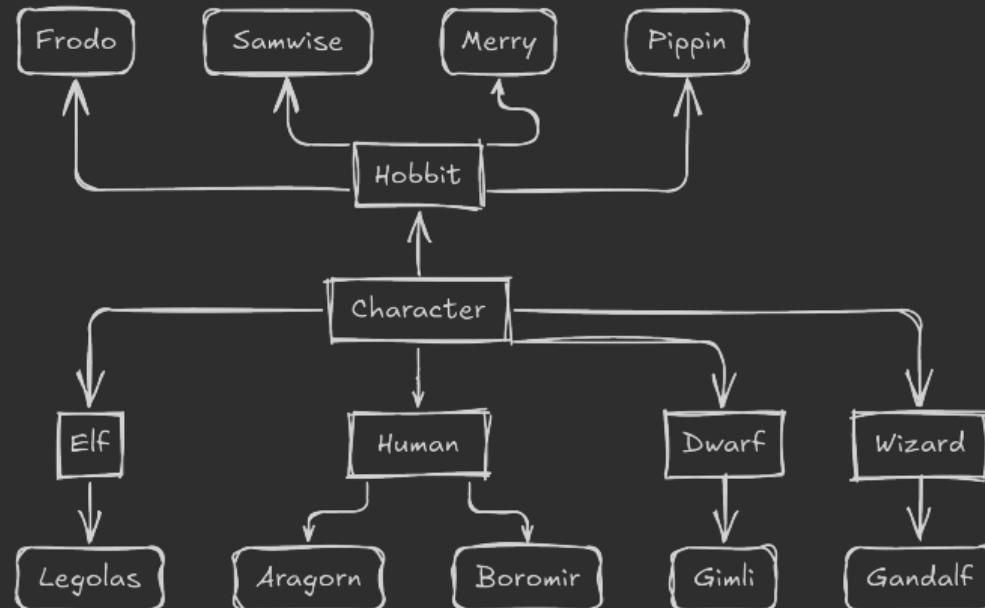
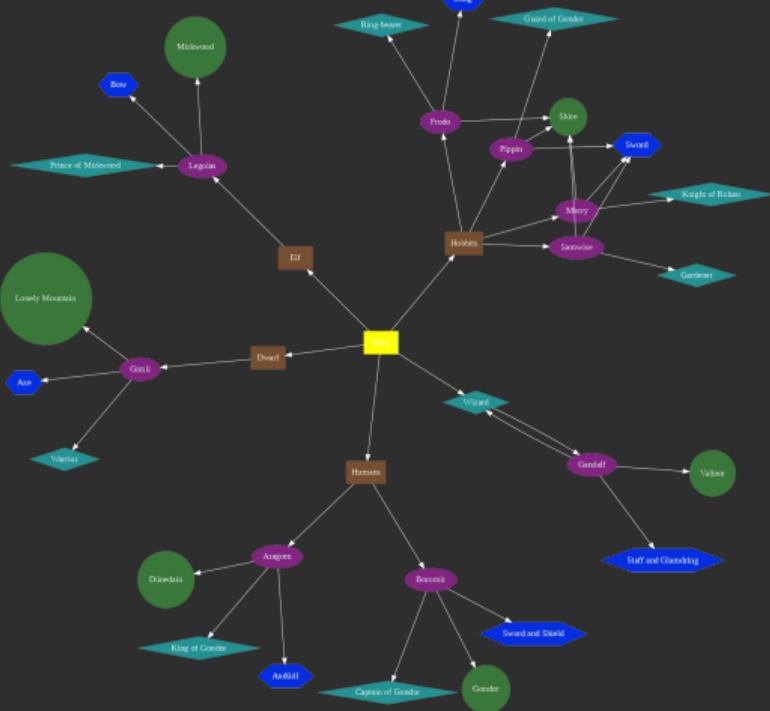


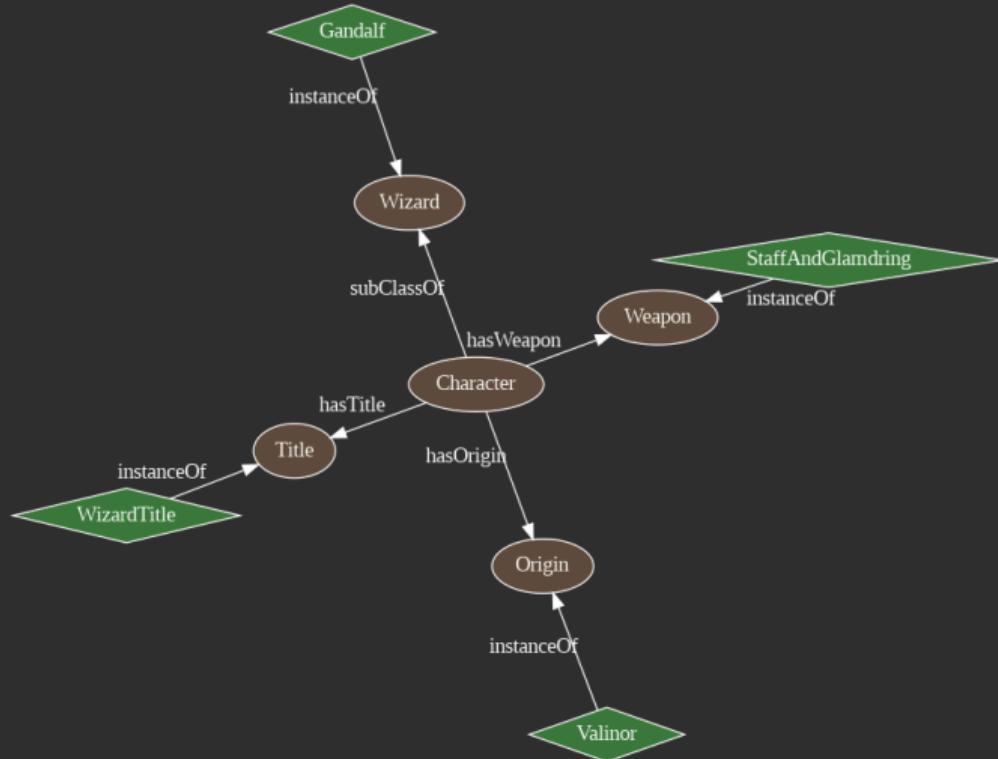
Figure 7: Taxonomy of the selected concepts of the Lord of the Rings novel by J. R. R. Tolkien [6]

# Ontologies



**Figure 8:** Knowledge graph of the selected concepts of the Lord of the Rings novel by J. R. R. Tolkien

# Ontologies



**Figure 9:** Ontology visualisation of the selected concepts of the Lord of the Rings novel by J. R. R. Tolkien

An ontology is more than a visual representation of related concepts.

# Ontologies

```
7 # Ontology
8 <http://example.org/lotr> a
9   → owl:Ontology .
10
11 # Classes
12 :Character a owl:Class .
13 :Wizard a owl:Class ;
14   rdfs:subClassOf :Character .
15
16 :Title a owl:Class .
17 :Weapon a owl:Class .
18 :Origin a owl:Class .
19
20 # Object Properties
21 :hasTitle a owl:ObjectProperty
22   → ;
23     rdfs:domain :Character ;
24     rdfs:range :Title .
25
26 :hasWeapon a
27   → owl:ObjectProperty ;
28     rdfs:domain :Character ;
29     rdfs:range :Weapon .
30
31 :hasOrigin a
32   → owl:ObjectProperty ;
33     rdfs:domain :Character ;
34     rdfs:range :Origin .
35
36 # Individuals
37 :Gandalf a :Wizard ;
38   :hasTitle :WizardTitle ;
39   :hasWeapon
40   → :StaffAndGlamdring ;
41   :hasOrigin :Valinor .
42
43 :WizardTitle a :Title ;
44   rdfs:label "Wizard" .
45
46 :StaffAndGlamdring a :Weapon ;
47   rdfs:label "Staff and
48   → Glamdring" .
49
50 :Valinor a :Origin ;
51   rdfs:label "Valinor" .
```

Listing 5: Ontology serialisation using Turtle syntax

# Ontologies

---

```
33 # Individuals
34 :Gandalf a :Wizard ;
35   :hasTitle :WizardTitle ;
36   :hasWeapon :StaffAndGlamdring ;
37   :hasOrigin :Valinor .
38
39 :WizardTitle a :Title ;
40   rdfs:label "Wizard" .
41
42 :StaffAndGlamdring a :Weapon ;
43   rdfs:label "Staff and Glamdring" .
44
45 :Valinor a :Origin ;
46   rdfs:label "Valinor" .
```

---

```
1 individual(gandalf).
2 type(gandalf, wizard).
3
4 individual(wizard_title).
5 type(wizard_title, title).
6 label(wizard_title, "Wizard").
7
8 individual(staff_and_glamdring).
9 type(staff_and_glamdring, weapon).
10 label(staff_and_glamdring, "Staff and Glamdring").
11
12 individual(valinor).
13 type(valinor, origin).
14 label(valinor, "Valinor").
15
16 has_title(gandalf, wizard_title).
17 has_weapon(gandalf, staff_and_glamdring).
18 has_origin(gandalf, valinor).
```

---

**Listing 6:** Ontology individual serialisation using Turtle syntax vs. ontology individual as Prolog expressions

# Ontologies

---

An ontology is a **shared** vocabulary of a chosen domain.

---

8 <<http://example.org/lotr>> a owl:Ontology .

---

# Ontologies



Figure 10: Concepts of the MAGO-Ag ontology

## RecipeWorld example

RecipeWorld [7] is an agent-based model comprising three distinct foundational elements: recipes, orders, and agents. In general, agents within recipeWorld can be considered as **service providers** and **service consumers**.

Order agents need services as detailed in their recipes, while **factory** agents provide a subset of all the services available in the system.

The original framework's goal is to simulate 'the emergence of networks out of a decentralized autonomous interaction.' [7]



ACTIVITY ↗

Protégé



ACTIVITY ↗

Finalised recipeWorld

# Developing a FraMework for Agent Gamification Based on Ontologies (MAGO)

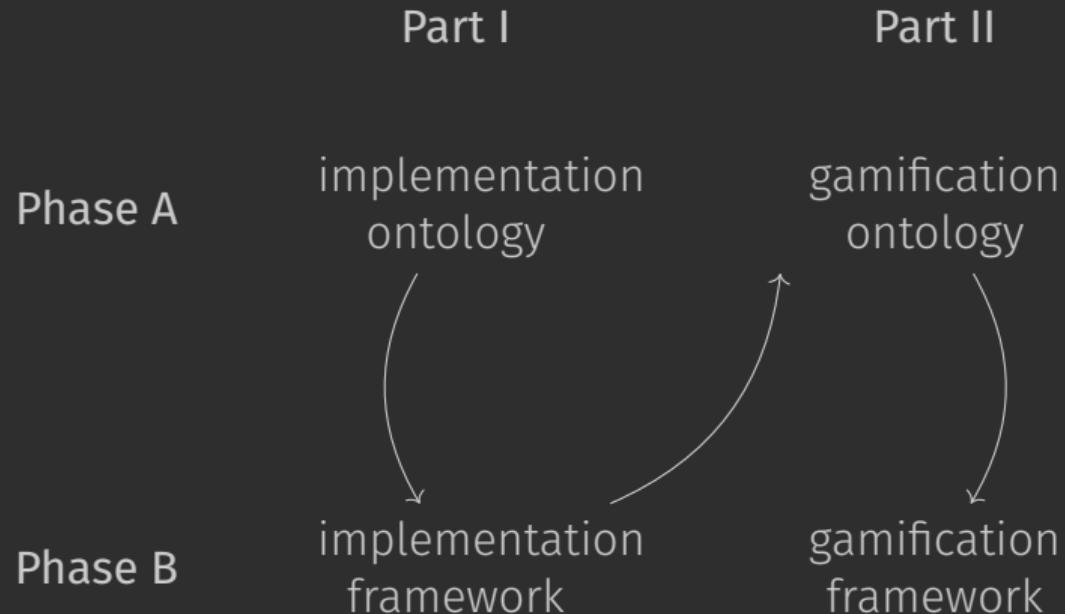
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The result of a cooperation between:

- University of Zagreb Faculty of Organization and Informatics (**UNIZG FOI**) and
- Universitat Politècnica de València (**UPV**), Valencian Research Institute for Artificial Intelligence (**VRAIN**).

The European Union and the Croatian Science Foundation fund this cooperation.

# Developing a FraMework for Agent Gamification Based on Ontologies (MAGO)



**Figure 11:** The flow between the parts and the phases of this research

# Developing a FraMework for Agent Gamification Based on Ontologies (MAGO)

---

MAGO-Ag Ontology

- An ontology comprising concepts applicable to **implementing MASs as intelligent virtual environments (IVEs)**.
- The **main goal** of the ontology is to enable the modelling of a multiagent system in terms of implementation possibilities.
- The ontology contains a selection of modified and enriched concepts of the MAMbO5 ontology, a result of earlier cooperation [8].
  - e.g. Agent, Behaviour, Action, Process, Objective, Artefact

# MAGO-Ag Ontology

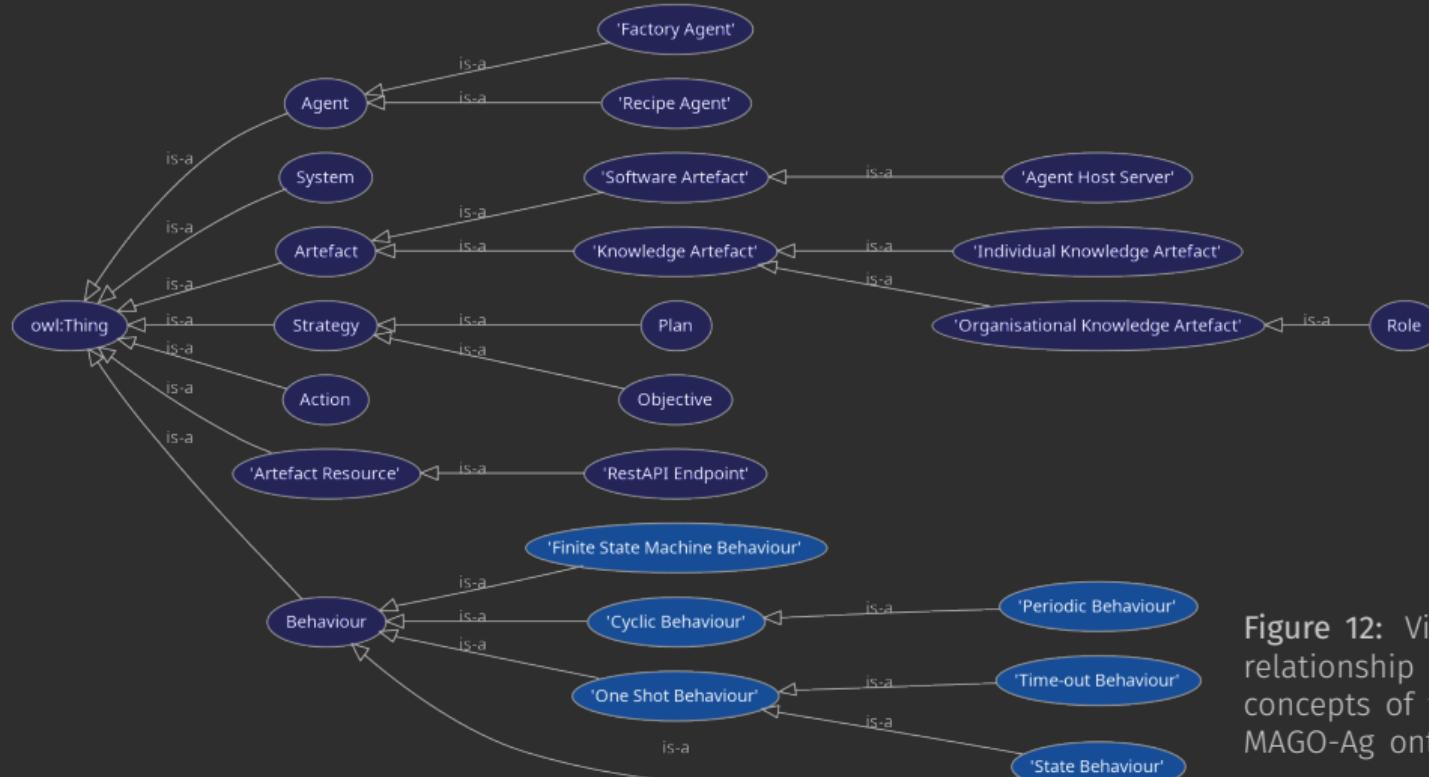


Figure 12: Visual relationship of the concepts of the MAGO-Ag ontology

# Developing a Framework for Agent Gamification Based on Ontologies (MAGO)

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MAGO-Ag Framework

- The **main objective** of the MAGO-Ag framework is to translate a MAS modelled using the MAGO-Ag ontology into an **implementation template** for a MAS comprising SPADE agents.

# MAGO-Ag Framework

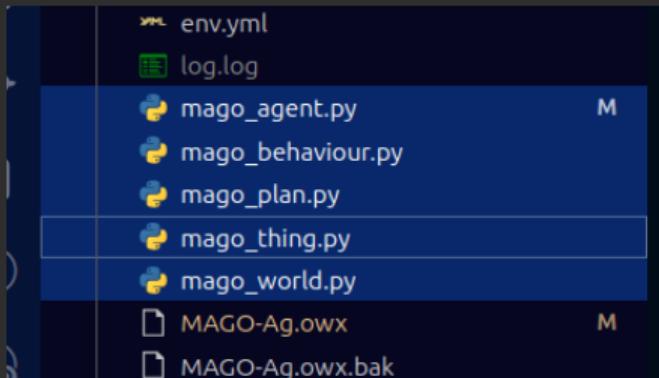


Figure 13: Essential files of the translation process

## ACTIVITY

MAGO-Ag framework

# MAGO-Ag Framework

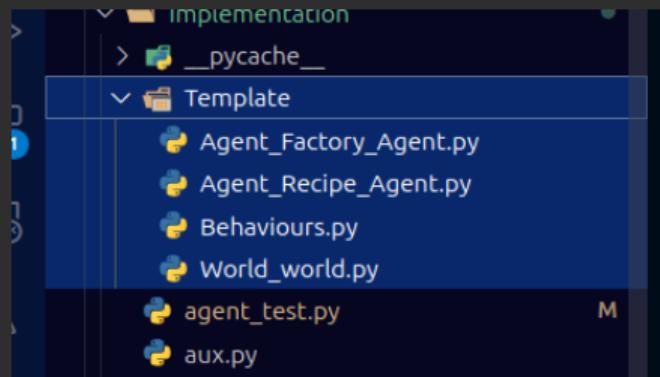
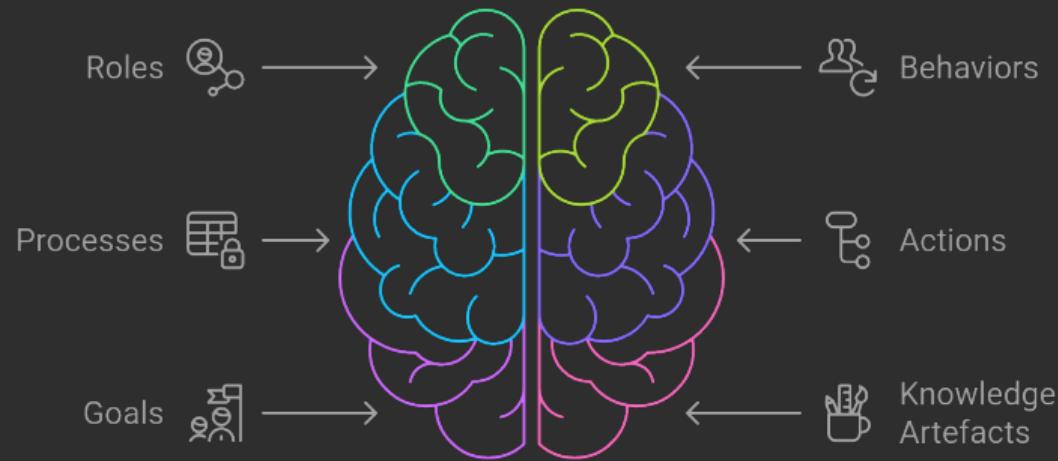


Figure 14: Generated template files for the modelled system

# MAGO-Ag Framework



**Figure 15:** Pieces of knowledge available to agents after template generation

## Conclusion

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# Conclusion

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In its presented state, the framework is a **work-in-progress** package.

Further improvements are seen in:

- rendering strategy-related concepts using languages that allow for reasoning;
- implementing the framework as a distributed system that would focus on deploying agent implementation templates over several workspaces;
- use the MAGO-Ag ontology to facilitate sending agent information and whole agents;
- further testing the framework using different scenarios;
- adapting the implementation templates to different agent development frameworks;
- using the MAGO-Ag ontology in combination with a language model.

## Bibliography

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# Bibliography i

- [1] M. Wooldridge, 'Intelligent Agents,' in *Multiagent Systems*, ser. Intelligent Robotics and Autonomous Agents, G. Weiss, Ed., red. by R. C. Arkin, 2nd ed., Cambridge US-MA: The MIT Press, 2013, ISBN: 978-0-262-01889-0.
- [2] S. J. Russell and P. Norvig, Eds., *Artificial Intelligence: A Modern Approach* (Pearson Series in Artificial Intelligence), 4th ed. Harlow, UK: Pearson Education Limited, 2022, 1166 pp., ISBN: 978-1-292-40113-3.
- [3] V. Dignum, 'Multiagent Organizations,' in *Multiagent Systems*, ser. Intelligent Robotics and Autonomous Agents, G. Weiss, Ed., red. by R. C. Arkin, 2nd ed., Cambridge US-MA: The MIT Press, 2013, ISBN: 978-0-262-01889-0.
- [4] N. Guarino, D. Oberle and S. Staab, 'What Is an Ontology?' In *Handbook on Ontologies*, ser. International Handbooks on Information Systems, S. Staab and R. Studer, Eds., red. by P. Bernus, J. Błażewicz, G. Schmidt and M. Shaw, 2nd ed., Berlin DE: Springer, 2009, pp. 1–17, ISBN: 978-3-540-70999-2. doi: [10.1007/978-3-540-92673-3](https://doi.org/10.1007/978-3-540-92673-3).
- [5] W. N. Borst, 'Construction of Engineering Ontologies for Knowledge Sharing and Reuse,' Ph.D. dissertation, University of Twente, Enschede NL, 05/09/1997, ISBN: 90-365-0988-2.
- [6] J. R. R. Tolkien, *The Lord of the Rings*, 50th Anniversary. London: HarperCollinsPublishers, 2007, 1178 pp., ISBN: 978-0-261-10325-2.
- [7] M. Fontana and P. Terna, 'From Agent-based models to network analysis (and return): The policy-making perspective,' University of Turin Department of Economics and Statistics "Cognetti de Martiis", Torino IT, 201507, 2015, pp. 1–19.
- [8] B. Okreša Đurić, J. Rincon, C. Carrascosa, M. Schatten and V. Julian, 'MAMbO5: A new Ontology Approach for Modelling and Managing Intelligent Virtual Environments Based on Multi-Agent Systems,' *Journal of Ambient Intelligence and Humanized Computing*, vol. 10, no. 9, pp. 3629–3641, 2019, ISSN: 1868-5145. doi: [10.1007/s12652-018-1089-4](https://doi.org/10.1007/s12652-018-1089-4).

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