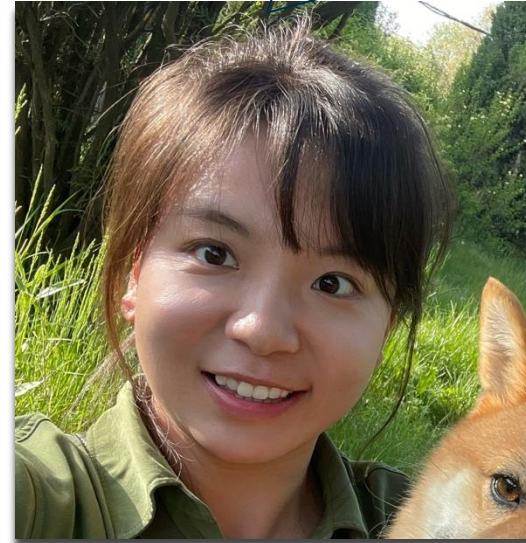


I am the speaker

RAdaptSQ: Real-Time AI-Planning and Environment-Aware Self-Adaptation to Optimize Security and QoS.



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Background

Microservice application

- Decompose monolithic functionality into **independent, single-purpose services**.
- **Simplifies updating**, scheduling, scaling, and integration
- **Widely adopted across industries**: 74% of respondents already use a microservices architecture; the remaining 23% plan to (Gartner 2023).

Service-based E-Food Application(SEFA)

- The prototype was implemented by RAMSES.
- Ordering: manages carts and finalizes orders
- Restaurant: handles restaurant listings and menus
- Payment proxy: connects to a third-party payment provider
- Delivery proxy: arranges food delivery

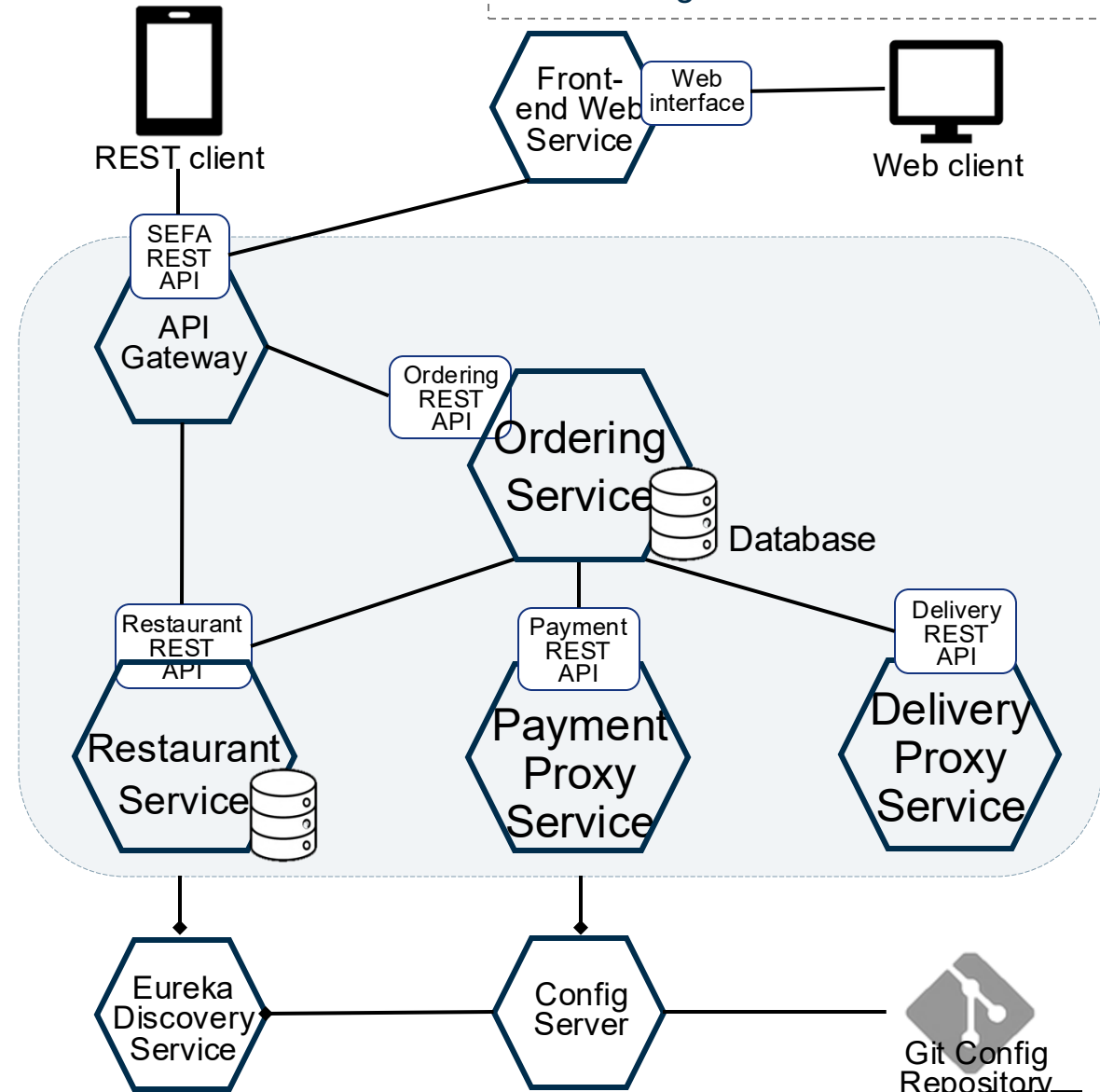
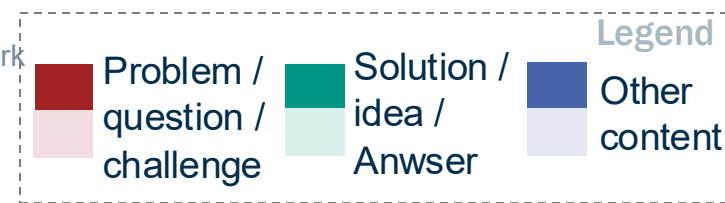


Figure. SEFA architecture

Characters

Lin Operations Engineer

- 9 years of experience
- Owns a Border Collie
- Works hard to earn a living and support the family



Characters

Characters

Some things are fictional

Danjiao Attacker

- Evil dog, known as DJ in the community
- Passionate about breaking
- Very smart, currently learning computer skills



Characters

Raffaella Leader

- Nearly 30 years of experience
- Highly competent and meticulous



Characters

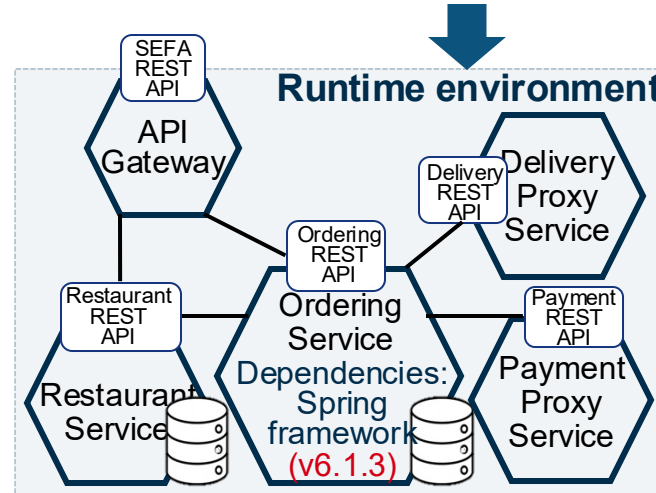
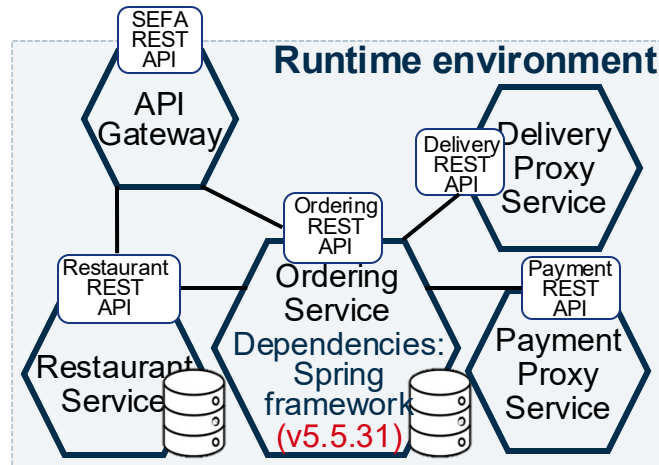
Problem Statement

Some things are fictional

Lin,
that dish just blew up and
the order volume spiked.
Users are noticing delays
can you **quickly** handle it?



The uncertainties (order volume spike, version changes, attacks...) are only known during operation



Change the version of Spring Framework from 5.5.31 to 6.1.3.

New vulnerabilities
CVE-2024-22243
CVE-2024-38820
...

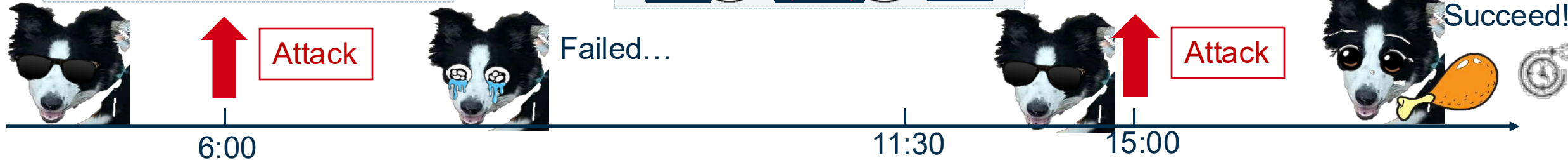


Figure. How runtime uncertainties in microservice applications cause security drift

Rapid fluctuation of the attack surfaces

- Change during runtime introduces new threats, vulnerabilities, the attack surfaces change quickly

Security Drift

- Static security controls with fixed strategies become outdated and ineffective shortly after deployment

Problem Statement

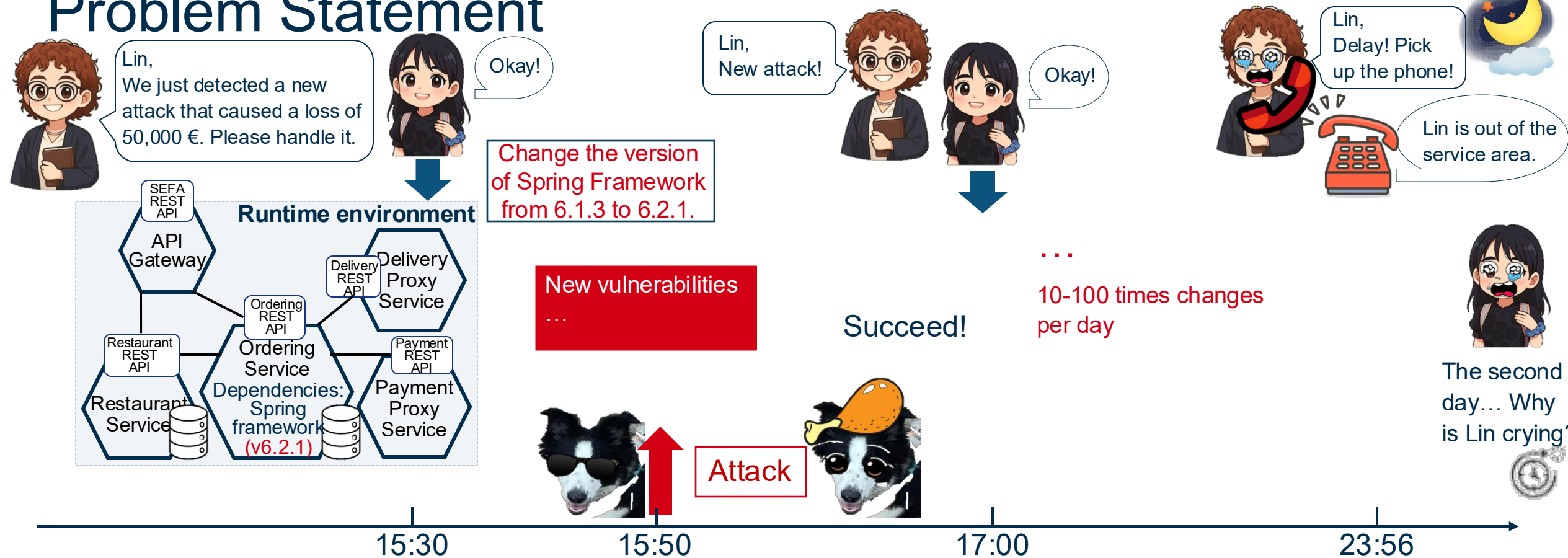


Figure. How runtime uncertainties in microservice applications cause security drift

Rapid fluctuation of the attack surfaces

- Change during runtime introduces new threats, vulnerabilities the attack surfaces change quickly

Security Drift

- Static security controls with fixed strategies become outdated and ineffective shortly after deployment

Rapid Security Drift

- Manual Maintenance unrealistic, can never keep up with the pace of change.



Problem Statement

Is there a way to **automatically handle uncertainties** during an app's runtime while maintaining system performance and security?



Envisioned Solution

Assumption: SAS won't introduce new attack surfaces to the microservice app

Why Self-adaptive System (SAS)?

- Self-adaptation is one prominent approach to deal with **uncertainty** and business continuity **autonomously**
- Key idea: let system **gather new knowledge at runtime to resolve uncertainties**, reason about itself, its context and goals, and adapt to realize goals

What is SAS?

- **External principle:** A self-adaptive system is a system that can **handle uncertainty** in its environment, itself and its goals **autonomously** (or with minimal human interference)
- **Internal principle:** A self-adaptive system comprises two distinct parts:
 - 1. **Managed system** interacts with the environment and fulfils business functions.
 - 2. **Managing system** monitors and adapts the managed system to handle adaptation concerns and achieve self-adaptation.

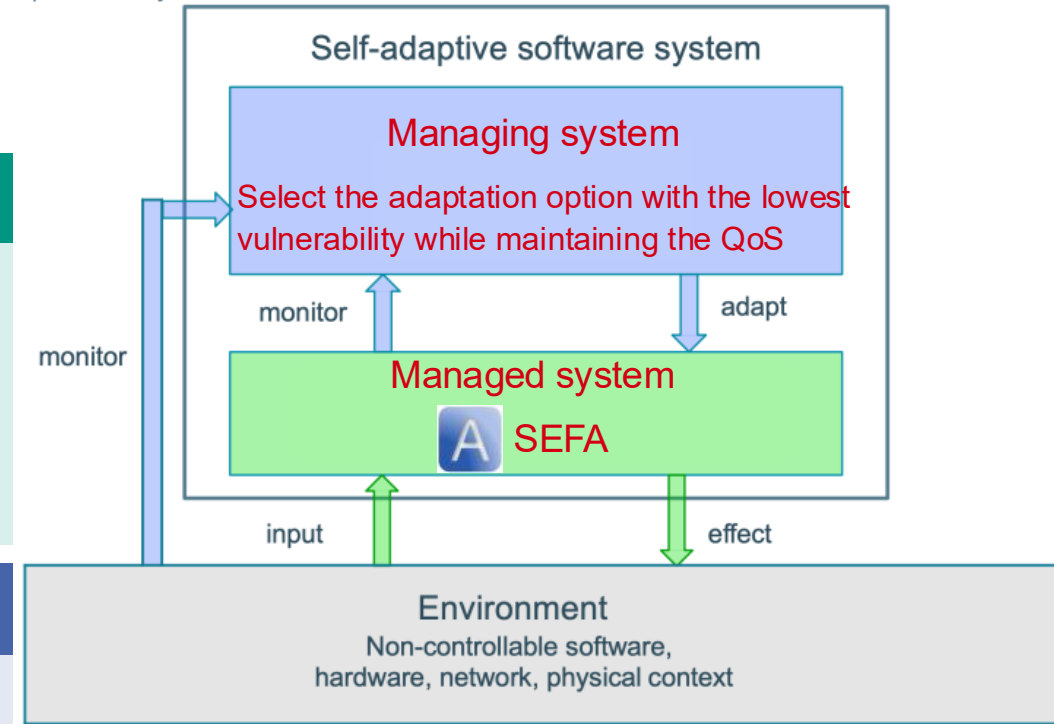


Figure. Self-adaptive system

Gap in the Existing Solution: AQUA [7]

- Representative work to make security enhancement an adaptation objective for microservice Apps by integrating security assessment into an adaptive MAPE-K loop.
- **Security assessment performed offline and remains static at runtime.**
- **Cannot handle fluctuating attack surfaces.**

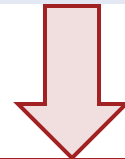
Research Questions

RQ1: Modeling the App's Endogenous Configuration and its Exogenous Environment

How to efficiently model the managed microservice app's internal configuration and external environment within the Knowledge module?

- Update in a timely manner, consistently reflect changes, and the system's latest runtime state.

Goal: Maintaining a model within the Knowledge module that consistently reflects the managed system and the environment



Basis. Model in the Knowledge module serves for adaptation decision making

RQ2: Dynamic Assessment and Selection the Optimal Adaptation Option

How can the MAPE-K loop dynamically assess the runtime security of the system based on the latest internal and external states?

- Meet the stringent time requirements of microservice environments.

Goal: Spotting the optimal option that optimize the app's security while maintain acceptable QoS

Contribution: Conceptual Framework of RAdaptSQ

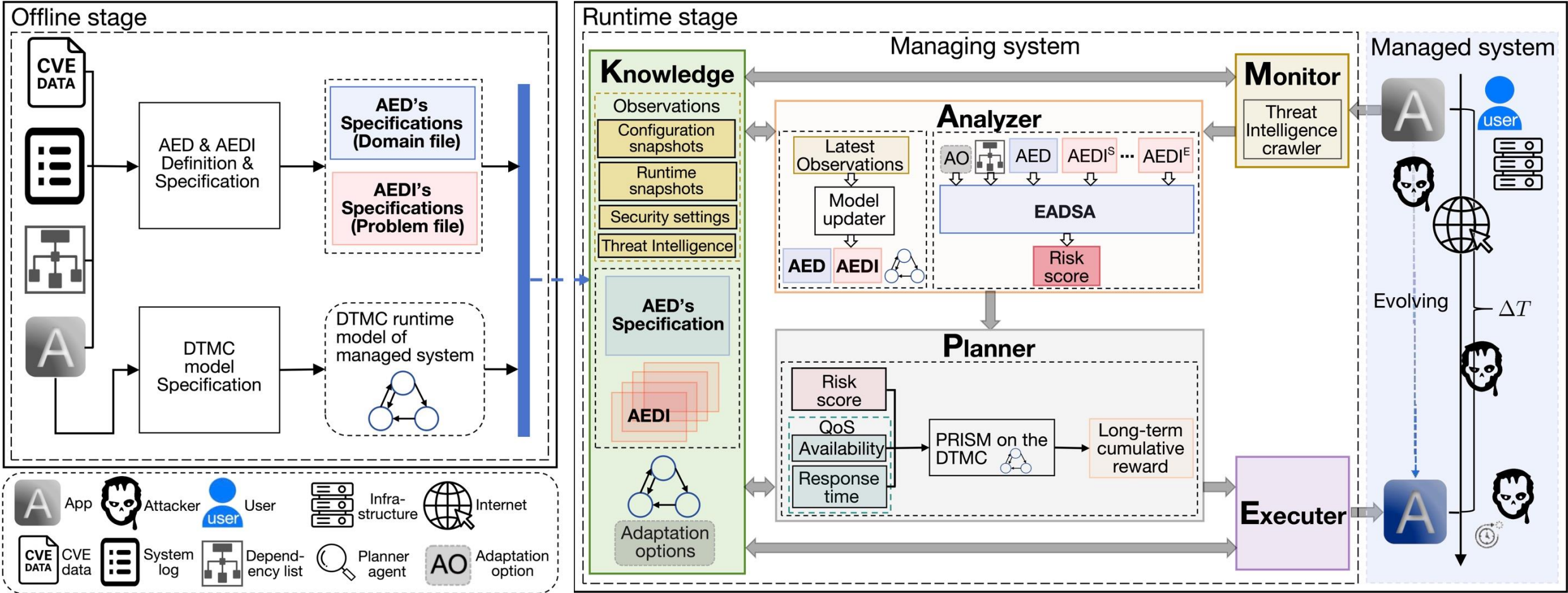


Figure. Conceptual framework of RAdaptSQ

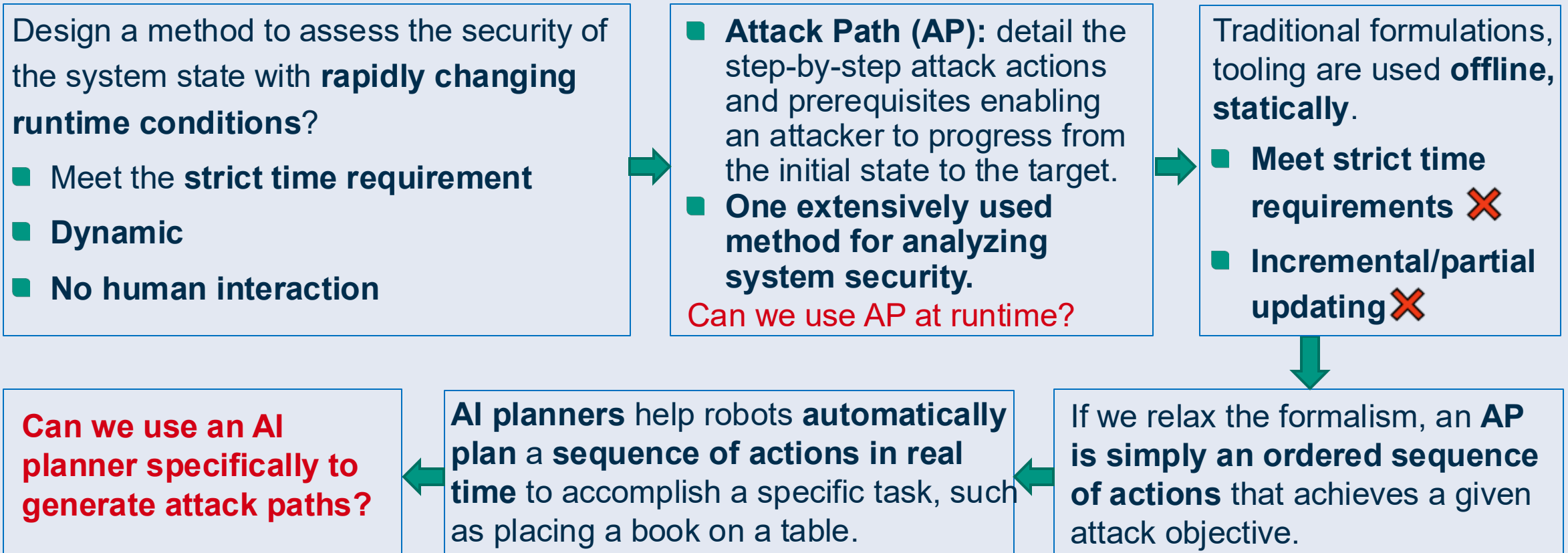
Abbreviation
AED: Adversarial Environment Domain; AEDI: Adversarial Environment Domain Instance; EADSA: Environmental-Aware Dynamic Security Assessment

Ideas for RQ2 (Dynamic Assessment)

RQ2

- How can the MAPE-K loop dynamically assess the runtime security of the system based on the latest internal and external states?

Brainstorm for Potential Solution: Security assessment → Attack Paths planning



Envisioned Solution

What is AI planner?

- An AI planner is a system that **automatically generates a sequence of actions** to **achieve a specific goal** from a given starting state.
- Features:
 - **Real-time planning:** can operate in real-time.
 - **Dynamic:** generated action sequences (plans) adjust automatically when the environment changes.
 - **Automation:** Reduces human effort in complex decision-making.
- The AI planner is extensively used in robotics, autonomous vehicles, smart homes, game AI, logistics, scheduling, and etc.

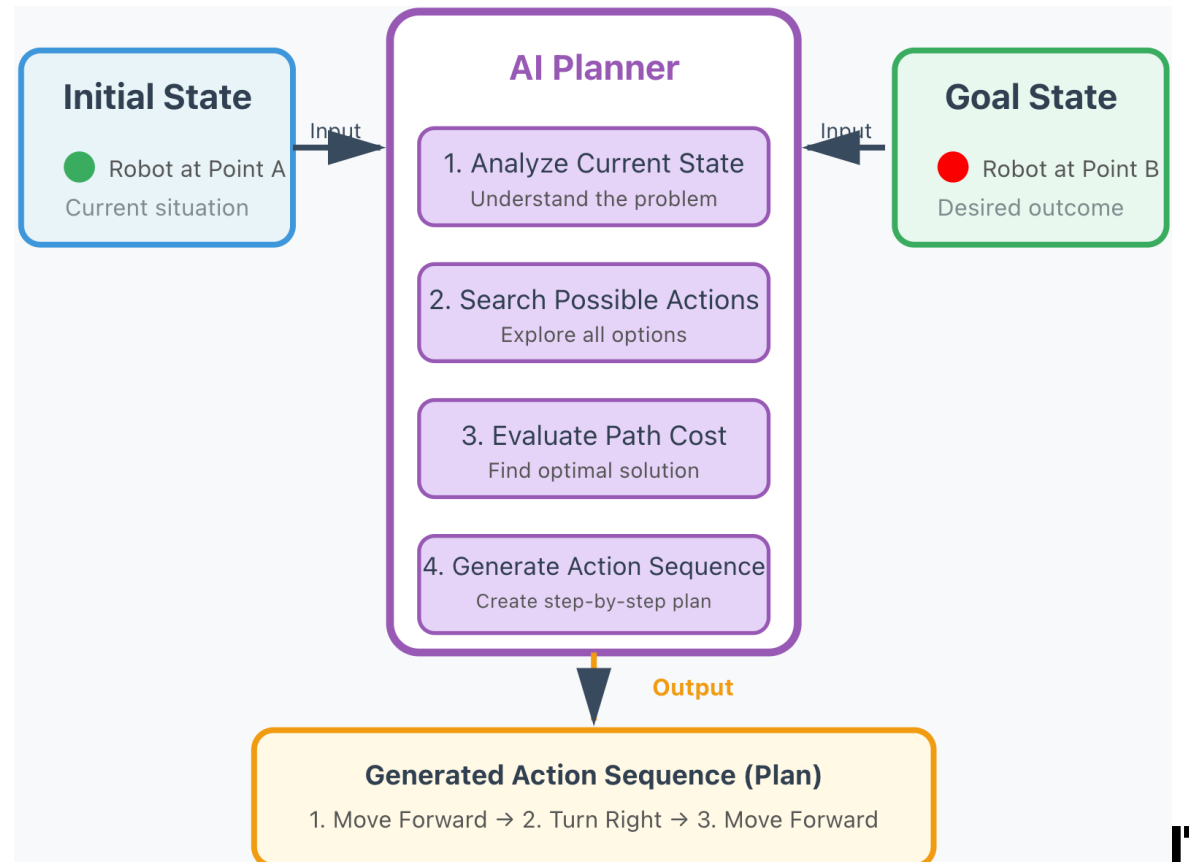
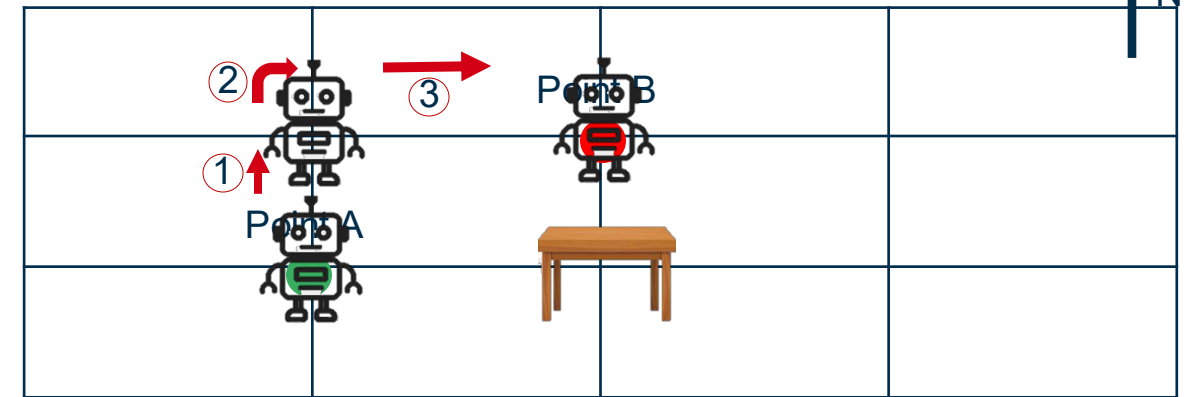


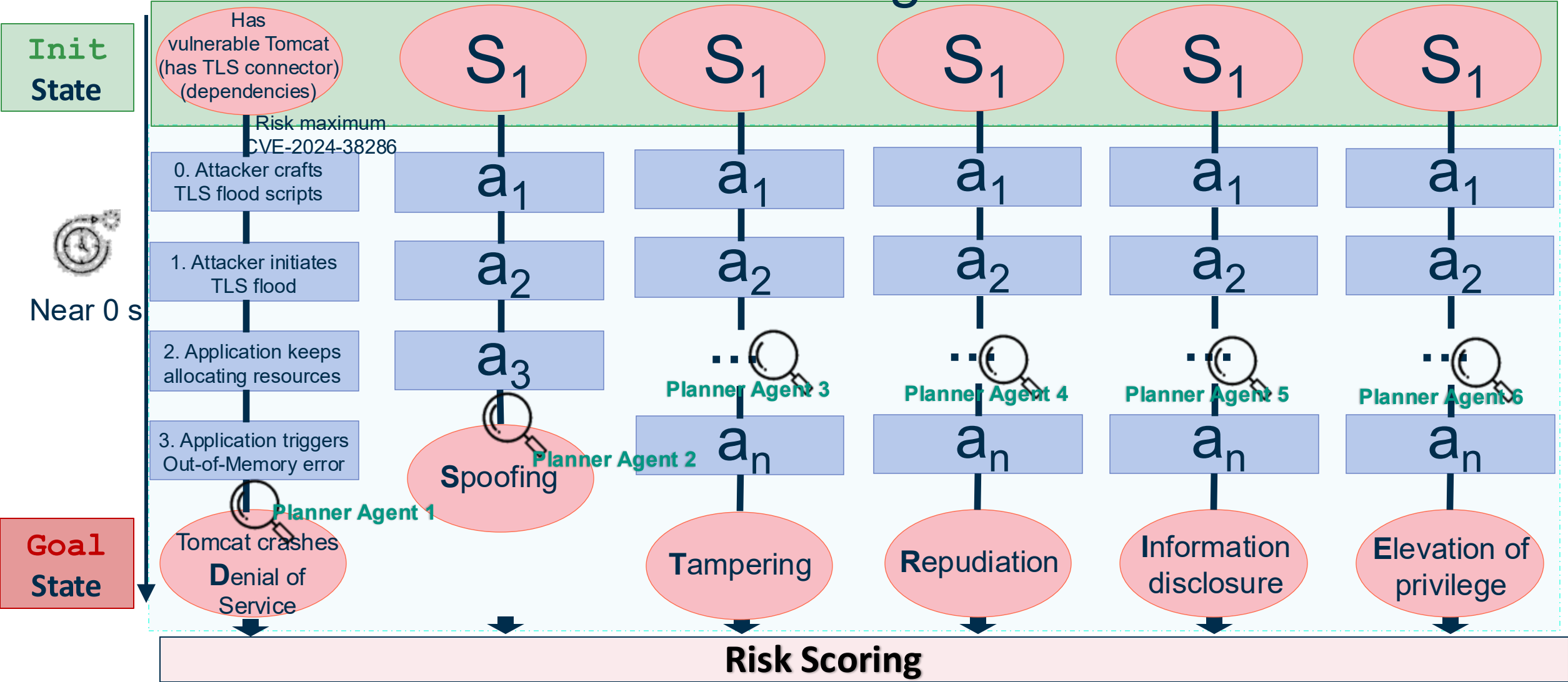
Figure. AI planner

Envisioned Attack Paths Planning

state

atomic action

Legend



Problem Statement

Are there any readily usable AI planners?
If so, how to **use AI planners**?
How to **interpret the system's initial state and the target goal state** for AI planners?



Envisioned Solution

Why Planning Domain Definition Language (PDDL)?

- PDDL is a **standardized description language for automated AI planning**.
- By standardizing the representation of planning problems, **PDDL enables most AI planners**, such as Metric-FF and Fast Downward, **to interpret and solve planning problems**.

How to use PDDL?

- The PDDL standardizes planning problem description via:
 - Problem file, instantiates the domain for a specific scenario. It lists concrete objects, specifies the initial state as a set of grounded predicates, and desired goal states to be reached.
 - Domain file, defines the model of the environment and system by specifying types, predicates, and actions.
- **A PDDL planner receives these files as input and searches for an action sequence that transforms the initial state into one satisfying the goal.**

```
(define (domain AED)
  (:requirements :strips :typing ...)
  (:types app lib...)
  (:predicates (ddos ?x - app)(mem-ex ?x)
    (has-lib ?x - app ?y - lib ) ...)
  (:functions (version ?x)...)
  (:action app-becomes-unresponsive
    :parameters (?x - app)
    :precondition (and (mem-ex ?x )...)
    :effect (and (ddos ?x)))...)
```

Types

States and relationships of typed objects

Numerical features of objects.

Executable actions of attackers, applications, users, or infrastructures

Figure. Example of PDDL domain file

```
(define (problem AEDI)
  (:domain AED)
  (:objects SEFA - app Logback - lib...)
  (:init
    (has-lib SEFA Logback)
    (= (version Jettision) 1004011000)...)
  (:goal (and (ddos SEFA)...) )
```

All concrete typed objects in the system and environment

The initial state of the system and the environment

Attack goal

Figure. Example of PDDL problem file

Solutions for RQ1 (Modeling)

RQ1: Modeling the App's Endogenous System and its External Environment

How to efficiently model a microservice app's internal system and external environment within the Knowledge module?

- Update in a timely manner, consistently reflect changes and the system's latest runtime state.

Solution

- **Using PDDL 2.0 syntax to define** the system's internal configuration and external environment in the PDDL “**domain file**” (**AED**) and “**problem file**” (**AEDI**).
- The initial versions of AED and AEDI are specified in the offline stage and are pre-stored in the Knowledge module.
- At runtime, AED and AEDI are maintained by the Knowledge module.
Before planning APs based on AED and AEDI to assess the risk of a specific implementation, the **Analyzer** must first **update AED and AEDI** using the latest observations collected by the Monitor.

AED & AEDI Specification

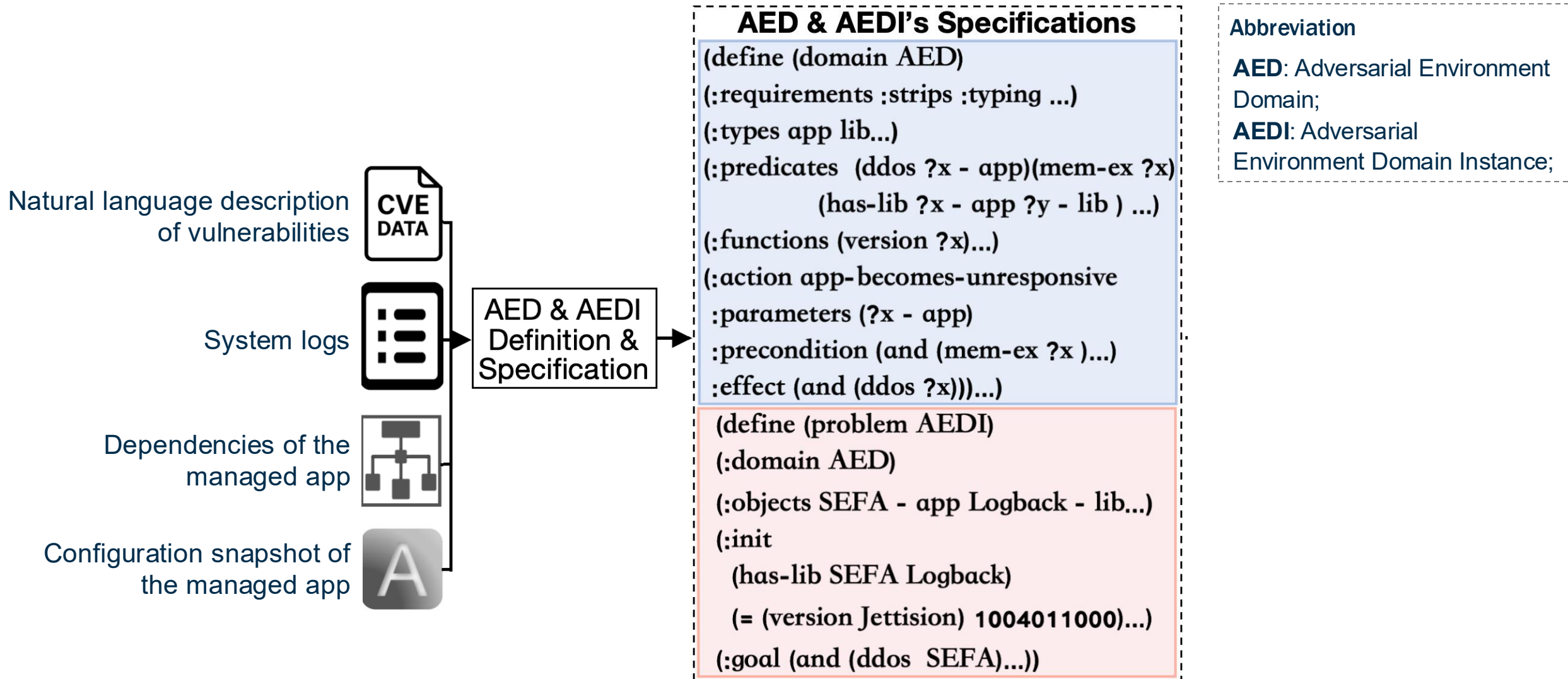


Figure. Workflow of specifying PDDL domain (AED) and problem files (AEDIs) to model the system configuration and environment

Contribution: Conceptual Framework of RAdaptSQ

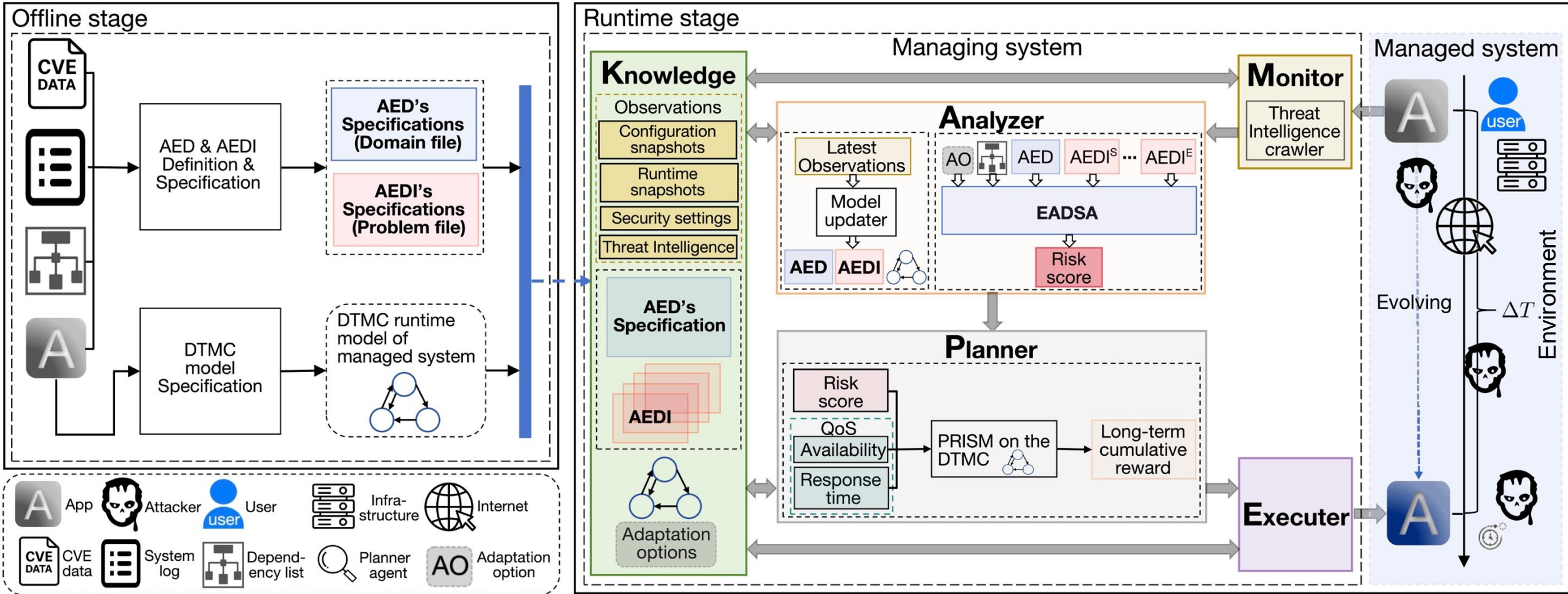


Figure. Conceptual framework of RAdaptSQ

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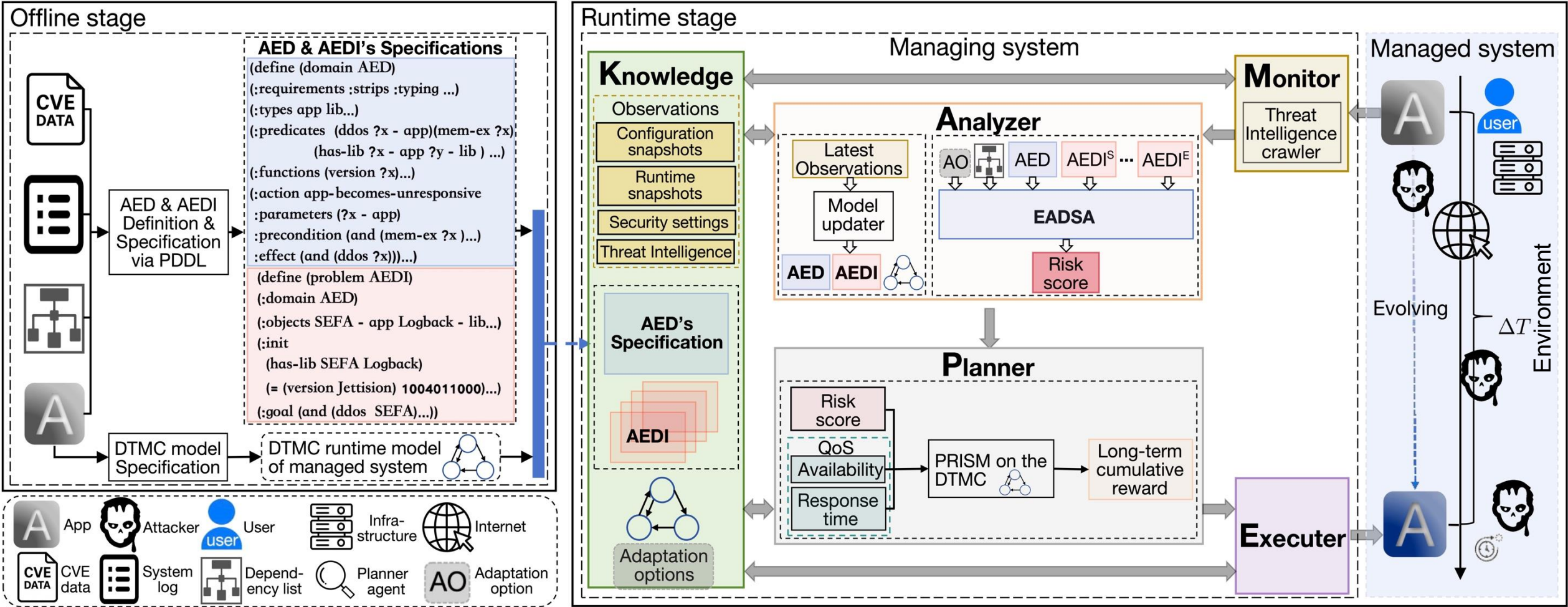


Figure. Conceptual framework of RAdaptSQ

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Evaluation Plan

Research Questions

- RQ1: Effectiveness without runtime change
- RQ2: Effectiveness under runtime change
(Simulate 3-5 types of runtime changes)
- RQ3: Scalability



We are currently conducting a systematic evaluation of our method.

Case study & Metric & Baseline

Case study:

- SEFA
- A classic microservice demo application (composed of 4-5 microservices) in the SAS community.

Metric:

- Runtime decision time: wall-clock time to
- Long-term cumulative reward: quantifies the expected long-term benefit of an adaptation.

Compared method:

- RAMSES (doesn't consider security)
- AQUA (offline security assessment)
- RAdaptSQ's ablation variants

Summary & Future Work

Summary

- Problem statement: Rapid attack surface fluctuation and security drift faced by microservice applications caused by their rapid changes
- Contribution: Propose the conceptual framework of RAdaptSQ, a real-time AI planning-driven and environment-aware self-adaptive system
- Objective: Automatically adapts the managed microservice application to changing attack surfaces, while continuously minimizing the security risk and ensuring acceptable QoS at runtime.

Future work

- RAdaptSQ's Monitor module periodically captures *CVE and limited behavioral statistics* from the Internet threat intelligence

- Large-scale, information-rich TI remains underutilized
- Develop an SAS-compliant mechanism for automated Threat Intelligence (TI) extraction and correlation analysis to better handle evolving attack surfaces



Thank you!

Questions?

Interested in more?
If you're interested,
please visit **sasis.kastel.kit.edu**



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