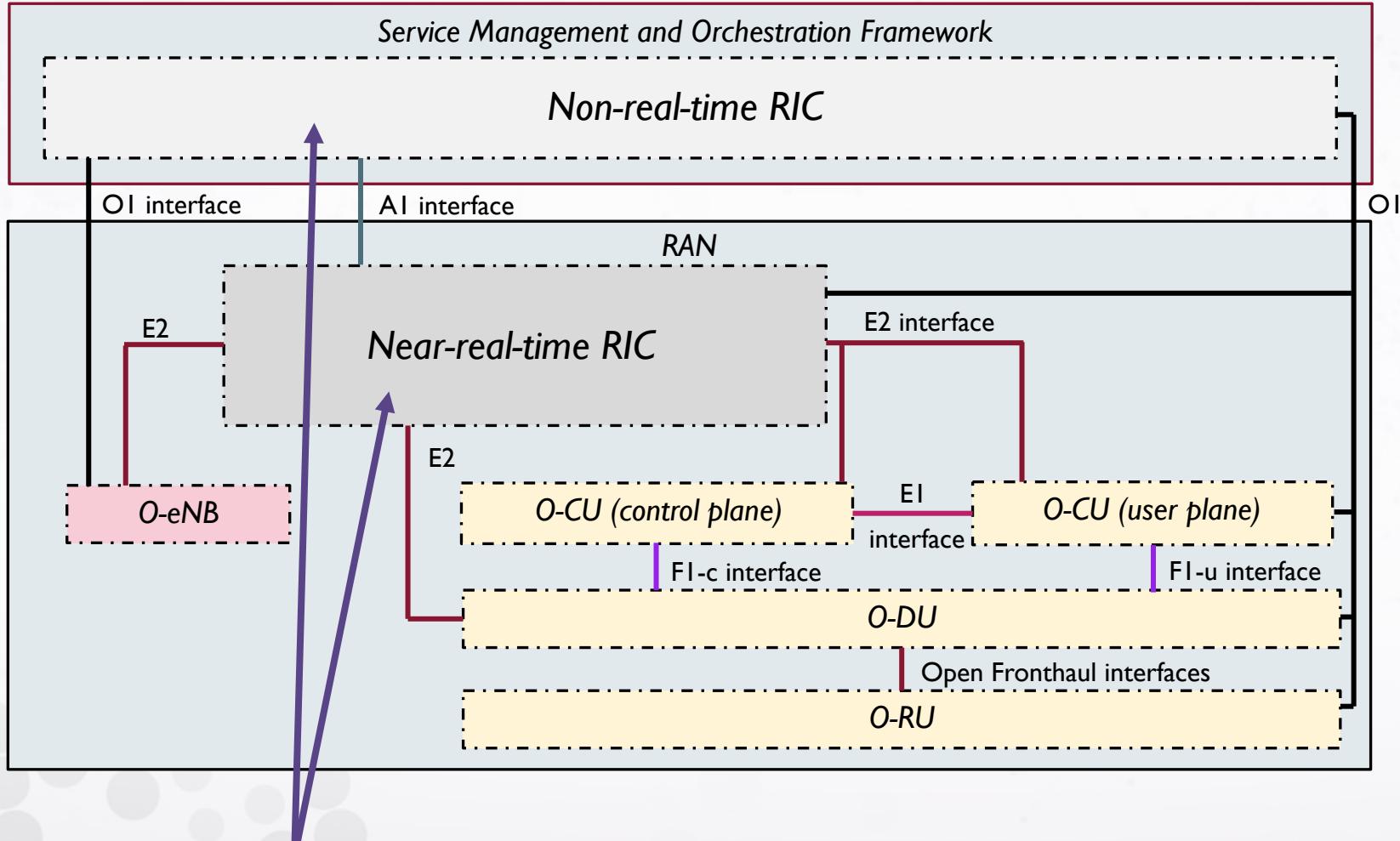


N Institute for the Wireless
Internet of Things
at Northeastern University

OpenRAN Gym
Enabling AI and ML in O-RAN

Michele Polese
Institute for the Wireless Internet of Things
Northeastern University
m.polese@northeastern.edu

Joint work with most of the people you see in the room



1. Open, standardized interfaces
2. Disaggregated RAN
3. Software

4. RAN Intelligent Controllers

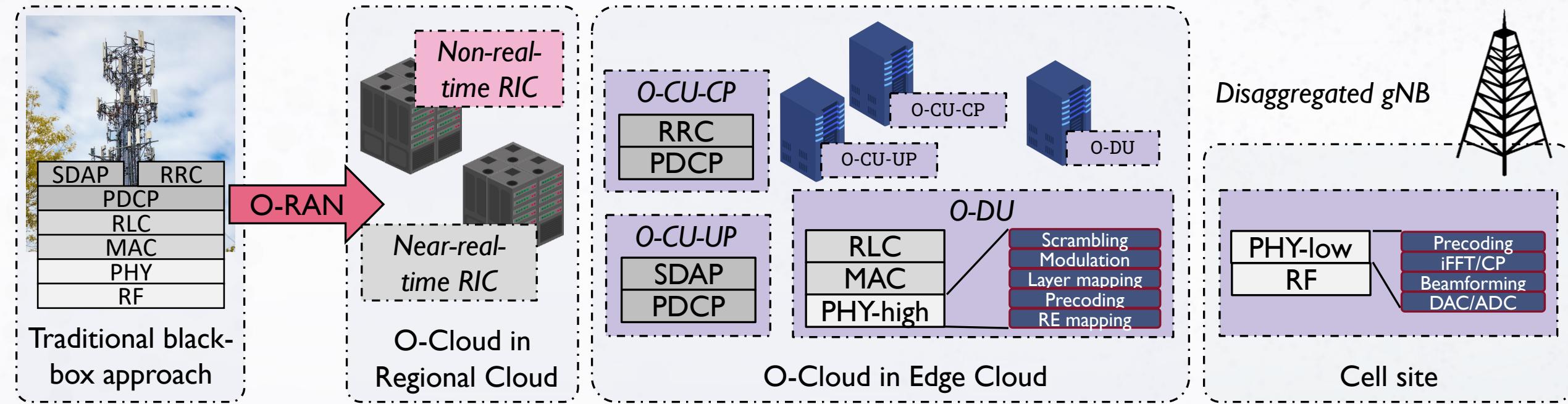
Intelligent Control Loops

Currently supported by O-RAN

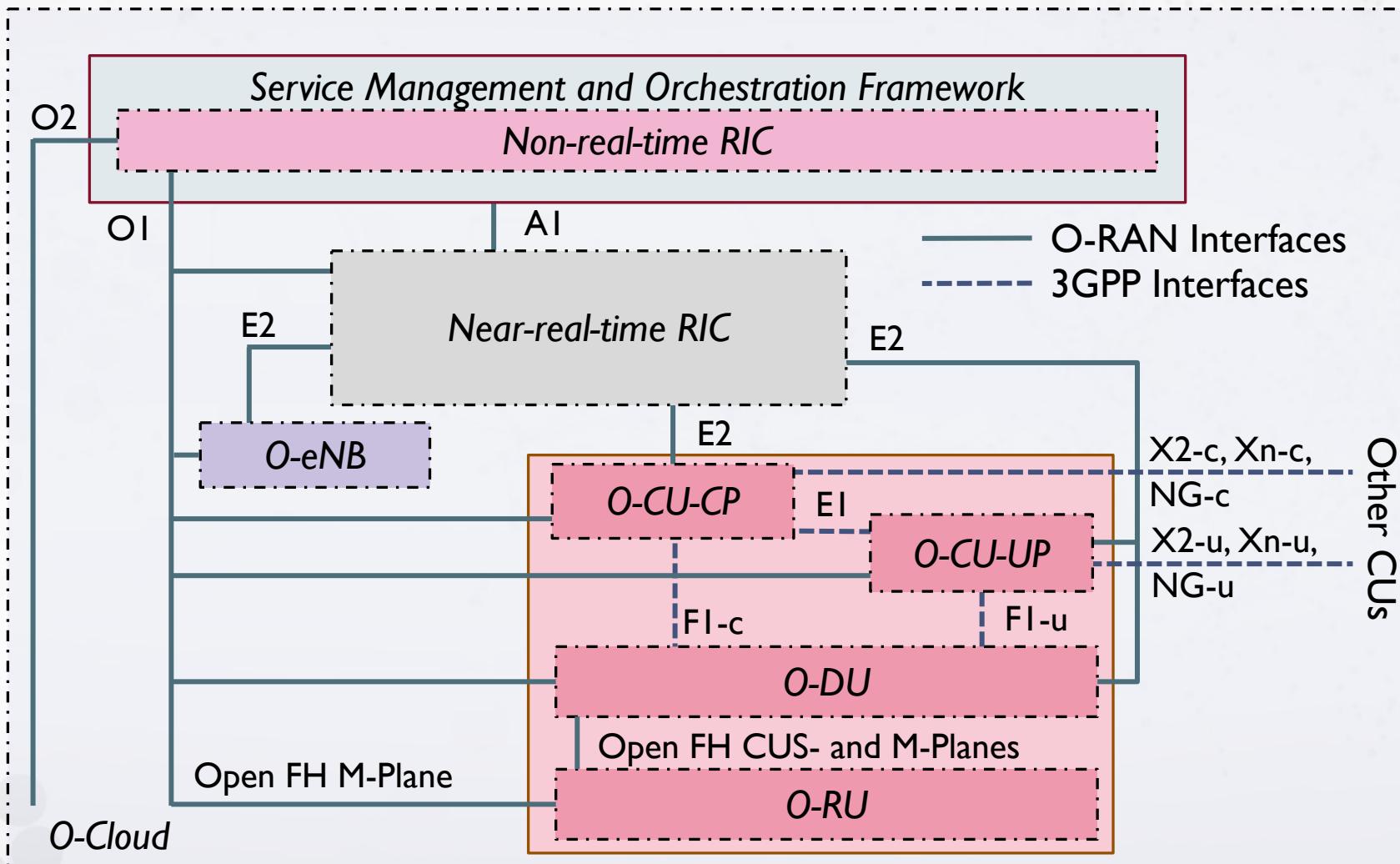
Control and learning objective	Scale	Input data	Timescale	Architecture
Policies, models, slicing	> 1000 devices	Infrastructure-level KPIs	Non real-time > 1 s	
User Session Management e.g., load balancing, handover	> 100 devices	CU-level KPIs e.g., number of sessions, PDCP traffic	Near real-time 10-1000 ms	
Medium Access Management e.g., scheduling policy, RAN slicing	> 100 devices	MAC-level KPIs e.g., PRB utilization, buffering	Near real-time 10-1000 ms	
Radio Management e.g., resource scheduling, beamforming	~10 devices	MAC/PHY-level KPIs e.g., PRB utilization, channel estimation	Real-time < 10 ms	
Device DL/UL Management e.g., modulation, interference, blockage detection	1 device	I/Q samples	Real-time < 1 ms	

For further study or not supported

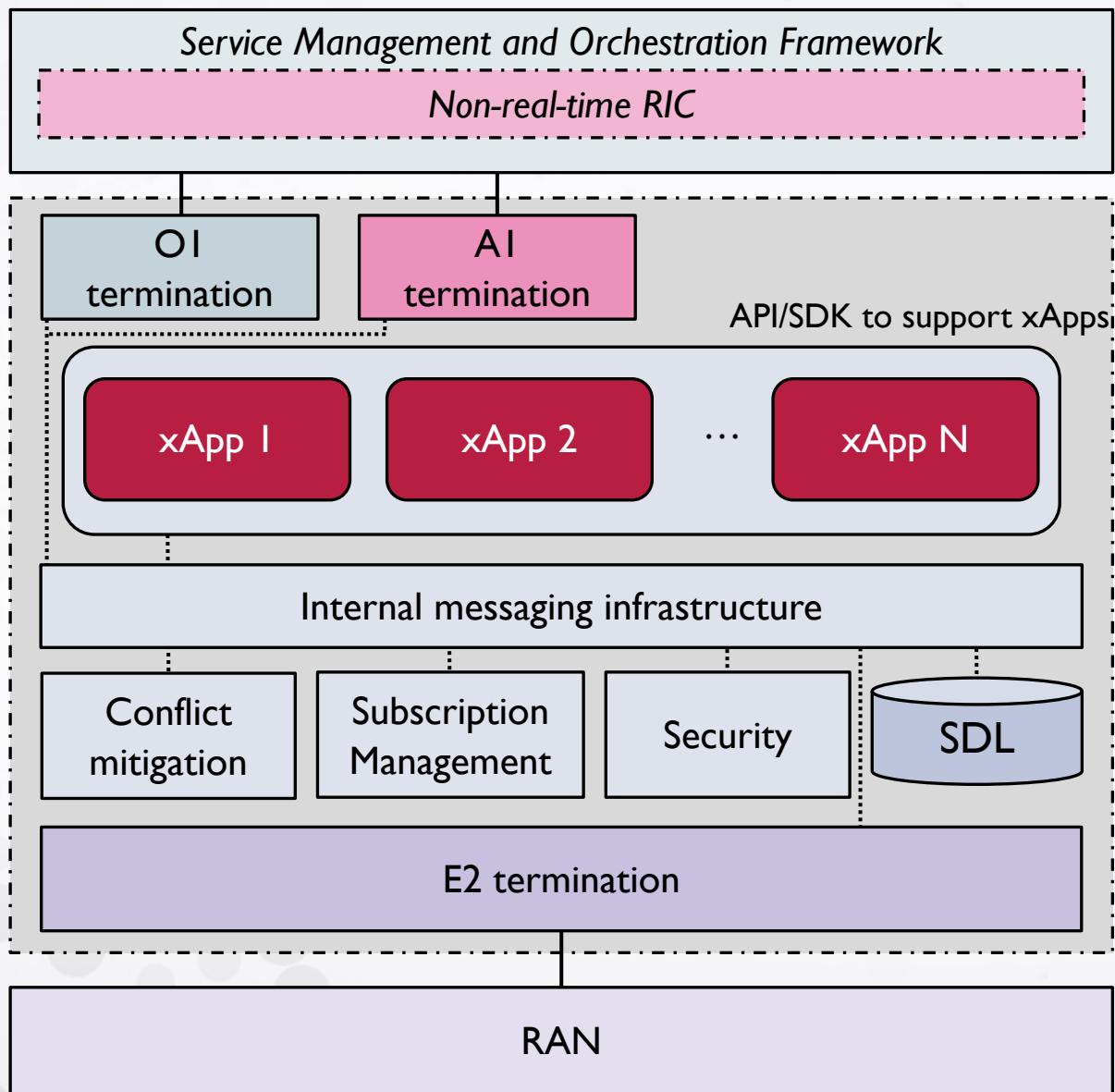
A split architecture



Logical architecture overview

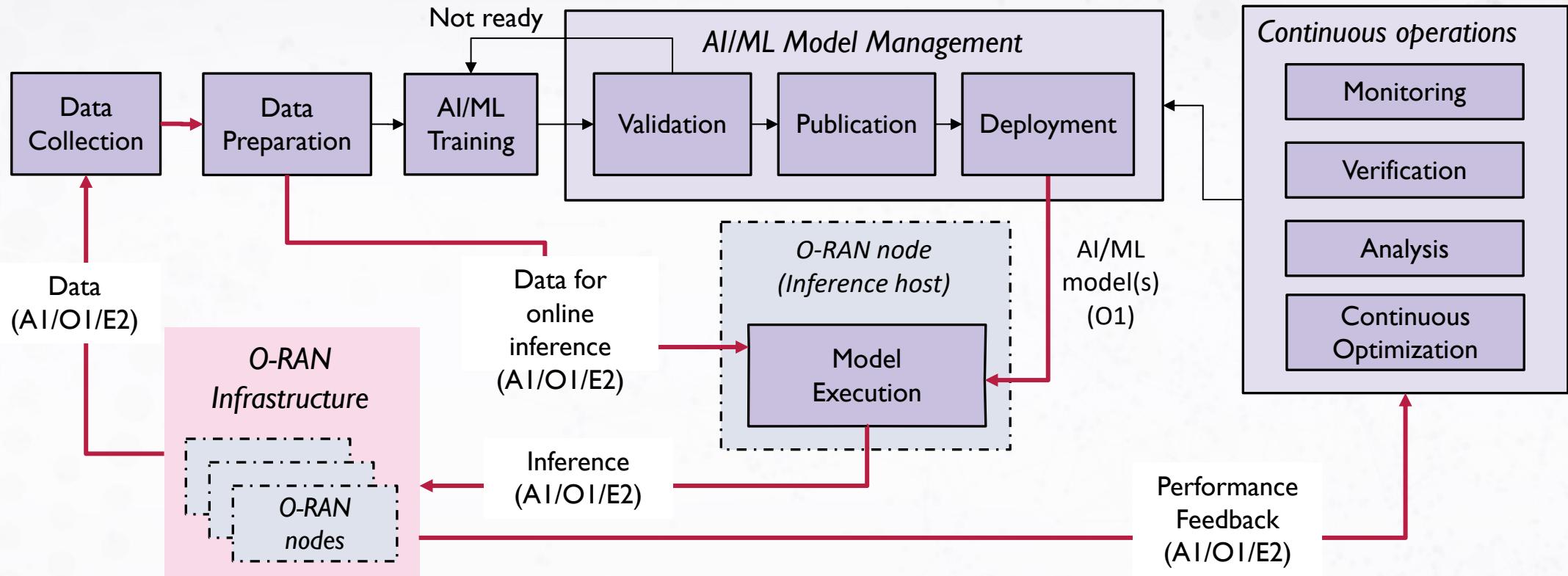


Near-real-time RIC



- Standardized blocks and functionality
- Different implementations

Lifecycle of AI/ML in O-RAN



- From **data collection** to **online fine-tuning and inference**

- Covers all aspects of **AIOps**:

- Monitor
- Engage
- Act

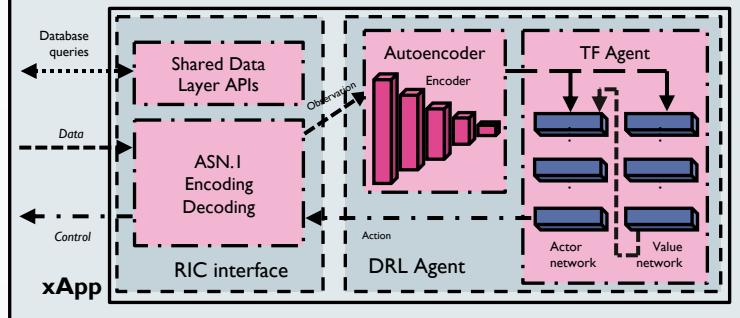
The OpenRAN Gym vision

Enable native O-RAN-driven experiments in large-scale experimental testbeds and networks

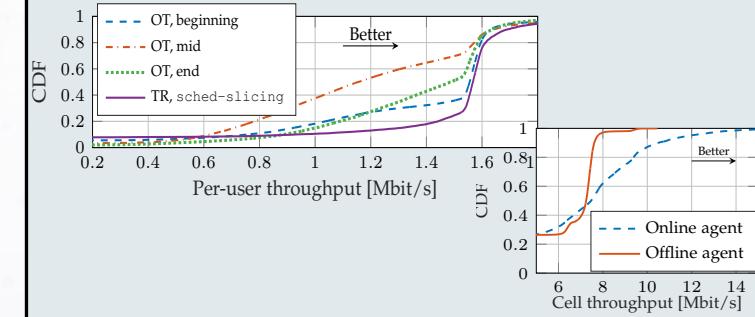
Collect data at scale on virtual RF scenarios



Design, train, and package AI/ML components as xApps



Test and refine on experimental wireless platforms



OpenRAN Gym

A toolbox for Intelligent O-RAN
www.openrangym.com



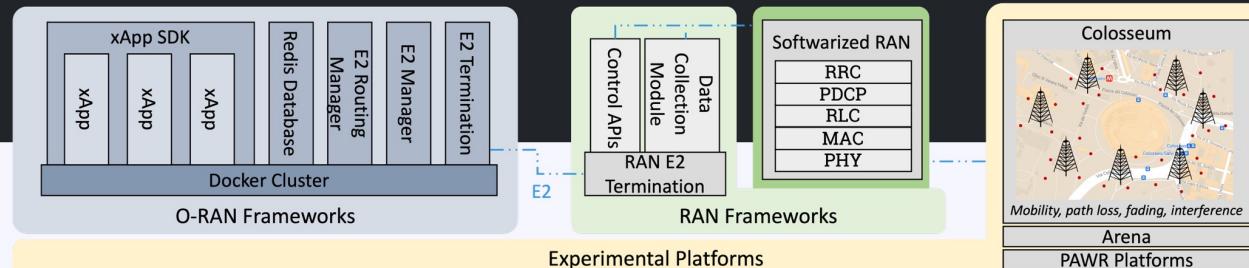
Open5G Publications

Contribute

OpenRAN Gym

An Open Toolbox for Data Collection and Experimentation with AI in O-RAN

OpenRAN Gym is the first publicly-available research platform for data-driven O-RAN experimentation at scale. Building on frameworks for data collection and RAN control, OpenRAN Gym enables end-to-end design and testing of data-driven xApps by offering an O-RAN-compliant near-real-time RIC and E2 termination.

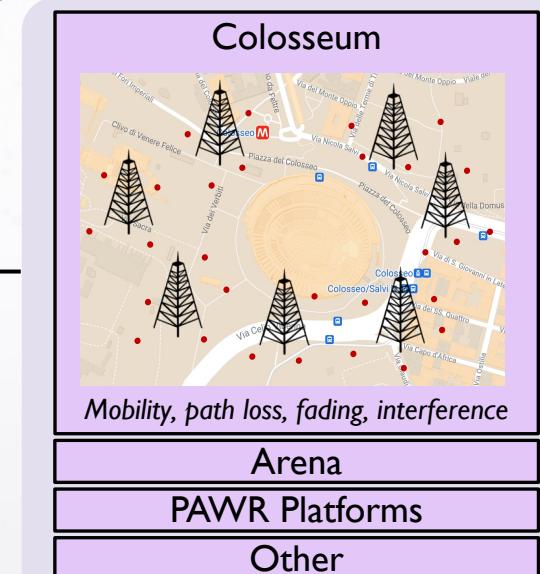
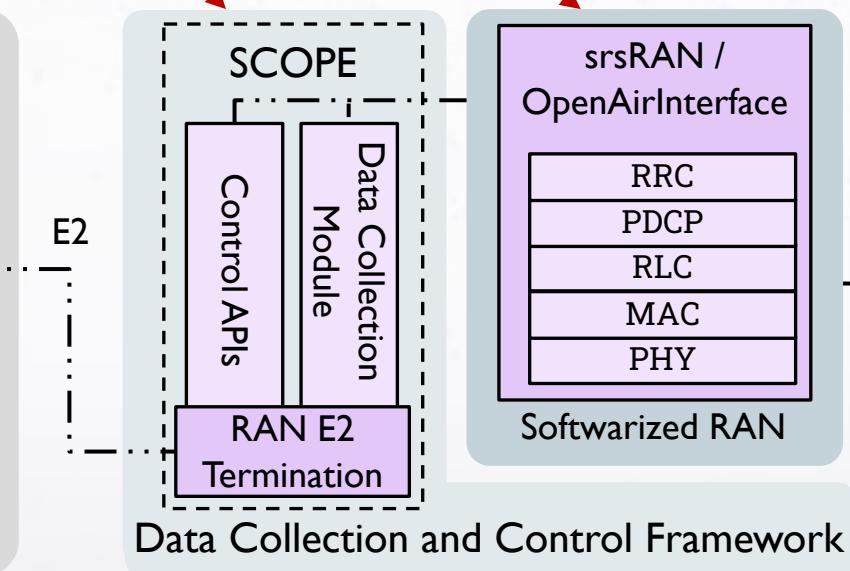
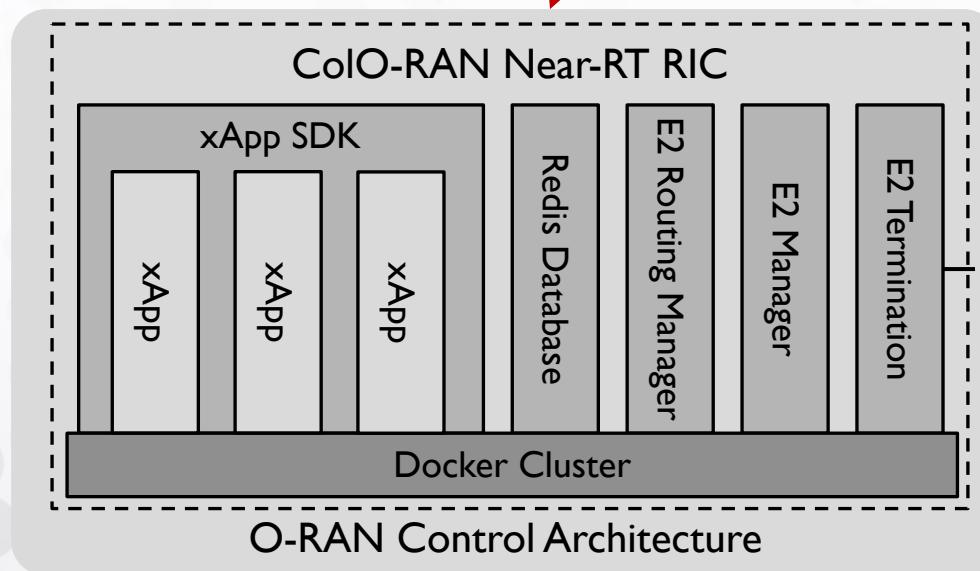


O-RAN Frameworks

RAN Frameworks

OpenRAN Gym – A Toolbox for Intelligent O-RAN

- O-RAN-compliant **near-real-time RIC** running on Colosseum (CoO-RAN)
- RAN framework for **data-collection and control** of the base stations (SCOPE)
- **Programmable** software-defined protocol stacks
- Publicly-accessible **experimental platforms** (e.g., Colosseum, Arena, PAWR platforms)



Moving OpenRAN Gym experiments

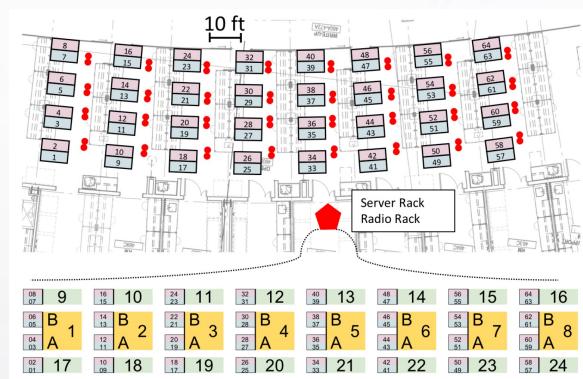
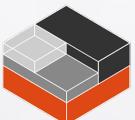
The same experiment (and software) can be seamlessly deployed in different testbeds

- Initial design and testing at-a-scale on Colosseum w/ different scenarios
- Validate on real-world indoor environment on Arena (Northeastern over-the-air SDR testbed)
- Experiment into the wild on PAWR city-scale platforms

Test at-a-scale
on emulated
scenarios



Validate in
real wireless
environment

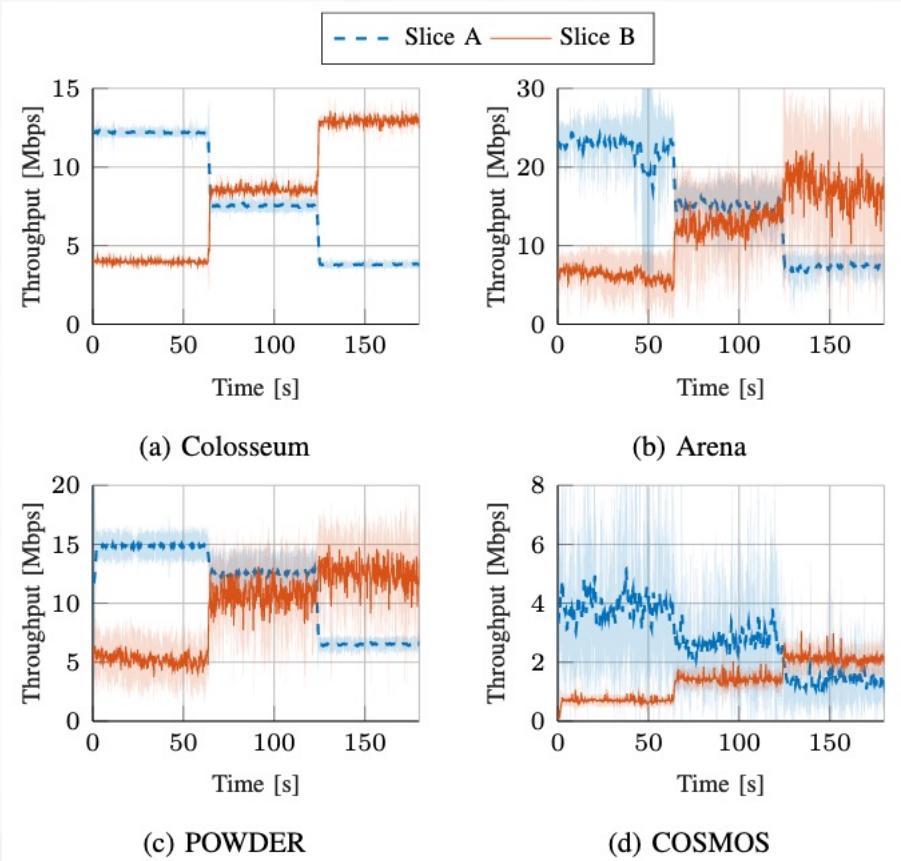


Test large-
scale
capabilities

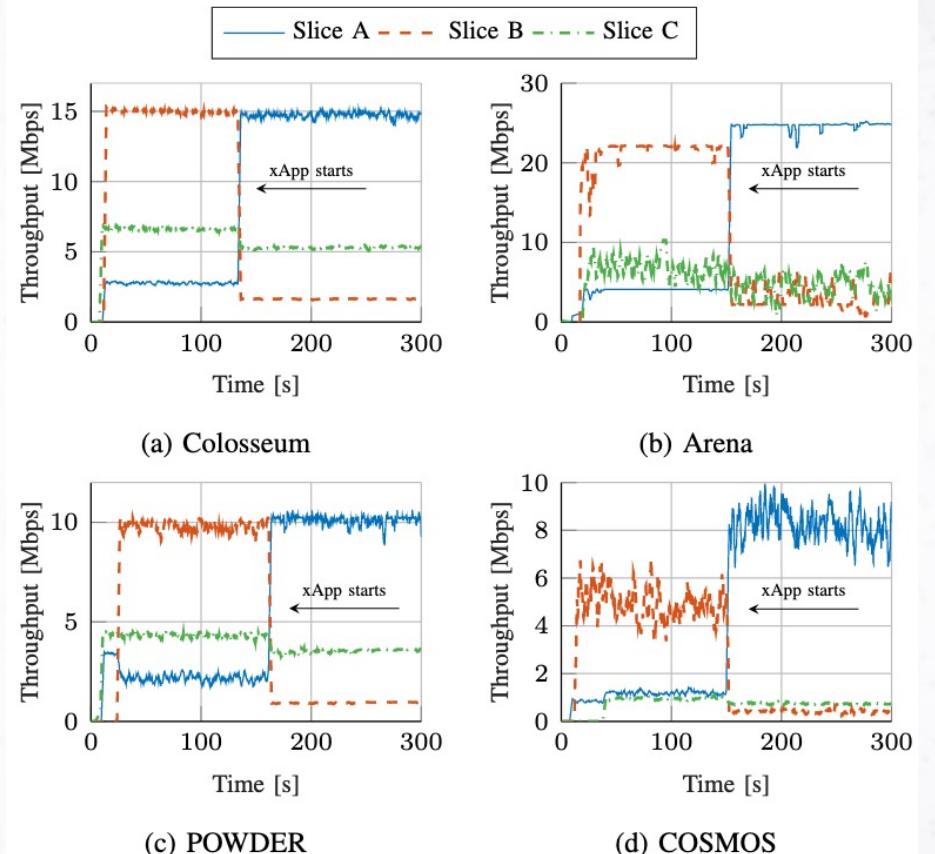


Example: Open RAN experiment across different testbeds

Periodic change of slicing resources



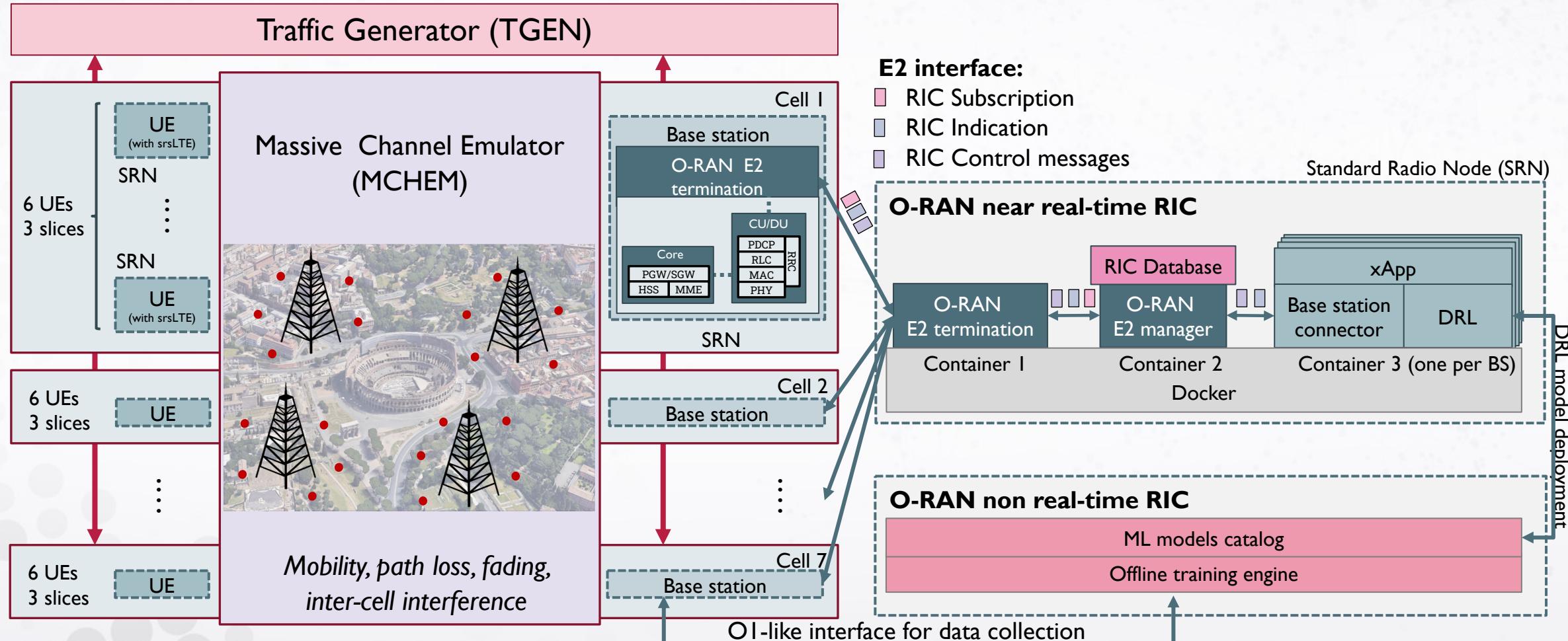
xApp closed-control loop



Results are consistent across **very different platforms** with **heterogeneous environments**

Example OpenRAN Gym deployment – 42 UEs and 7 gNBs

OpenRAN Gym on a large-scale Colosseum deployment – 7 base stations, 42 UEs, 3 slices



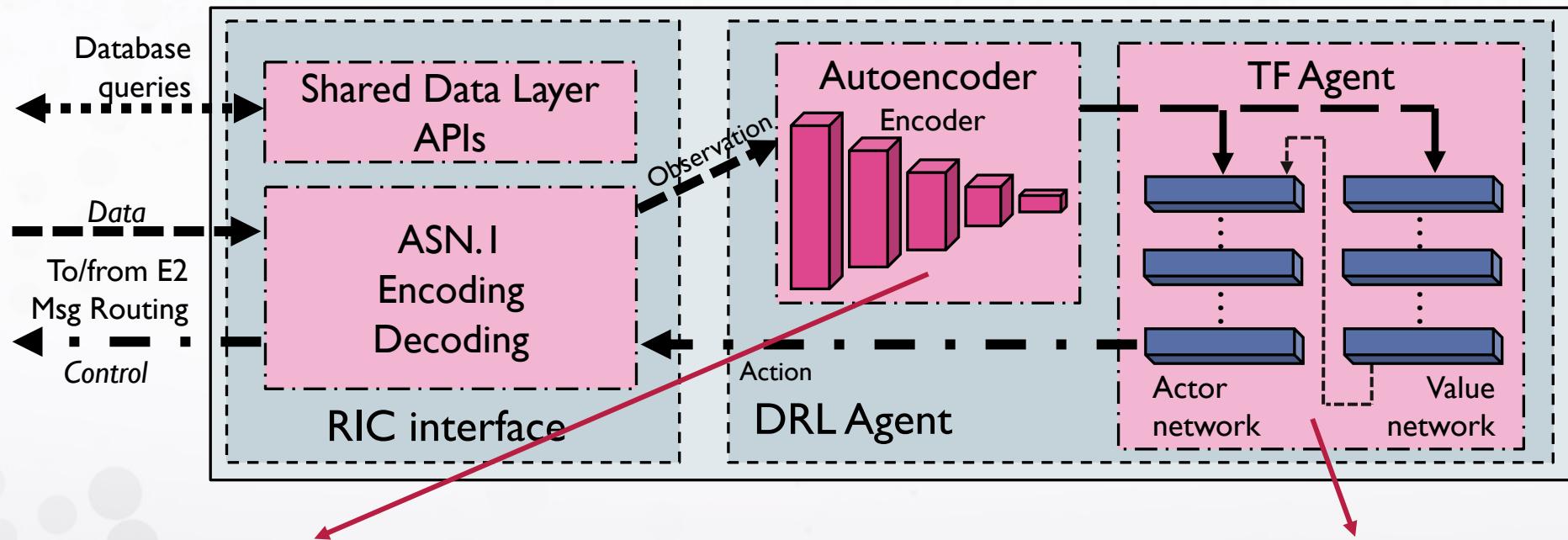
CoO-RAN – ML development and testing for O-RAN



Need algorithms that generalize to different scenarios and conditions



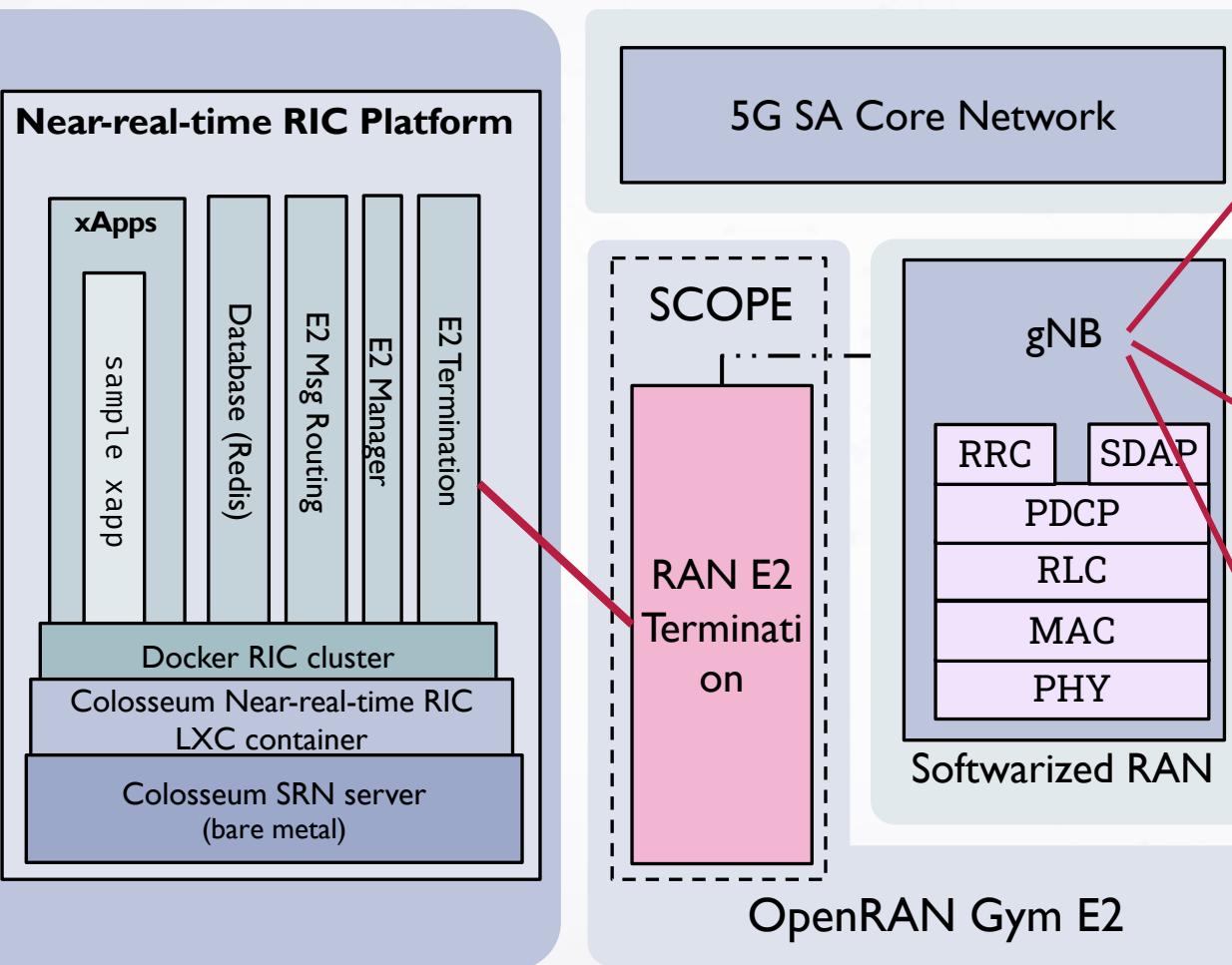
CoO-RAN xApp



Generate a compressed representation of the RAN

Exploit it to generate control actions in the network

E2 interfaces for OpenRAN Gym



The first release supported srsLTE

New: support for simulated gNBs in ns-3 (ns-O-RAN)

New: support for OAI gNBs

True interoperability!

```
polesemi - root@neu-test-team-1-leo-du-cellos-srn99: ~/radio_code/du-l2 -- ssh + ssh root@neu-test-team-1-099 - 163x27
<E2AP-PDU>
<successfulOutcome>
<procedureCode>1</procedureCode>
<criticality><reject/></criticality>
<value>
<E2setupResponse>
<protocolIEs>
<id>4</id>
<criticality><reject/></criticality>
<value>
<GlobalRIC-ID>
<pLMN-Identity>13 10 14</pLMN-Identity>
<rfc-ID>
10101010110011001110
</rfc-ID>
<GlobalRIC-ID>
</value>
</E2setupResponse>
</protocolIEs>
</E2setupResponse>
</successfulOutcome>
</E2AP-PDU>

E2AP : Store E2 setup response Params
E2AP : E2 Setup Response received!
[INFO ] [SCTP] Connecting to server at 172.30.199.201:36422 ...
[UNCON] Start E2 Agent (E2 Simulator)
[UNCON] Current Log level is 2
[INFO ] [SCTP] Binding client socket with source port 38472
[INFO ] [SCTP] Connecting to server at 172.30.199.201:36422 ...
[UNCON] Start E2 Agent (E2 Simulator)
[UNCON] Current Log level is 2
[INFO ] [SCTP] Binding client socket with source port 38473
[INFO ] [SCTP] Connecting to server at 172.30.199.201:36422 ...
[UNCON] Start E2 Agent (E2 Simulator)
[UNCON] Current Log level is 2
[INFO ] [SCTP] Binding client socket with source port 38474
[INFO ] [SCTP] Connecting to server at 172.30.199.201:36422 ...
[UNCON] Start E2 Agent (E2 Simulator)
[UNCON] Current Log level is 2
[INFO ] [SCTP] Binding client socket with source port 38475
[INFO ] [SCTP] Connecting to server at 172.30.199.201:36422 ...
[INFO ] [SCTP] Connection established
[INFO ] [INFO] About to register a function[INFO ]
About to register a function
About to register a function[INFO ] About to register a function
[INFO ] About to register a function
[INFO ] About to register a function

[INFO ] [SCTP] Sent E2-SETUP-REQUEST
[INFO ] [INFO ] [INFO ] [SCTP] Sent E2-SETUP-REQUEST
[INFO ] [SCTP] Sent E2-SETUP-REQUEST
[SCTP] Sent E2-SETUP-REQUEST
[INFO ] [SCTP] Received SETUP-RESPONSE-SUCCESS
[INFO ] [E2AP] Received SETUP-RESPONSE-SUCCESS
[]

root@neu-test-team-1-eugenio-ran-dev-srn102:~/ocp-e2sim# ./run_e2sim.sh 172.30.199.201
Starting e2term - oai support version

Encoding RAN Function Description
Registering RAN Function Description callbacks
Init done, running loop...
E2Sim loop init
[SCTP] Binding client socket to source port 36422
[SCTP] Connecting to server at 172.30.199.201:36422 ...
[SCTP] Connection established
Generating e2api1 setup request
Env variable GNB_ID not set. Using default values to build gNB ID
[SCTP] Sent E2-SETUP-REQUEST
[SCTP] Waiting for SCTP data
[SCTP] Received new data of size 33
decoding...
[E2AP] Unpacked E2AP-PDU: index = 2, procedureCode = 1
[E2AP] Received SETUP-RESPONSE-SUCCESS
[]

[1] 0:bash#
```

E2 for srsLTE

E2 for ns-3
(5 gNBs)

E2 for OAI

Same OpenRAN Gym RIC

```
// "e2Manager",GNB"
[127.0.0.1:6379> KEYS *
1) "{e2Manager},GNB:313131:00110011000000000000000000000000"
2) "{e2Manager},RAN:gnb_131_133_31000000"
3) "{e2Manager},E2TAddresses"
4) "{e2Manager},GNB:313131:00110001000000000000000000000000"
5) "{e2Manager},GNB:373437:1011010111000110011101111000"
6) "{e2Manager},RAN:gnb_131_133_32000000"
7) "{e2Manager},RAN:gnb_131_133_33000000"
8) "{e2Manager},GNB:313131:00110101000000000000000000000000"
9) "{e2Manager},RAN:gnb_311_048_01090901"
10) "{e2Manager},RAN:gnb_734_733_b5c67780"
11) "{e2Manager},E2TInstance:10.0.2.10:38000"
12) "{e2Manager},GNB:13F184:00000010000100100001001000000001"
13) "{e2Manager},RAN:gnb_131_133_35000000"
14) "{e2Manager},RAN:gnb_131_133_34000000"
15) "{e2Manager},GNB:313131:00110100000000000000000000000000"
16) "{e2Manager},GNB:313131:00110010000000000000000000000000"
17) "{e2Manager},GNB"
127.0.0.1:6379>
```

Based on OSC RIC

OpenRAN Gym – multiple RAN support



Ease of use – provide basic building blocks and end-to-end control connectivity



Support different RANs with the same RIC infrastructure



Adapt a RIC widely adopted by industrial/academic communities (O-RAN Software Community RIC)

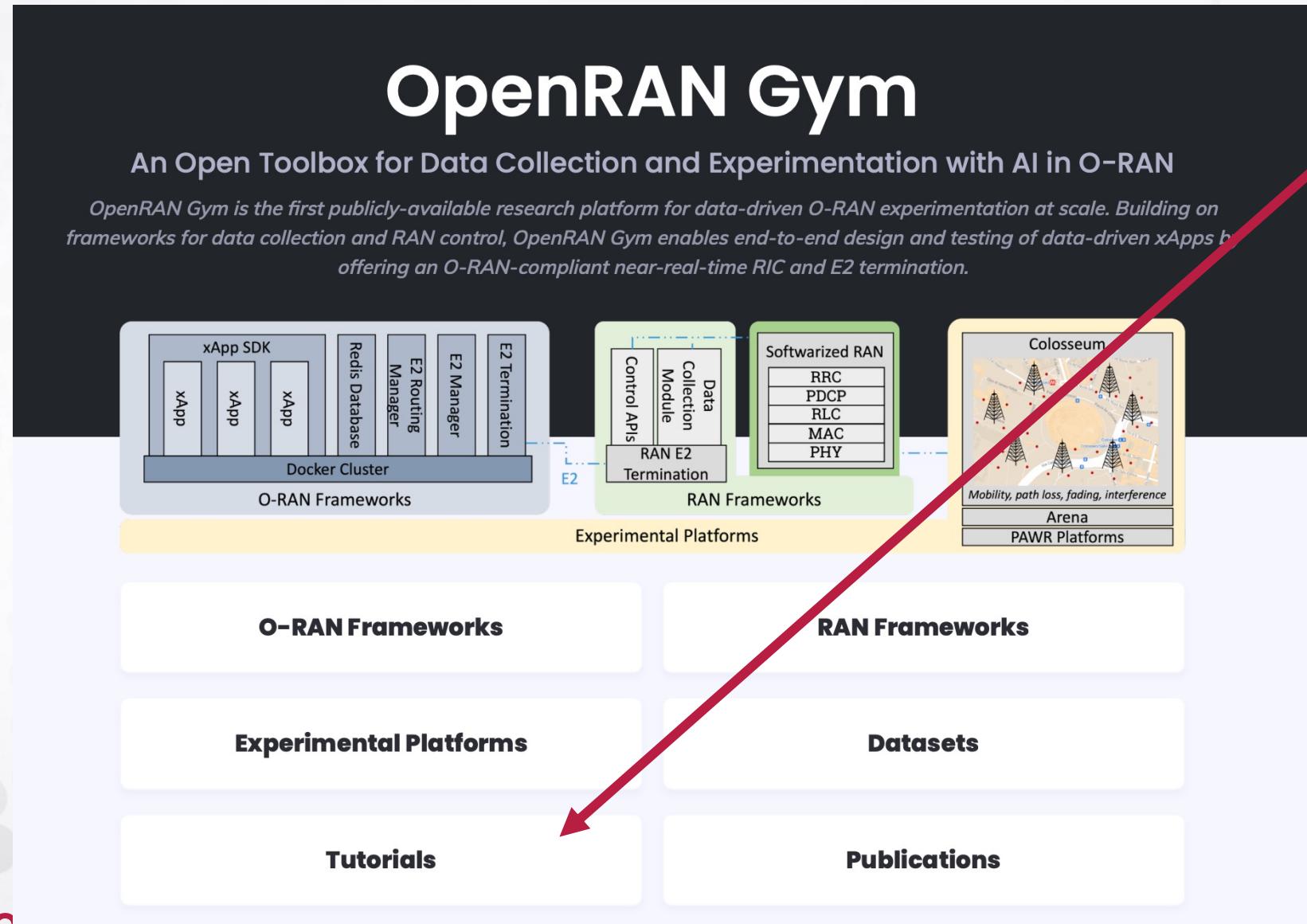


Easily extend for fast prototyping and testing



Pre-packaged for Colosseum (and PAWR platforms)

How to?



**New tutorial
section on
openrangym.com**

- step-by-step instructions on how to clone, build, execute the different OpenRAN Gym components

or wait for the hands-on after lunch ;)

Resources on NextG open source software

Understanding O-RAN: Architecture, Interfaces, Algorithms, Security, and Research Challenges

Michele Polese, Leonardo Bonati, Salvatore D'Oro, Stefano Basagni, Tommaso Melodia

Survey paper

Open, Programmable, and Virtualized 5G Networks: State-of-the-Art and the Road Ahead[☆]

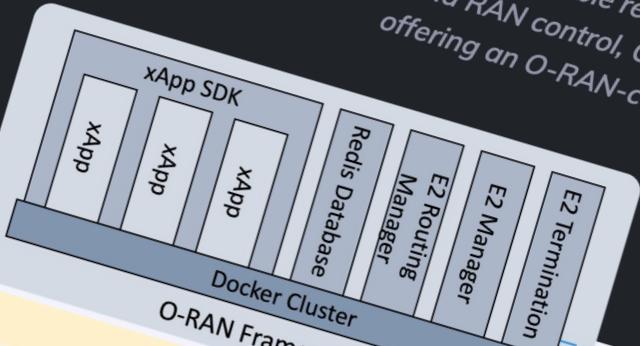


Bonati*, Michele Polese, Salvatore D'Oro, Stefano Basagni, Tommaso Melodia

Cambridge, MA 02139, Northeastern University, Boston, MA 02115, USA

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Open, Programmable,
and Virtualized 5G
Networks

Consider contributing to this open list
on Github

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OpenRAN Gym

OpenRAN Gym

Enabling AI and ML in O-RAN

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