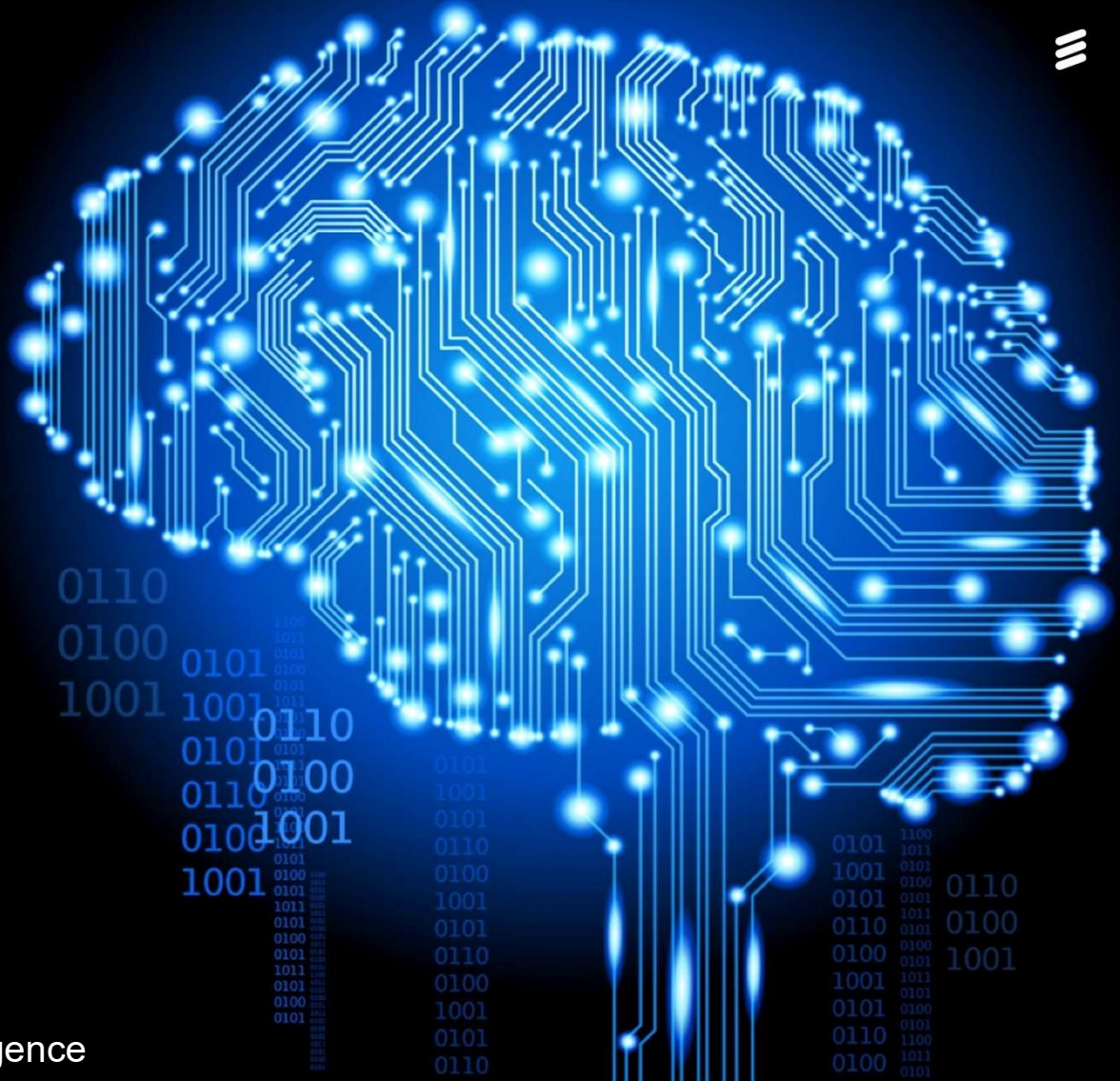


AI for Zero-touch systems

with a focus on trustworthiness

Dr. Aneta Vulgarakis Feljan, Sector Manager
Ericsson Research, Research Area Artificial Intelligence



New applications place higher demands on telecom networks



2G

A network for
voice services

3G

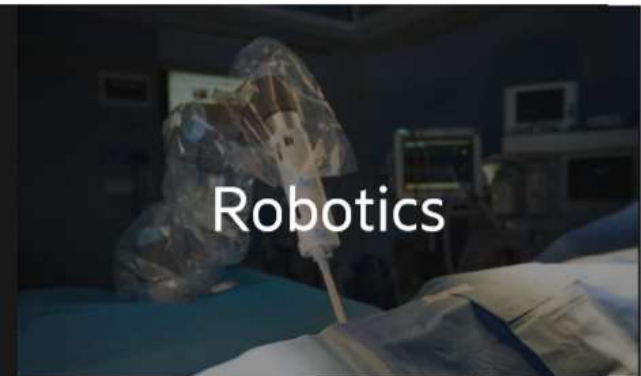
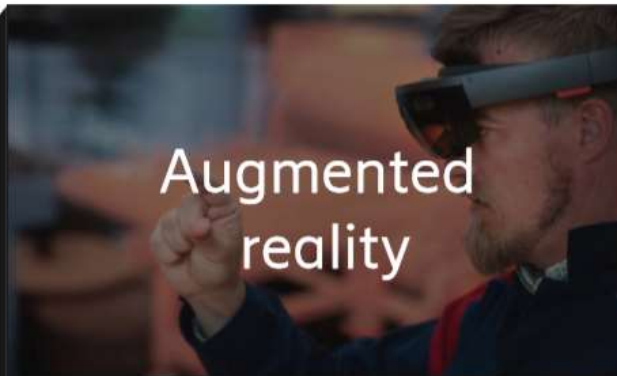
A network for voice &
data services

4G

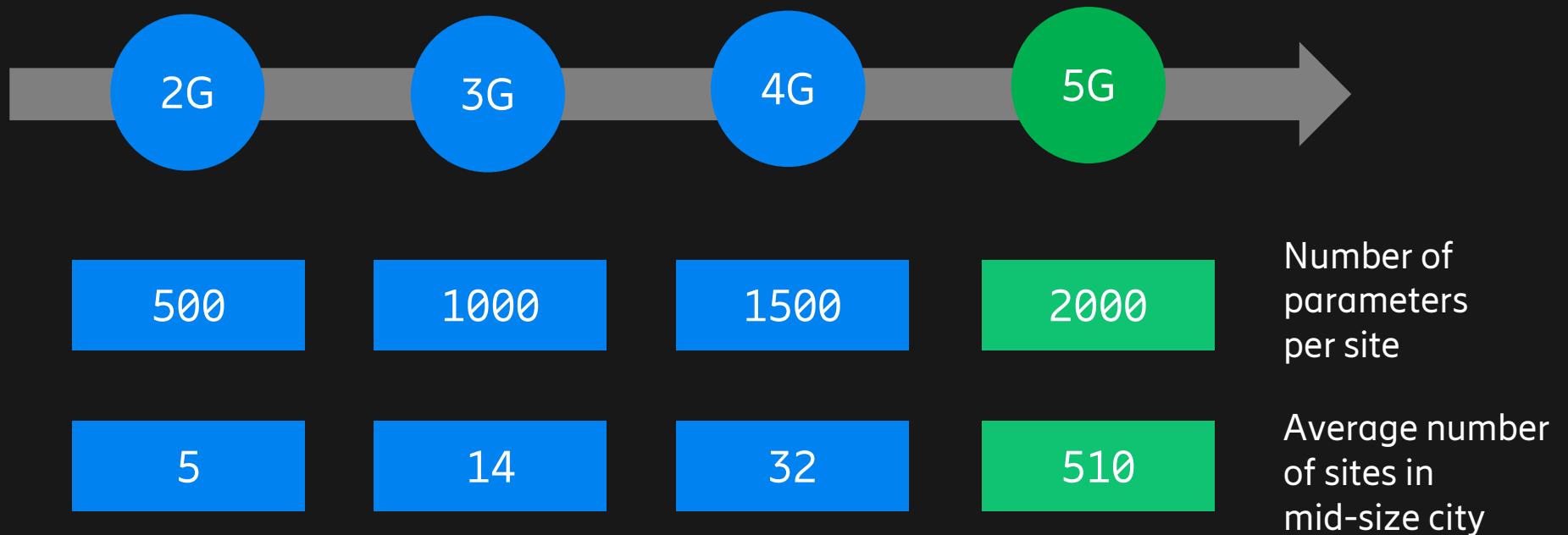
A network for
video & data services

5G

A network for a
million different
needs



Tuning of Antenna Tilt ... but not only



Stolen with pride from Ali Imran, PhD, Director of AI4Networks Center, University of Oklahoma

Zero-touch automation



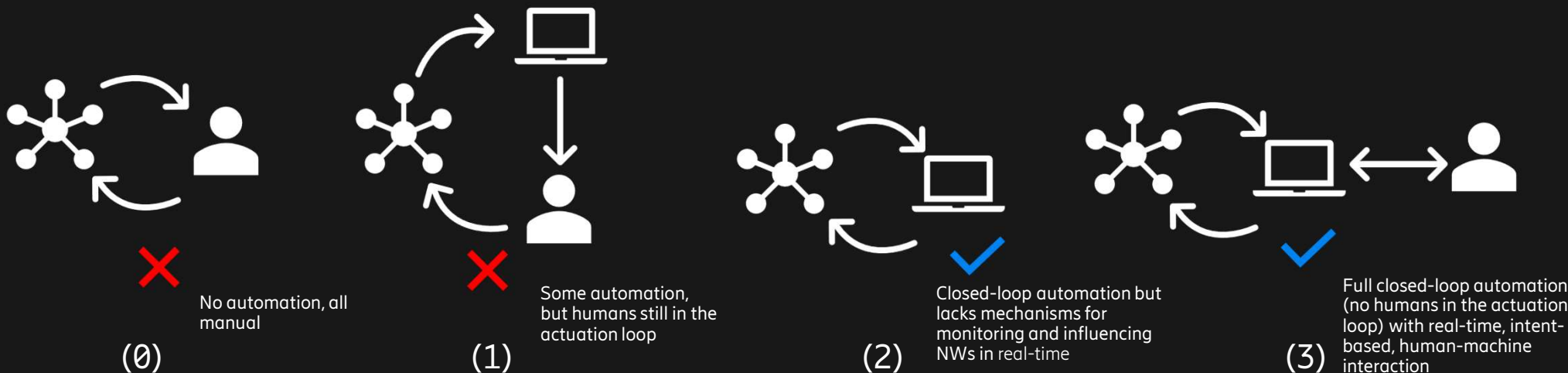
"To have all operational processes and tasks (e.g. delivery, deployment, configuration, assurance, and optimization) executed automatically... ideally with 100% automation."

[*ETSI ZSM](#)

Zero-touch == fully automated



- Closed-loop
- No humans in the actuation loop!



AI for zero-touch automation



Real-time

- Intelligent decision making on live data
- Network edge, IoT sensors and more



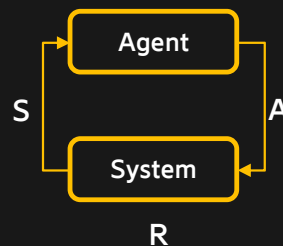
Distributed Intelligence

- From data center to network edge
- Distributed learning, Local vs. Global



Beyond Games and Simulations

- Reinforcement Learning
- Simulators + Live systems



Machine Learning + Reasoning

- Extract high level knowledge from ML
- Inferencing, Planning
- Graph neural networks

Machine Learning



Reasoning

Trustworthy AI

- Safety guarantees and verification
- Traceability of decisions, explainability



Human-Machine symbiosis

- Human Intelligence Augmentation
- Evolved Human-Machine interaction



Trustworthy AI



Human Agency and
Oversight

Human autonomy is
paramount

Transparency

Usage transparency

Explainability

Must explain outcomes

Accountability

Traceable and
auditable

Diversity & Fairness

Unbiased and non-
discriminatory

Technical Robustness
and Safety

Resilient to attacks
and uncertainty

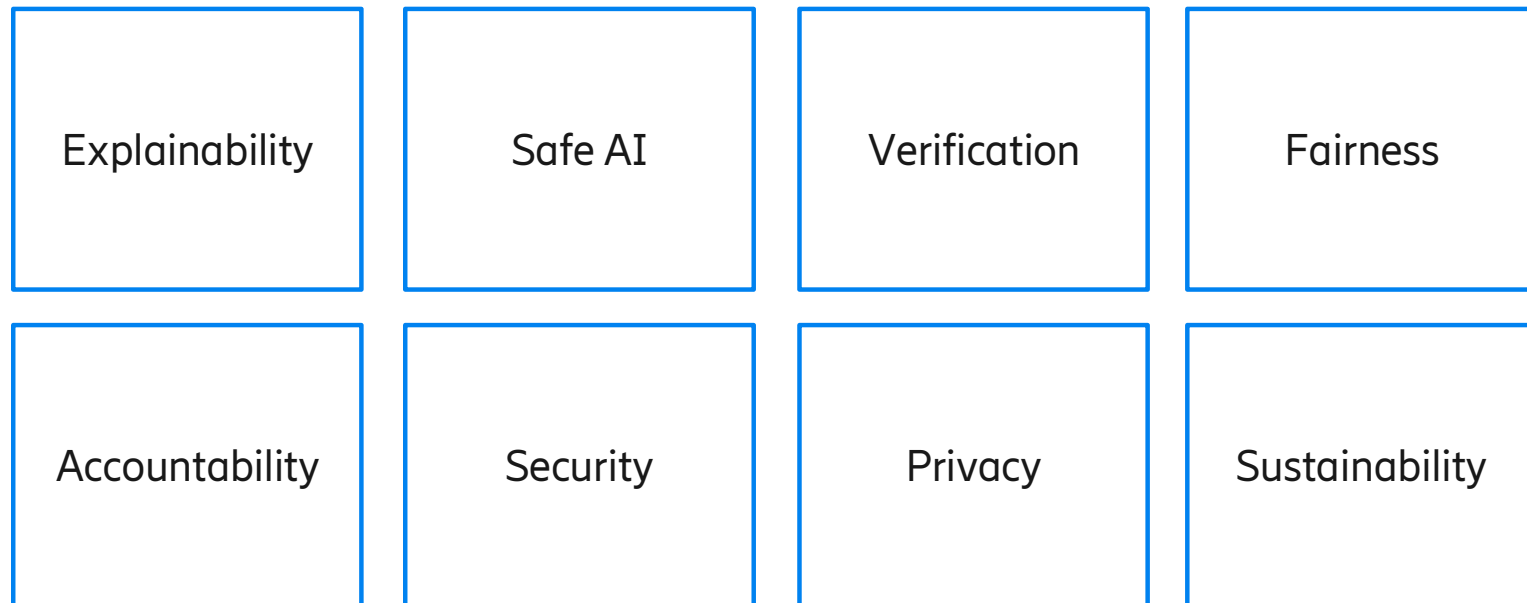
Privacy

Respects data
privacy and user
consent

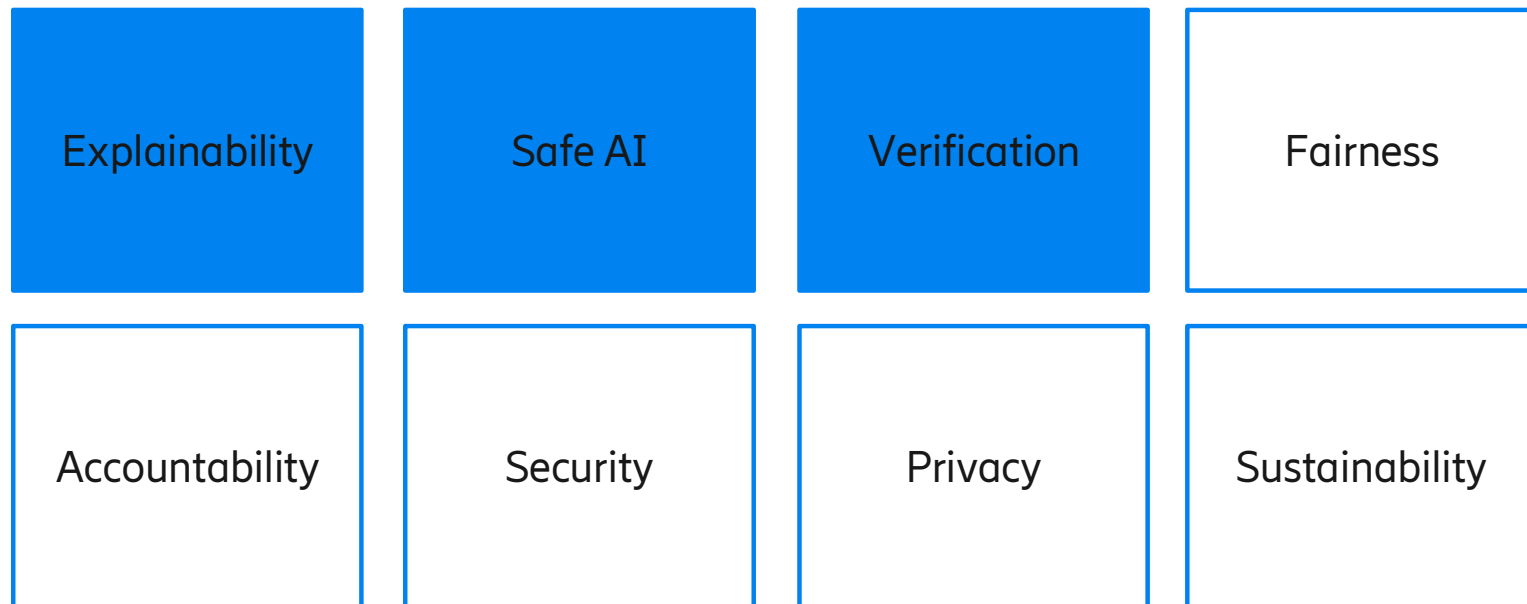
Societal wellbeing

Respect human rights and
environmental wellbeing

Technology pieces for Trustworthy AI



Technology pieces for Trustworthy AI



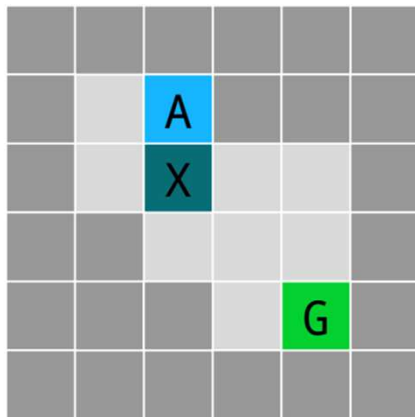


Safe AI

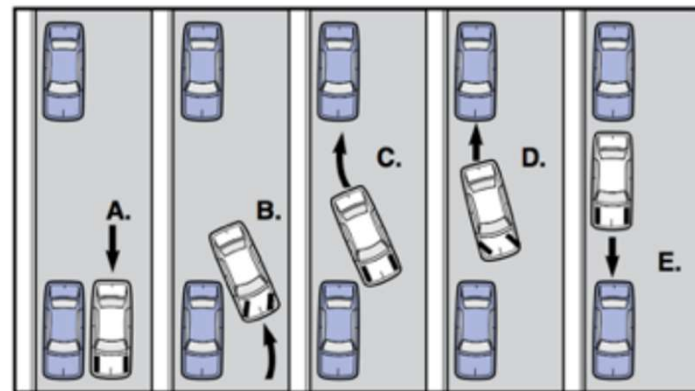
Safe AI



How can we get agents to minimize effects unrelated to their main objectives, especially those that are irreversible?



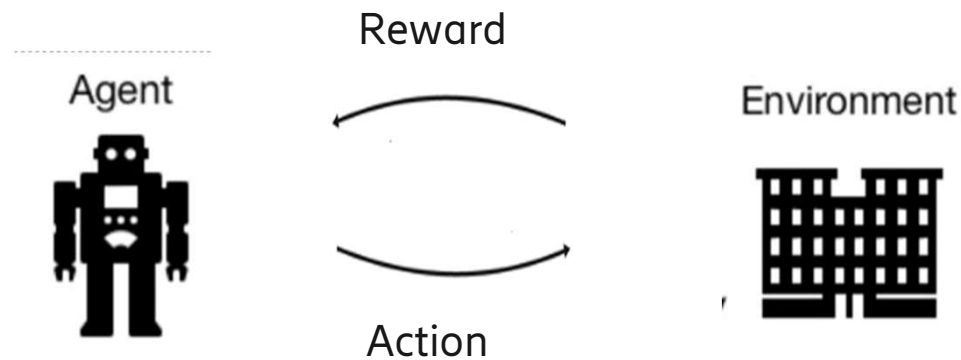
- A** Agent
- G** Goal
- X** Box





Intelligent agents

- Reinforcement learning (RL) has recently become a powerful solution for dealing with the general problem of optimal decision and control for agents that interact with an uncertain environment.

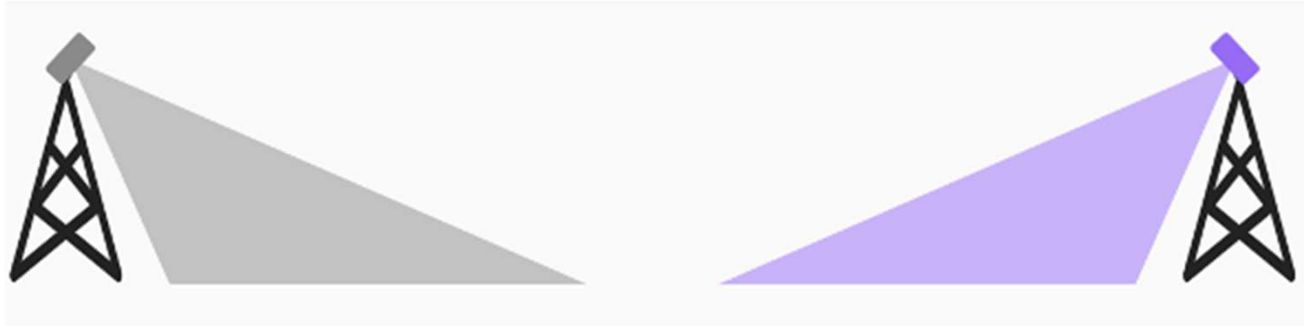


- Telecommunication systems are inherently stochastic and dynamic -> RL can be applied to domain specific use cases to make optimal decisions in order to improve performance



Use cases

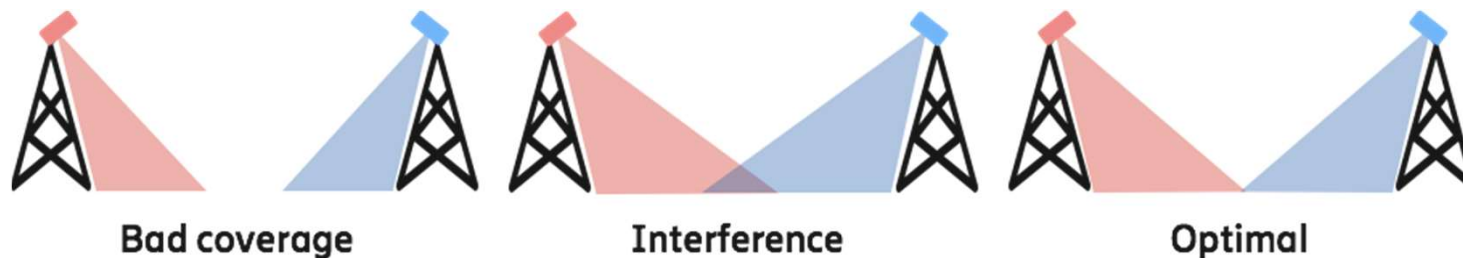
Design control policies in order to optimize network configuration parameters such as antenna tilts



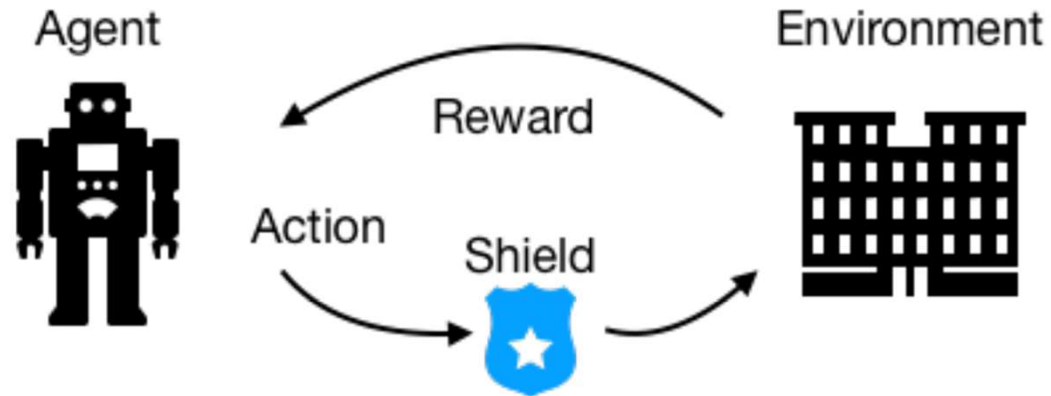
Safe and Symbolic Reinforcement Learning



- When RL agents are deployed in an online learning setting, they perform exploration of the state-action space in the real world to arrive at an optimal policy.
- However, this exploration needs to be safe, while also arriving at a policy that performs better than baselines.



Safe and Symbolic RL

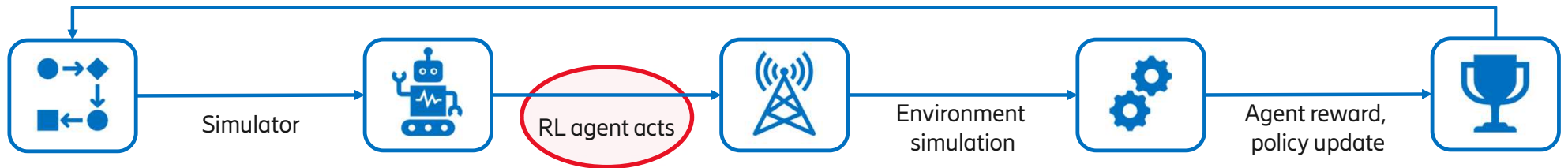


Model-based shielding to “block” unsafe actions towards the environment.

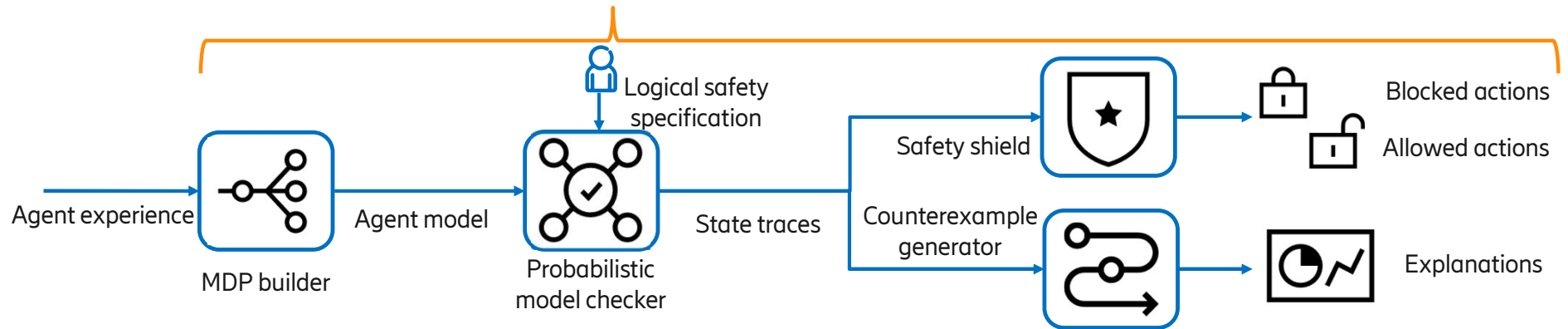
Safe and explainable RL process



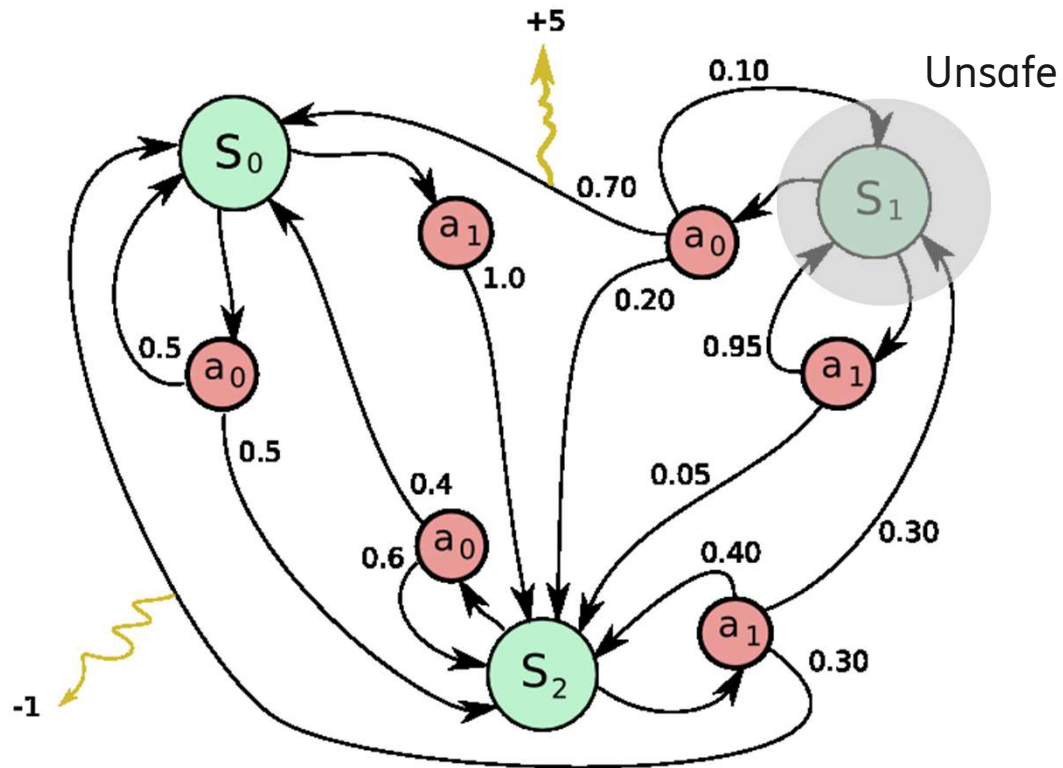
Current RL solutions



Is it safe and explainable?



MDPs to make state-action transitions explicit





Explainable AI

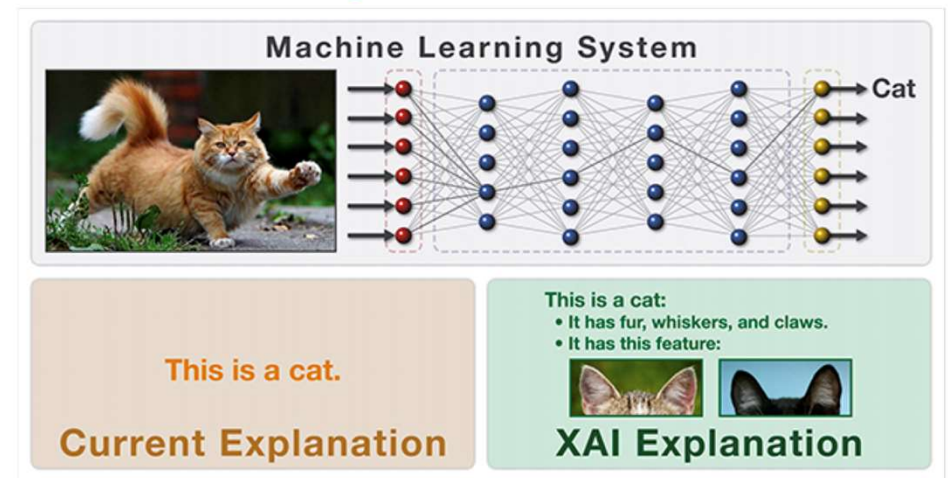
Explainable Machine Learning



Google's explanations service (based on Shap)

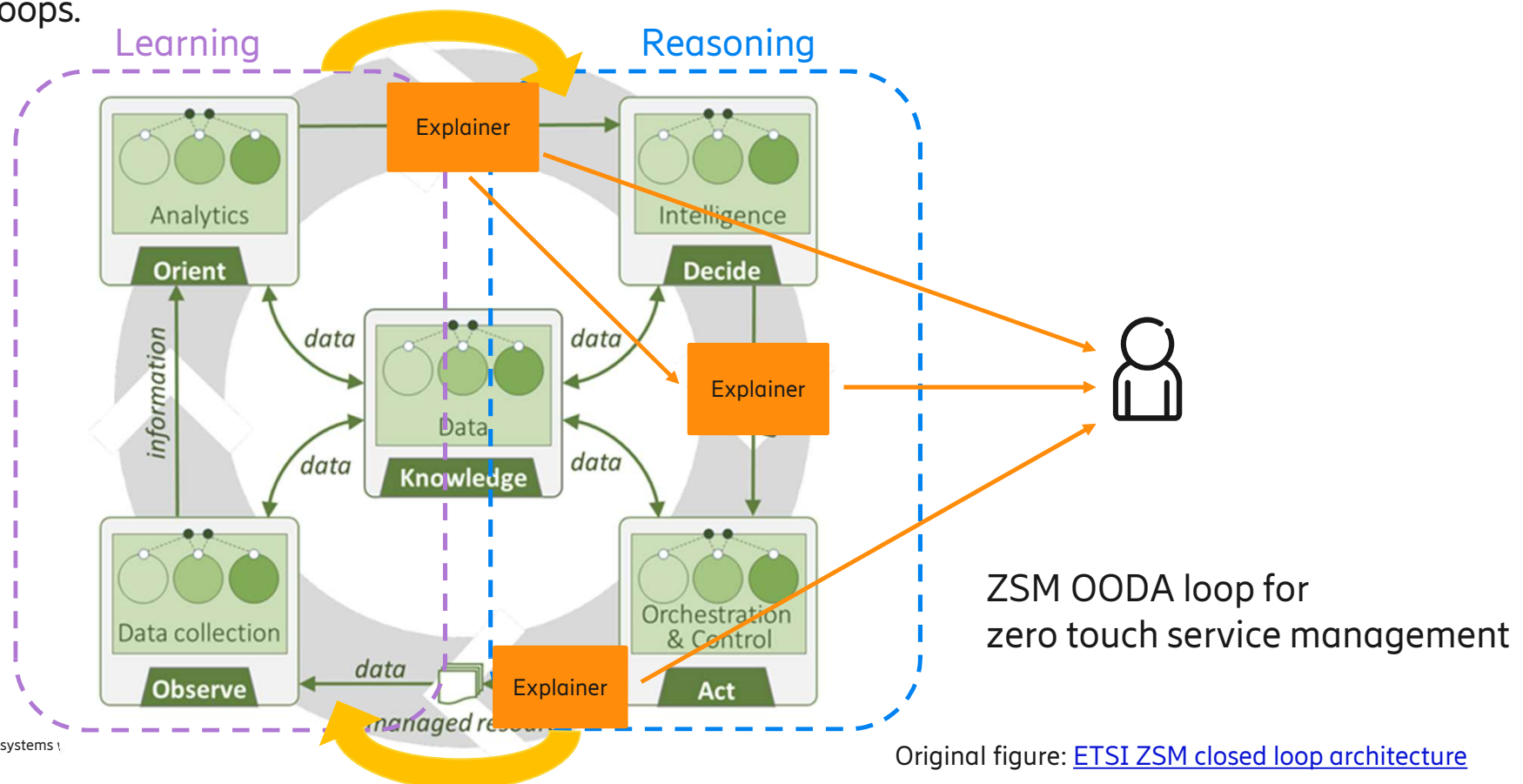


Explainable AI

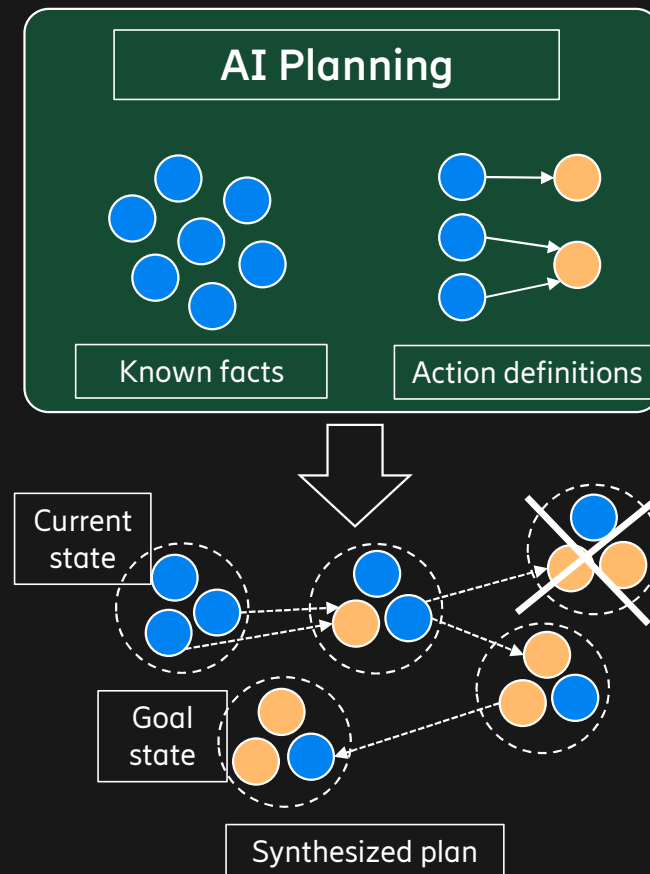


Explainable AI (XAI)

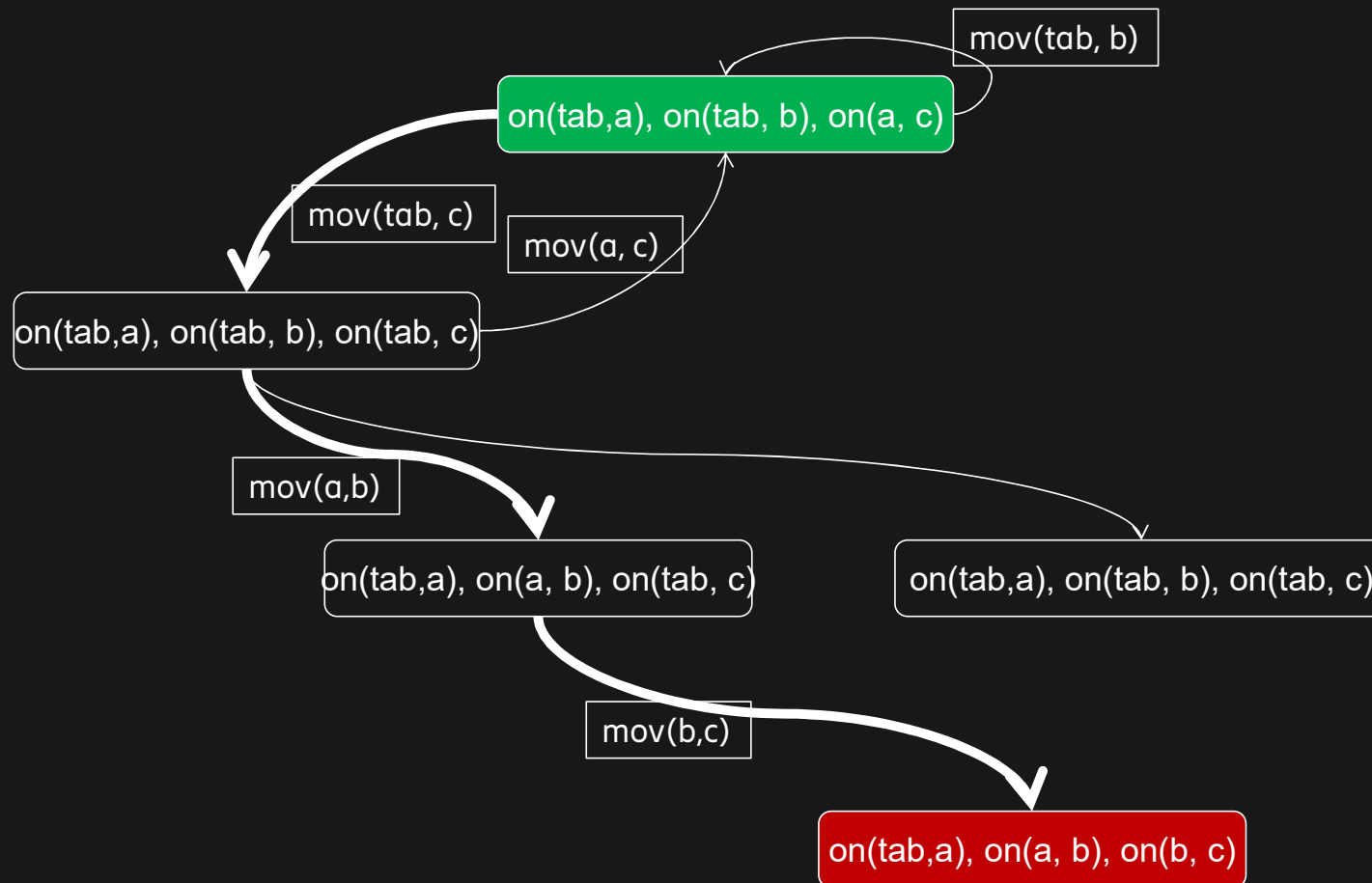
- Study of explainability in the larger intelligent agent context, or for AI agents in both the "Analyse" and "Decide" loops.



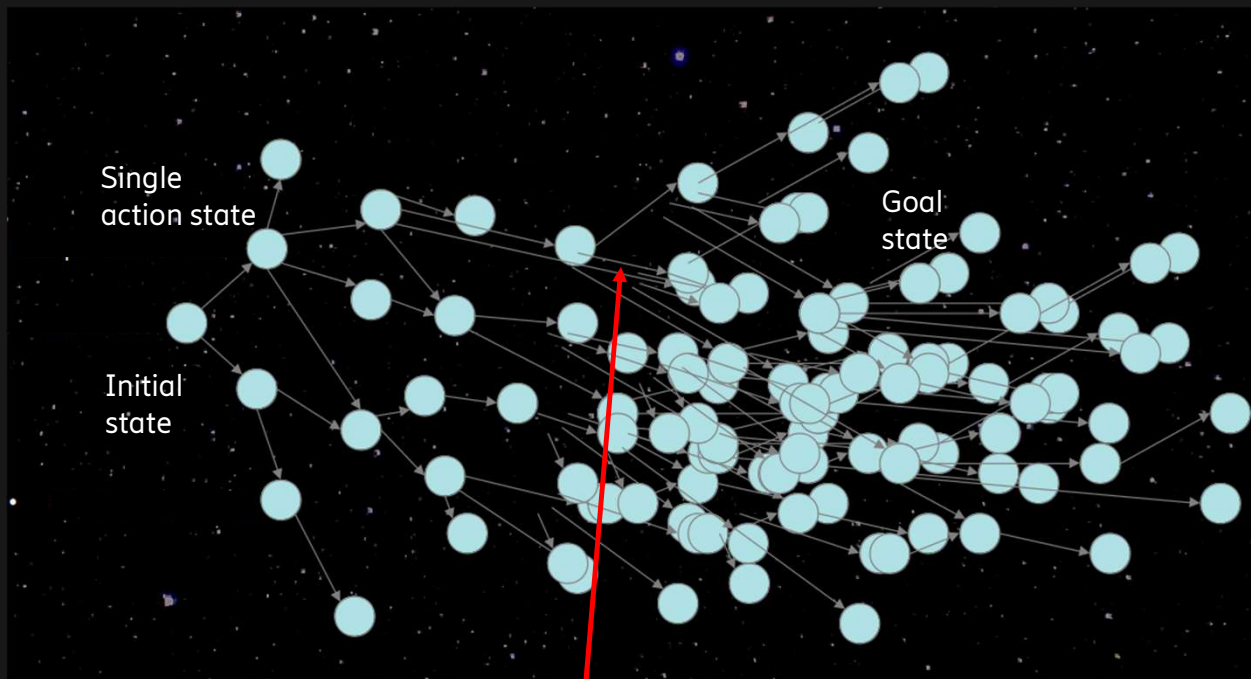
Explainable AI Planning



Explainable AI Planning



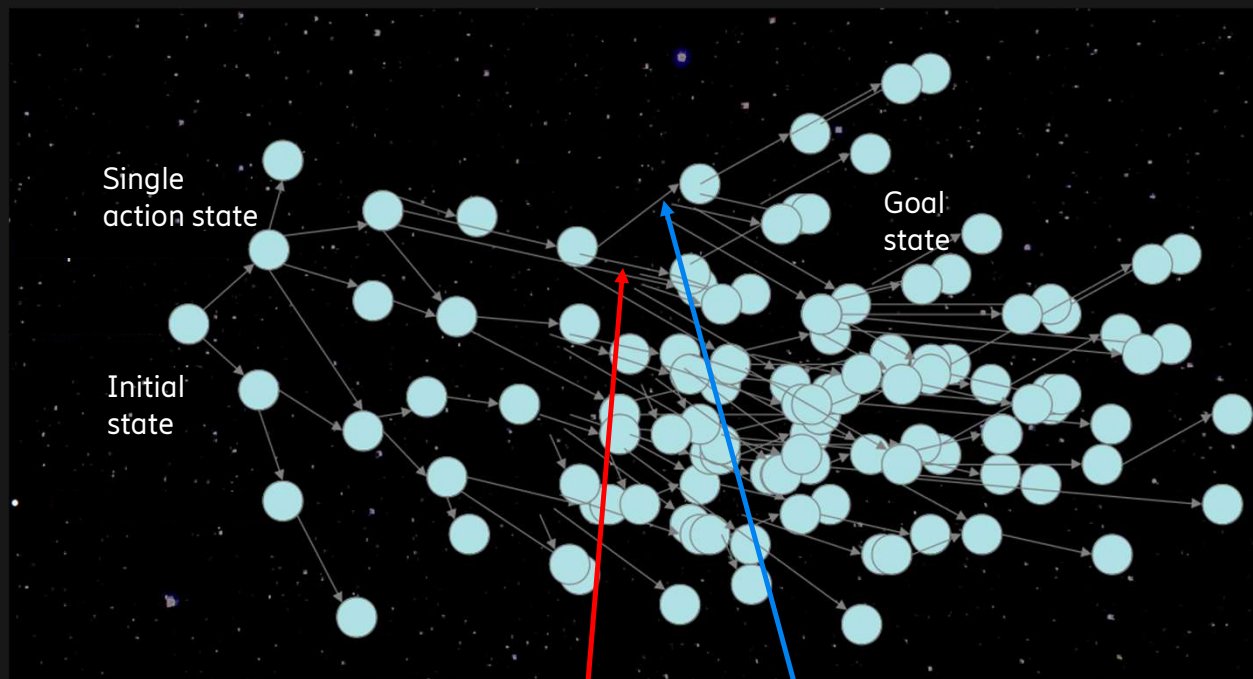
Explainable AI Planning



Why this action?

Why action A at step n ?

Explainable AI Planning

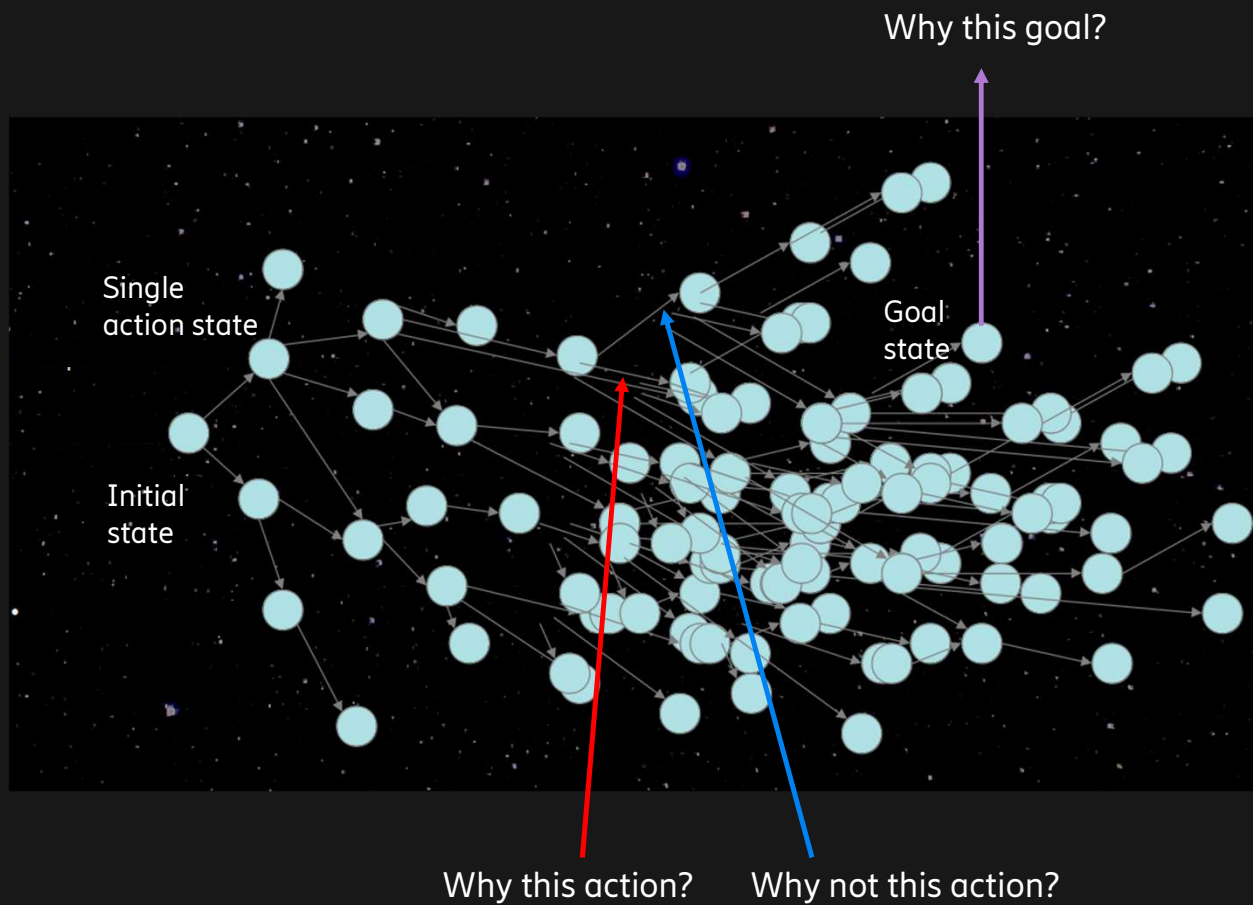


Why action A at step n ?
Why not action B at step n?

Why this action?

Why not this action?

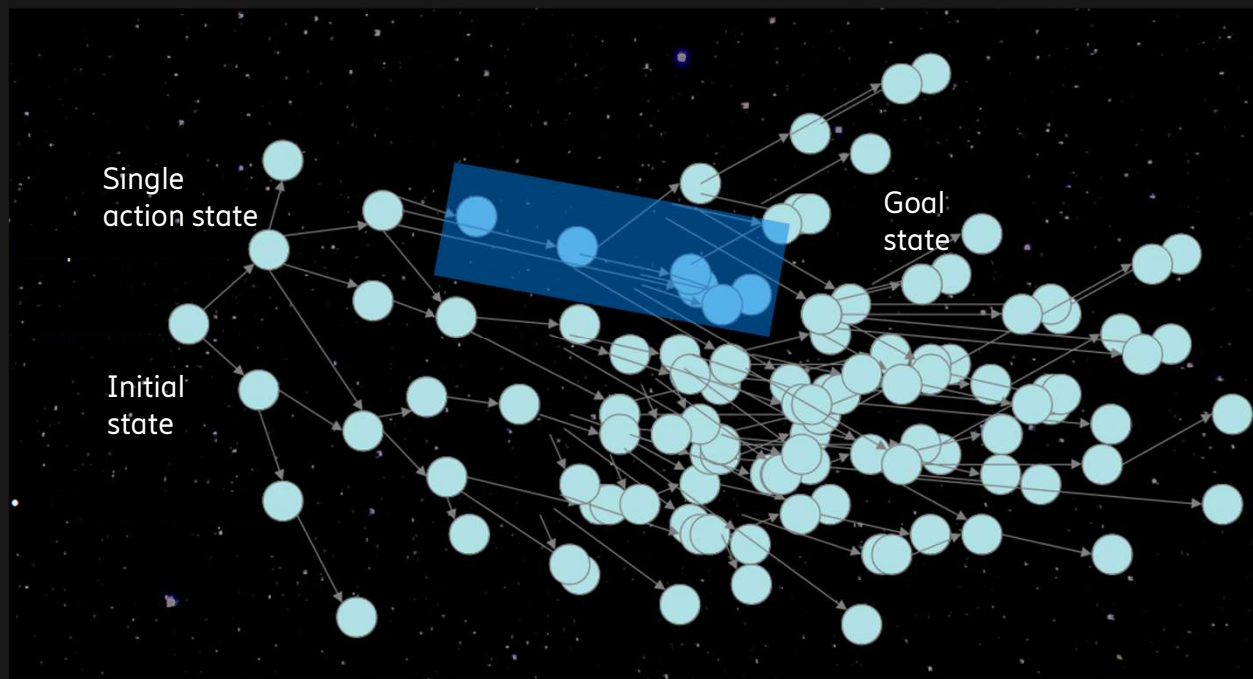
Explainable AI Planning



Contrastive

Why action A at step n ?
Why not action B at step n?
Why this goal or sub-intent?

Explainable AI Planning



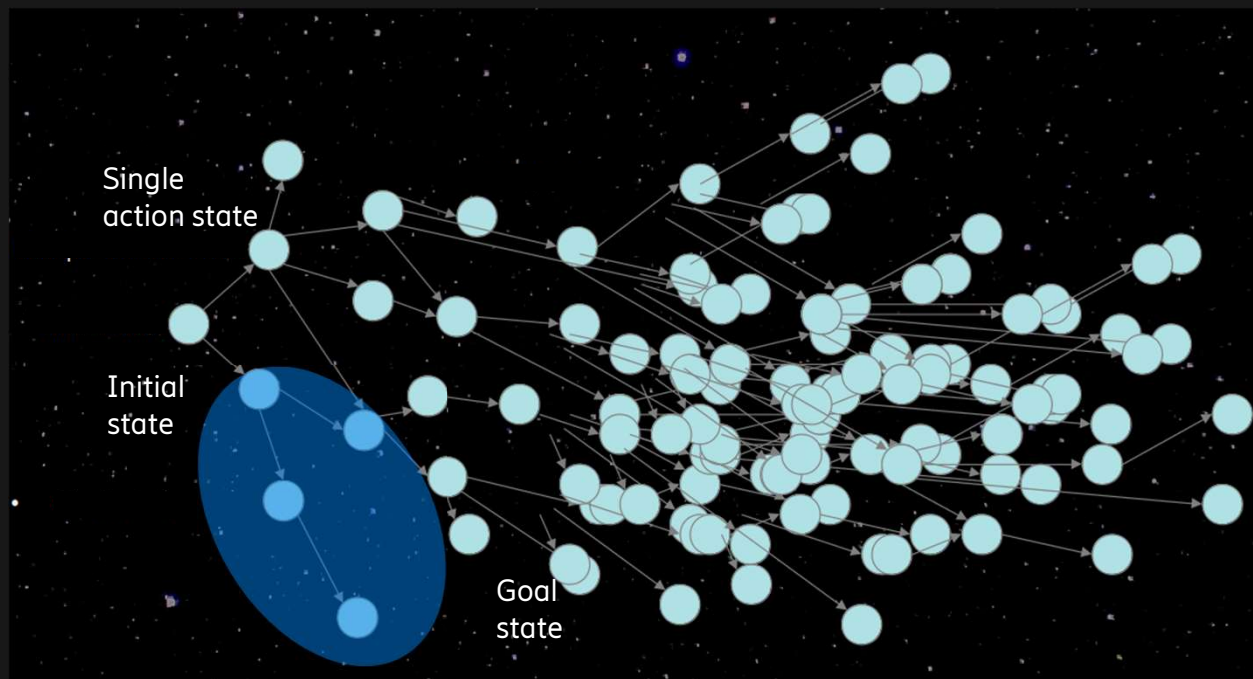
Contrastive

Why action A at step n ?
Why not action B at step n?
Why this goal or sub-intent?

State traces

What was the decision path?
State traces
Plan recognition
What facts support/attack?

Explainable AI Planning



Contrastive

Why action A at step n ?
Why not action B at step n?
Why this goal or sub-intent?

State traces

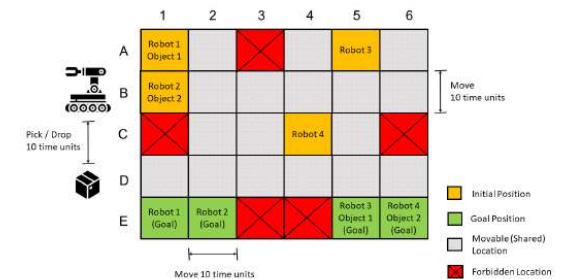
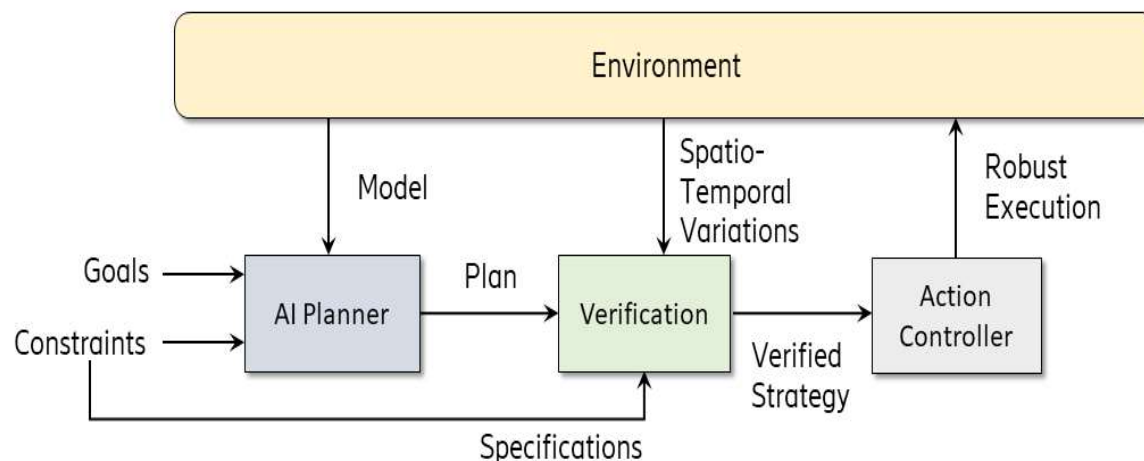
What was the decision path?
State traces
Plan recognition
What facts support/attack?

Explain unsolvability
Introspection in RL



Verification in AI

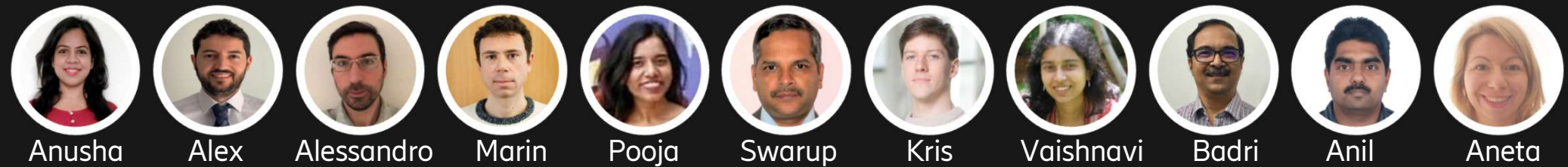
Verification in AI Planning



- **Problem:** How do we verify AI Planning systems to be conformant to specifications, despite spatio-temporal deviations in the deployment environment?
- Demonstrated in an automated warehouse use case (SCOTT EU project).
- Paper "FlatPack: Flexible Temporal Planning with Verification and Controller Synthesis", [Ajay Kattepur](#) and [Swarup Kumar Mohalik](#) to SAC'21, March 22-March 26, 2021, Gwangju, South Korea



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