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# Network/System Co-simulation Platform for Design Space Exploration of IoT Applications

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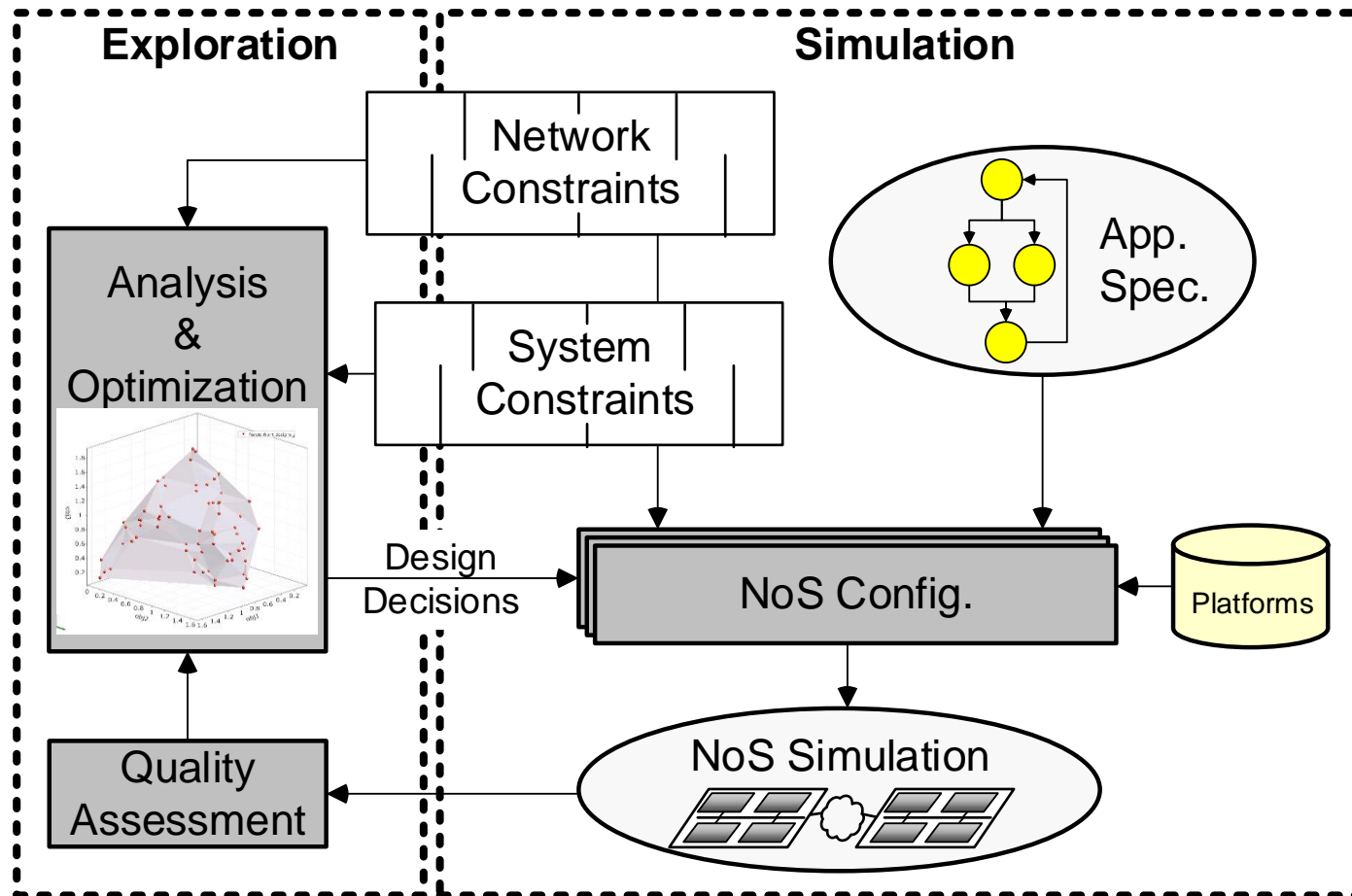
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University of Athens**

# Background

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- **Growing complexity and scale of future IoT applications**
  - Distributed data collection, aggregation and processing
  - Tightly coupled communication and computation workload
  - Non-obvious interactions and tradeoffs
- **Networks-of-Systems (NoS) environment**
  - System & network architecture configurations
  - Application mapping and offloading
  - Complex application/network/system interactions
- **Network and system co-design**
  - Traditionally designed in isolation
  - Joint consideration of design parameters from applications to network configurations and system platform definitions

# Network/System Co-Design



- **Flexible NoS simulation platform to instantiate various network/system configurations for exploration**

# Related Work

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- **IoT design space exploration**

- Application-specific with over-simplified models
  - Smart camera networks [Devarajan'06, Quaritsch'07]
  - Healthcare systems [Doukas'12, Catarinucci'15]

➤ Limited design space exploration

- **Network and system simulation**

- Existing network simulators
  - Traditional network simulators (ns-3, OMNeT++) model system devices without detailed system architectures
  - State-based system models and over-simplified network models in WSN-oriented simulators [Sommer'09, Bai'11, Du'11, Damm'10]

- Existing system simulators

- Host-compiled TLM simulation [Bringmann'15]
- Simple network extension [Fummi'08, Banerjee'09]

➤ Comprehensive NoS simulation platform are lacking

# Outline

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## ✓ Introduction

- ✓ Motivation, background
- ✓ Related work

## • NoS simulation platform overview

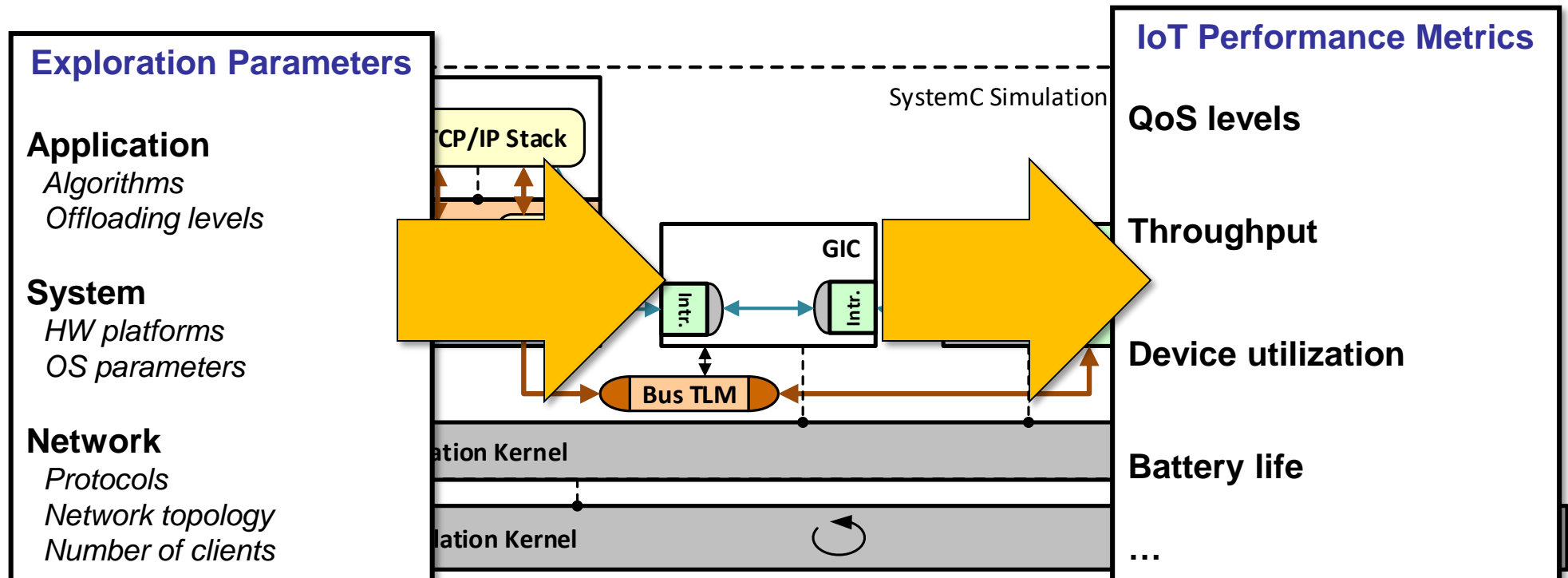
- System simulation model
- Network simulation backplane

## • Experimental setup

- IoT application case studies
- Exploration results
- Simulation speed and accuracy

# NoS Simulation Platform Overview

- **System simulation model**
  - SystemC-based host-compiled device model [Razaghi'14]
  - Capture system-wide interactions between application, OS and underlying hardware components
- **Network simulation backplane**
  - OMNeT++/INET network simulation framework

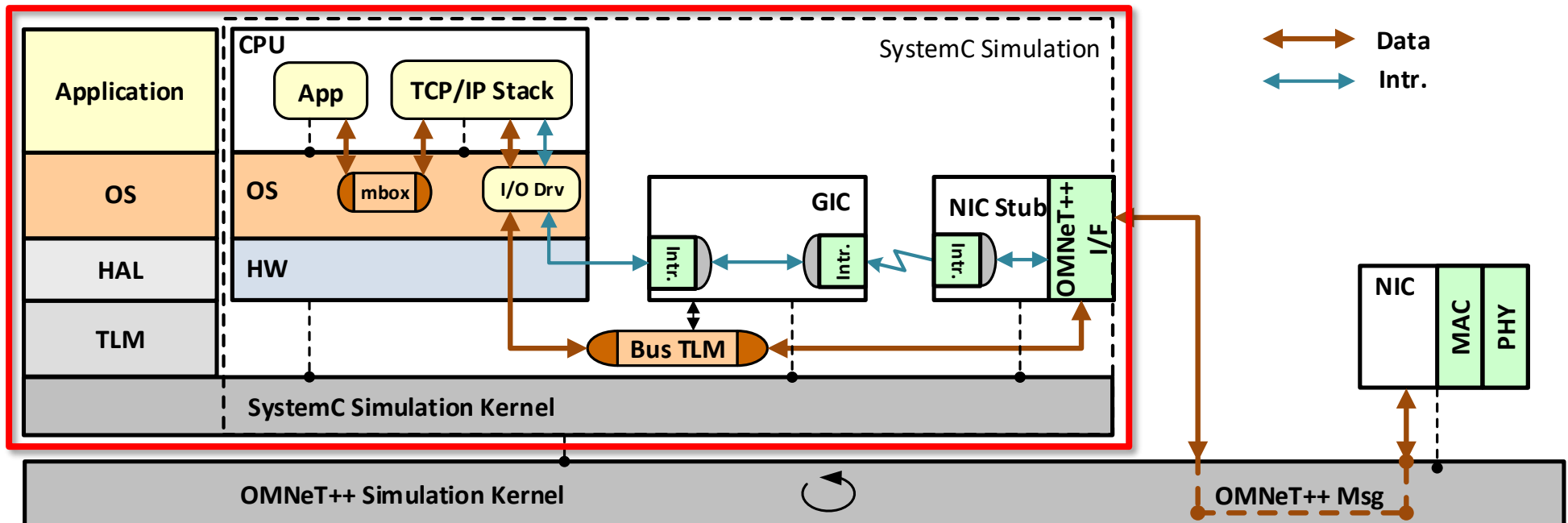


# System Simulation Model

- **Host-compiled (HC) system simulator**

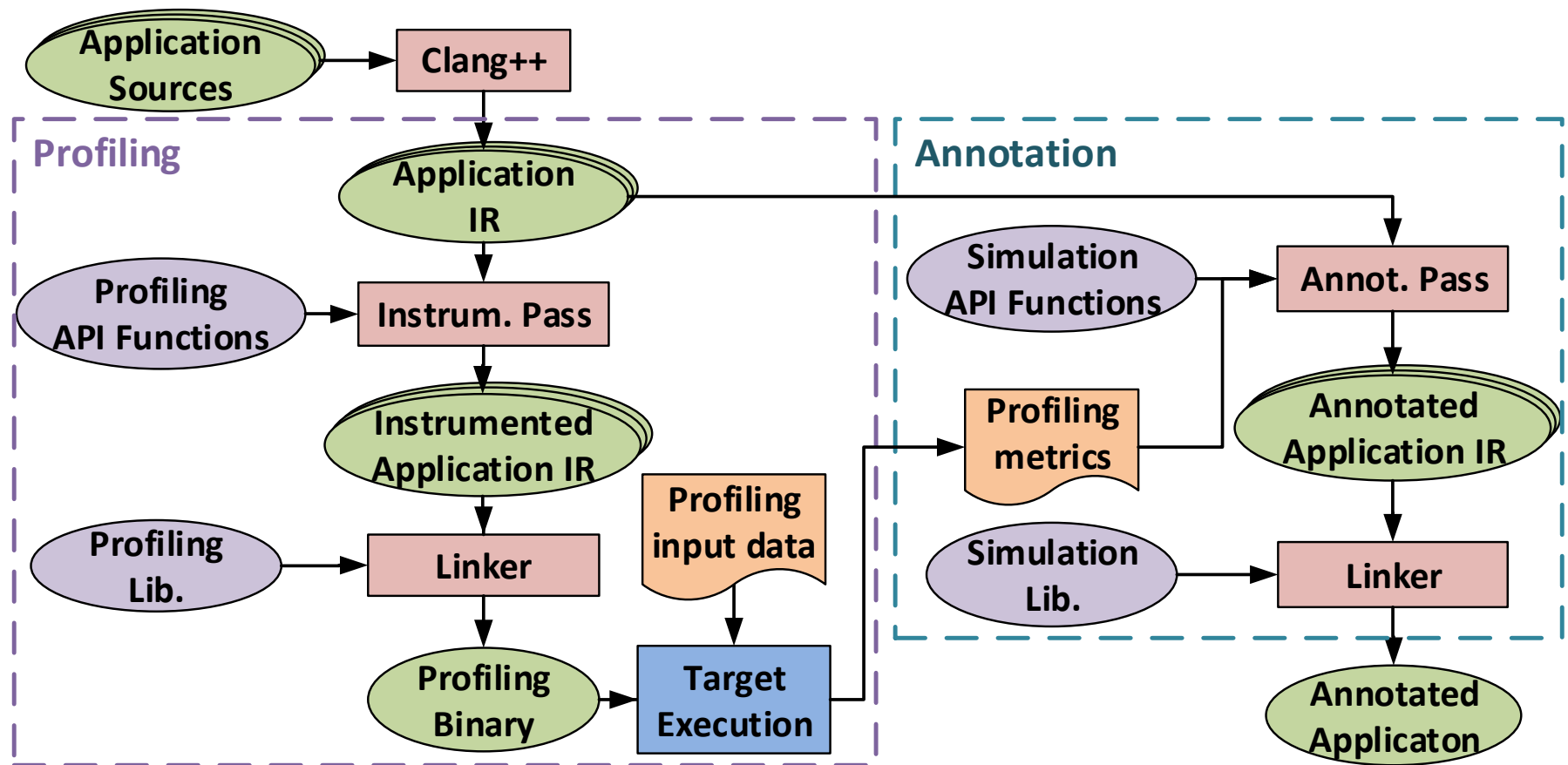
- Source-level back-annotated application model
- Network stack model [lwIP]
- Abstract multi-core OS and processor model [Razaghi'14]
- Network interface & hardware peripheral models
- Transaction-level modeling (TLM) base [SystemC]

**Our work**



# Application Task Model

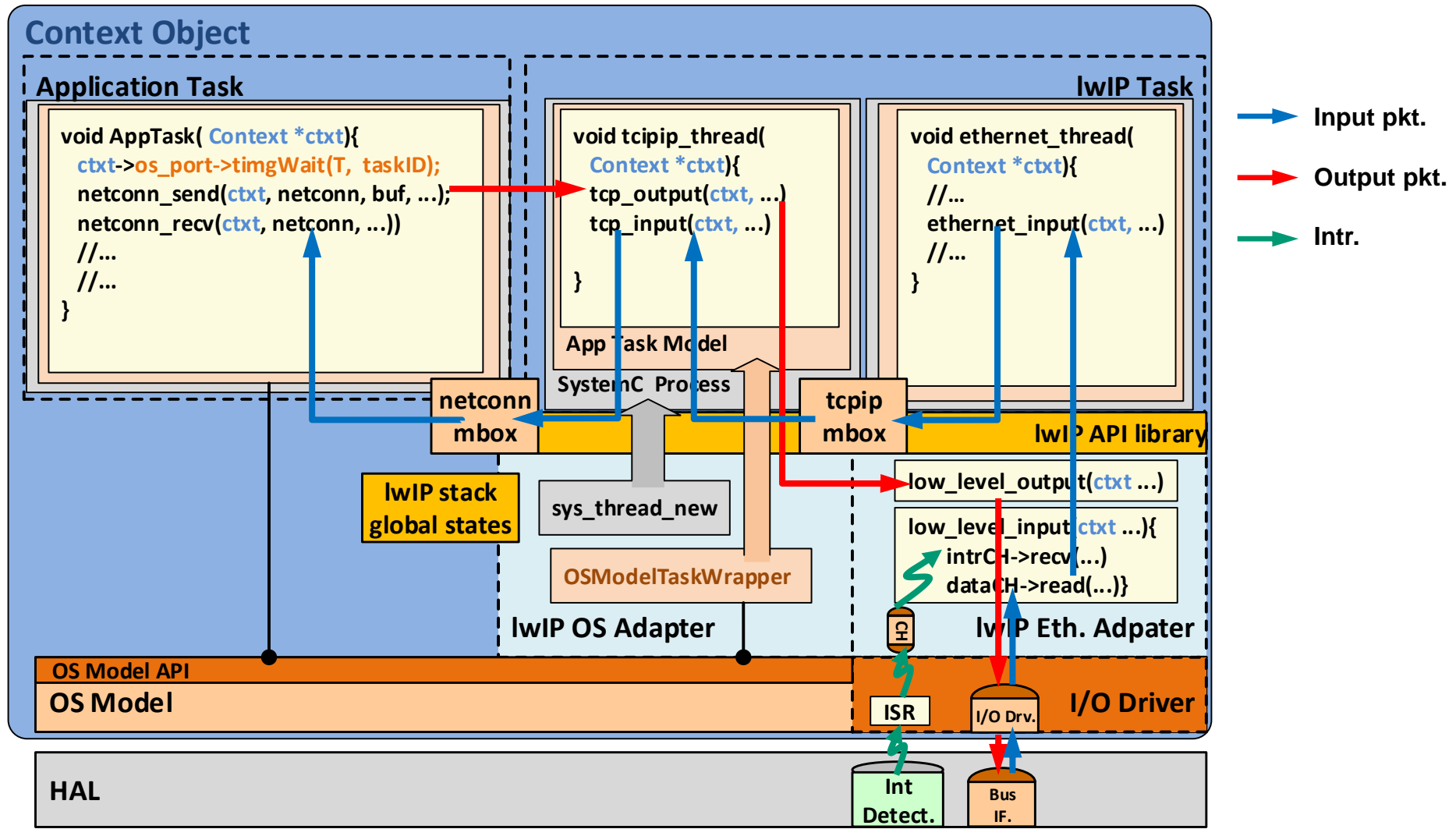
- **Function-level performance back-annotation**
  - Function-level profiling/annotation pass [LLVM]
  - Back-annotation with average per-function execution time





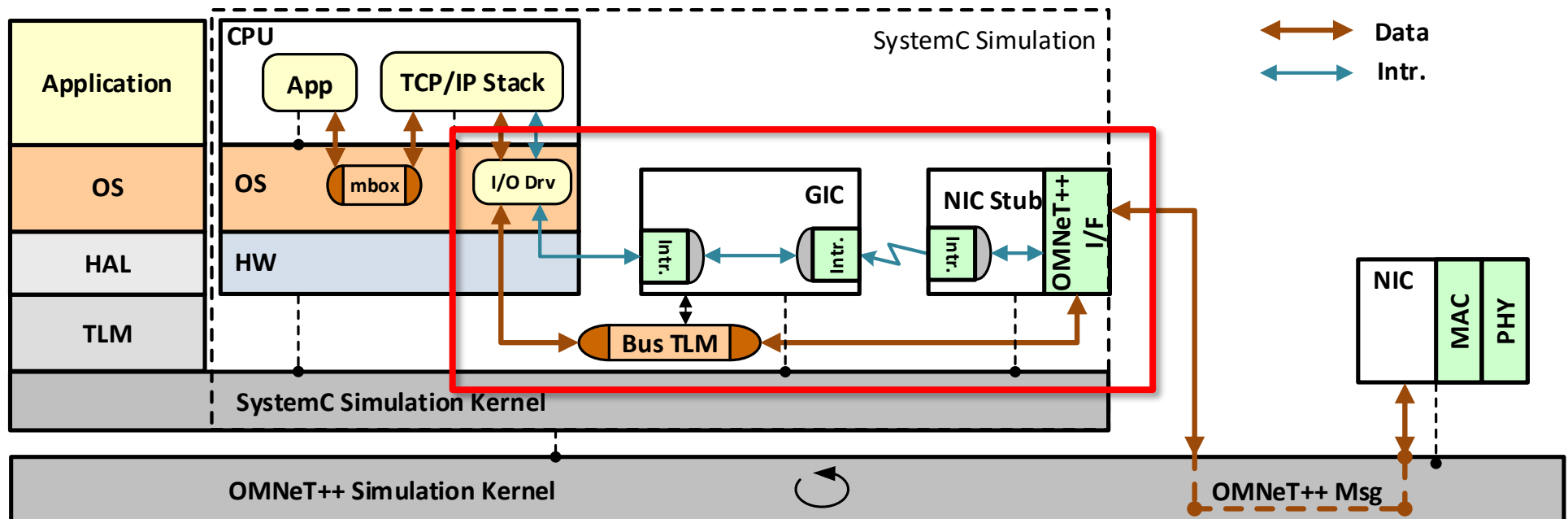
# Network Stack Model

- Open source lightweight TCP/IP stack [lwIP]



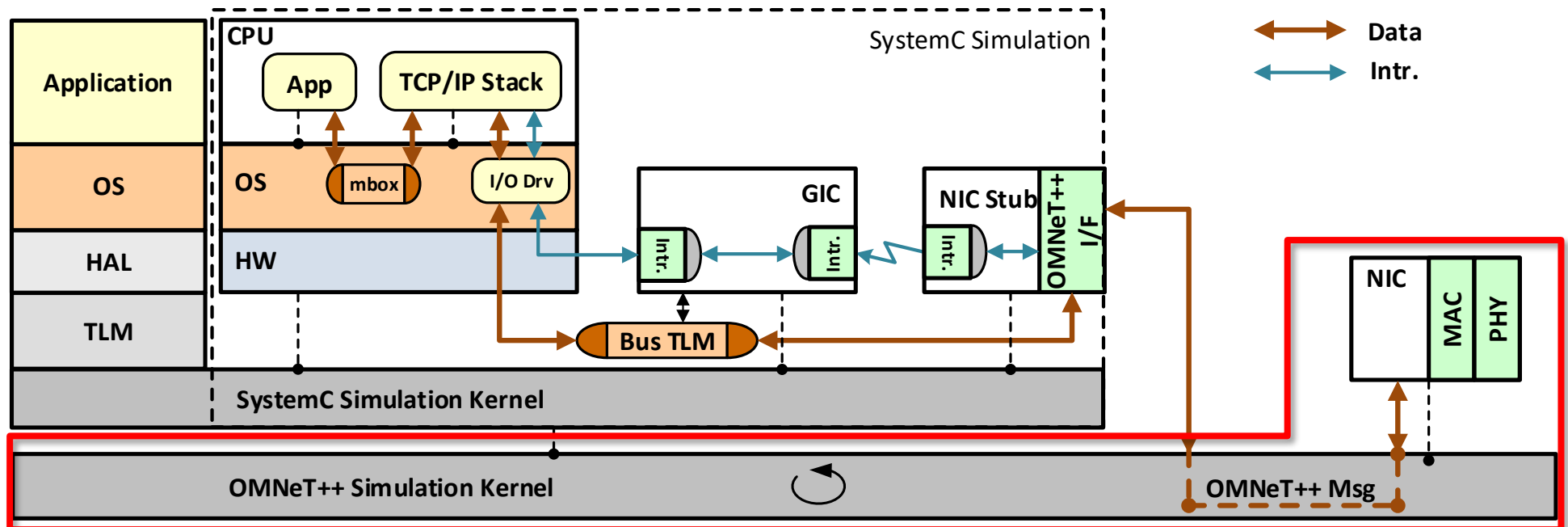
# Network Interface Model

- **SystemC network interface card (NIC) stub model**
  - Interfacing with detailed NIC model in OMNET++
- **Generic interruption controller (GIC) model**
  - Distribute interruption signals from NIC upon packet arrival
- **NIC driver**
  - Interrupt service routine (ISR) triggered by GIC
  - Notify lwIP to read network packet data from NIC through bus TLM



# Network Simulation Backplane

- **Detailed NIC model in OMNeT++**
  - Media access (MAC) and physical (PHY) layer simulation
  - Interfacing with NIC stub through OMNeT++ message
- **SystemC/OMNeT++ integration**
  - Scheduled and synchronized globally by OMNeT++
  - Multiple device instances in given network topology



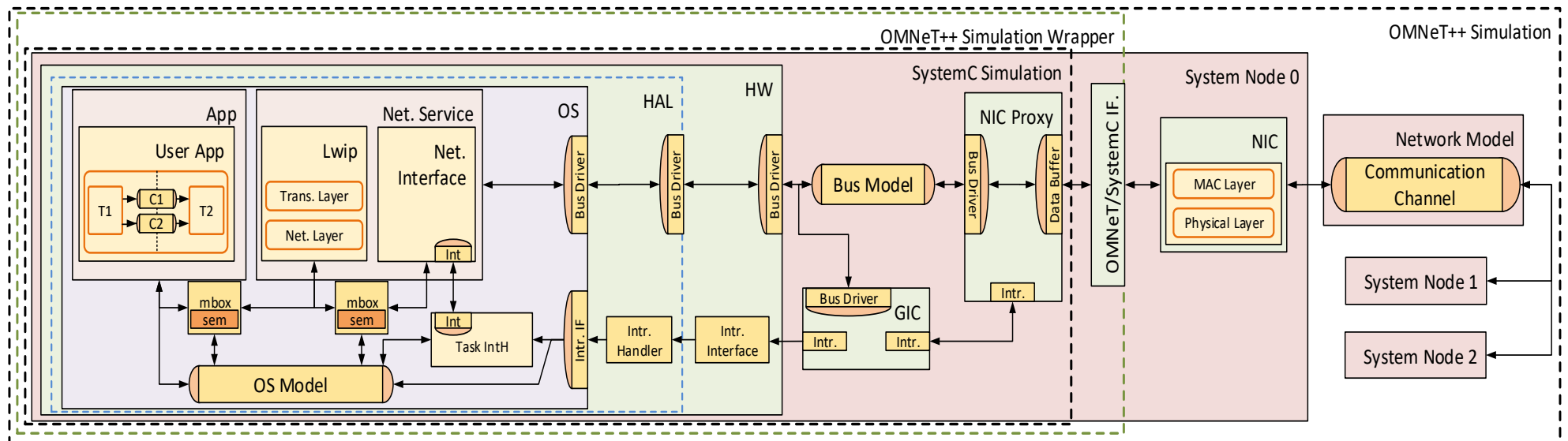
# Experimental Setup

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- **IoT application case studies**
  - Vision graph discovery
  - ECG diagnosis
- **Target platform**
  - Raspberry Pi 3 with 1.2 GHz ARM Cortex A-53
  - Raspberry Pi 0 with 1.0 GHz ARM11
- **WLAN client-server topology**
- **Design space exploration parameters**
  - Application task offloading levels
  - System configurations
    - Single core client (C:1 ×)
    - Single/dual core server (S:1 ×, S:2 ×)
    - Device type: Pi0, Pi3, Pi4 (Pi3 with twice the frequency)
  - 802.11 WLAN (b@11Mbps, g@9Mbps, g@54Mbps)

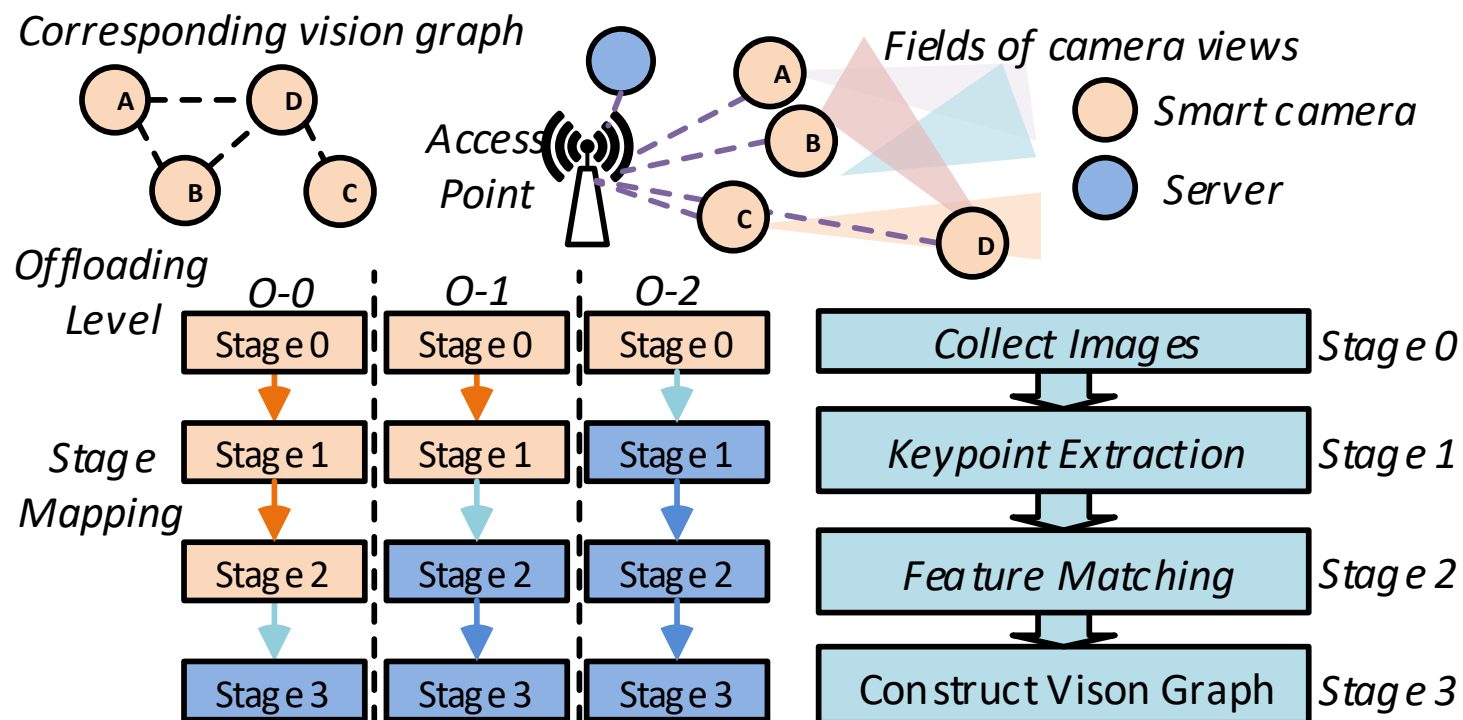
# NoS Simulation Setup

- **SystemC system instances**
  - Profiling using HW counters [PAPI]
  - FIFO scheduler in OS model
- **INET/OMNeT++**
  - Network-related timing information
  - Star-like client-server topology



# Vision Graph Discovery

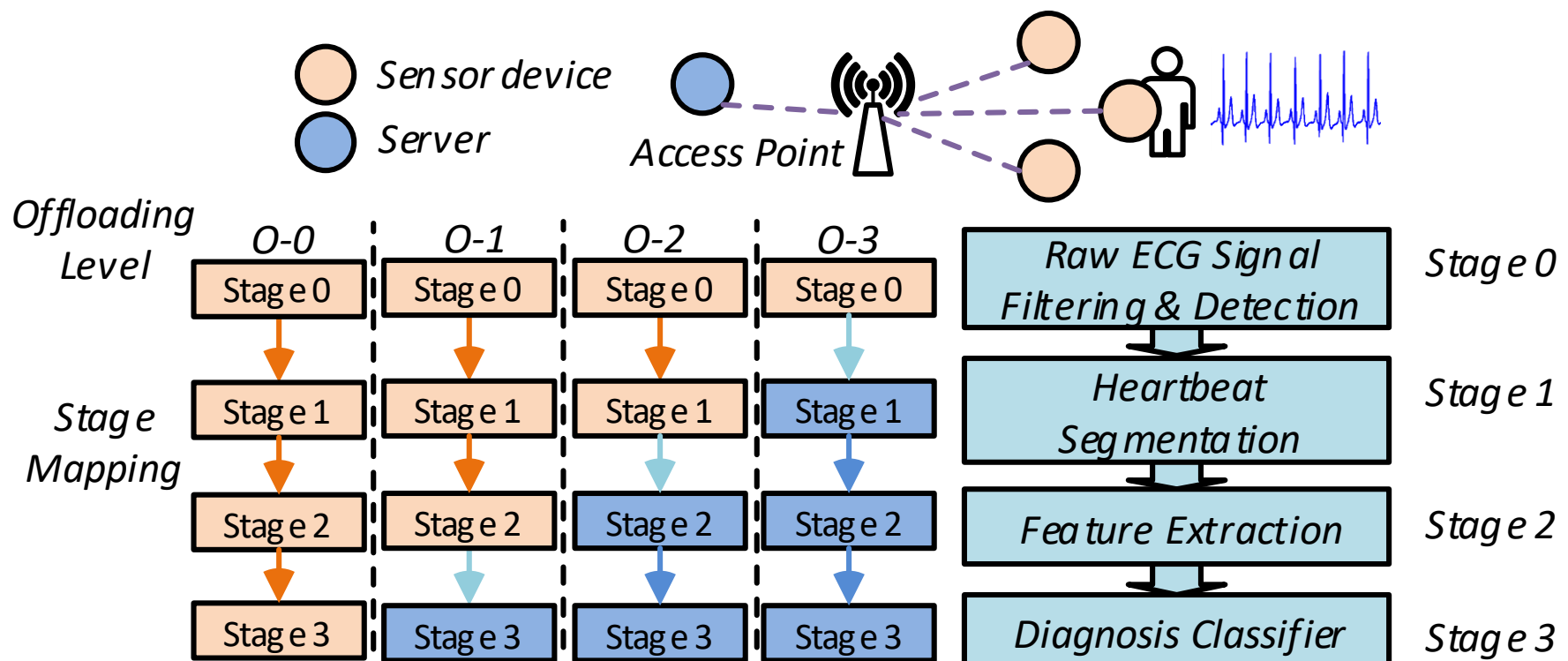
- **Vision graph discovery in smart camera networks**
  - Discover view overlaps among a set of cameras
  - 4 execution stages, 3 offloading levels, 2-6 clients
  - Implemented in C++ with OpenCV
  - Performance metrics: throughput, client core utilization



# ECG Diagnosis

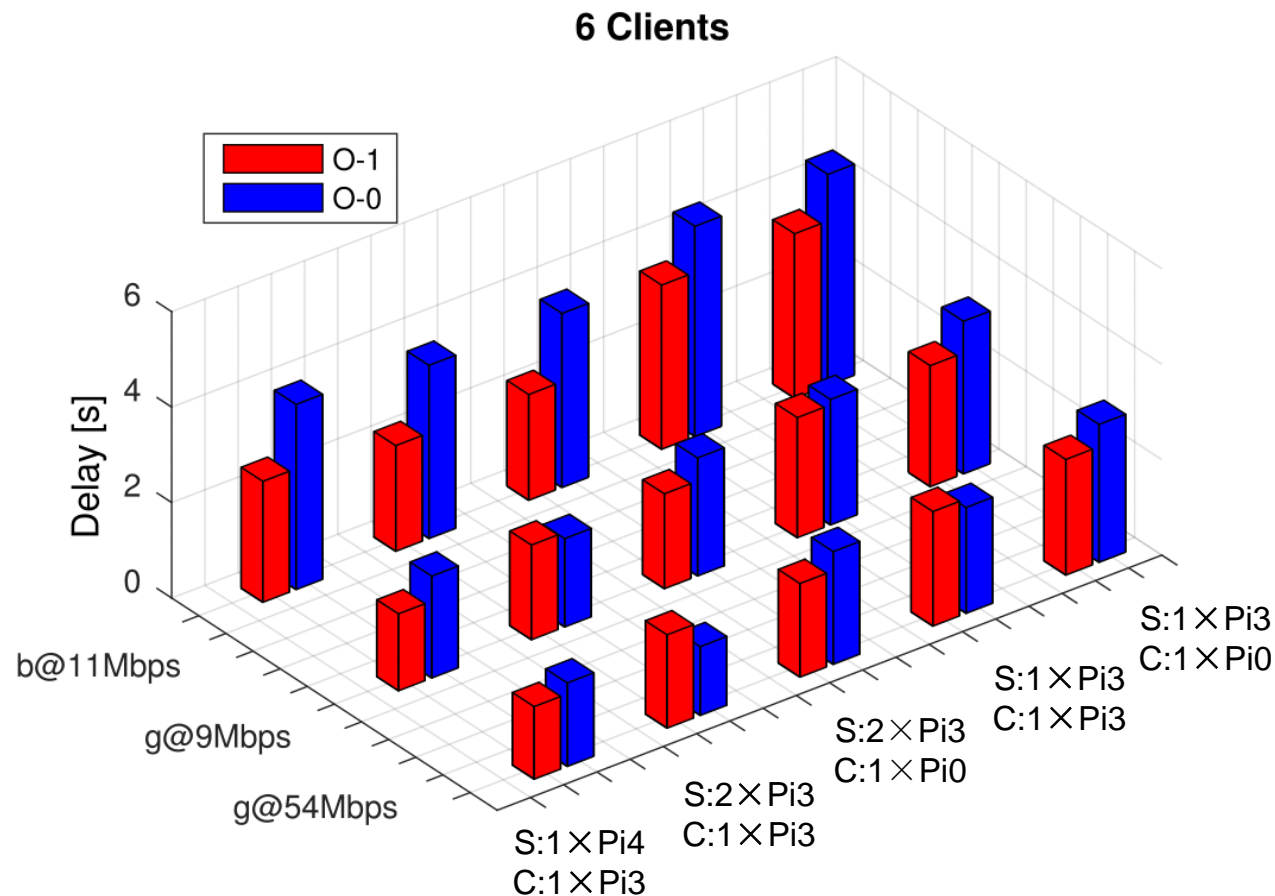
- ECG monitoring

- Recognize abnormal heartbeat from raw ECG signals
- 4 execution stages, 4 offloading levels, 2-6 clients
- Implemented in C
- Performance metrics: throughput, client core utilization



# Vision Graph Discovery Throughput

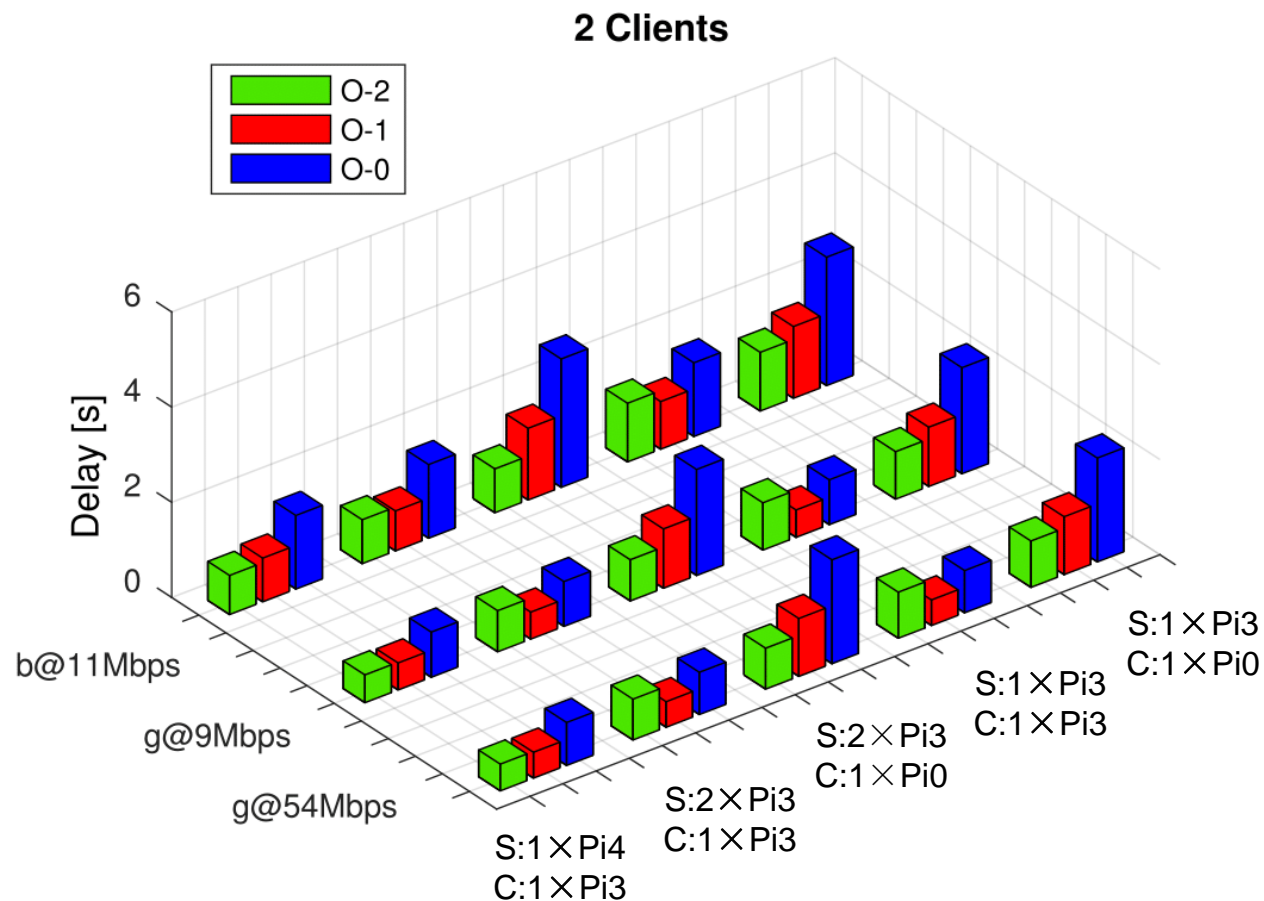
- **Output-to-output delay with 6 clients**
  - Server- and computation-bound at O-2
  - Balanced at O-0 and O-1





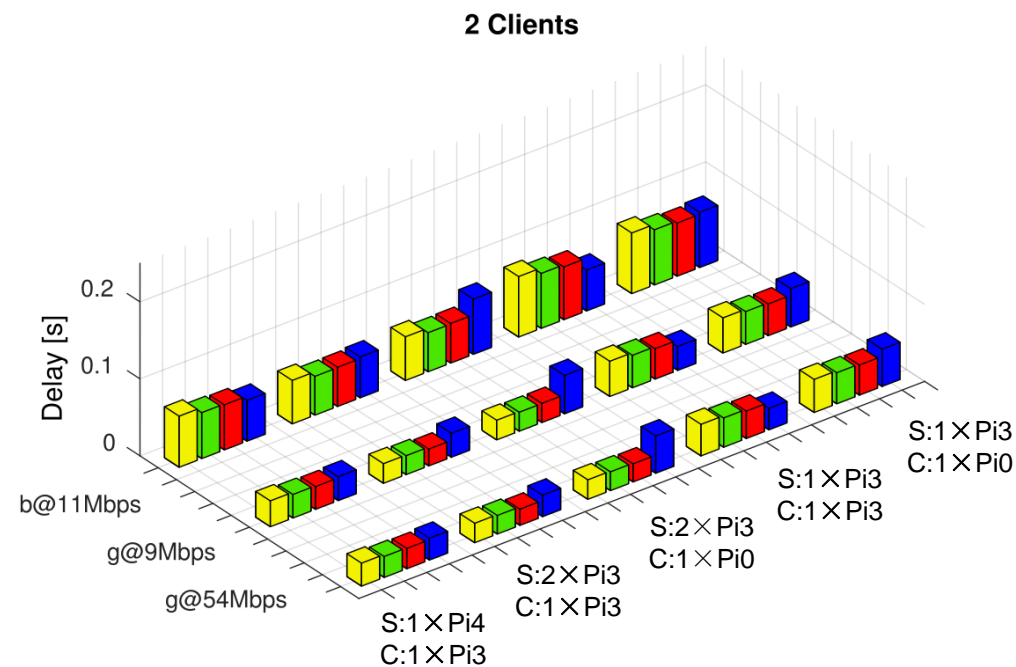
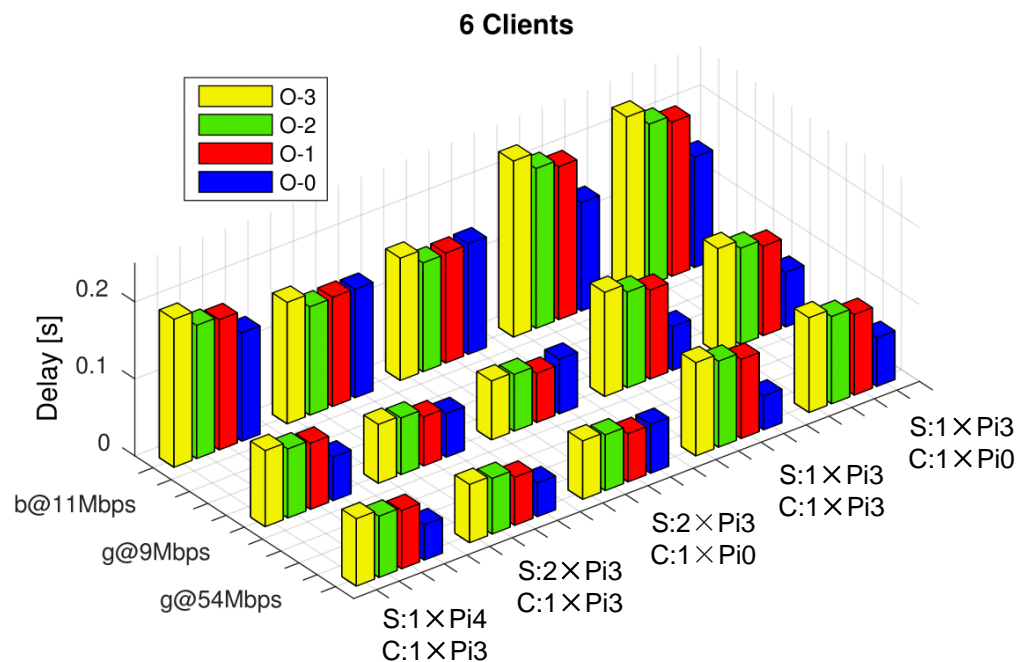
# Vision Graph Discovery Throughput

- **Output-to-output delay with 2 clients**
  - Computation and communication balanced
  - Client-bound at O-0 and O-1



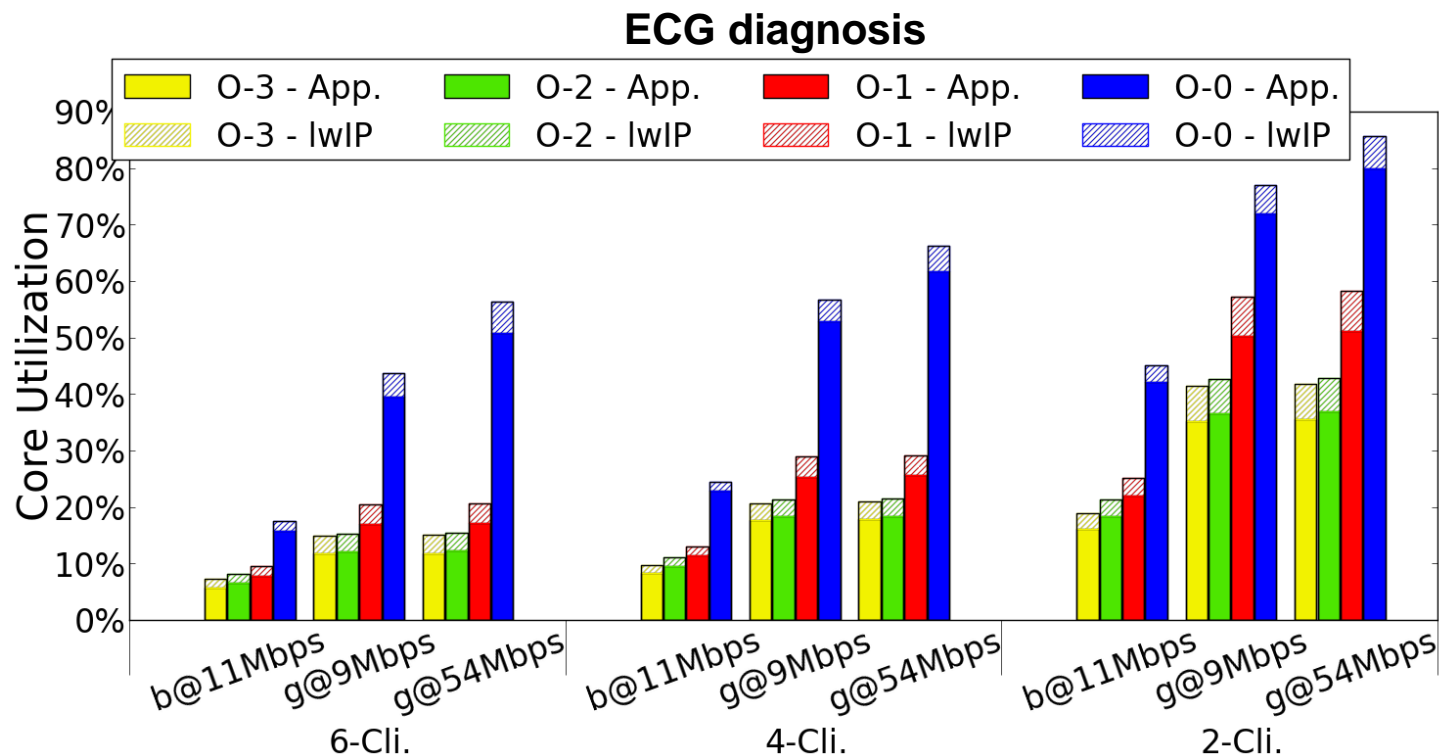
# ECG Diagnosis Throughput

- **Output-to-output delay with 2 and 6 clients**
  - Always computation and communication balanced
  - Server-bound at O-1,2,3
  - Client-bound at O-0



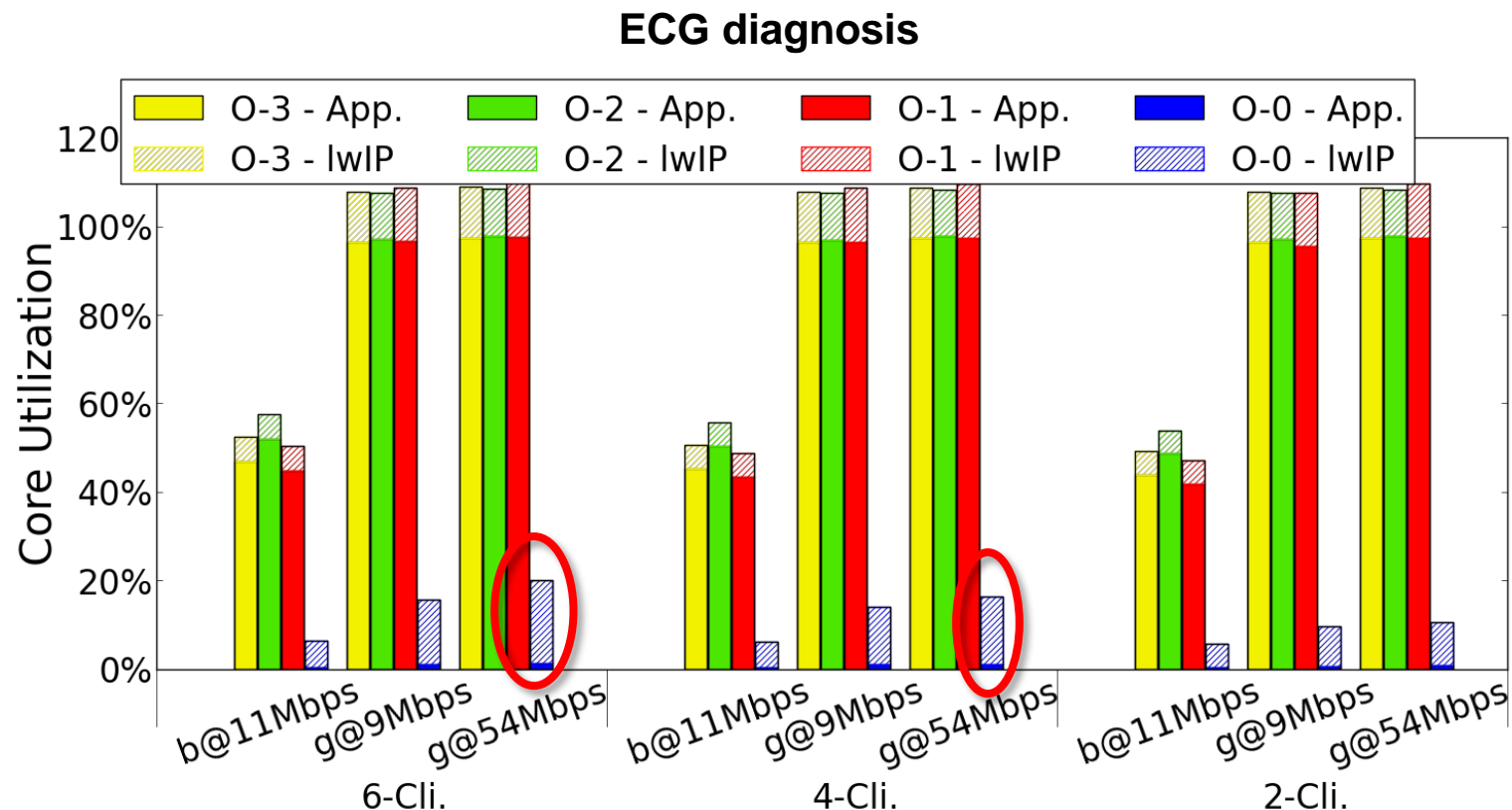
# Client Core Utilization

- **Mainly affected by offloading level and client count**
  - Lower offloading increases client load
  - Lower client count increases throughput
- **Network configuration impact**
  - ECG diagnosis: 13.7% - 31.6%
  - Vision graph discovery: 11.5% - 19.5%



# Server Core Utilization

- **Mainly affected by offloading level**
  - Higher offloading increases server load
  - Client count affects throughput and server load
- **Up to 20% core utilization for lwIP stack**



# NoS Design Space

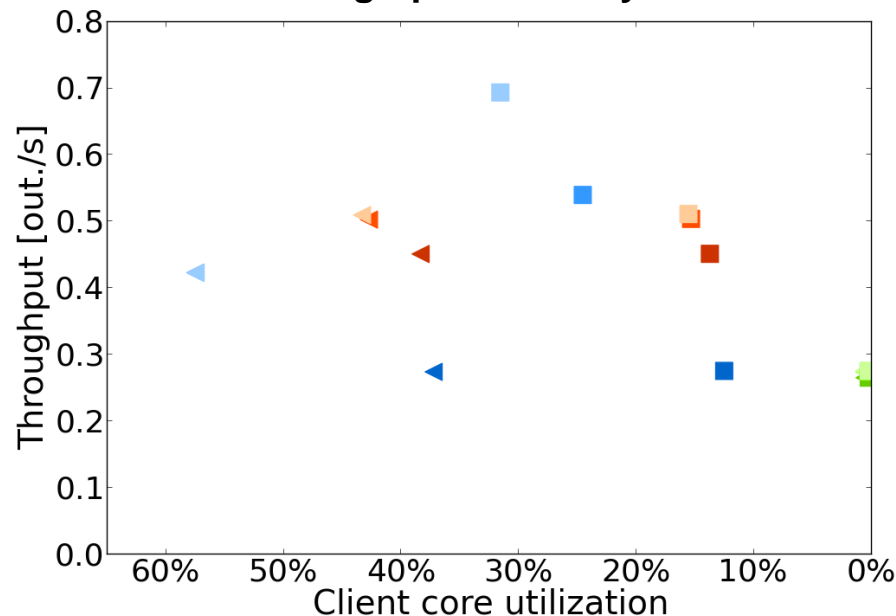
- IoT design space exploration

- 6-client setup with different app., system and net. config.

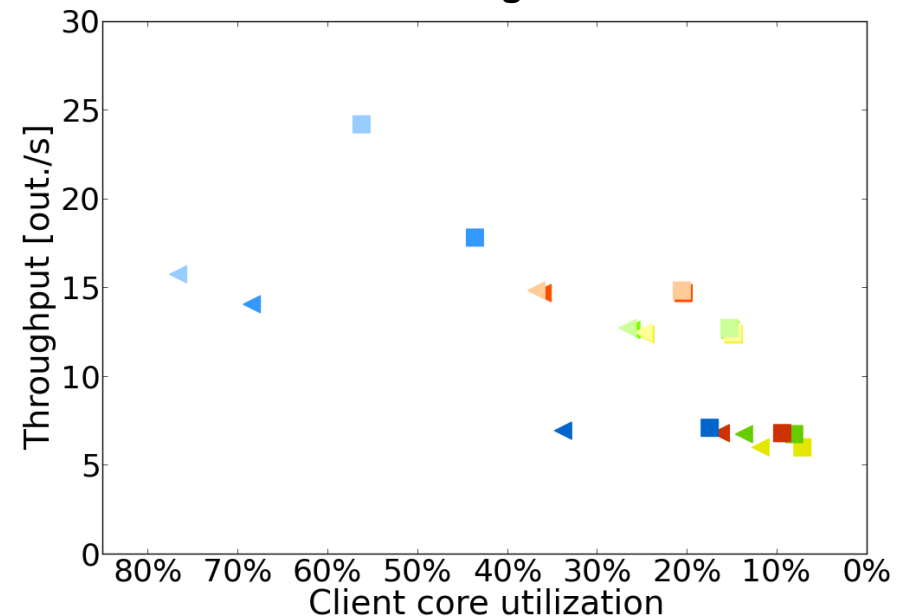
➤ Non-obvious parameter interactions

	O-3	O-2	O-1	O-0
S:2×Pi3	■ b@11Mbps	■ b@11Mbps	■ b@11Mbps	■ b@11Mbps
C:1×Pi0	■ g@9Mbps	■ g@9Mbps	■ g@9Mbps	■ g@9Mbps
	■ g@54Mbps	■ g@54Mbps	■ g@54Mbps	■ g@54Mbps
S:2×Pi3	◀ b@11Mbps	◀ b@11Mbps	◀ b@11Mbps	◀ b@11Mbps
C:1×Pi0	◀ g@9Mbps	◀ g@9Mbps	◀ g@9Mbps	◀ g@9Mbps
	◀ g@54Mbps	◀ g@54Mbps	◀ g@54Mbps	◀ g@54Mbps

Vision graph discovery



ECG diagnosis



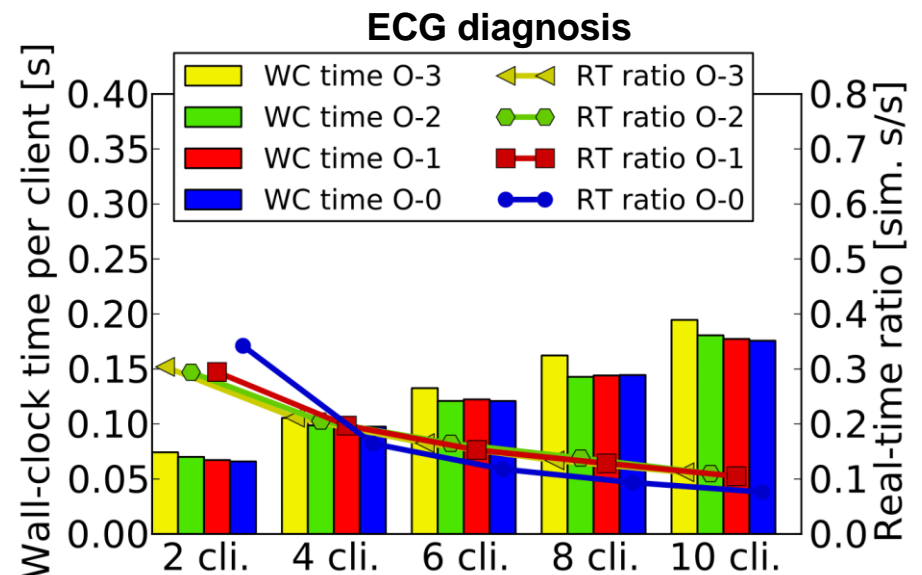
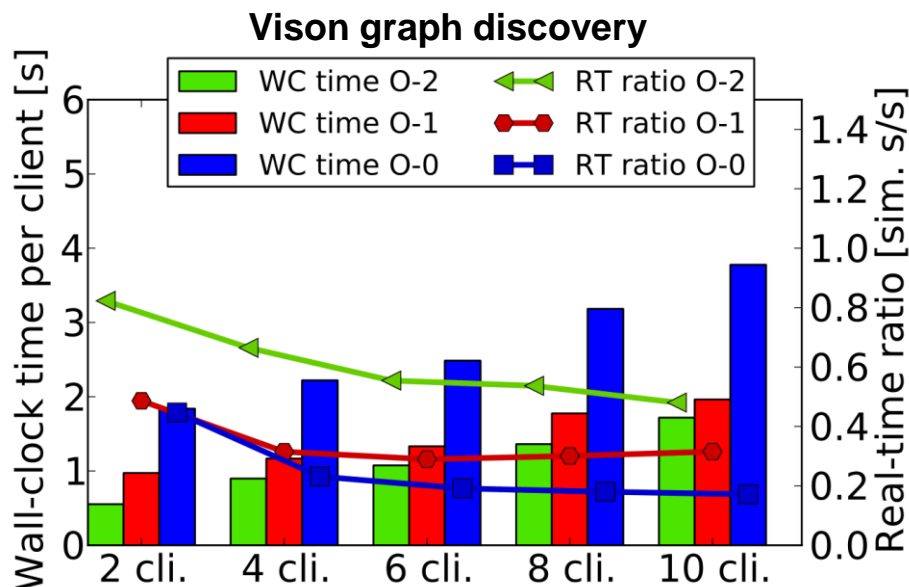
# Simulation Speed and Accuracy

- **Simulation speed**

- Vision graph discovery: 0.39 sim. seconds/s
- ECG: 0.18 sim. seconds/s
- Larger communication requires more simulation events

- **Simulation accuracy**

- >95% for system simulator



# Summary & Conclusions

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- **Networks-of-Systems (NoS) simulator**
  - SystemC based host-compiled system model
  - INET/OMNeT++ integration
  - Fast, comprehensive and flexible NoS simulator
- **NoS design space exploration**
  - IoT application case studies
  - Significant network/system interactions
- **Future work**
  - Accuracy validation against more real world setups
  - Various metrics such as quality and reliability
  - Network/system co-optimization