

# Using Multi-Agent Systems to Increase Privacy and Security in IoT

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The **Internet of Things**: the cyber-physical system in which objects and devices are embedded with computing capabilities and are connected to the Internet.



smart home

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smart home · smart medicine

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smart home · smart medicine · smart industry

## Challenges in IoT relate to

- Security
- Privacy
- Compatibility & interoperation
- Connectivity and bandwidth
- Maintenance and management

[Lamba et al., 2017]

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- the devices cannot be accessed by unauthorized parties
- user data must be secure – cannot be accessed by unauthorized parties



[Lamba et al., 2017]

## Challenges in IoT relate to

- Security
  - Privacy
  - Compatibility & interoperation
  - Connectivity and bandwidth
  - Maintenance and management
- ←
- only the necessary data is shared with other parties
  - users are able to control what data they share and with whom



[Lamba et al., 2017]

## Challenges in IoT relate to

- Security
- Privacy
- Compatibility & interoperation
  - ← ■ difficult interoperation between communication protocols
  - difficulty in heterogeneous systems
  - some smart-\* systems are not open to interoperation
- Connectivity and bandwidth
- Maintenance and management



[Lamba et al., 2017]



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## Challenges in security:

-  1 ensure secure communication between devices
-  2 ensure secure access to devices
-  3 ensure update delivery to the devices
-  4 verify the identity of devices which join an open system
-  5 ensure that devices are able to operate without Internet connection
-  6 ensure security despite devices being resource-constrained

## Challenges in privacy:

-  1 ensure only necessary data about users is gathered
-  2 ensure that personal information cannot leak while other data is gathered
-  3 ensure informed user consent for the gathered data
-  4 ensure any personally-identifiable information is anonymized and aggregated

## Challenges in heterogeneity, openness, robustness:

-  1 ensure devices from different producers and with different owners can exist as part of the same system
-  2 ensure that new devices can join the system and be integrated
-  3 ensure that the system works when devices leave or become disconnected

What are [Agents](#)?

*agere* (Latin) – to do.

**Agents** are entities which act autonomously in an environment.



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**Software agents** act autonomously in a socio-technical environment, interacting with tools, human users, and other agents, in order to reach their goals.

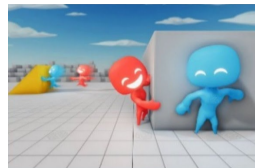
Multi agent systems are used in a wide range of **applications**:

- agent-based model simulation



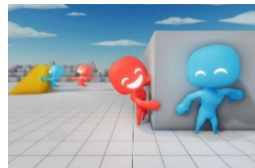
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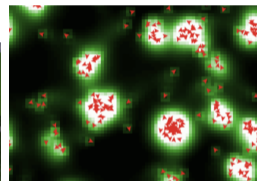
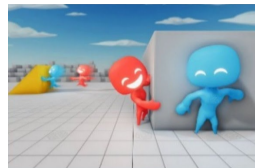
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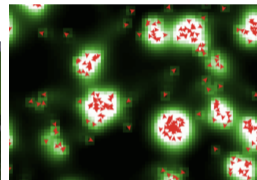
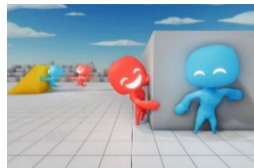
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- swarms and self-organizing systems



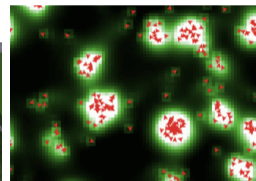
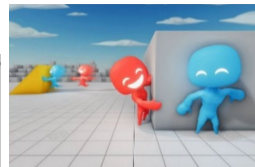
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- multi-agent learning
- multi-robot control
- swarms and self-organizing systems
- complex problem solving
- games and collaboration



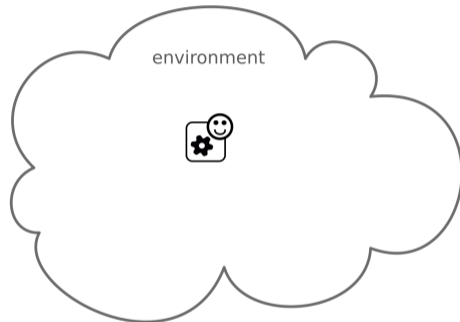
(a) Offensive task

(b) Defensive task

Agents are a programming paradigm – AOP – centered on **individual entities** and their relationship with other entities in their **environment**.

- agents are **persistent**

Instead of focusing on the global state of the system, AOP focuses on the state and behaviour of individual entities, each dealing with the other entities in its own way.



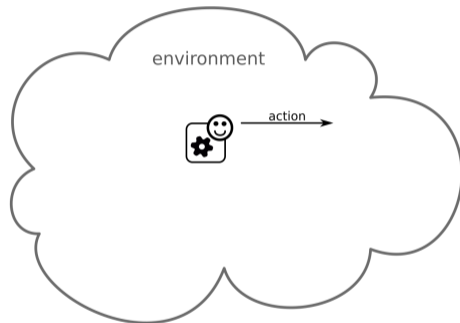
⇒ AOP is adequate for **open** and **heterogeneous** systems.



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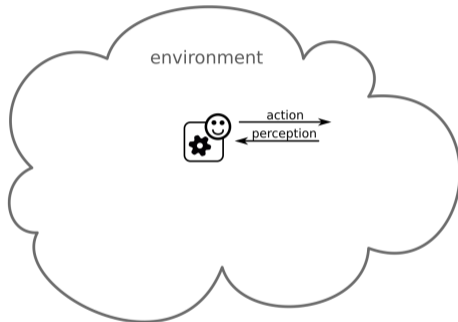


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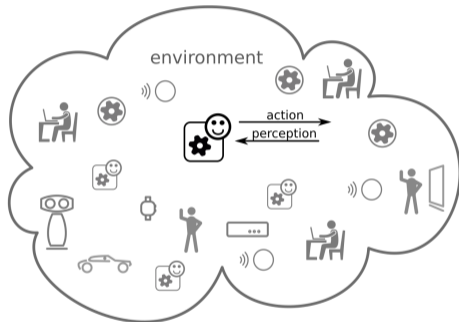


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- agents are **persistent**
- agents are **autonomous**
- agents are **reactive**
- agents are **social**

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⇒ AOP is adequate for **open** and **heterogeneous** systems.

IoT + MAS = ??



Agents can be very simple or very complex, but they always can be viewed in the same manner:






- they encapsulate an autonomous decision process
- they are able to receive messages from the outside
  - agent communication is standardized by the FIPA-ACL standard.

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⇒ a **standardized** view of an open, heterogeneous system

## Agents can help with

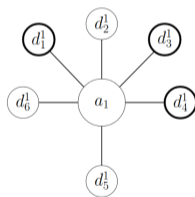
- managing the data that is coming from sensors and other devices in order to protect privacy
 
- managing data aggregation so as to ensure anonymization
 
- improving the secure access to IoT devices and protecting them from intrusion
 
- managing devices joining and leaving the system
 
- management of system heterogeneity in terms of communication protocols
 

*Collaborative agent-based detection of DDoS IoT botnets, 2019*

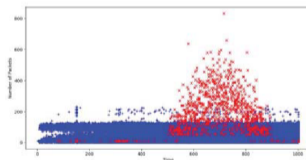
[Giachoudis et al., 2019]

Problem: IoT devices are hijacked as part of botnets and participate in DDoS attacks.

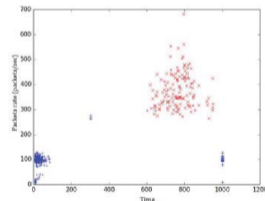
**Agent-based solution:** use agents that analyze the messages from devices and detect the launching of a DDoS attack.



architecture



message analysis



clustering

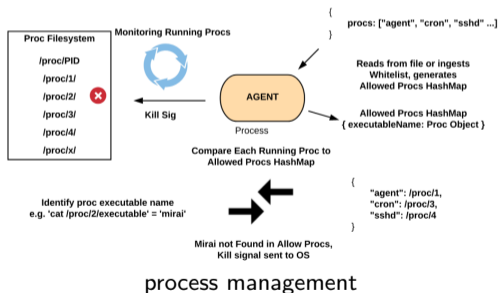


*Cyber physical IoT device management using a lightweight agent, 2019*

[Maloney et al., 2019]

Problem: IoT devices are vulnerable to attacks because their software is not up-to-date.

**Agent-based solution:** use agents to autonomously manage the updates of devices, the applications installed on devices, and the configuration of the devices.

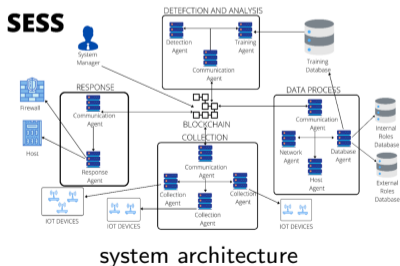


## *Intrusion detection system for the internet of things based on blockchain and multi-agent systems, 2020*

[Liang et al., 2020]

Problem: IoT devices may be corrupted and start working for malicious parties.

**Agent-based solution:** use agents and blockchain to collect data from the IoT devices; data is stored in a distributed, secure manner by using a private blockchain, protecting all the agents and devices from tampering.

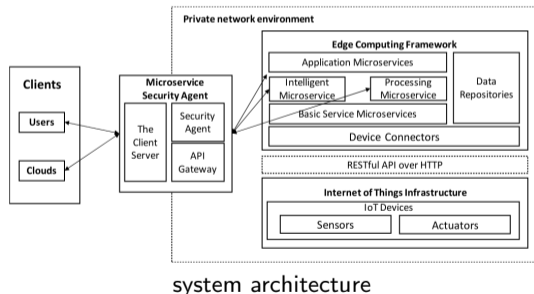


*Microservice security agent based on API gateway in edge computing, 2019*

[Xu et al., 2019]

Problem: Edge computing scenarios need a security approach for edge devices.

**Agent-based solution:** control access with an agent which is able to decide if access to the edge computing framework is legitimate.

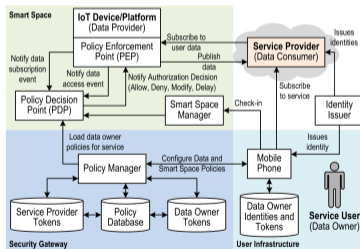


## An agent-based framework for informed consent in the internet of things, 2015

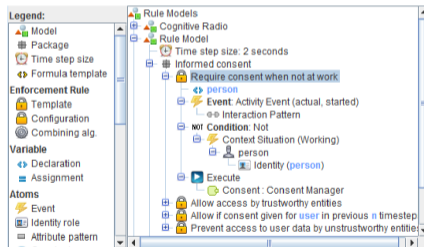
[Neisse et al., 2015]

Problem: Users need to give their consent for the information which is gathered by IoT devices.

**Agent-based solution:** an agent is used to obtain informed consent from users depending on the data and the context.



system architecture



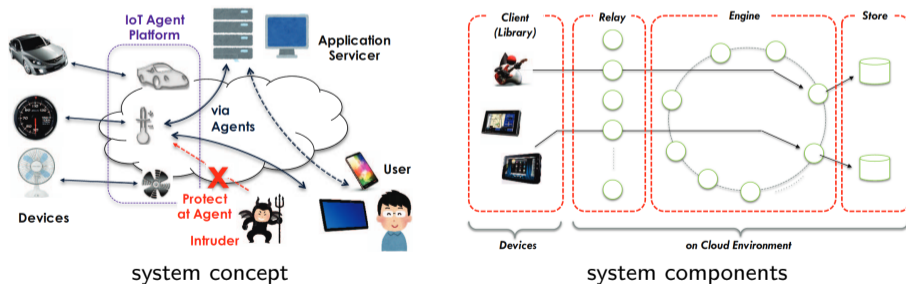
context-based consent

## IoT agent platform mechanism with transparent cloud computing framework for improving IoT security, 2017

[Nakagawa and Shimojo, 2017]

Problem: IoT devices may be corrupted and start working for malicious parties.

**Agent-based solution:** separate IoT devices from the cloud via a series of agentified relay nodes.

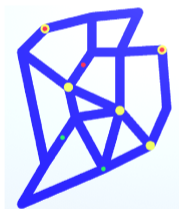


## Agent-based IoT coordination for smart cities considering security and privacy, 2019

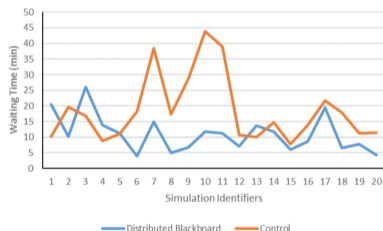
[García-Magariño et al., 2019]

Problem: In a smart city scenario, solutions are needed for large-scale data storage

**Agent-based solution:** a multi-agent system coordinates distributed blackboards, obtaining decentralized, asynchronous communication.



scenario map



experimental results





FLASH-MAS is *A Fast and Lightweight Agent Shell* to serve as a deployment platform for a variety of agent-based applications, including in IoT.

Its **aim** is to be a modern MAS framework: **standard-based · highly modular · very lightweight**

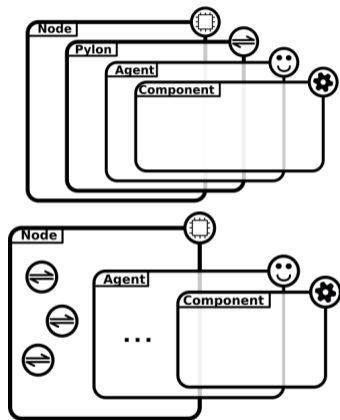
[Olaru et al., 2019]



In a FLASH-MAS deployment there is a great variety of **entities**, which are not all necessarily agents.

- entities inherent to the deployment
  - nodes, communication infrastructures
- entities based on various MAS models – agents, artifacts, workspaces, groups, organizations, contexts
- entities which facilitate working with the MAS
  - GUI support, monitoring and control entities

Entities can be placed in the context of one-another flexibly.



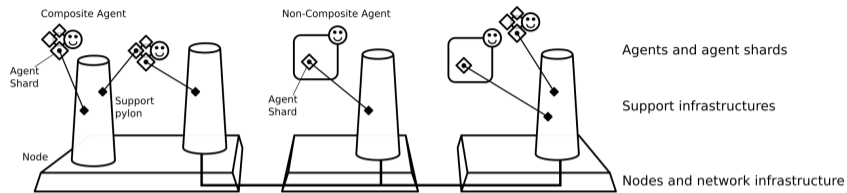
Entities have characteristic **operations**. ←

- agents have *receive*
- nodes have *load* and *migrate*
- workspaces have *join*
- communication infrastructures have *route*  
*etc*

Operations can be accessed based on the *context* of the *calling entity*.

⟨ the *context* is all the entities that an entity is part of in some way ⟩

Some entities in the context may even be *virtual* – they have no operations but they may serve as scope to other entities. E.g. geographic areas, or intervals of time.



agents · shards · pylons · nodes

but also

groups · organizations · artifacts · bridges

lot devices are notoriously limited on resources and many times need to use specific, constrained protocols.

In the entity-operation model

- all devices are also (first-class) entities
- bridges can exist which translate from one communication protocol to another
- the changes in communication protocol are **transparent** to the entities

IoT devices are notoriously limited on resources and many times need to use specific, constrained protocols.

In the entity-operation model

- all devices are also (first-class) entities
- bridges can exist which translate from one communication protocol to another
- the changes in communication protocol are **transparent** to the entities
- FLASH-MAS allows to have all the entities in the deployment as actual entities in the model, with a coherent set of operations, and communicating transparently

- IoT brings a great number of challenges, especially related to security and privacy
- agents are persistent, autonomous entities which enable designing adaptive, open, heterogeneous systems
- agents can be used in IoT architectures in order to make decisions, dynamically, related to access, management, and protection of IoT devices

# Thank You!

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Questions are welcome!

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[Sensors](#), 19(22):4905.

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