

# Energy-Efficient Orchestration of Metro-Scale 5G Radio Access Networks

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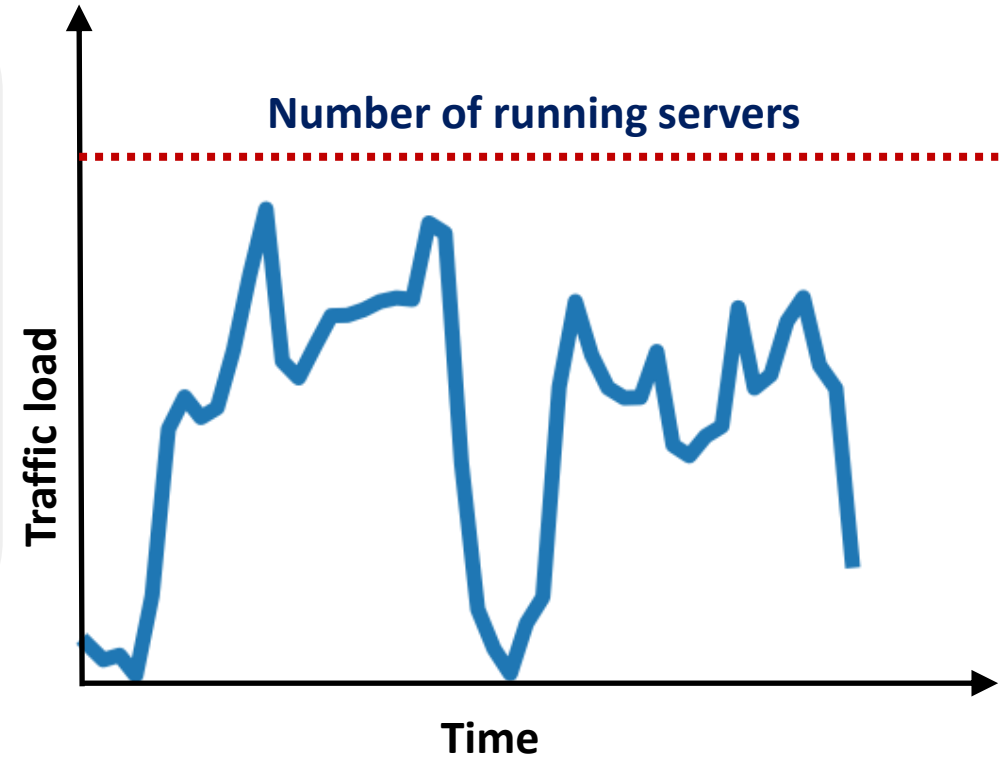
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# RAN Energy Consumption Problem

## Overprovisioning

1. Traffic load varies with time
2. Server capacity is greater than demand



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3. At lower traffic, static energy incurs huge costs
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**Need advanced measures to perform optimal resource orchestration**

# Our Contributions



Realistic multi-tier cloudified RAN model



Comprehensive energy model and problem formulation



A distributed and scalable solution: GreenRAN



Evaluation with metro-scale real world dataset

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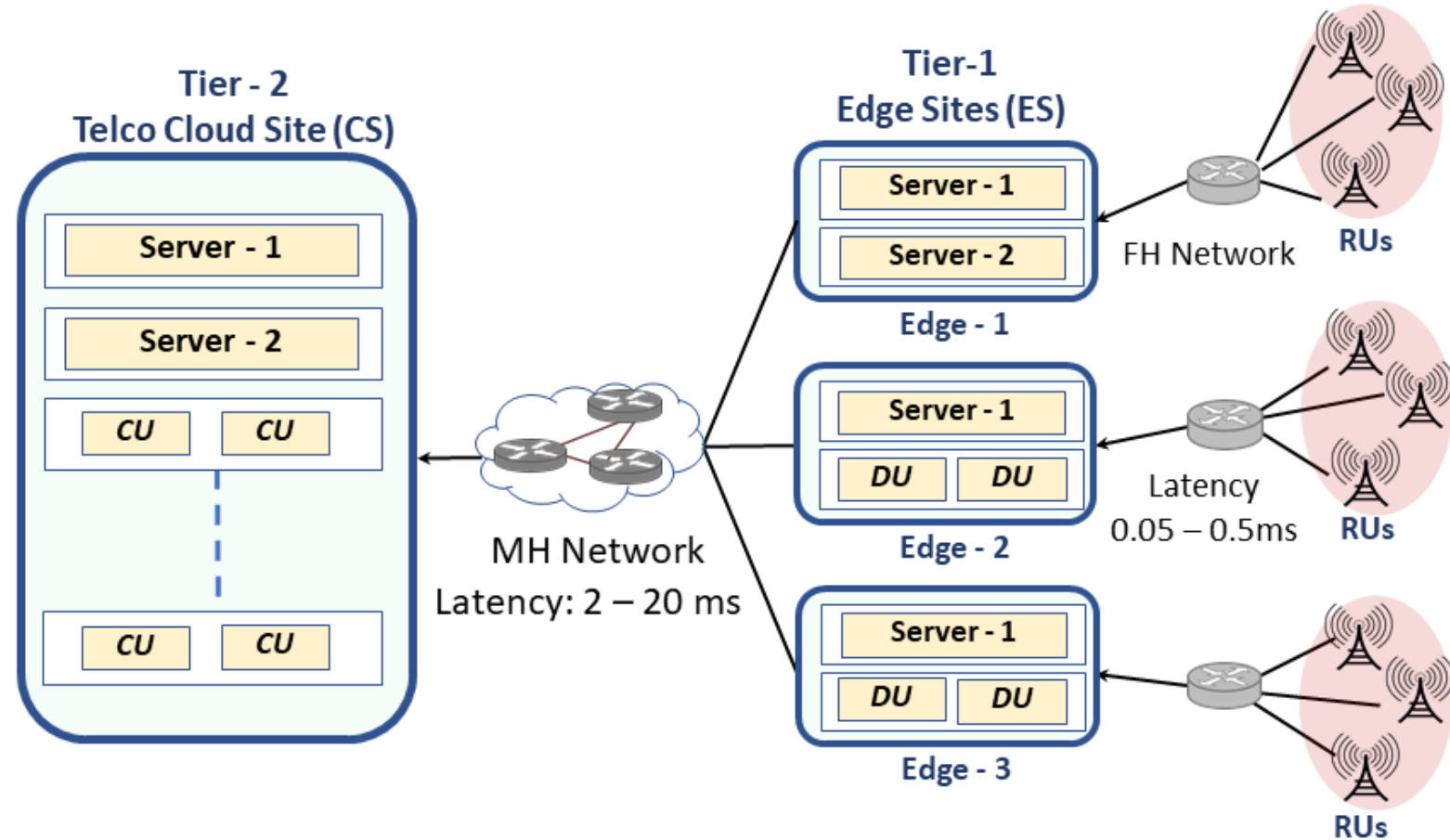
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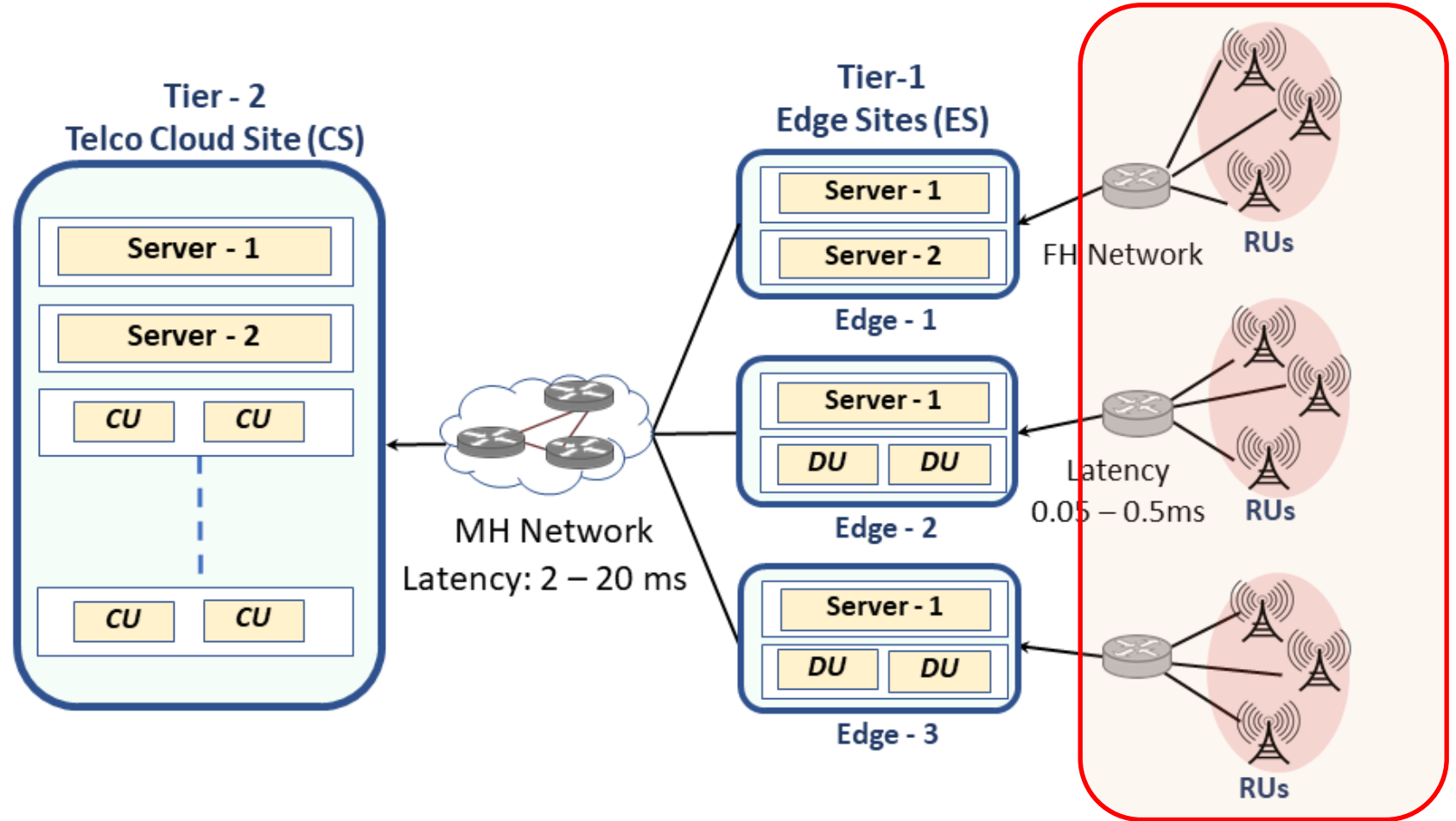
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# Multi-tier vRAN Architecture



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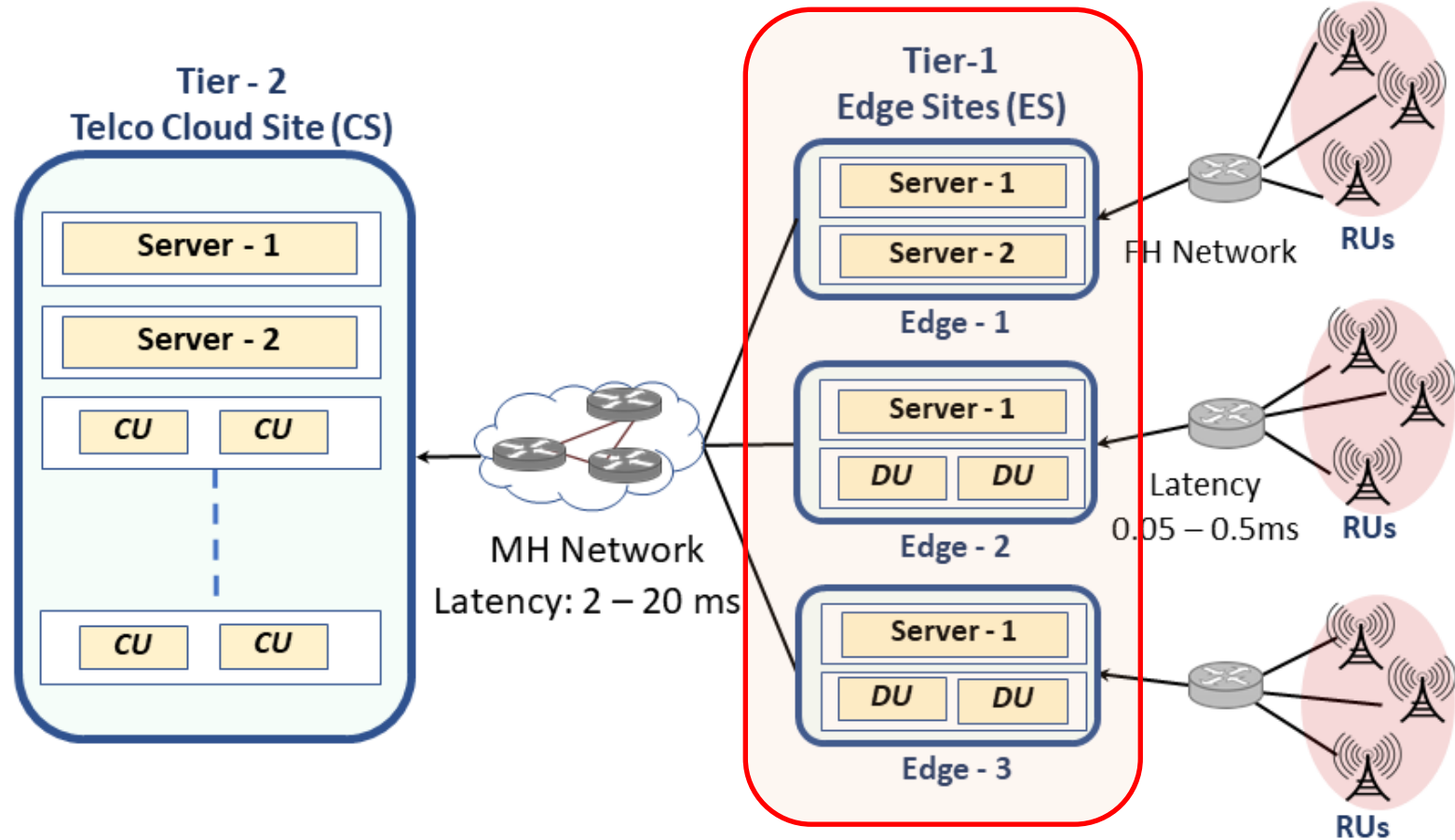
lowPHY using ASIC & FPGA





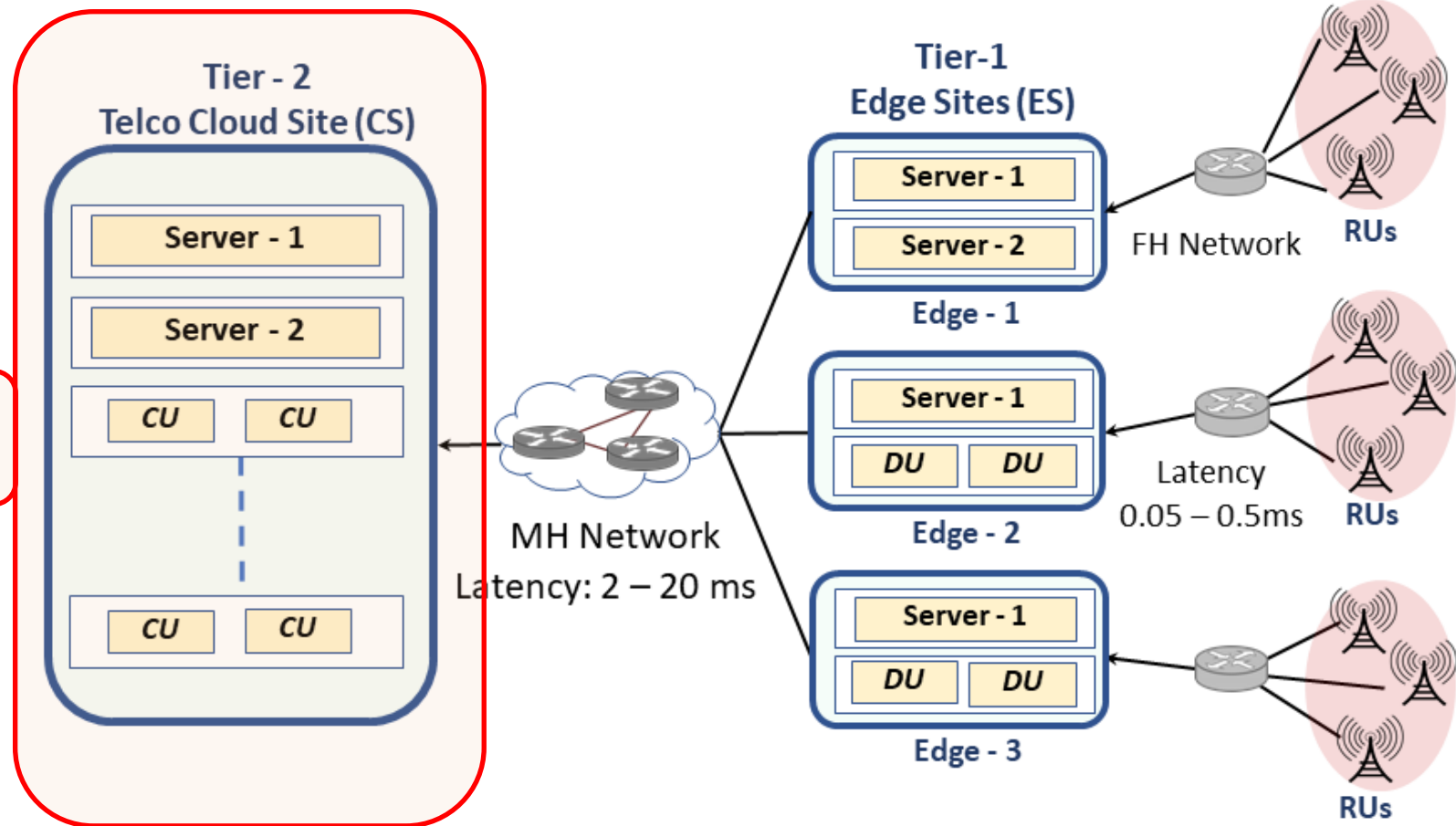
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- lowPHY using ASIC & FPGA
- General purpose compute
- VNF consolidation



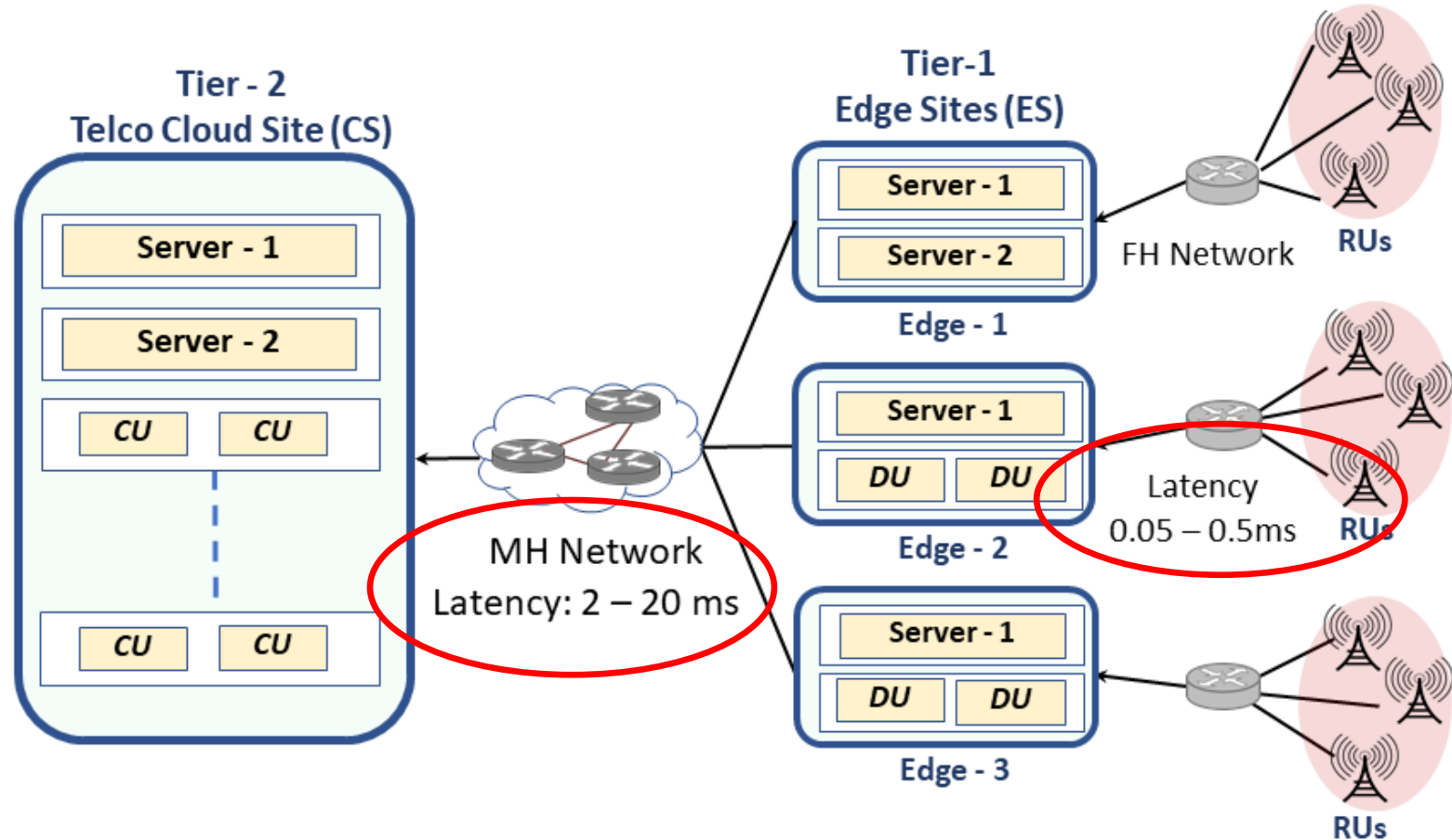
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- lowPHY using ASIC & FPGA
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- VNF consolidation
- More energy efficient



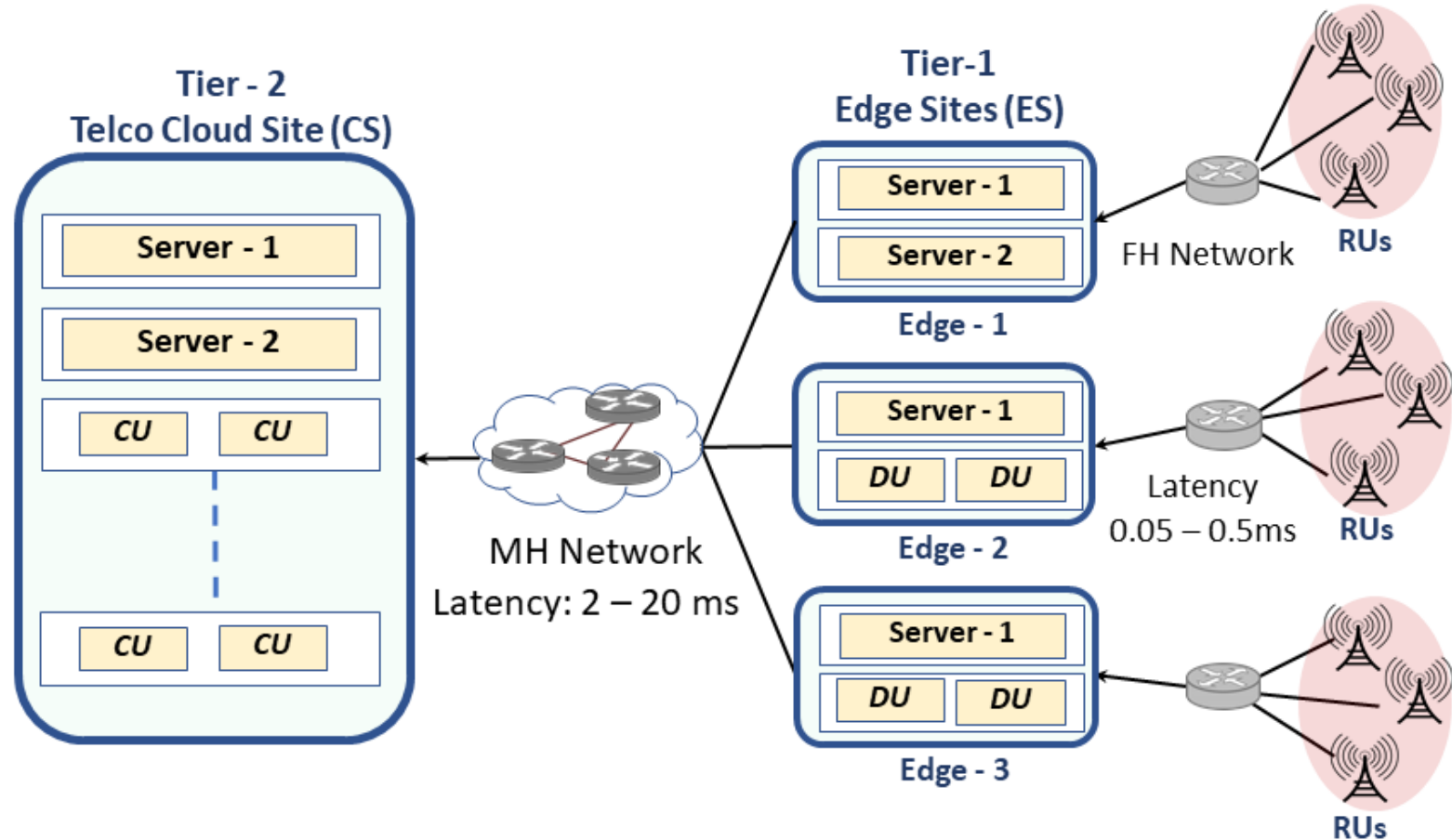
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- However, latency issues
- MH link capacity issues

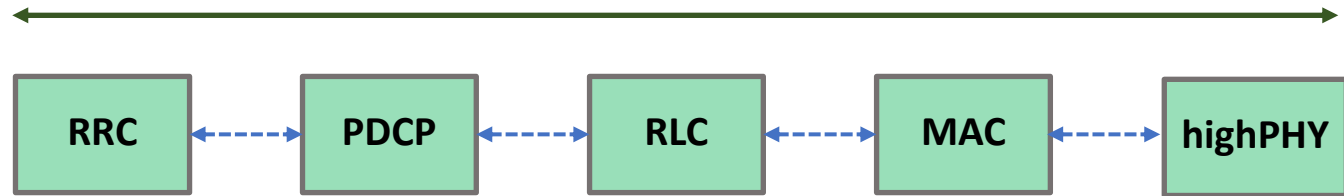


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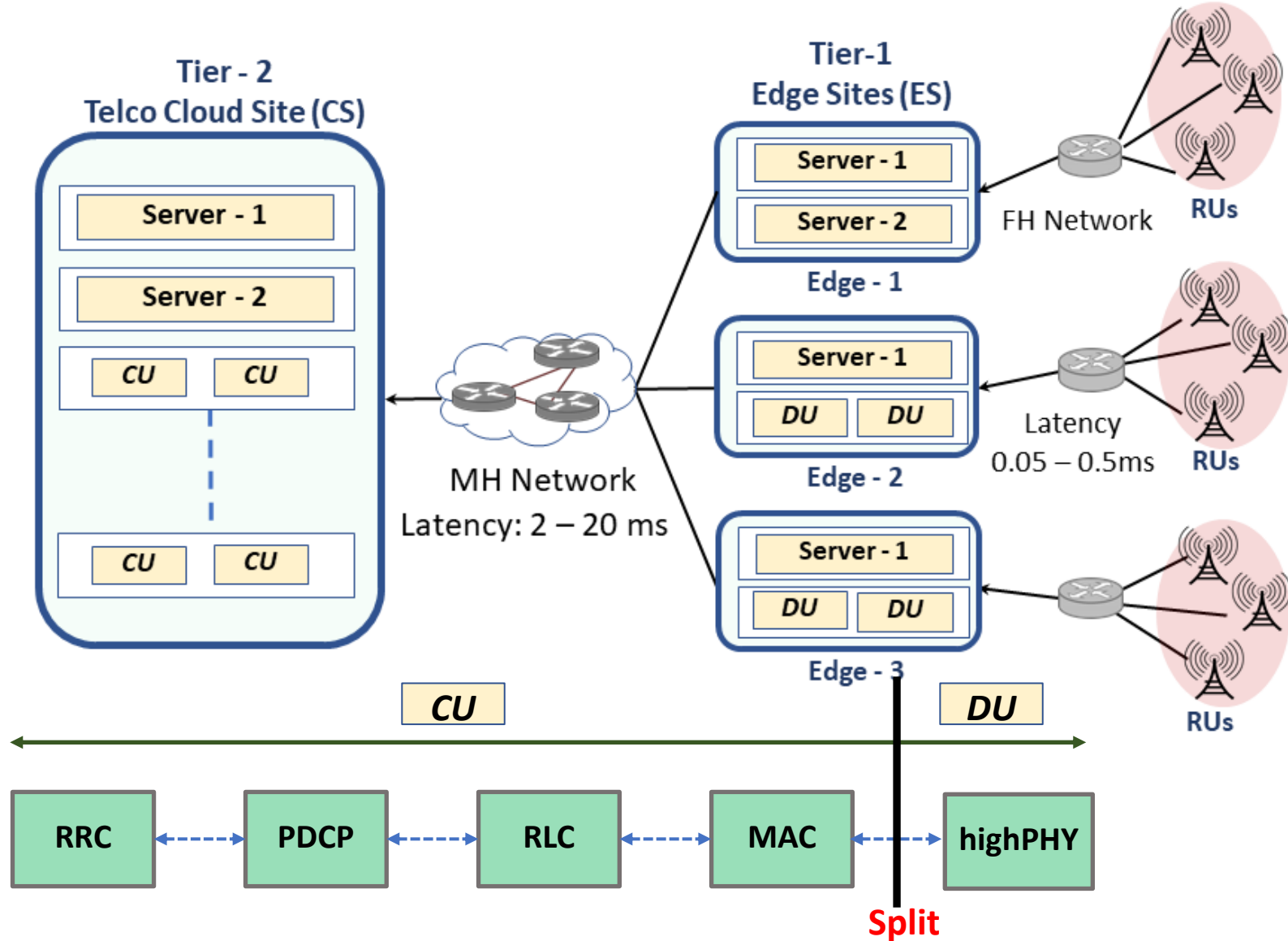


**RAN Functional Splits**



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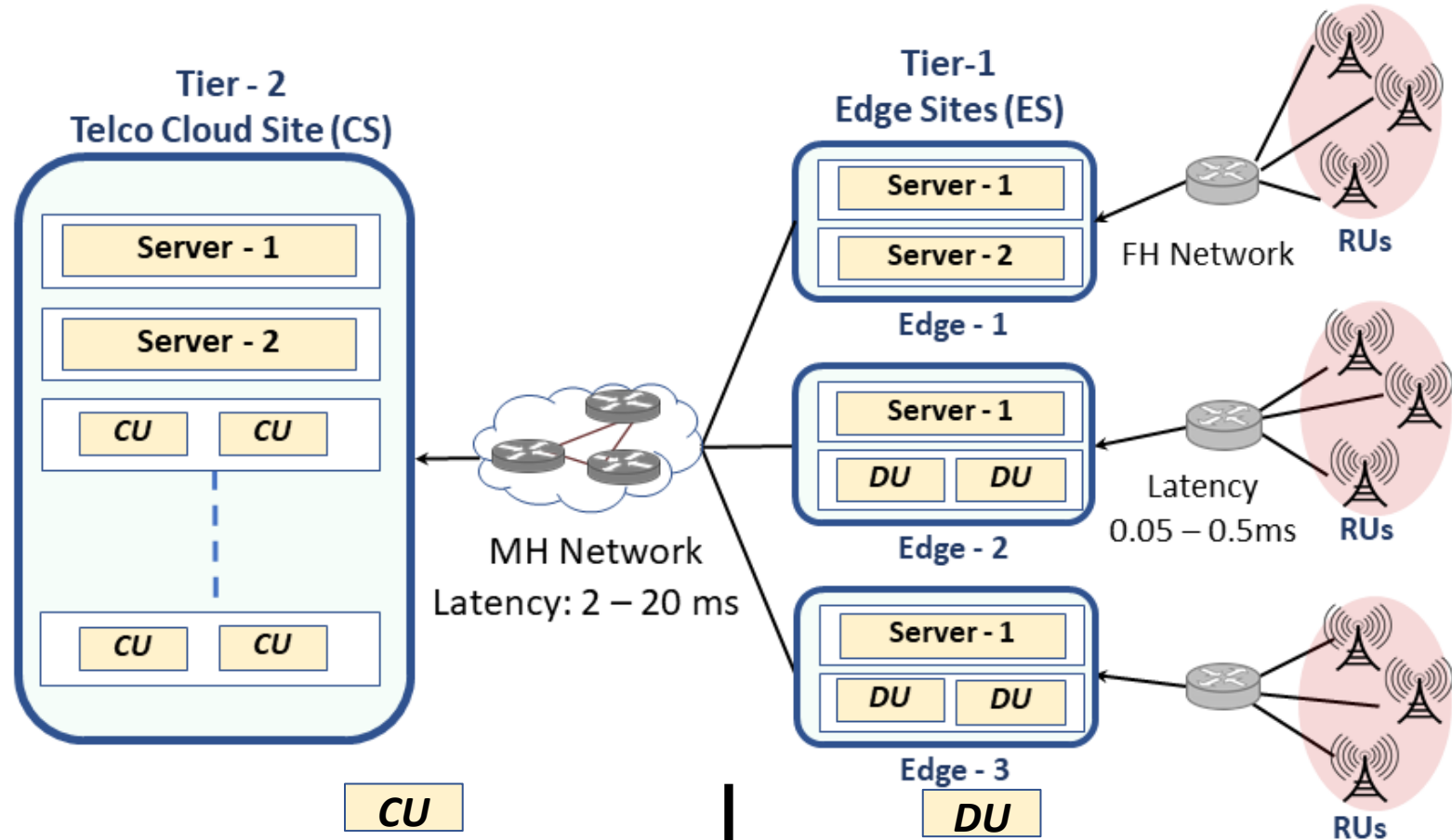
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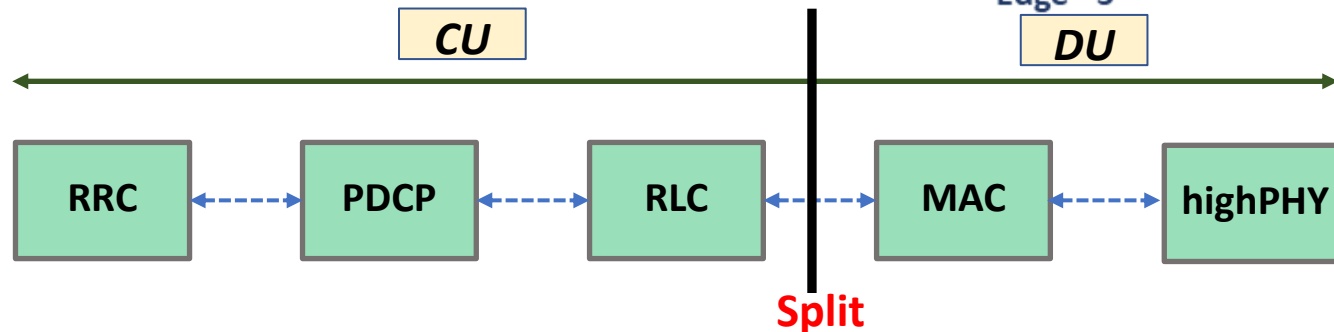
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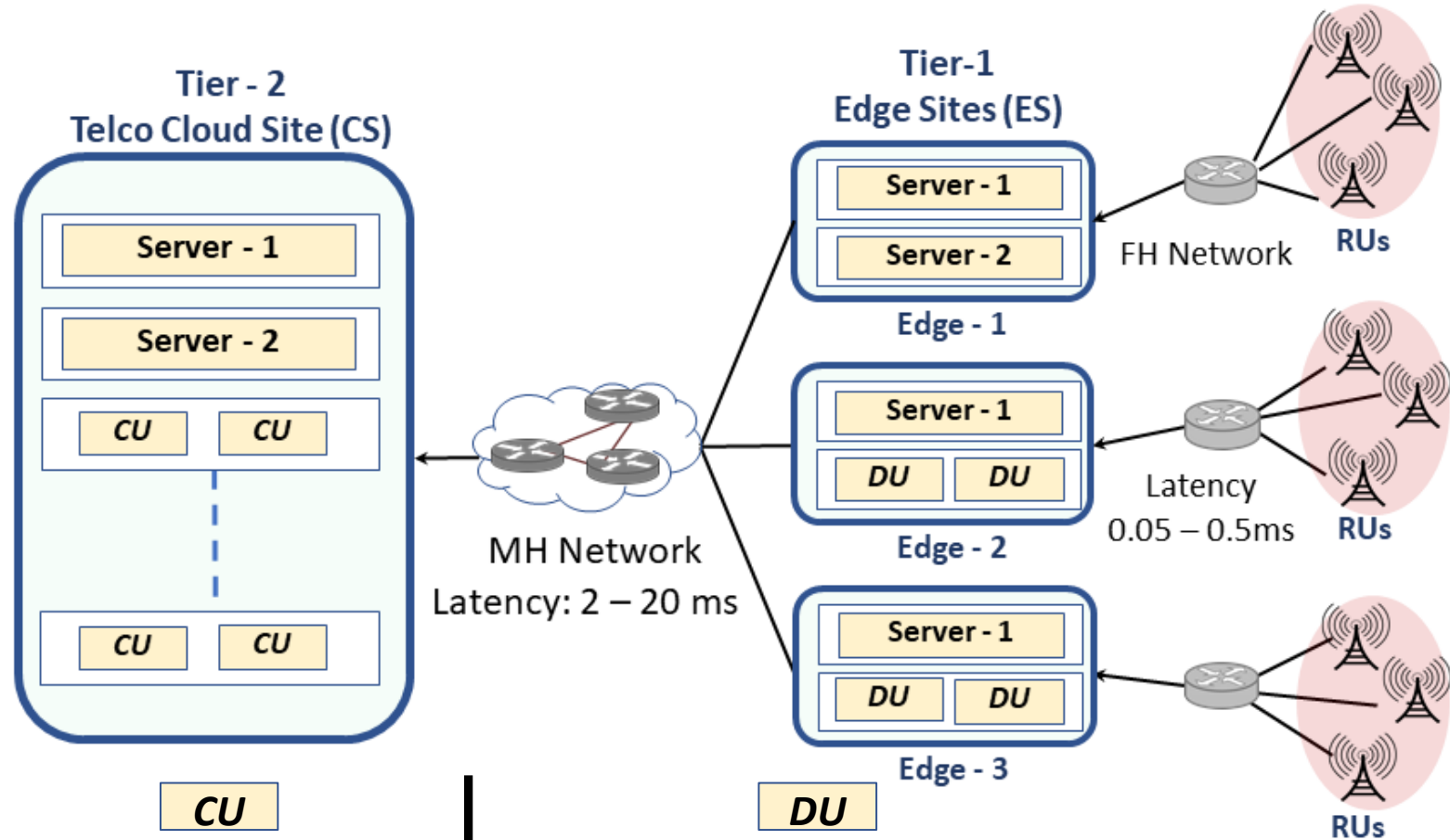


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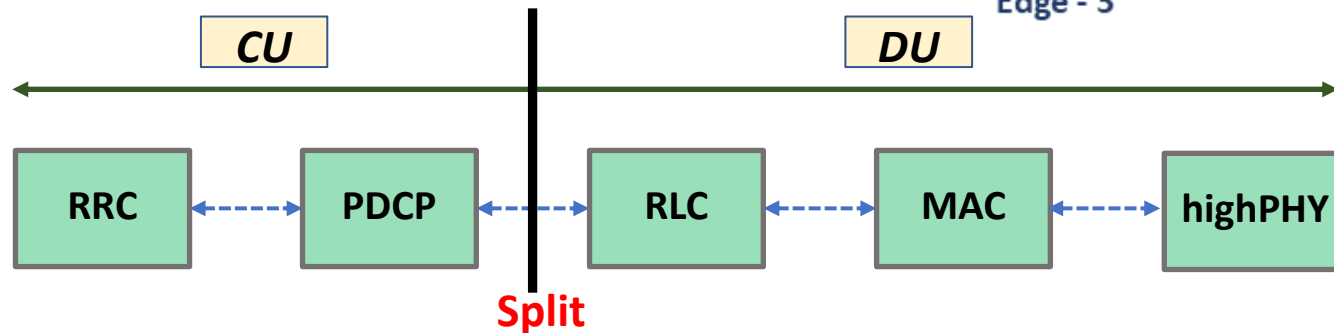


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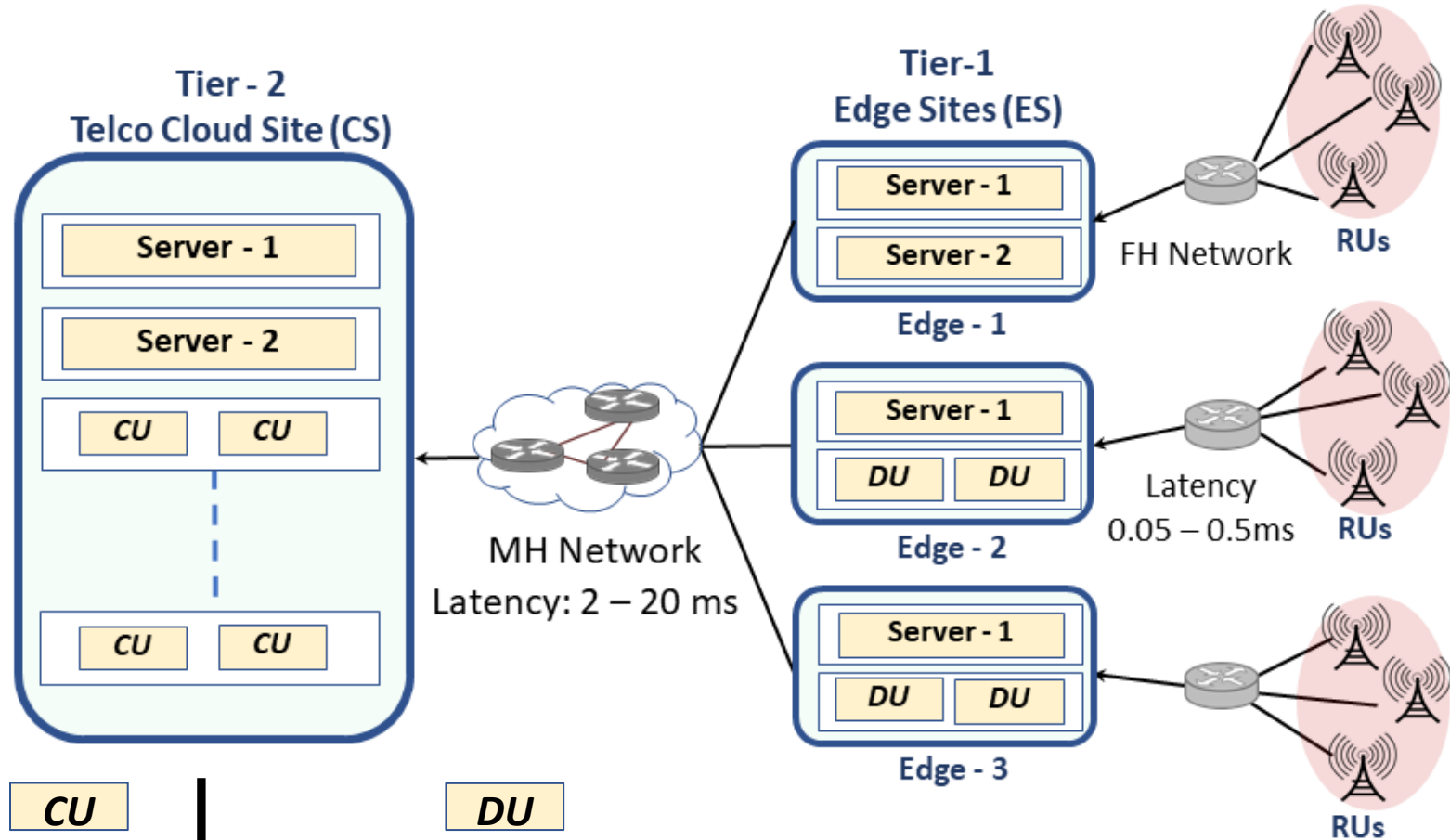


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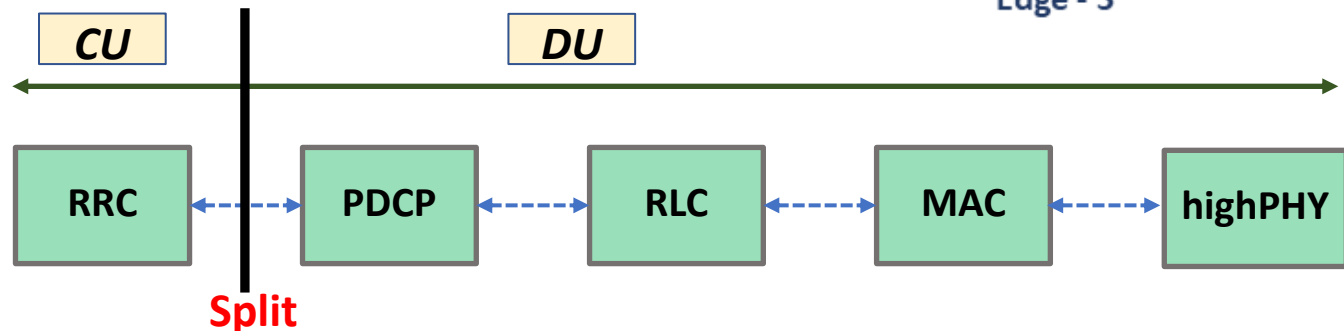
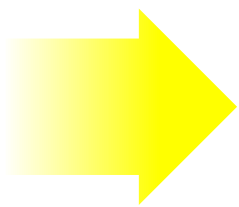


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**Comprehensive energy model and problem formulation**

A distributed and scalable solution: GreenRAN

Evaluation with metro-scale real world dataset

# Energy Model

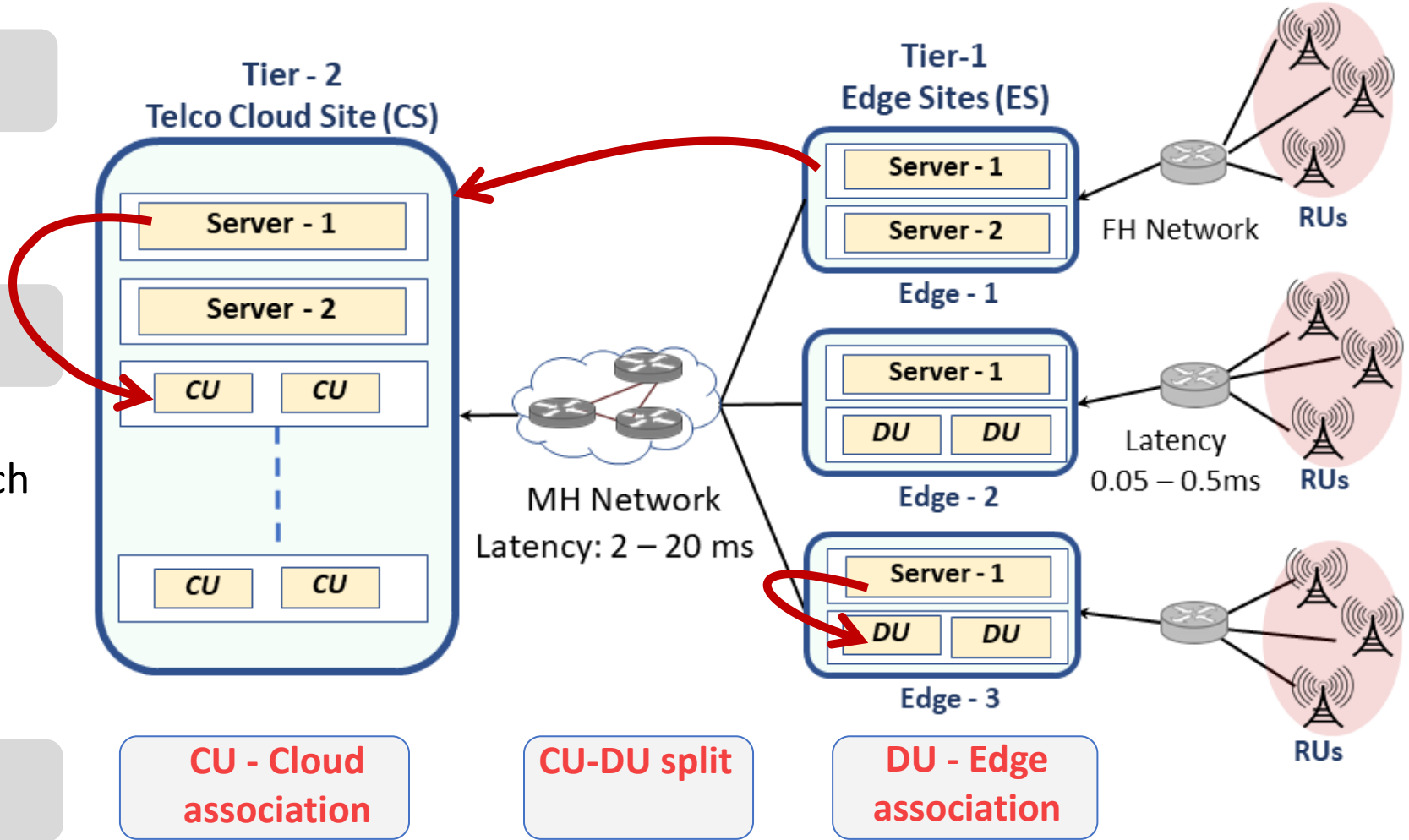
## Processing cost ( $E^P$ )

- To process VNFs
- Coupled bin-packing

## Migration cost ( $E^M$ )

- To consolidate VNFs
- Consider previous epoch

## Decision variables



# Challenges

## NP hard

- Integer Quadratic Program

## Scale

- Huge parameter space

## Centralized

- Edge and Cloud variables are inter-dependent

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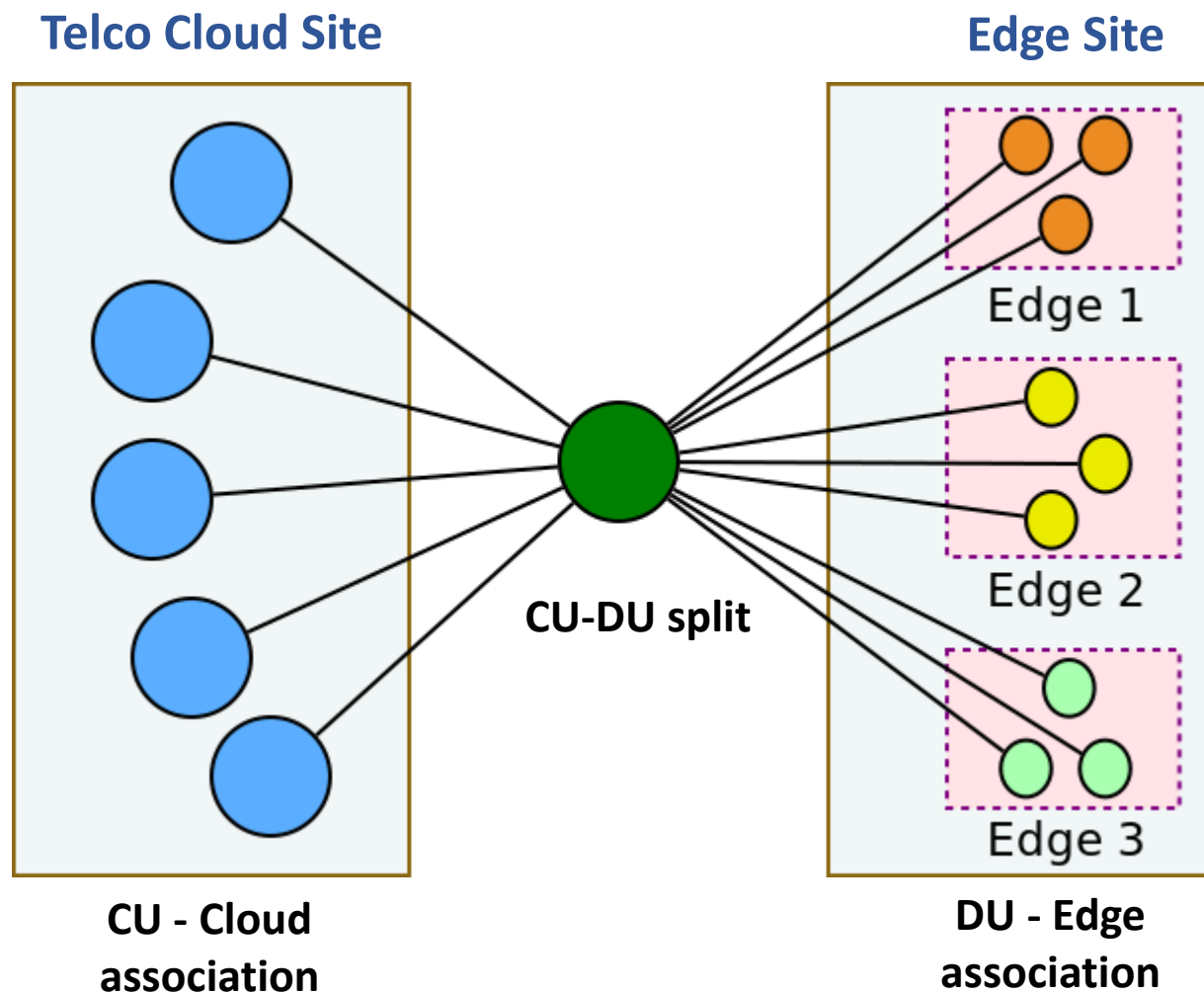
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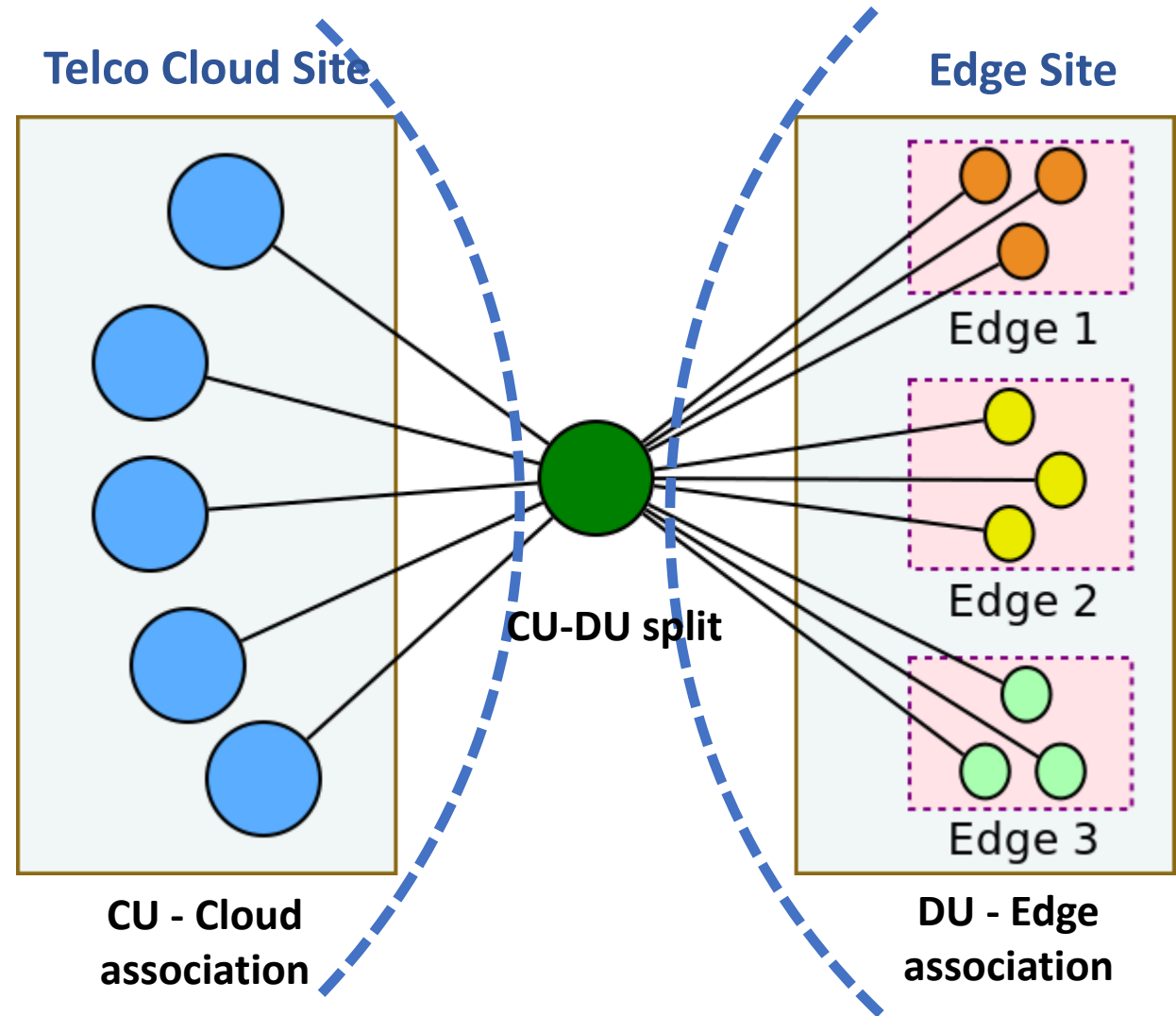
# Towards a decentralized solution: GreenRAN



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## Divide & Conquer Paradigm

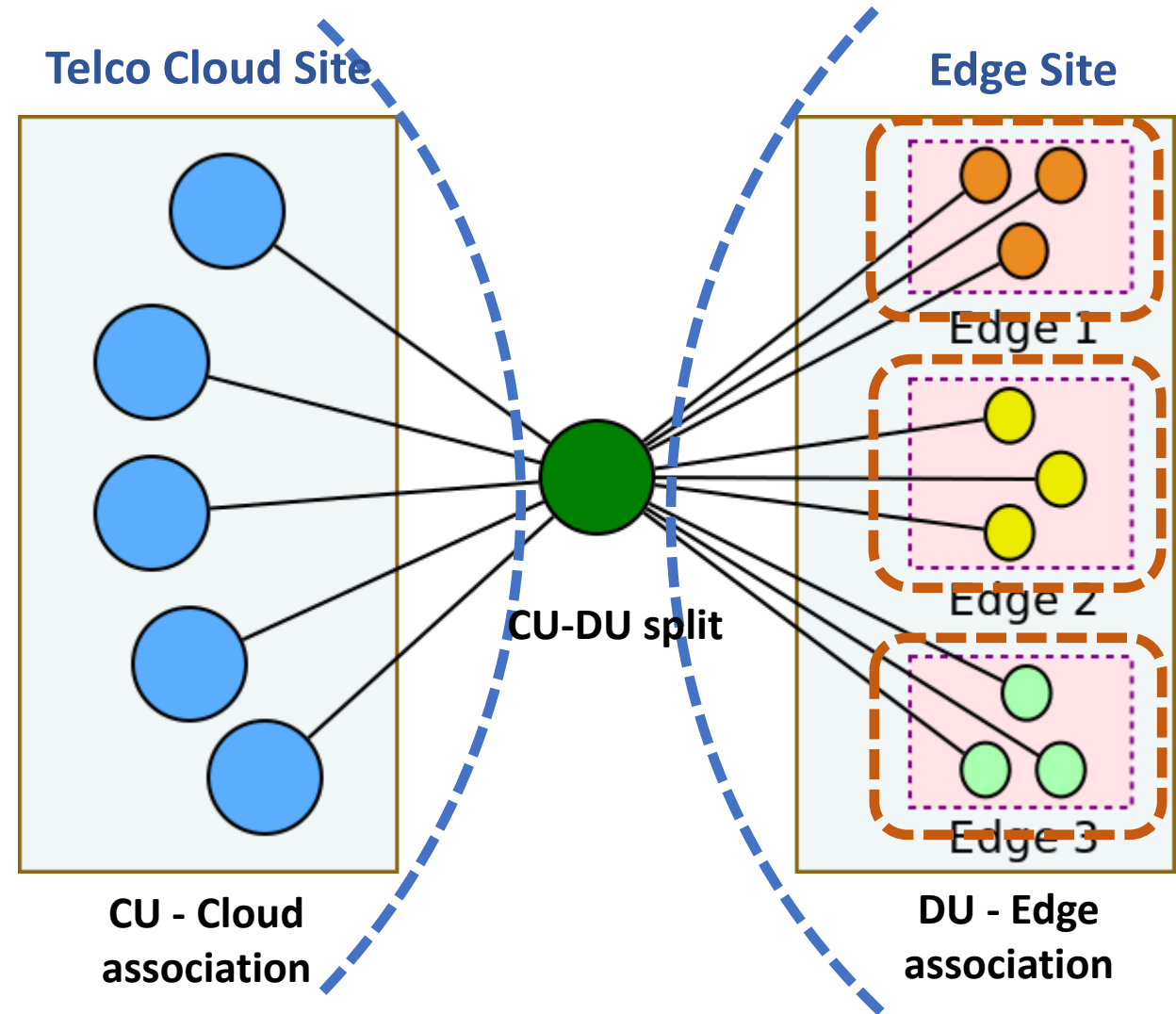
### 1. Lagrangean Relaxation



# Towards a decentralized solution: GreenRAN

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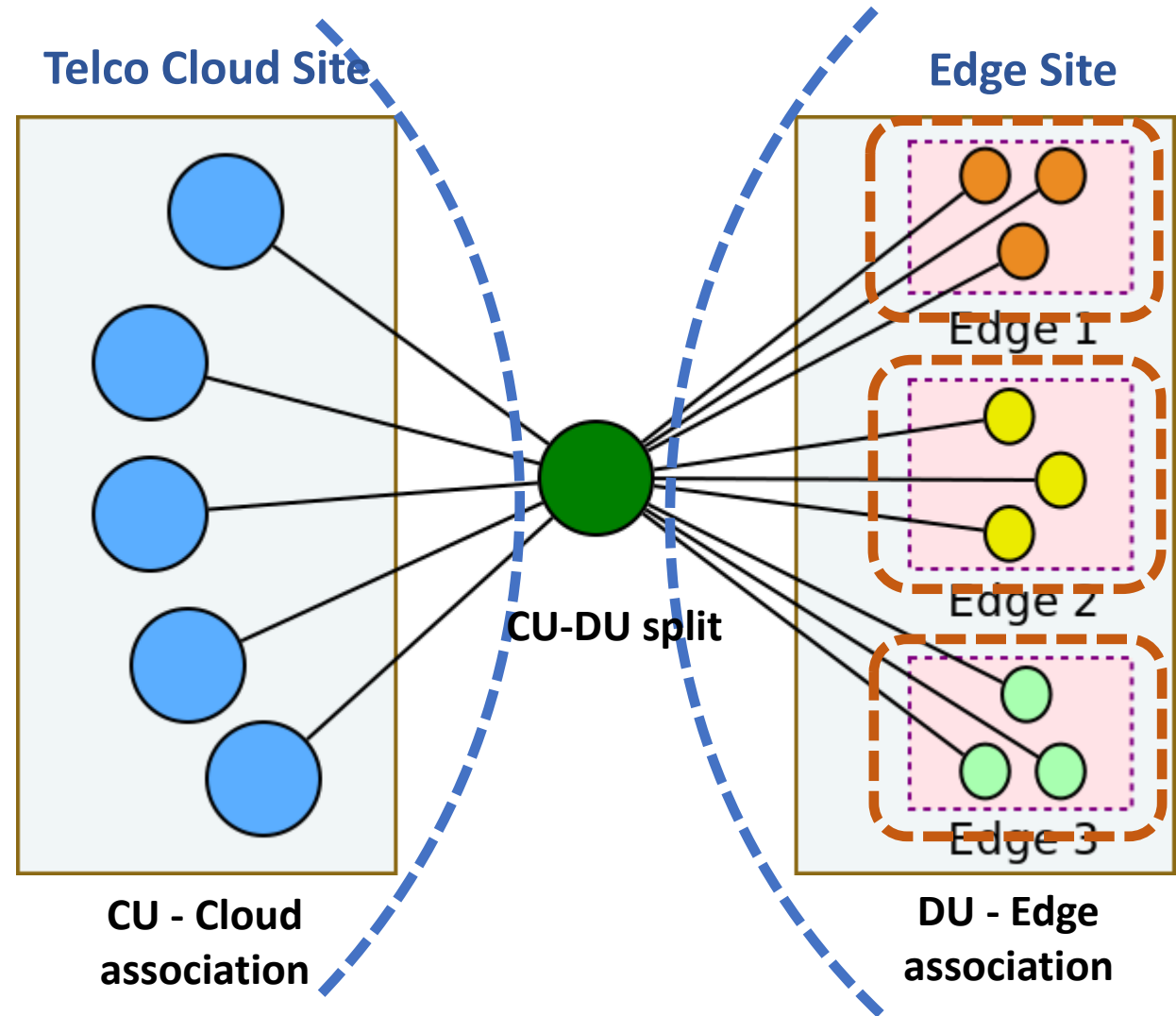
1. Lagrangean Relaxation
2. Per edge formulation



# Towards a decentralized solution: GreenRAN

## Divide & Conquer Paradigm

1. Lagrangean Relaxation
2. Per edge formulation
3. Simulated Annealing





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# Experimental Setup

## vRAN Configuration

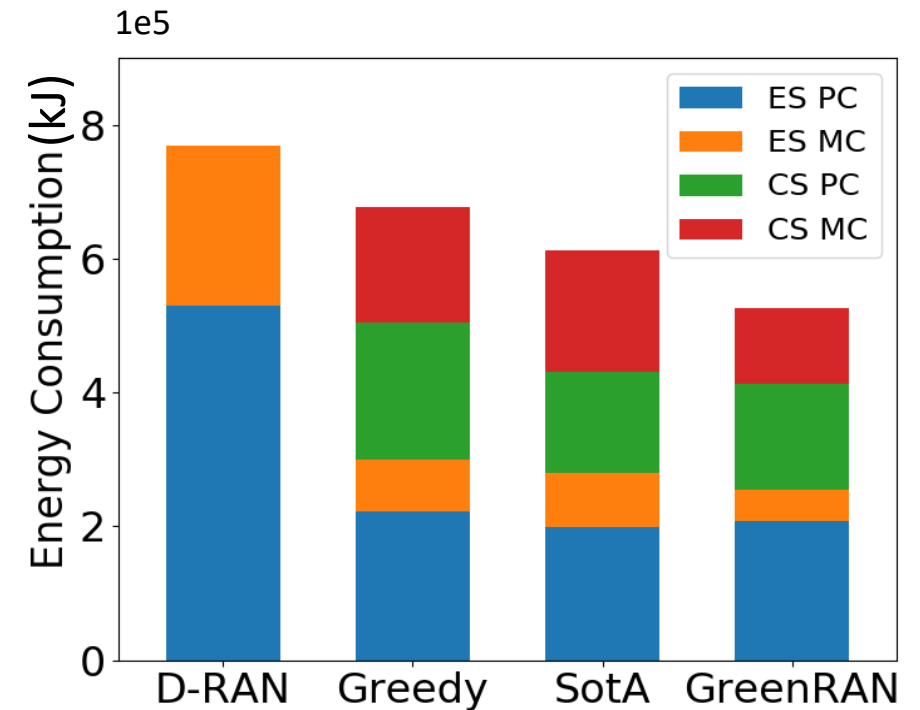
- Metro-scale **real world traffic** dataset
- **450** RUs
- **18** Far Edge Clouds
  - **15** physical servers per Edge Cloud
- **1** Telco Cloud
  - **30** servers per Telco Cloud

## Benchmarks

- **D-RAN**
  - All processing in DUs at Far edge site
- **Greedy**
  - Maximum processing at CU in Telco cloud
- **SotA**
  - Only considers the processing cost

# Energy Consumption

- GreenRAN
  - 25% better than SotA
  - 42% better than traditional D-RAN
- D-RAN has fewer multiplexing opportunities
- Greedy offloading to cloud is not optimal
- SotA incurs lesser processing cost
  - But higher migration cost



# Conclusion

Optimizing energy consumption is more **challenging with advanced architecture**

We presented a **latest vRAN** model, **realistic** energy model considering **migration costs**

Our framework, **GreenRAN**, is a distributed, scalable and highly efficient solution

Results show **25%** improvement over SotA and **42%** over D-RAN

*Thank You*