# NoQueue Real-Time Offloading Framework



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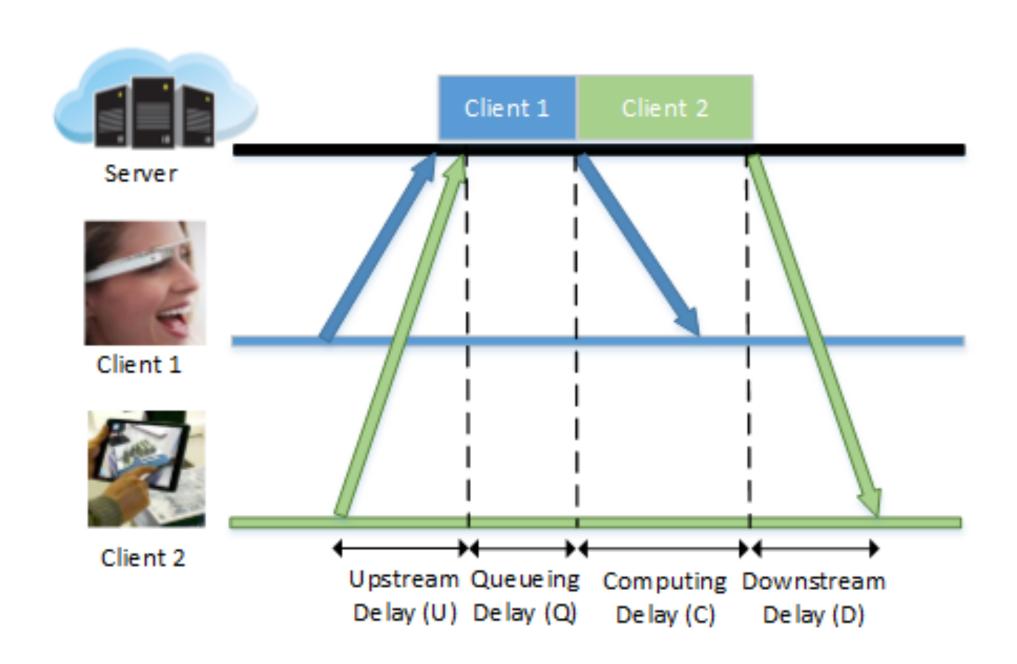


## Introduction

**NoQueue** is an offloading framework for serving real-time workload. Embedded devices benefit from offloading computation intensive tasks to more powerful servers in several aspects:

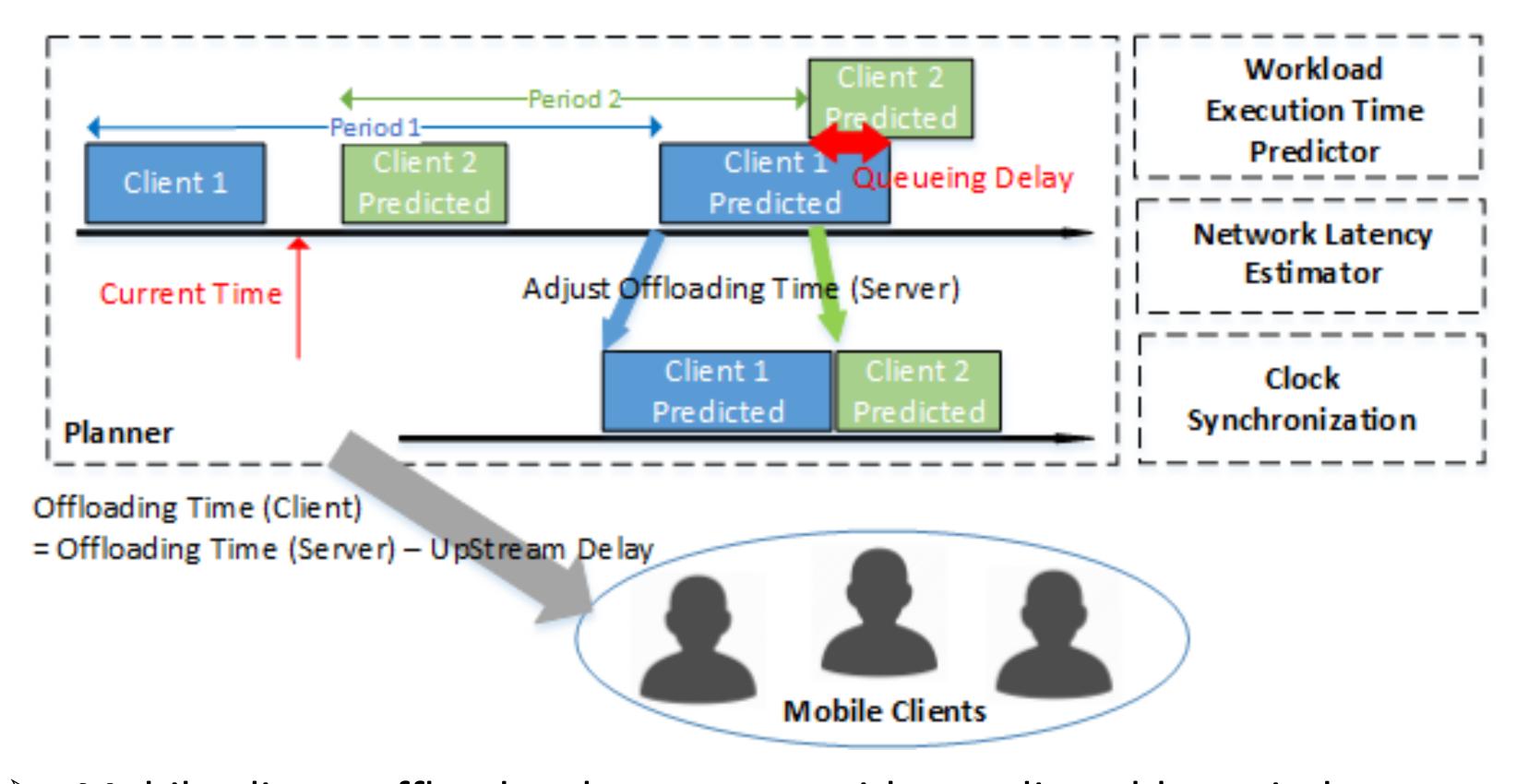
- data processing latency
- power consumption
- simplified embedded system development

Offloading real-time tasks is challenging because of unpredictable network latency (U, D), workload execution time variation (C) and multi-client interference on server resource (Q).



NoQueue adopts the *predict-plan* strategy to eliminate offloading task conflict to reduce server side queueing delay. It adopts workload execution time prediction, clock synchronization and network latency estimation. It also provides SLA to clients, manages server resource/admission control.

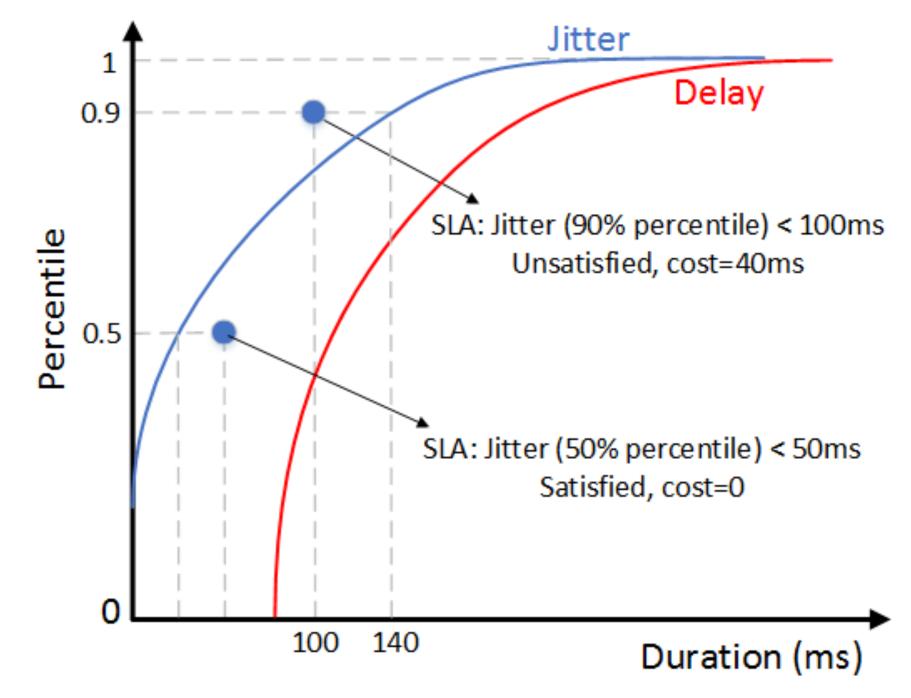
# Design



- Mobile clients offload tasks to server with an adjustable period
- All client **clock**s are synchronized to server via NTP. Remaining offset is estimated (by NTP algorithm) and compensated in client timestamps.
- ➤ **Upstream delay (U)** is estimated by TCP retransmission timeout timer algorithm (RFC 6298)
- Predictor estimates workload execution time using time series linear regression (one model per client, training online or offline)
- ➤ Planner runs continuous simulation on future task conflict, adjusts future offloading time, and sends new times to clients

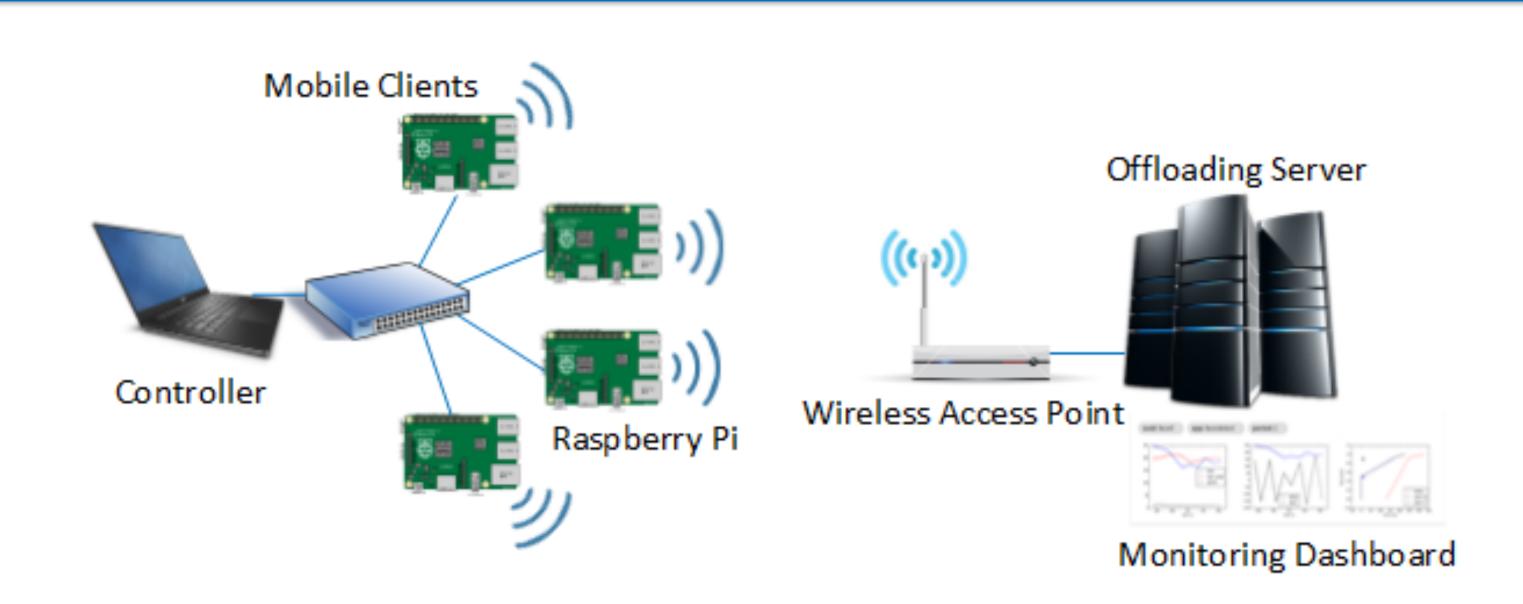
## Service Level Agreement (SLA)

**SLA** is defined as a list of desired values on percentile of jitter of task interval. If measured metric exceeds SLA, the difference results in a cost. The maximal SLA cost becomes the client's cost.



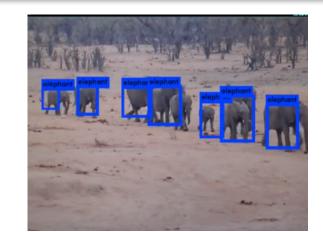
Planner adjusts offloading time based on client **cost**. The queueing delay to be removed is divided proportionally to adjust client1/client2.

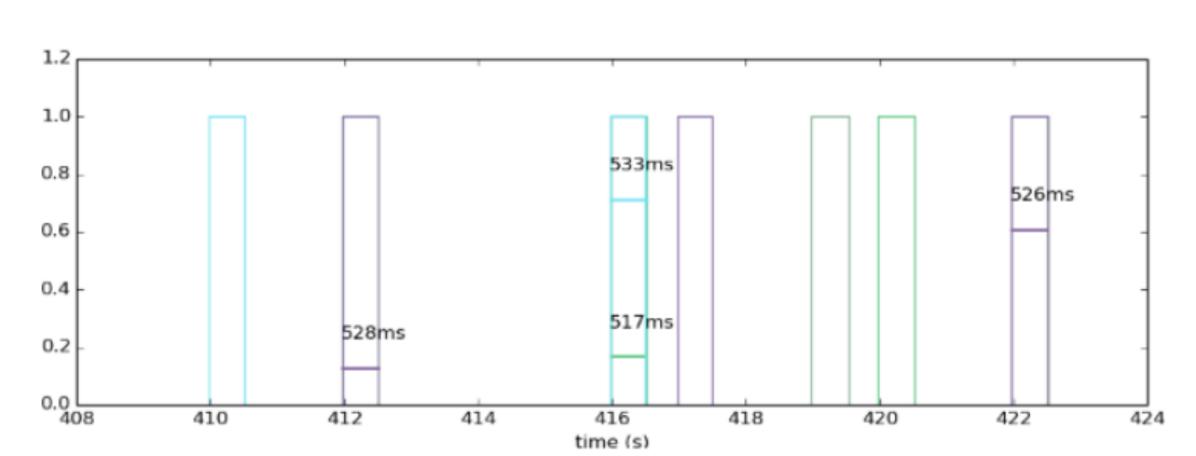
#### Testbed



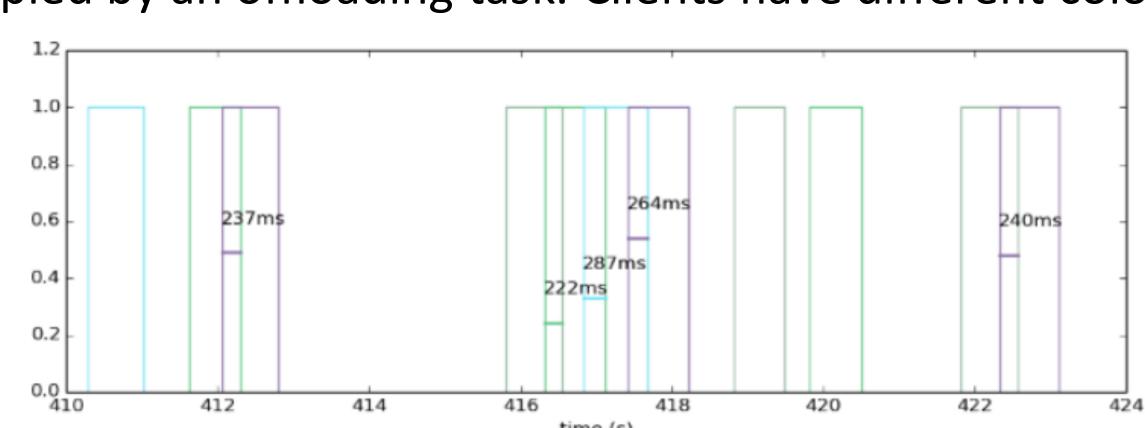
## Dashboard

Testcase: Neural Network Object Detection (https://github.com/pjreddie/darknet)





Queueing delay predicted by Planner. Each pulse is the time slot occupied by an offloading task. Clients have different colors.



Measured queueing delay after offloading time adjustment.









