

# Trends in Computing



THE EDGE

# What is Edge Computing?

**Broadly:** Placing computation and data storage closer to where they are needed

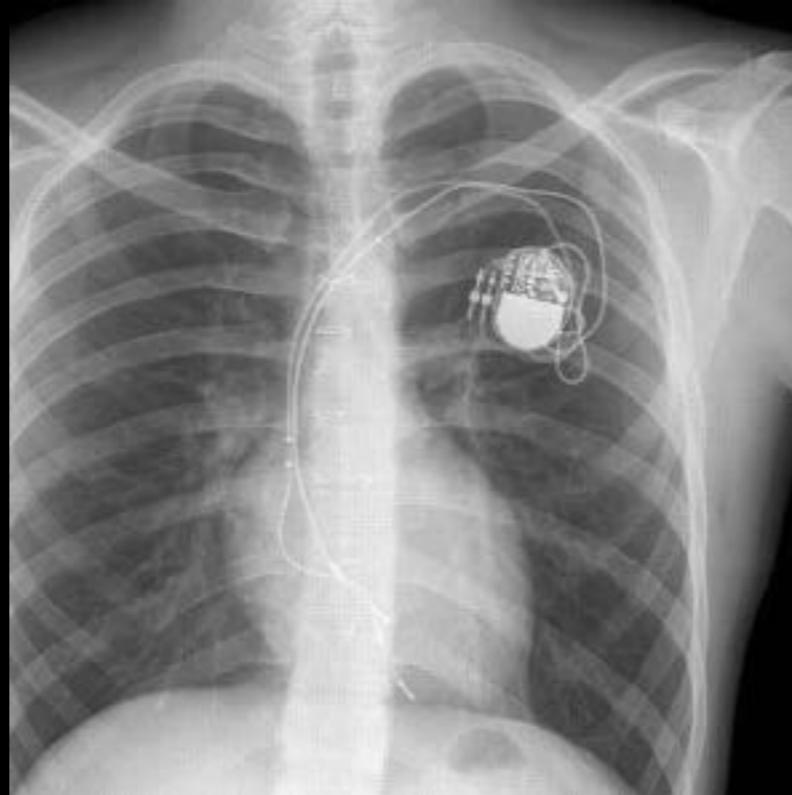
- E.g. content delivery networks (CDNs)

**Here:** Colocating computing resources with sensors

**Remote sensor network**



**Implanted health devices**

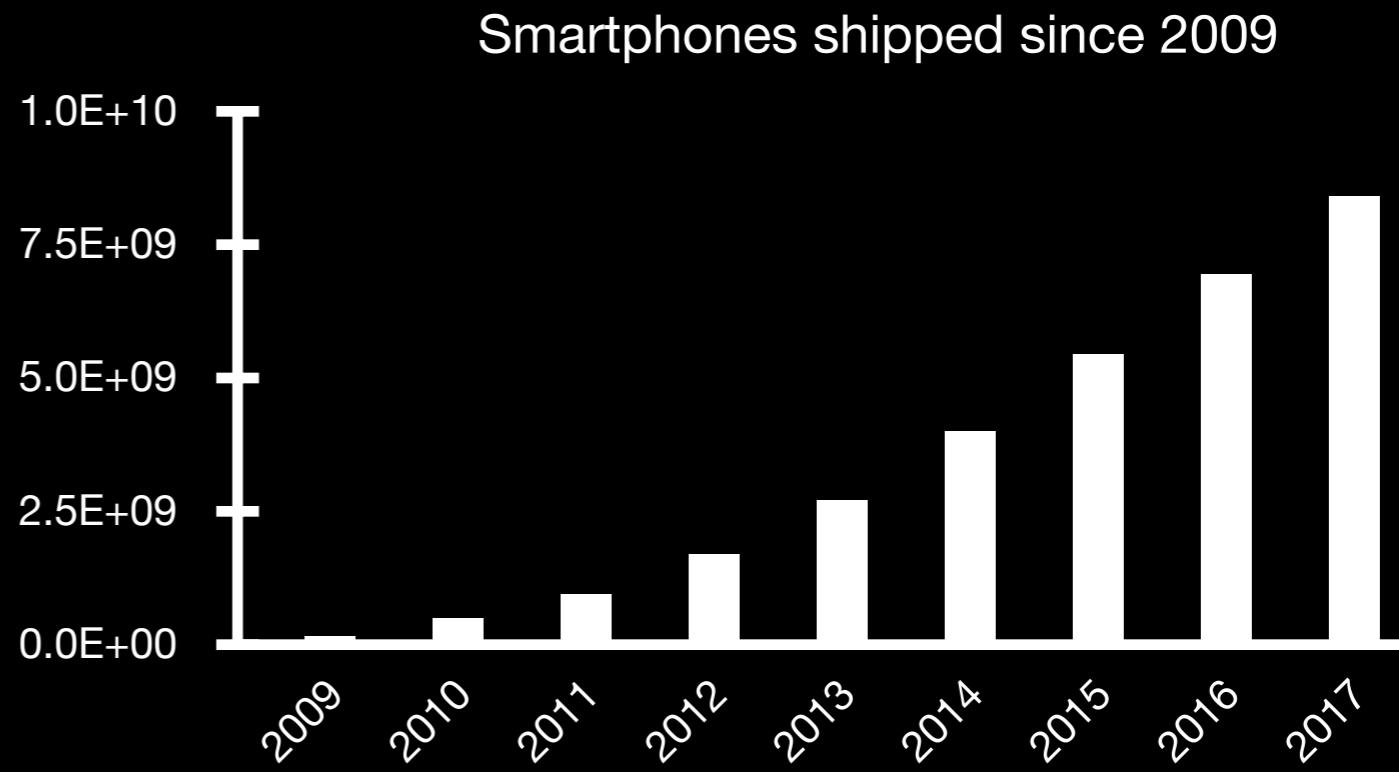
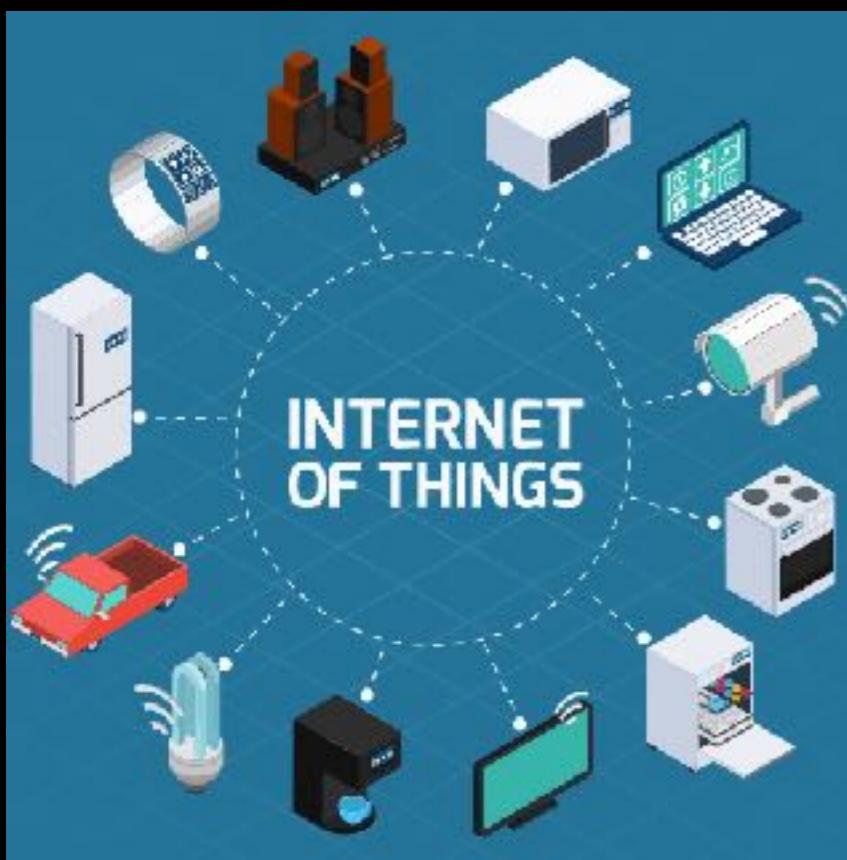


**Space systems**

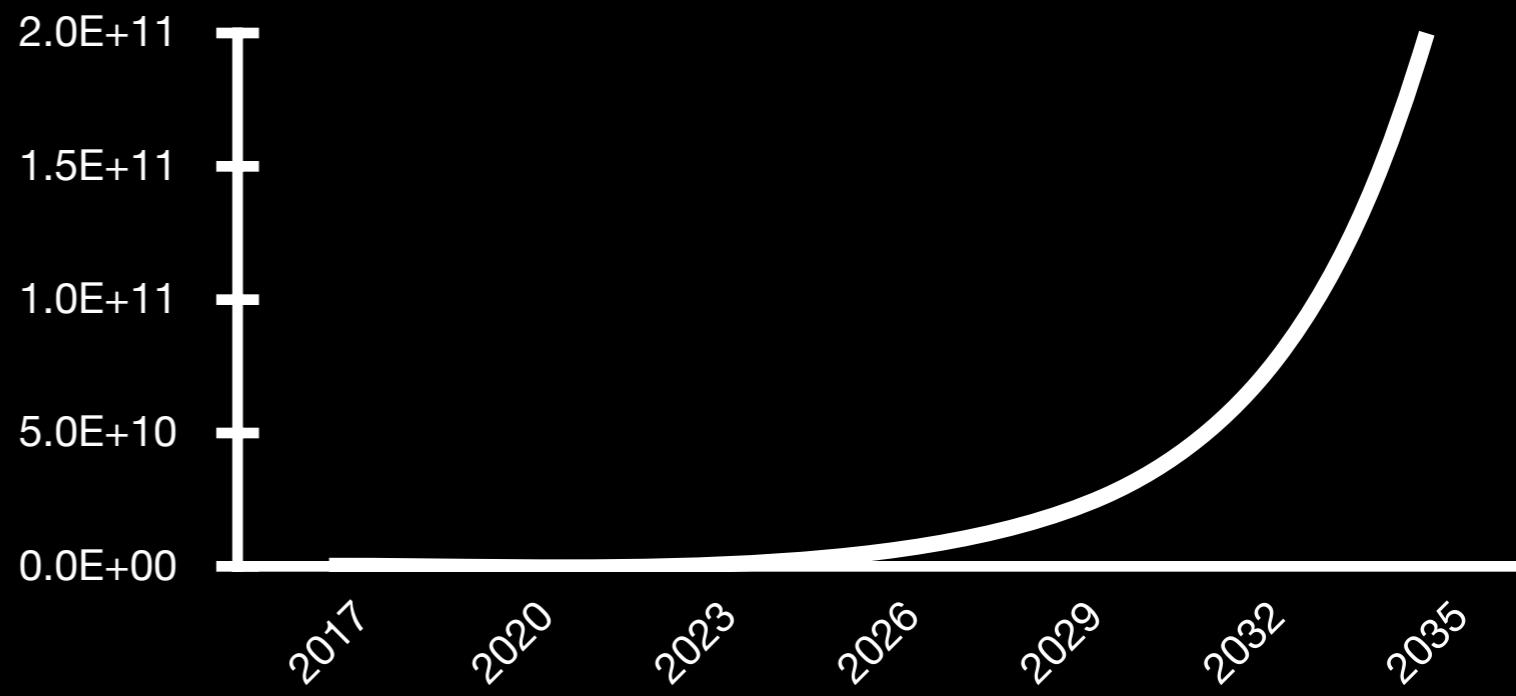


# Proliferation of Edge Devices

## Smartphones



Projected IoT Devices Produced



# Challenges of a Proliferated Edge

## Communication and Utility

- High data volumes result in communication bottlenecks
- High energy cost



## Maintainability, Sustainability

- It is infeasible to maintain trillions of edge devices
- What happens when the battery wears out?

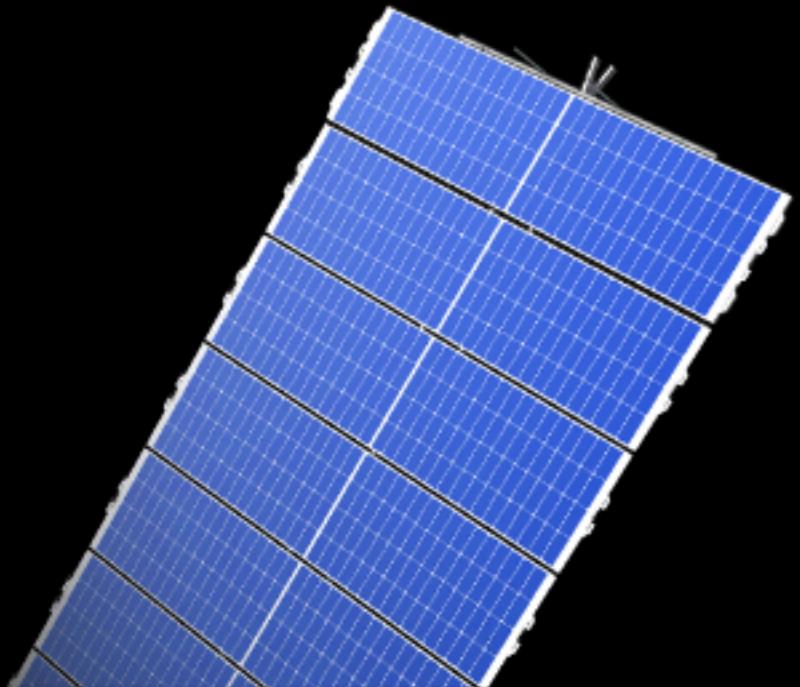


## Security and Privacy

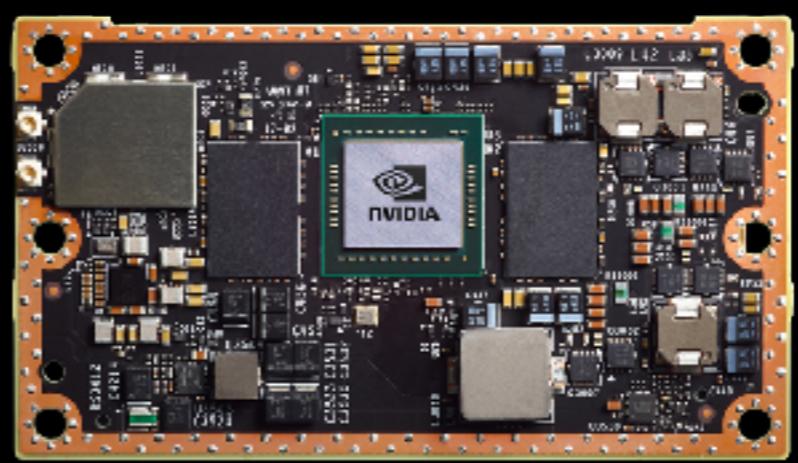
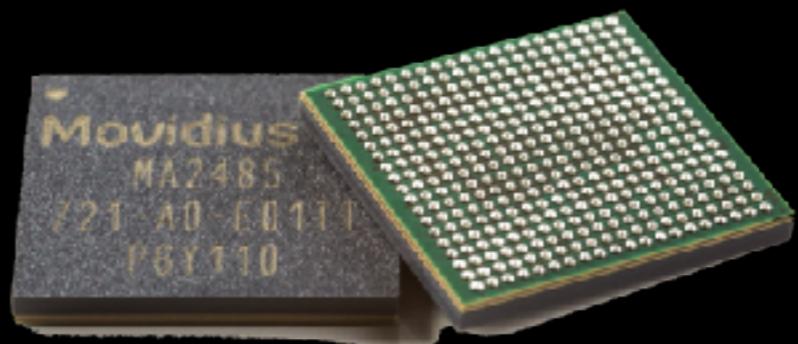
- Centralized data processing is vulnerable to attacks

# Addressing Edge Challenges

## Energy Harvesting and Storage



## Energy-Efficient Edge Computing



## Software, Runtime Techniques

```
configure mode2  
task sense() {  
    d = read_sensor()  
    nexttask proc{}
```

```
preburst burst=mode3  
exec=mode1  
task proc() {  
    if(motion_chk(d))  
        nexttask radio_tx  
    else  
        nexttask sense{}}
```

```
burst mode3  
task radio_tx() {  
    radio_tx("alert!")  
    nexttask sense{}}
```

# Orbital Edge Computing

Brad Denby, [bdenby@cmu.edu](mailto:bdenby@cmu.edu)  
Prof Brandon Lucia

Carnegie Mellon University

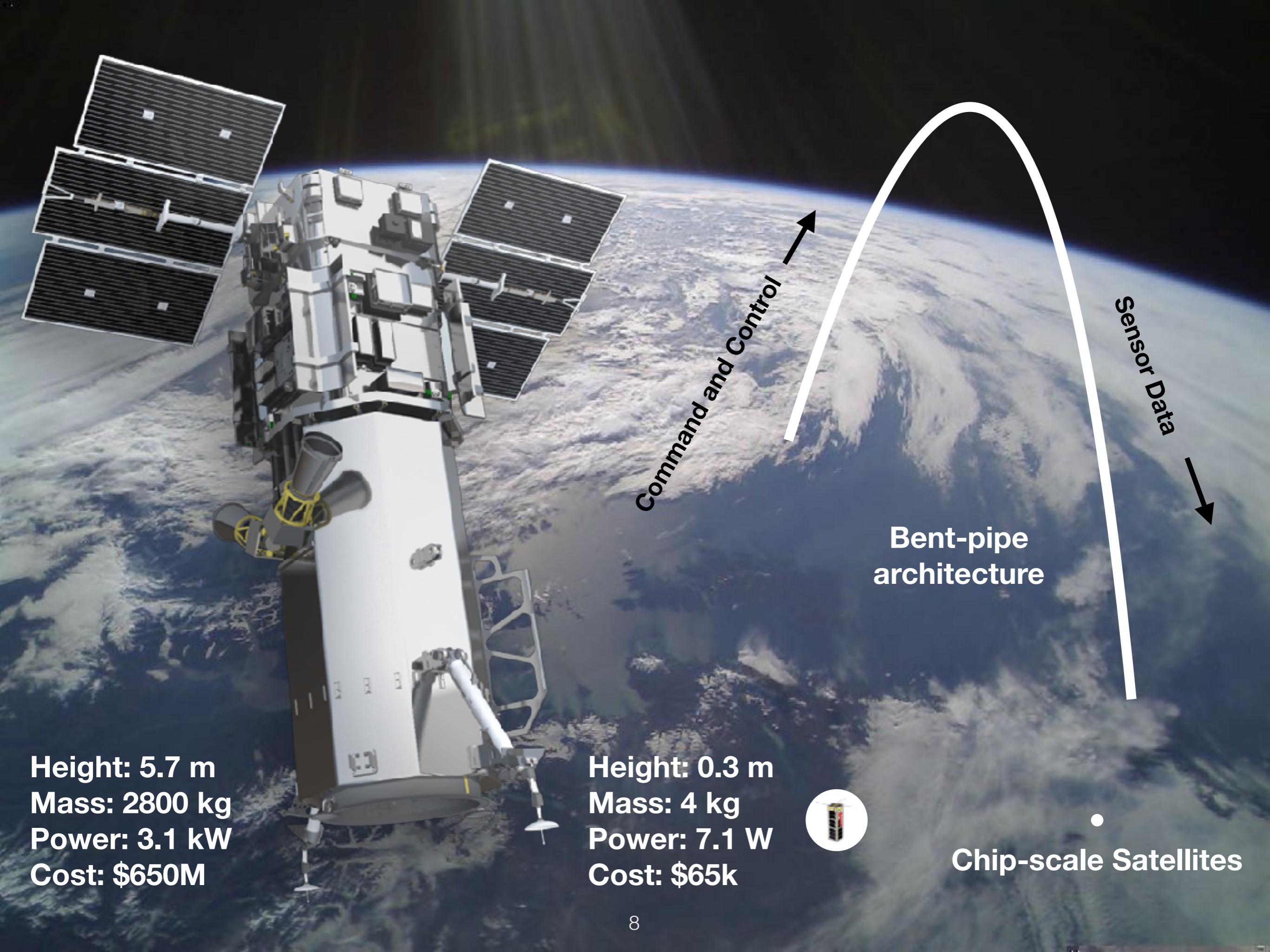
# Overview

**Background: Proliferating space systems**

**Motivation: Nanosatellite constraints**

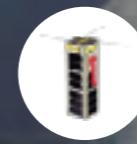
**Orbital edge computing**

**Evaluating constellation configurations**



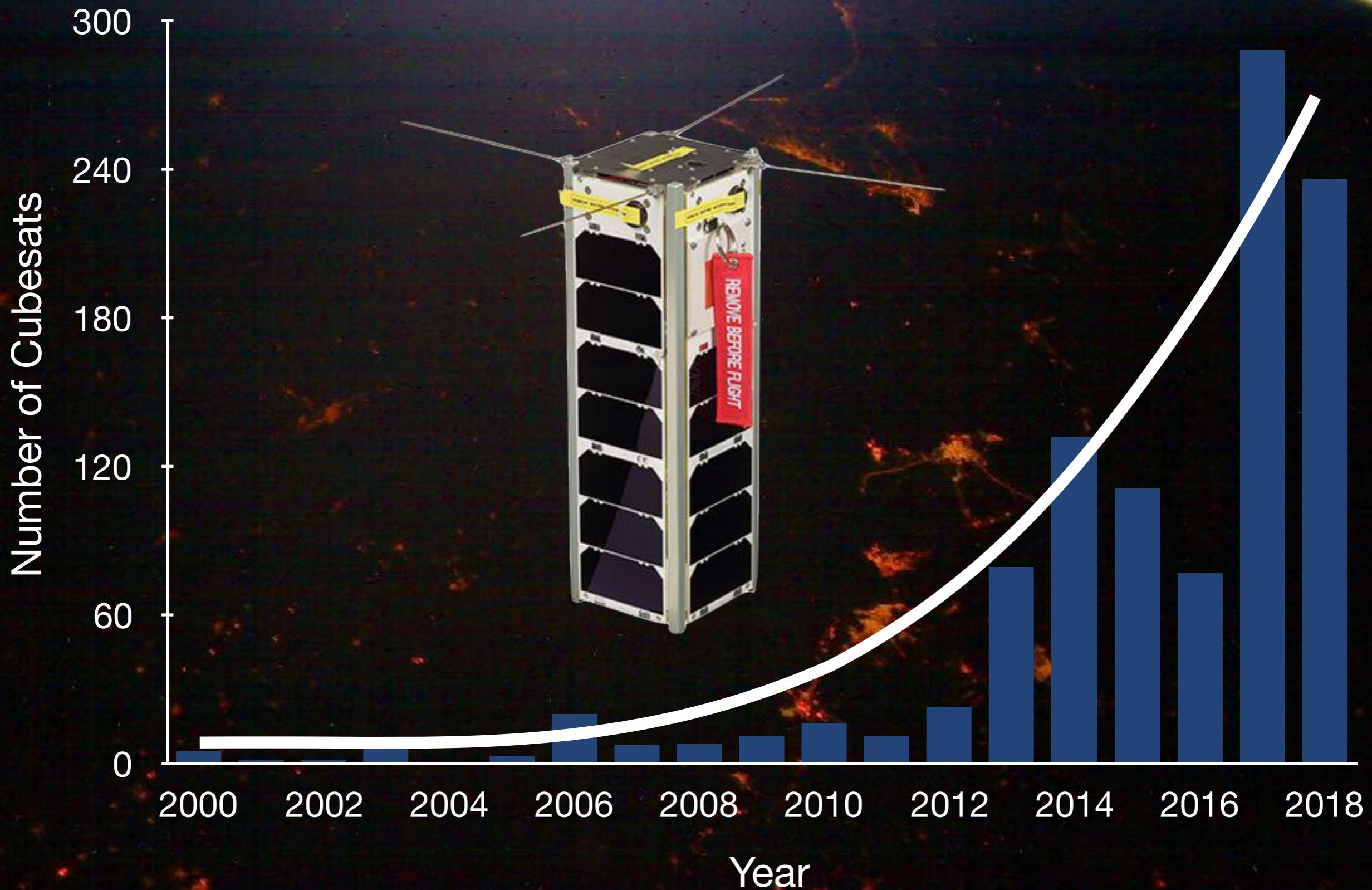
**Height:** 5.7 m  
**Mass:** 2800 kg  
**Power:** 3.1 kW  
**Cost:** \$650M

**Height:** 0.3 m  
**Mass:** 4 kg  
**Power:** 7.1 W  
**Cost:** \$65k



• **Chip-scale Satellites**

# Cubesats Launched by Year



# Overview

**Background: Emerging satellite systems**

**Motivation: Nanosatellite constraints**

**Orbital edge computing**

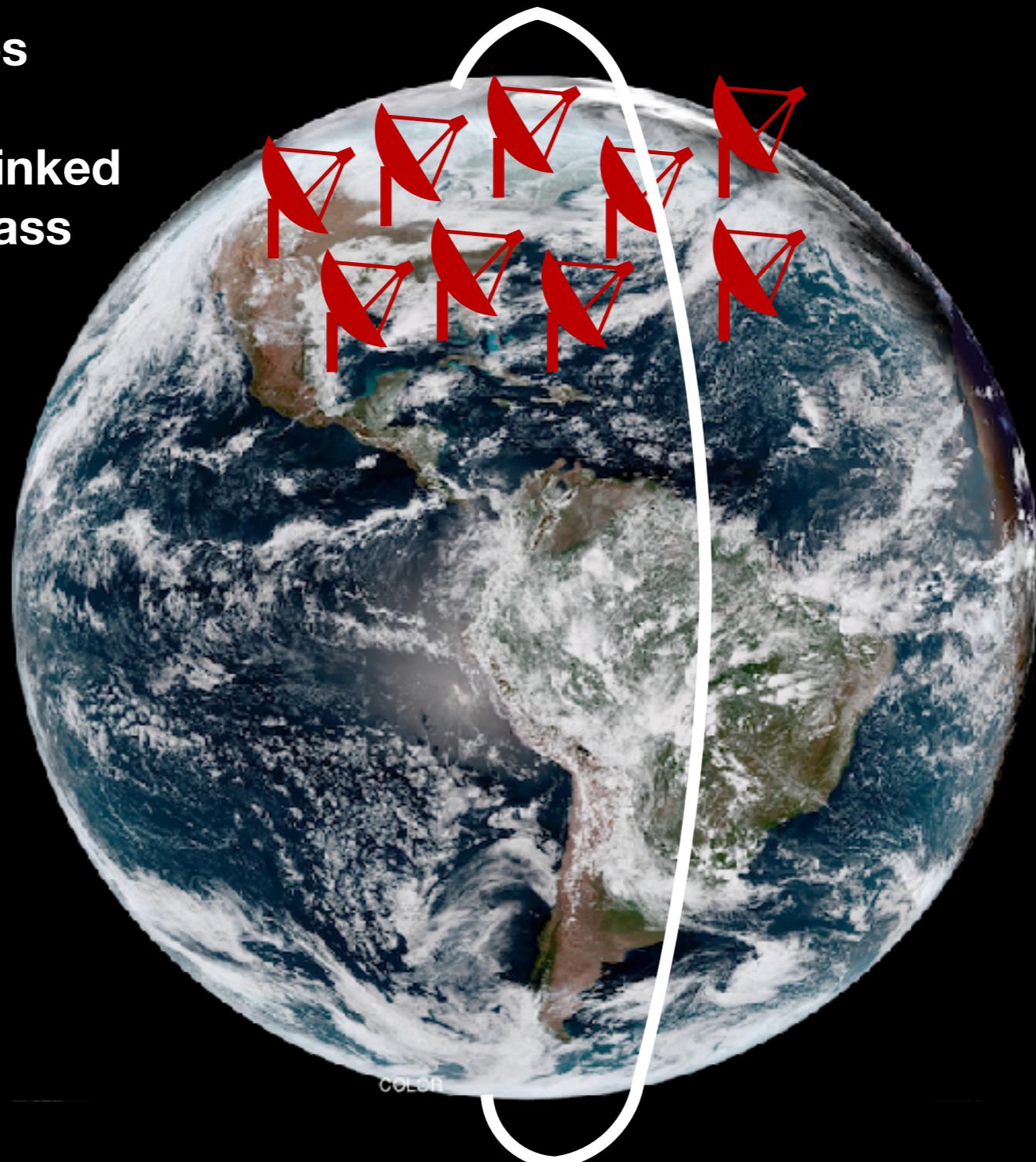
**Evaluating constellation configurations**

# Downlinking Data Does Not Scale

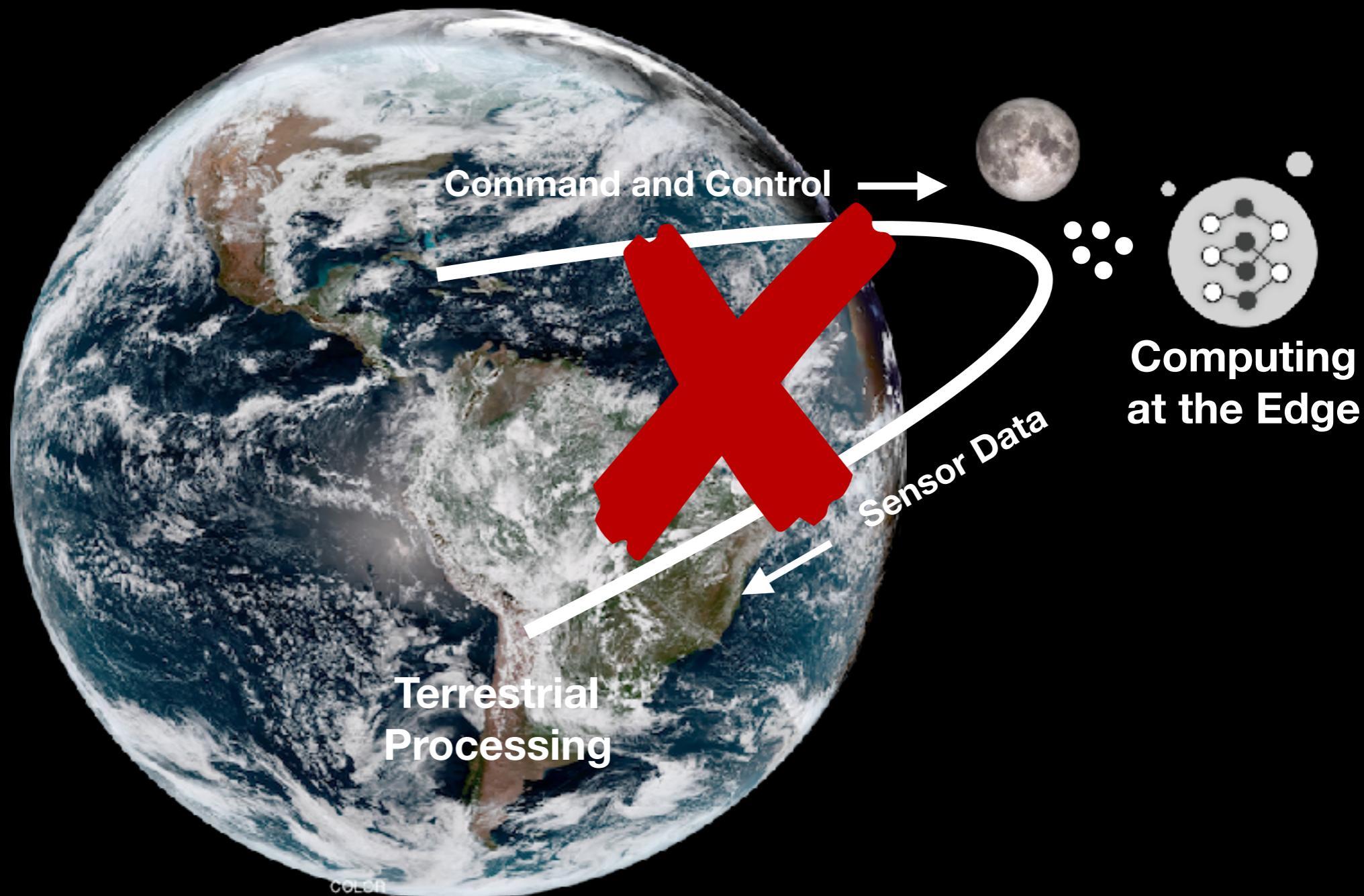
Downlink: 200 Mbps

Duration: <10 min.

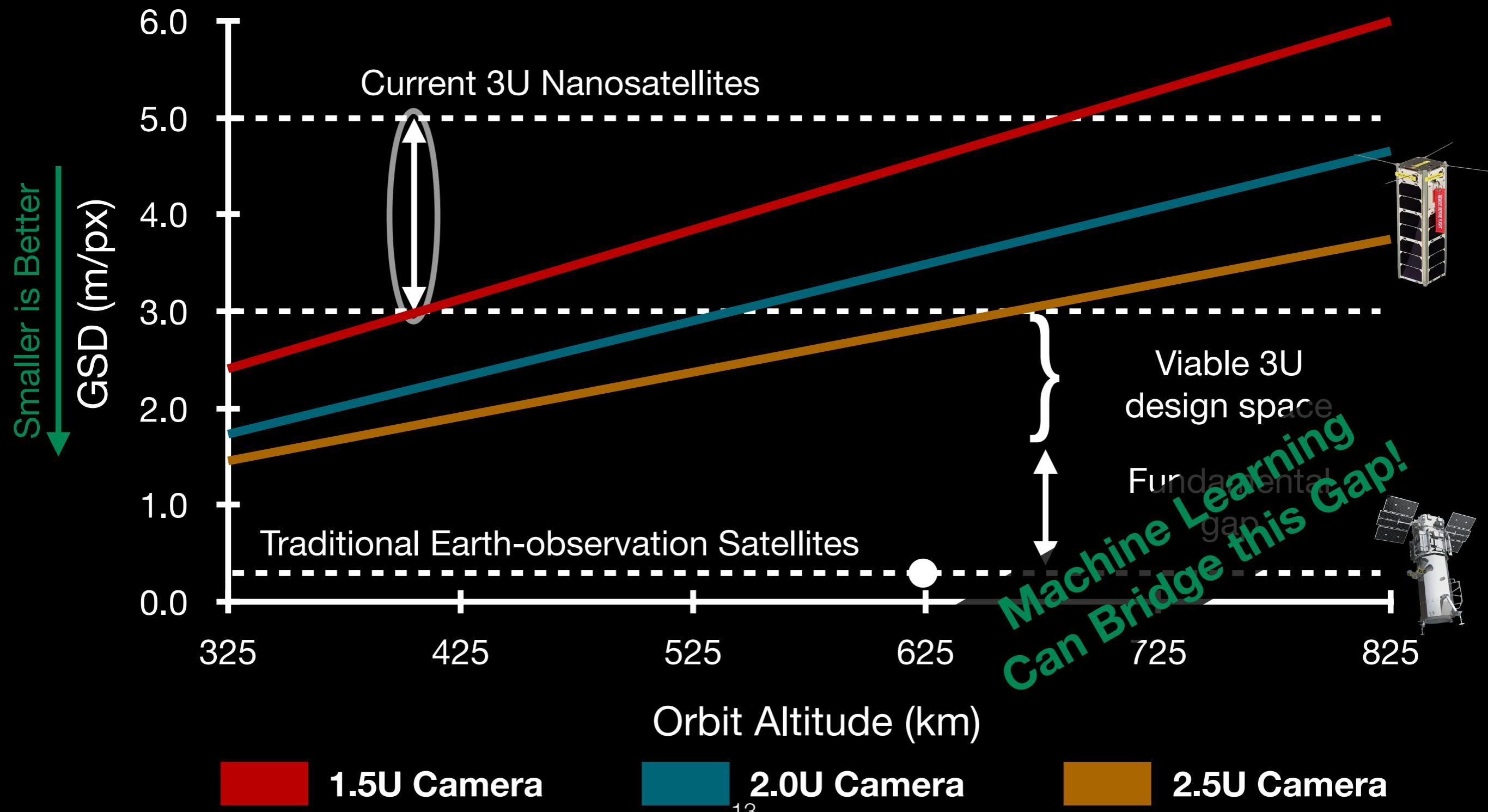
Up to 15 GB downlinked  
per nanosatellite pass

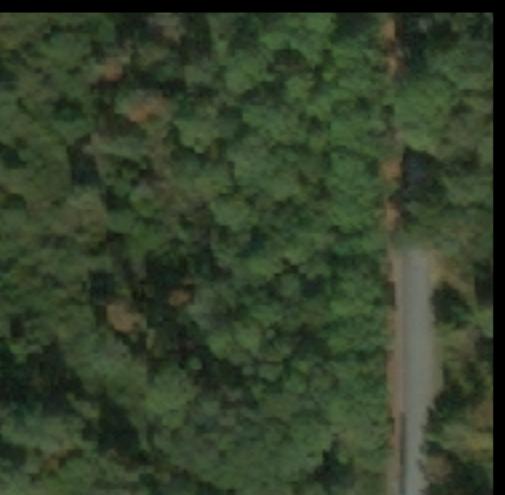
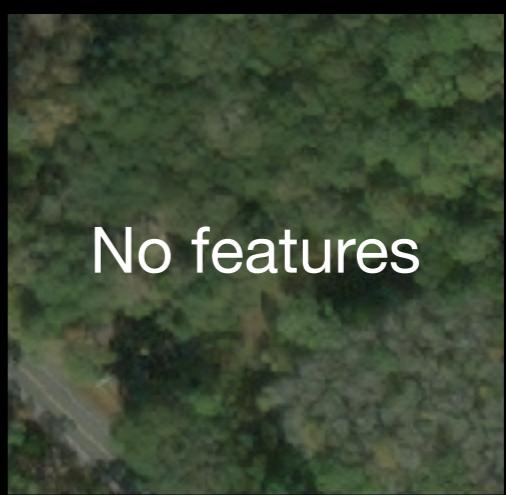
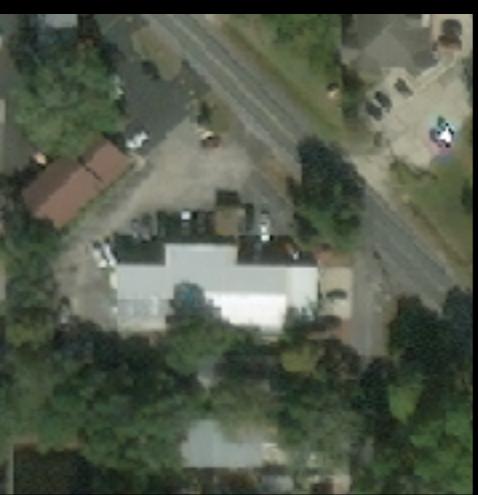
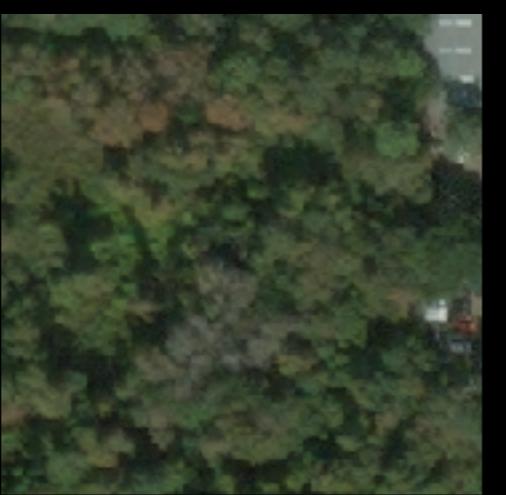
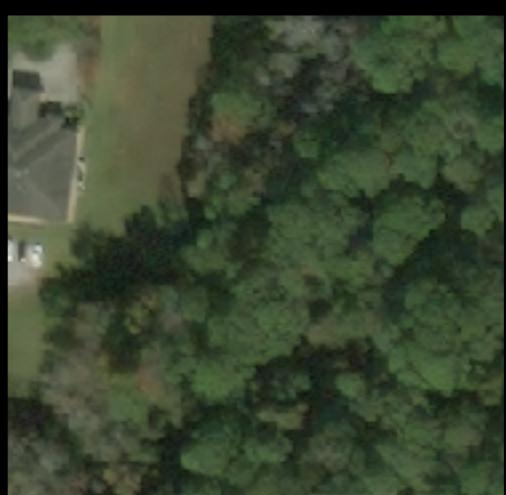
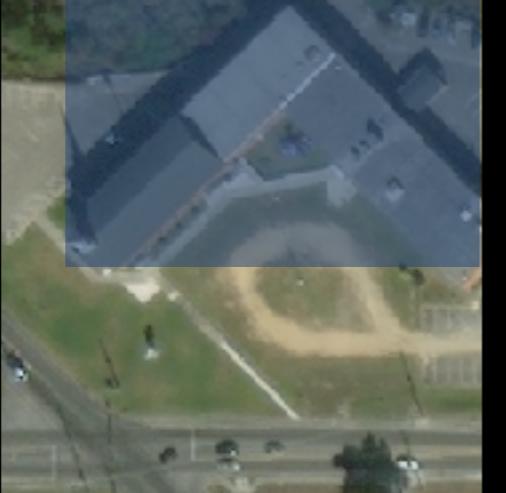


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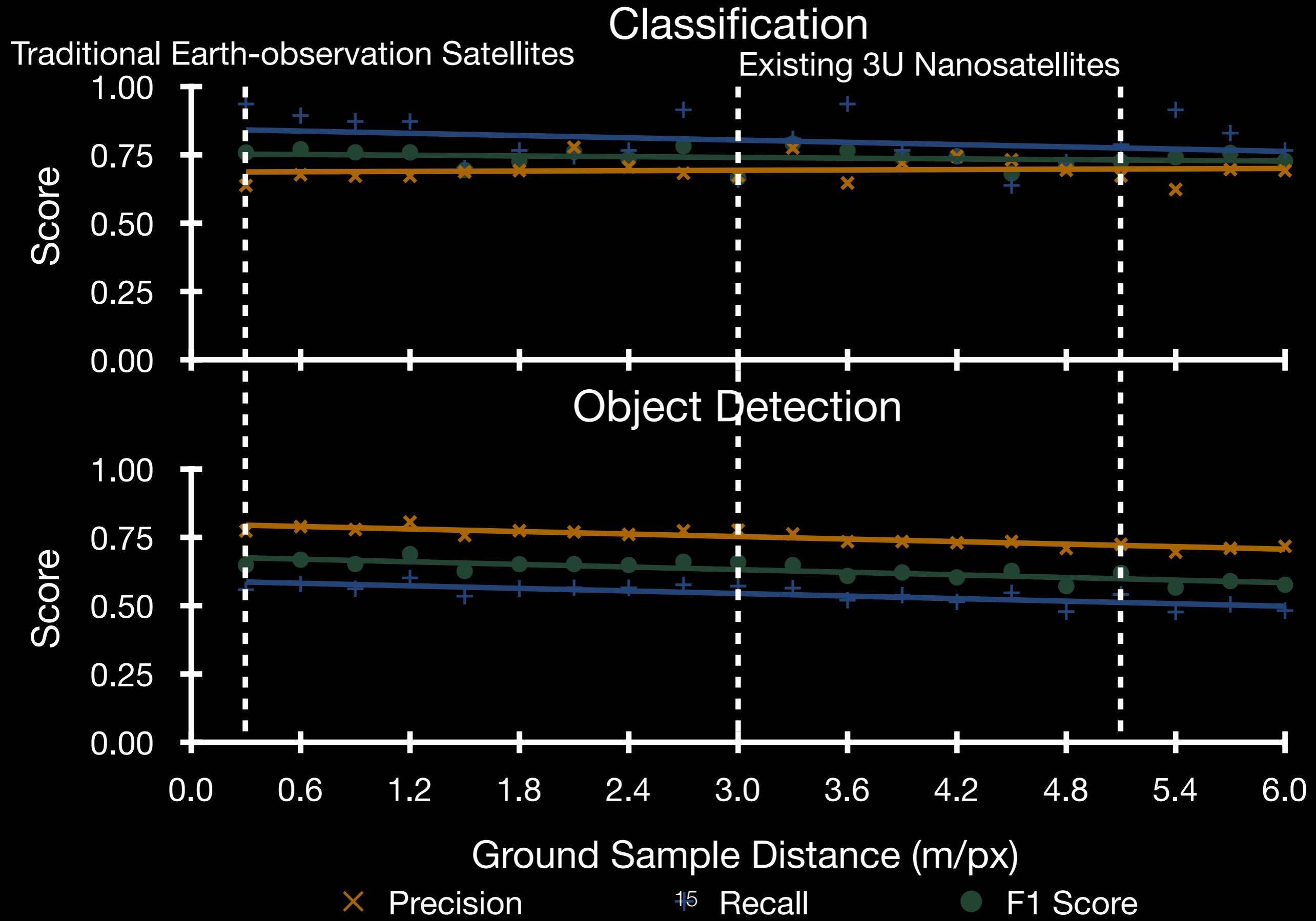


# Designing for Maximum Data Quality



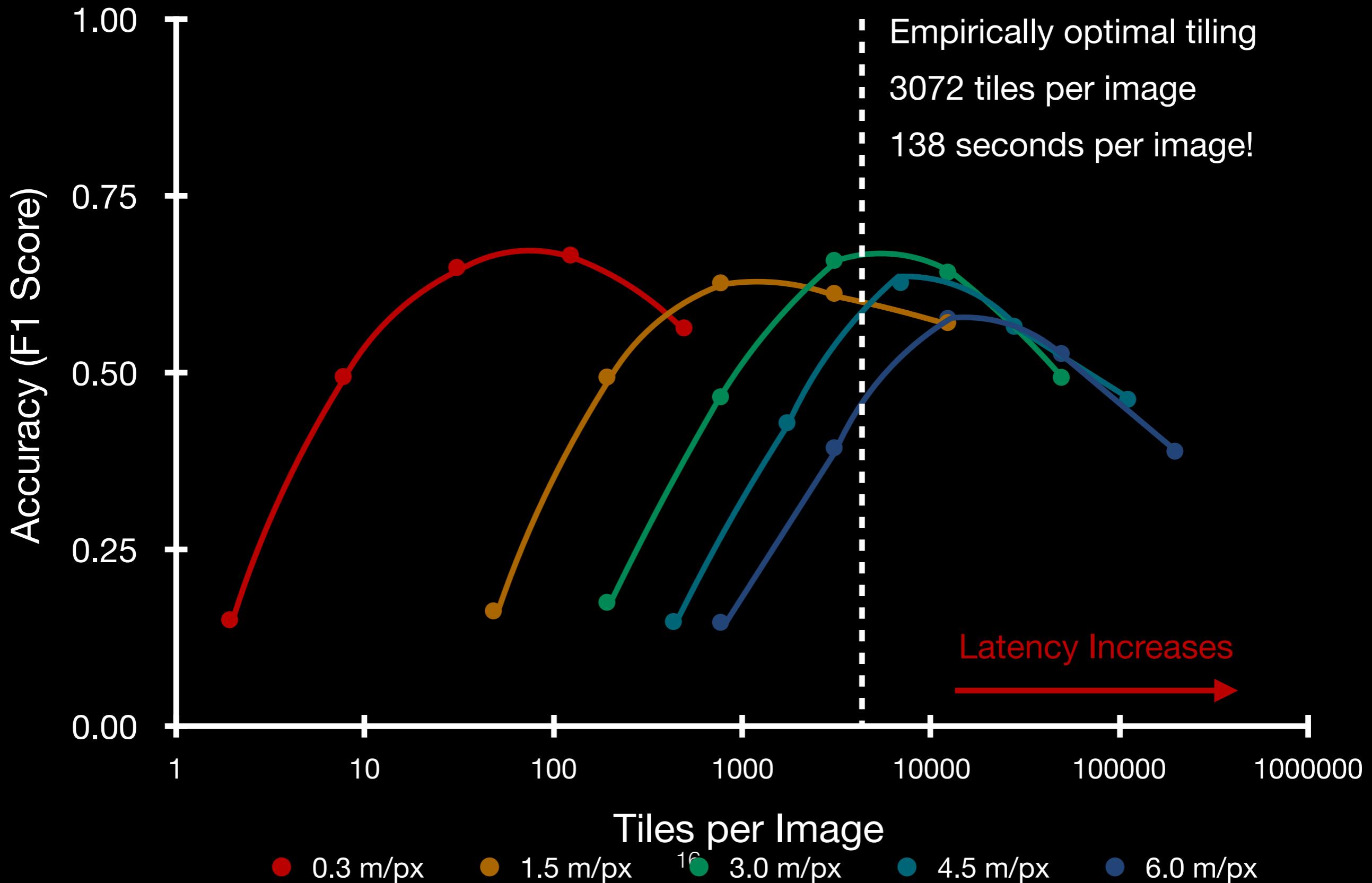


# ML Tolerates Low Data Quality



# Tile Size Determines Accuracy, Latency

## Object Detection



# Overview

**Background: Emerging satellite systems**

**Motivation: Nanosatellite constraints**

**Orbital edge computing**

**Evaluating constellation configurations**

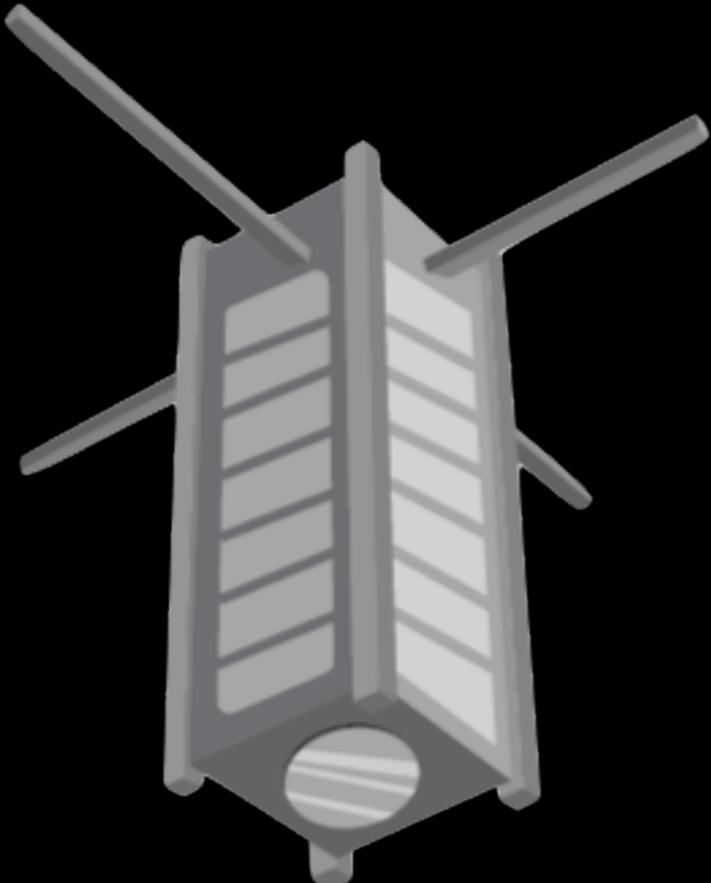
# Orbital Edge Computing

## Existing Systems

Communication

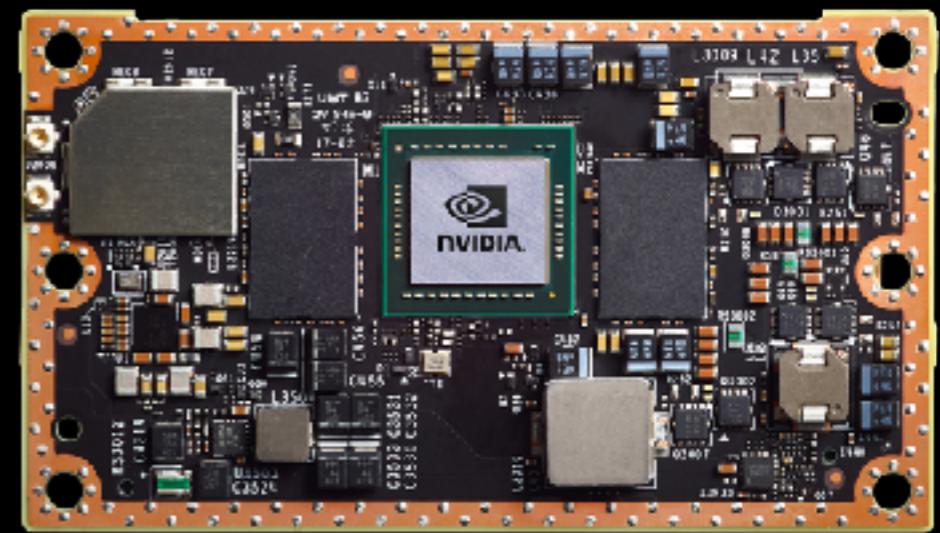
Guidance,  
Navigation,  
& Control

Sensors



## Edge Computing in Space

Jetson TX2 Compute Module



Capacitor-based energy storage



# Evaluating Orbital Edge Computing

## Tiled Ground Track Frames



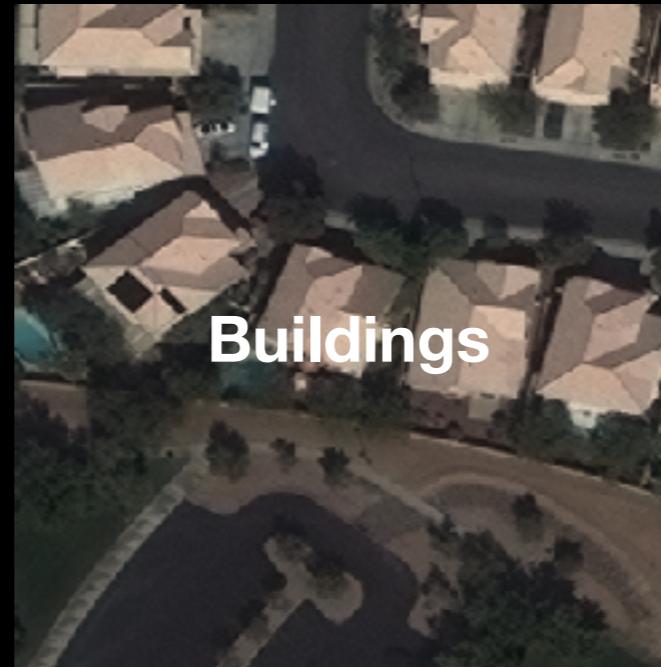
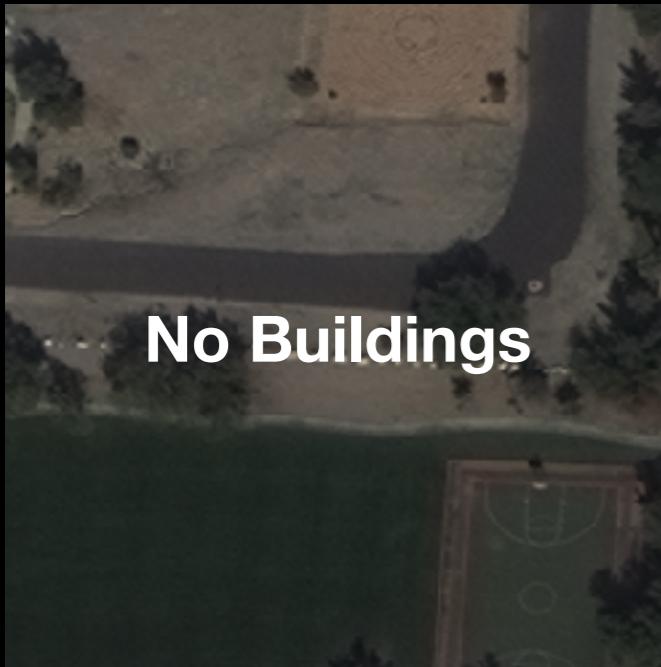
## Resized Input



### Image Classification

Average Power: 8.81W

Time per Tile: 0.0105s



### Object Detection

Average Power: 11.3W

Time per Tile: 0.0449s



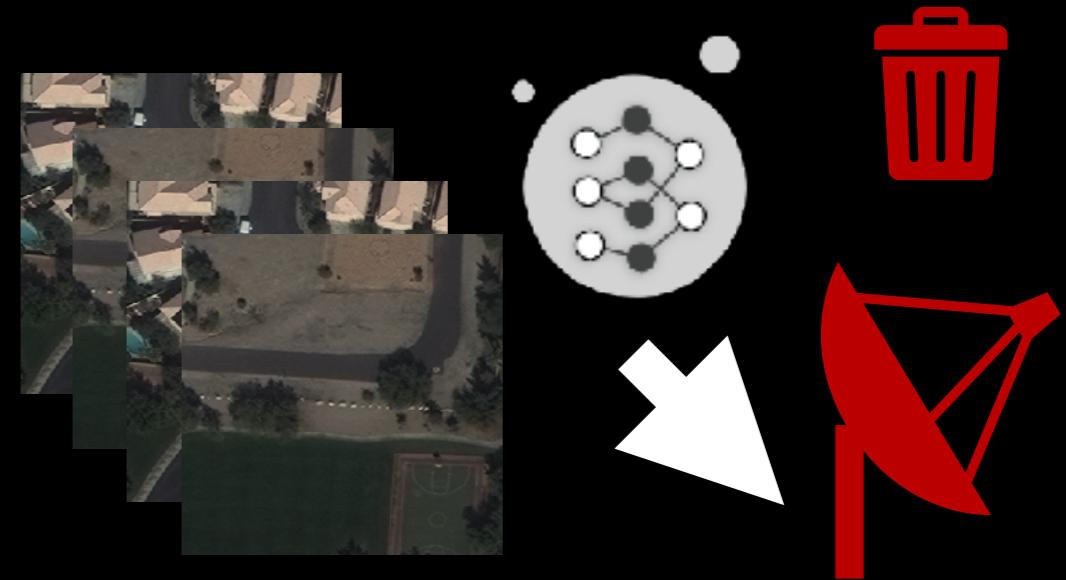
Onboard Inference

# Intelligent Early Discard

Downlink All Data



Classify and TX



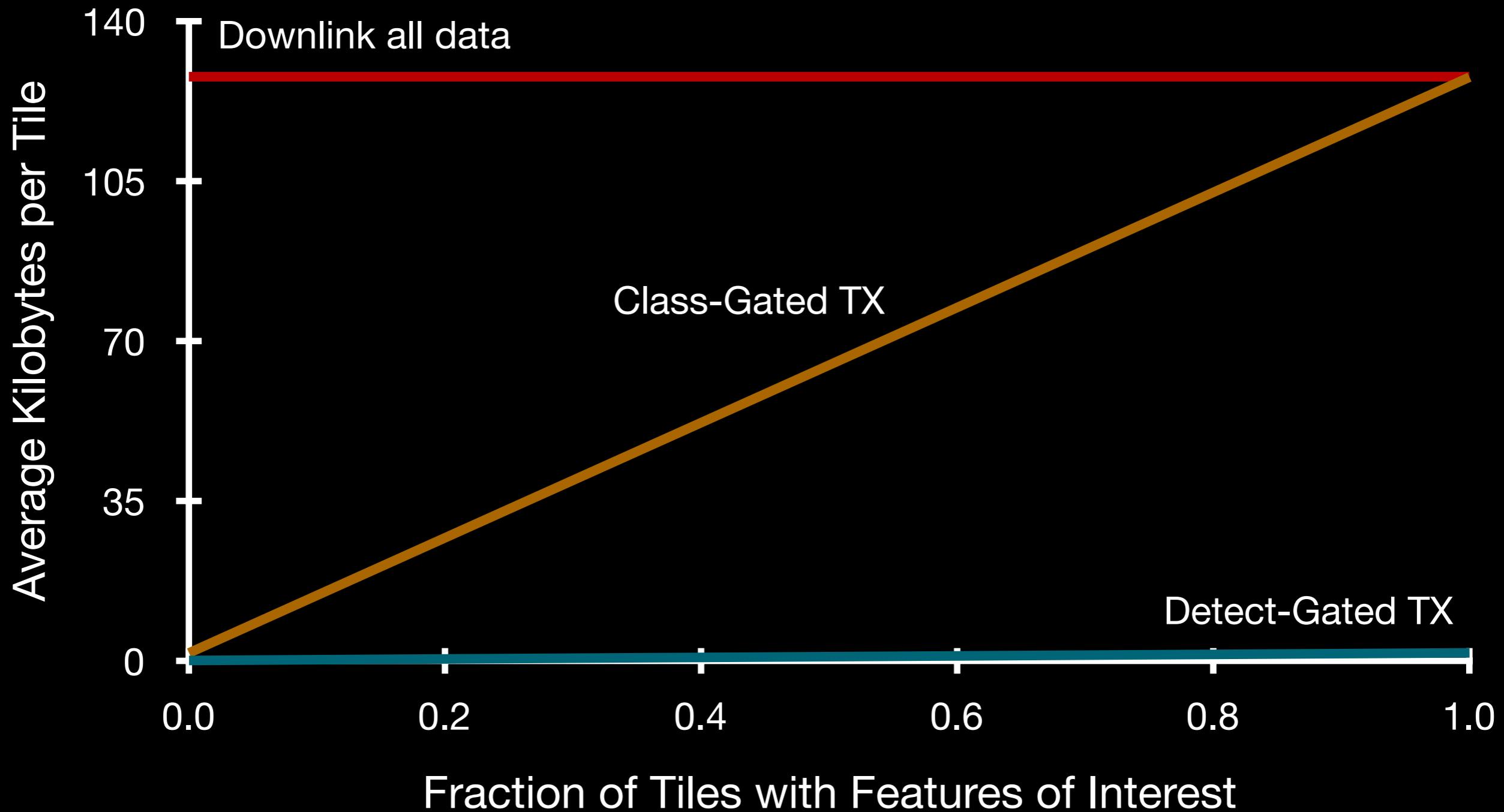
Detect and TX



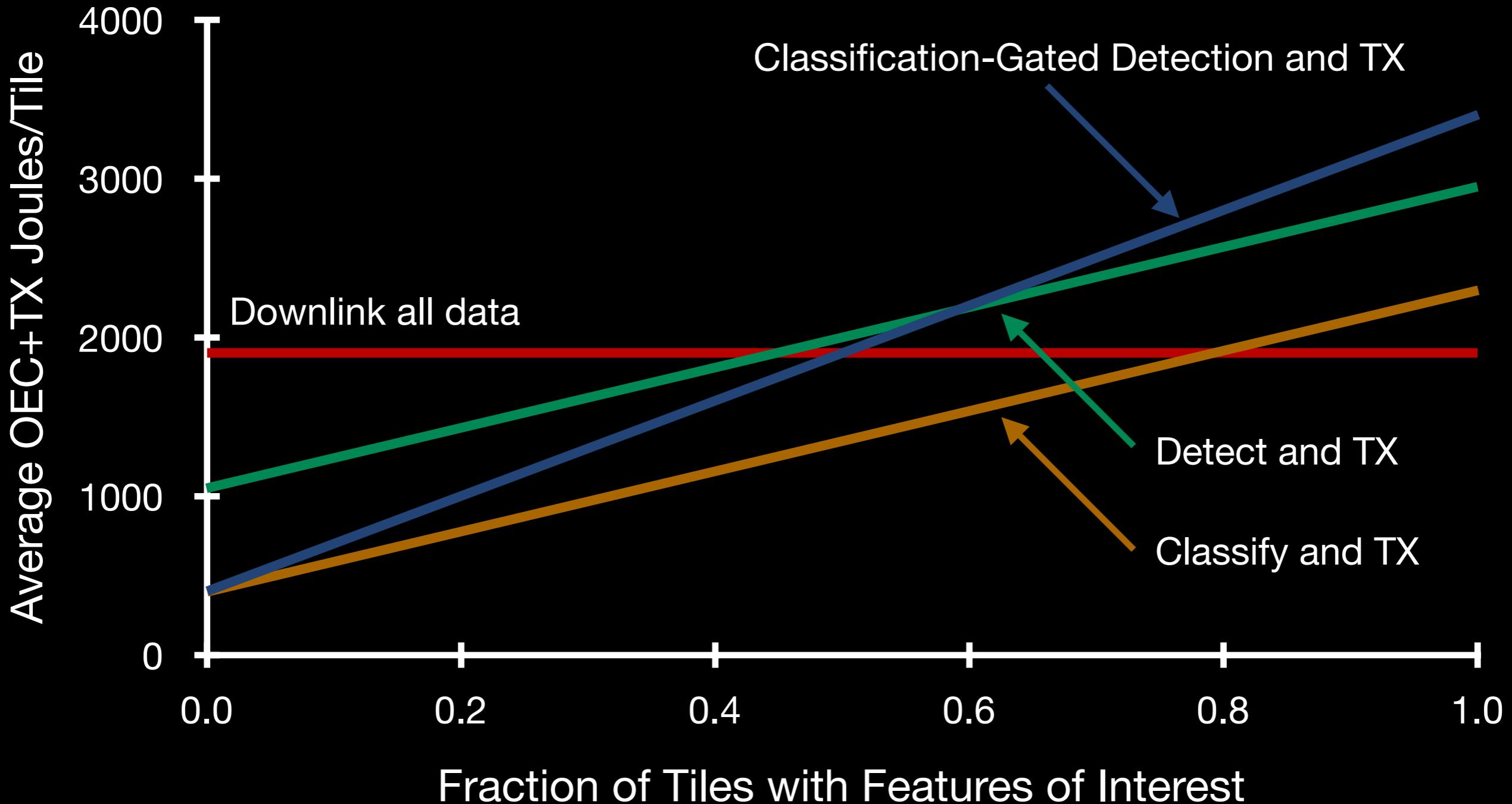
Class-Gated  
Detect and TX



# Early Discard and Data Volume



# Early Discard and Energy Efficiency



# Avoiding Redundant Data

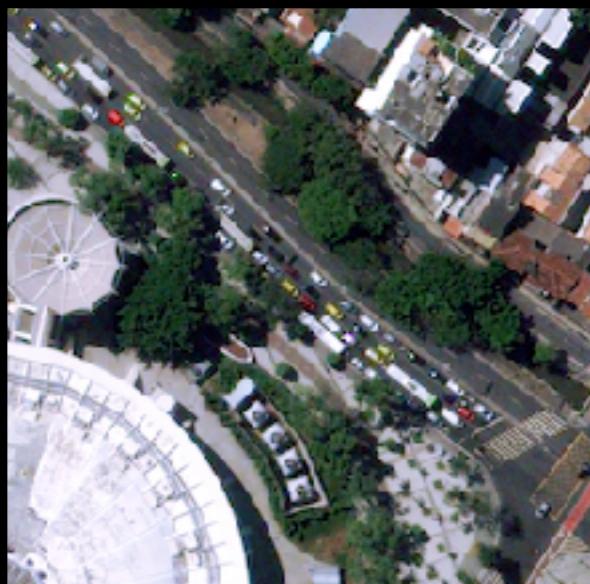
Well-defined orbit trajectories allow precise tuning of sample rates to avoid redundant data

**Example:**

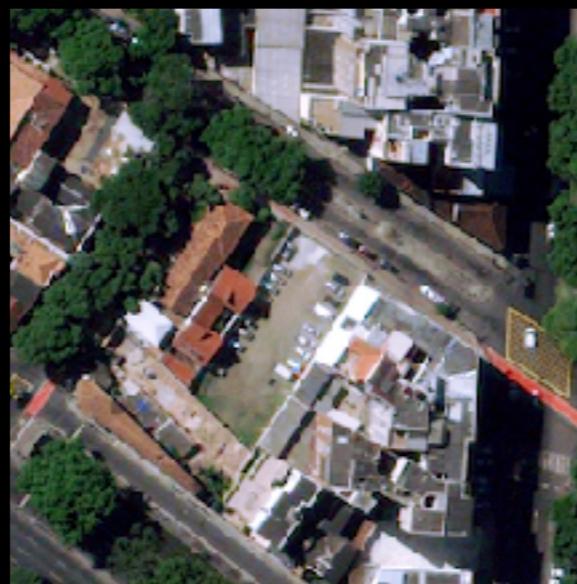
**400km orbit**  
**4K camera**  
**1.7s/frame**



Ground Track Frame 1



Ground Track Frame 2

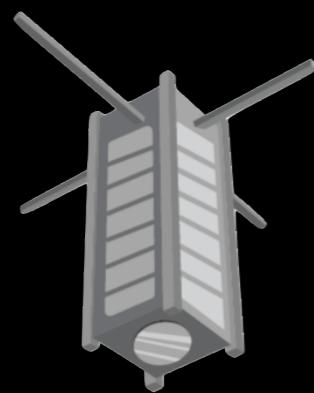


Ground Track Frame 3

Ground Track Frame 4

# Leveraging Large Device Counts

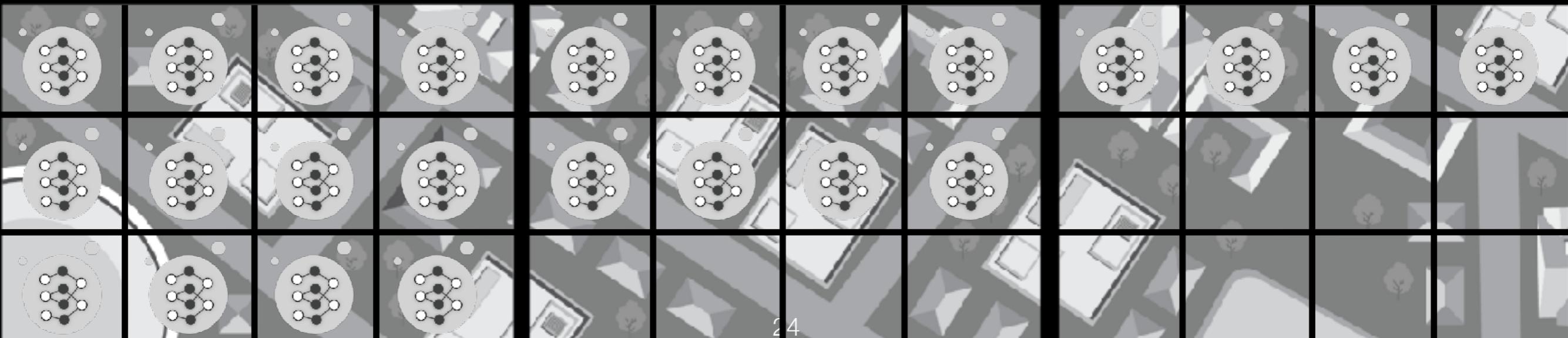
Computational Nanosatellite Pipeline: a convoy of nanosatellites in the same orbit with data processing statically distributed among devices



GROUND TRACK FRAME 1

GROUND TRACK FRAME 2

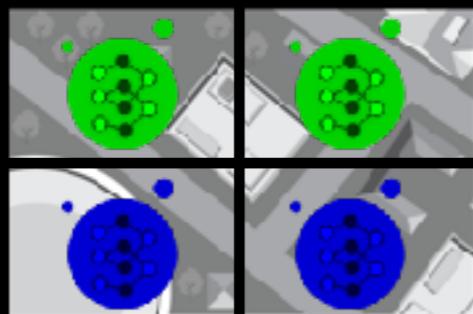
GROUND TRACK FRAME 3



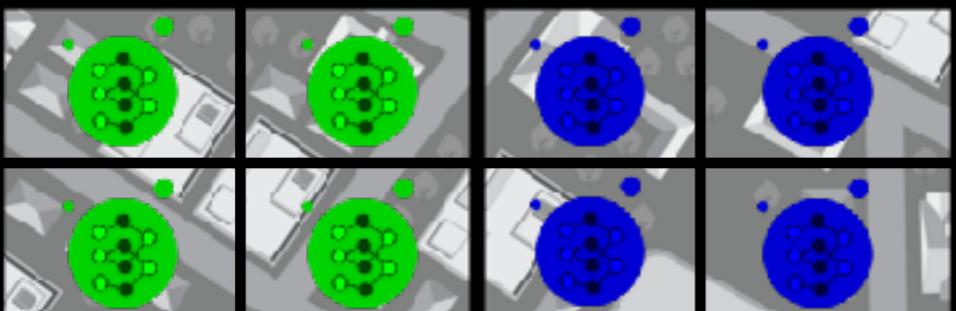
# CNP Configurations

## Processing Distribution

Tile-parallel



Frame-parallel

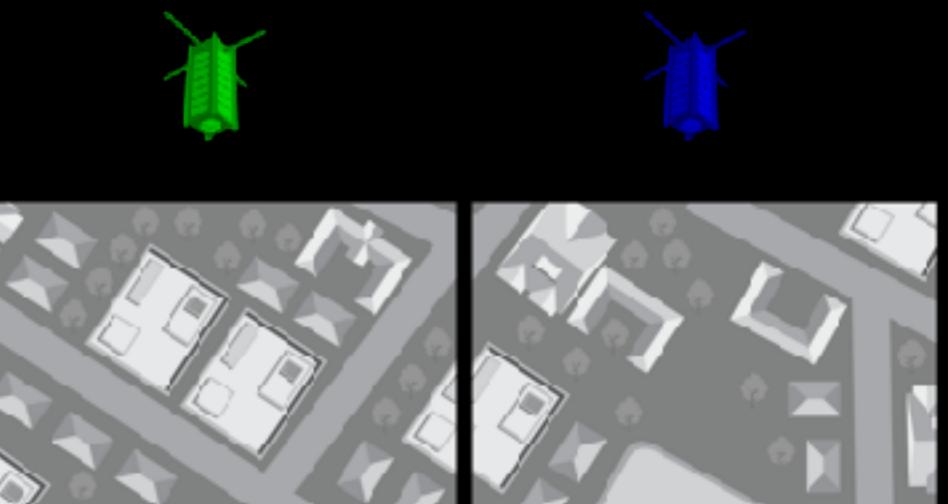


## Data Distribution

Close-spaced



Frame-spaced



# Overview

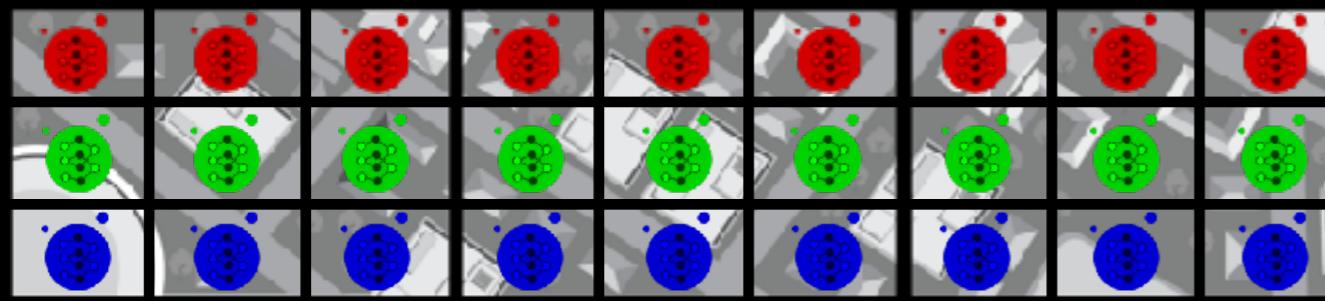
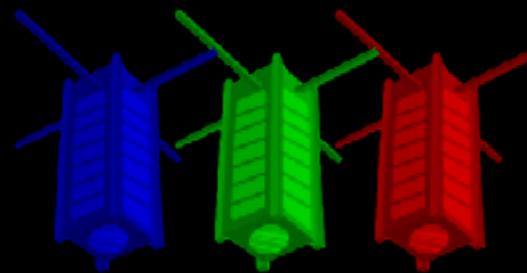
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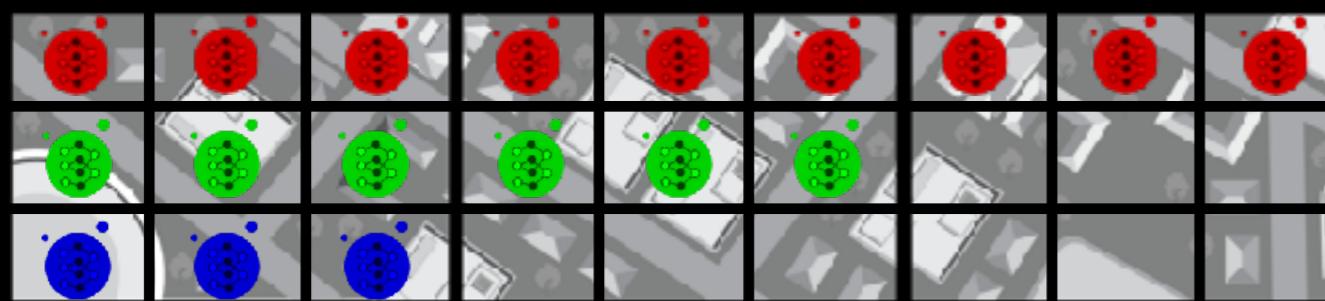
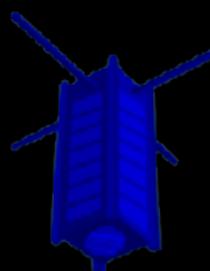
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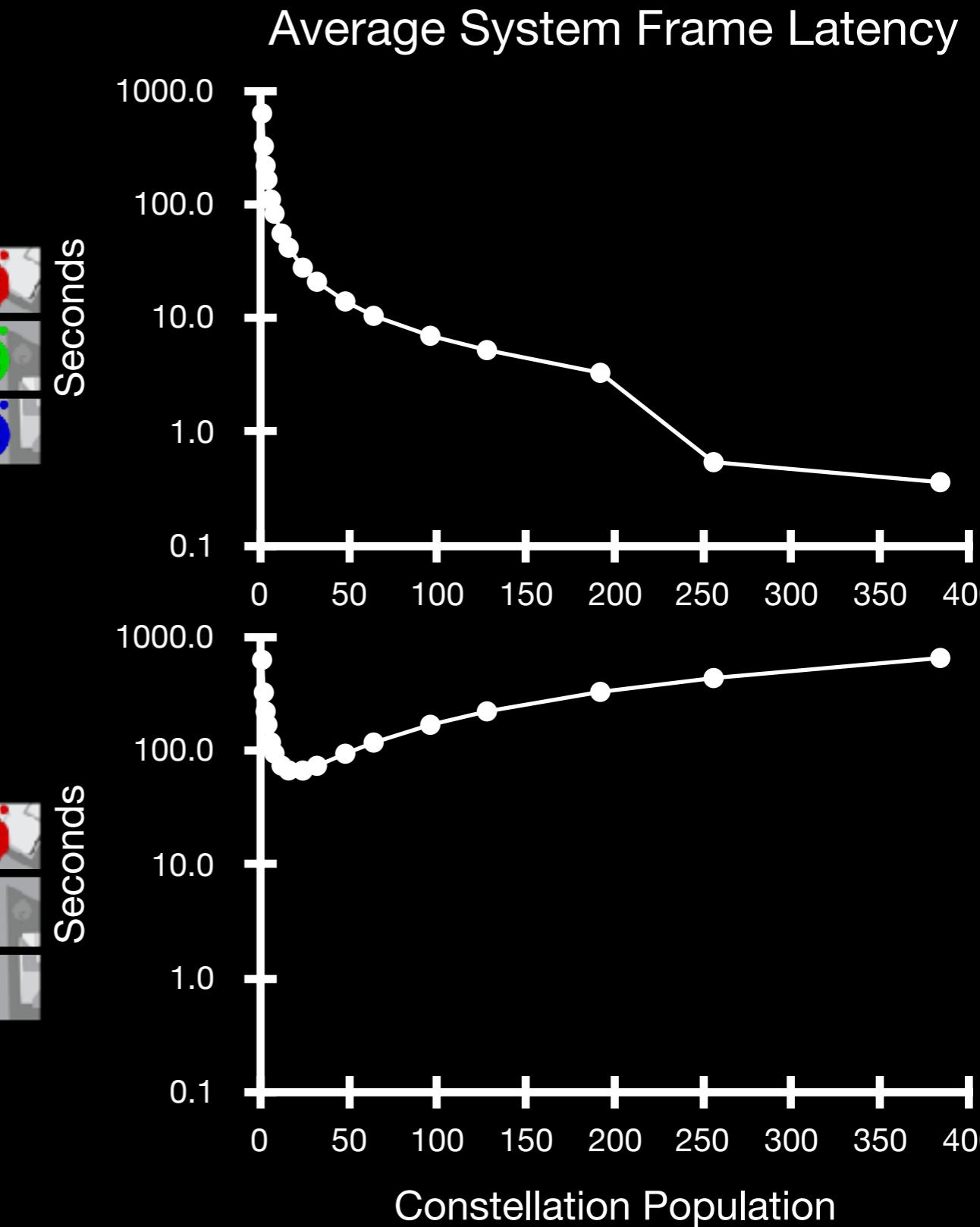
# Tile-parallel: Close- vs Frame-spaced



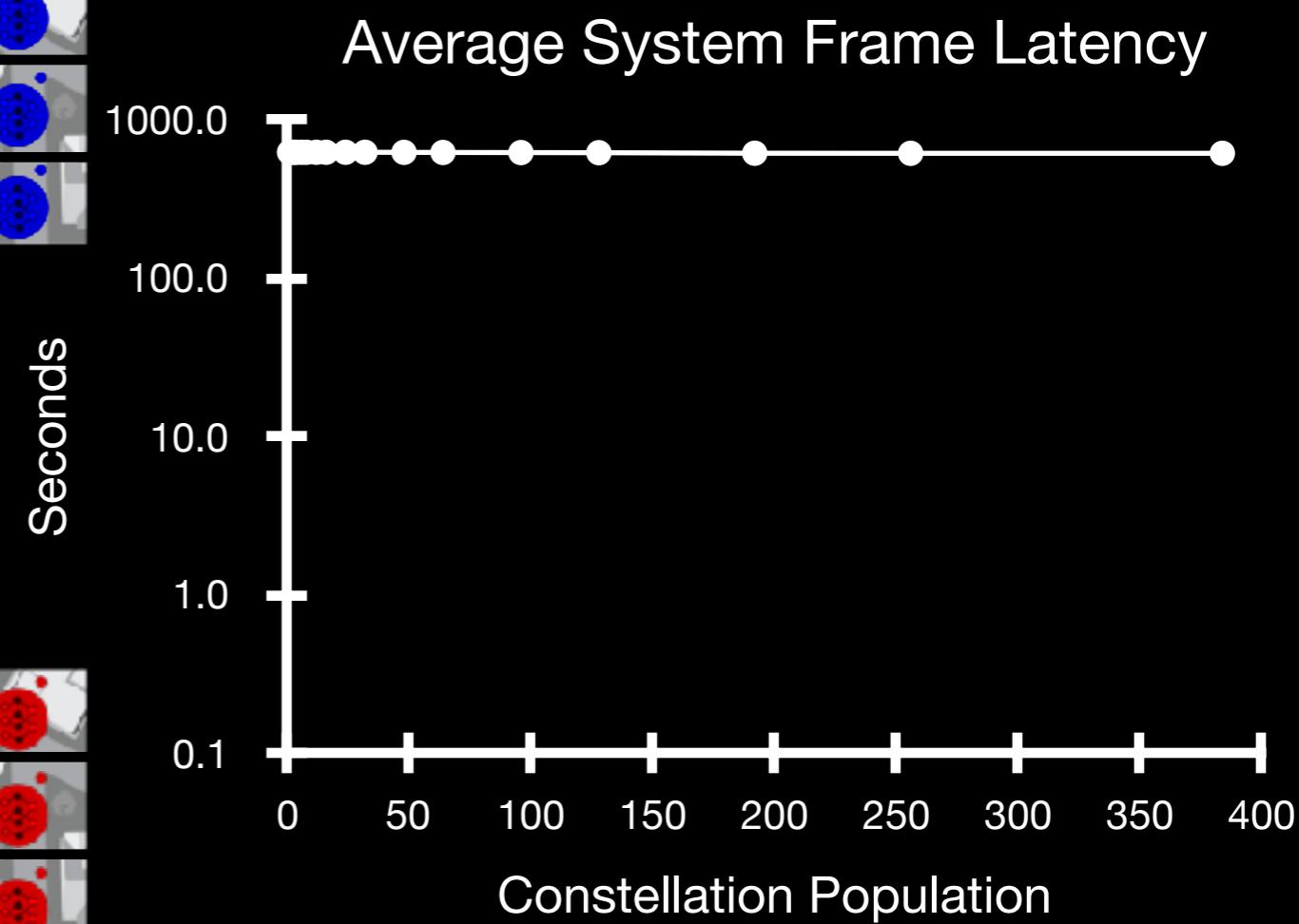
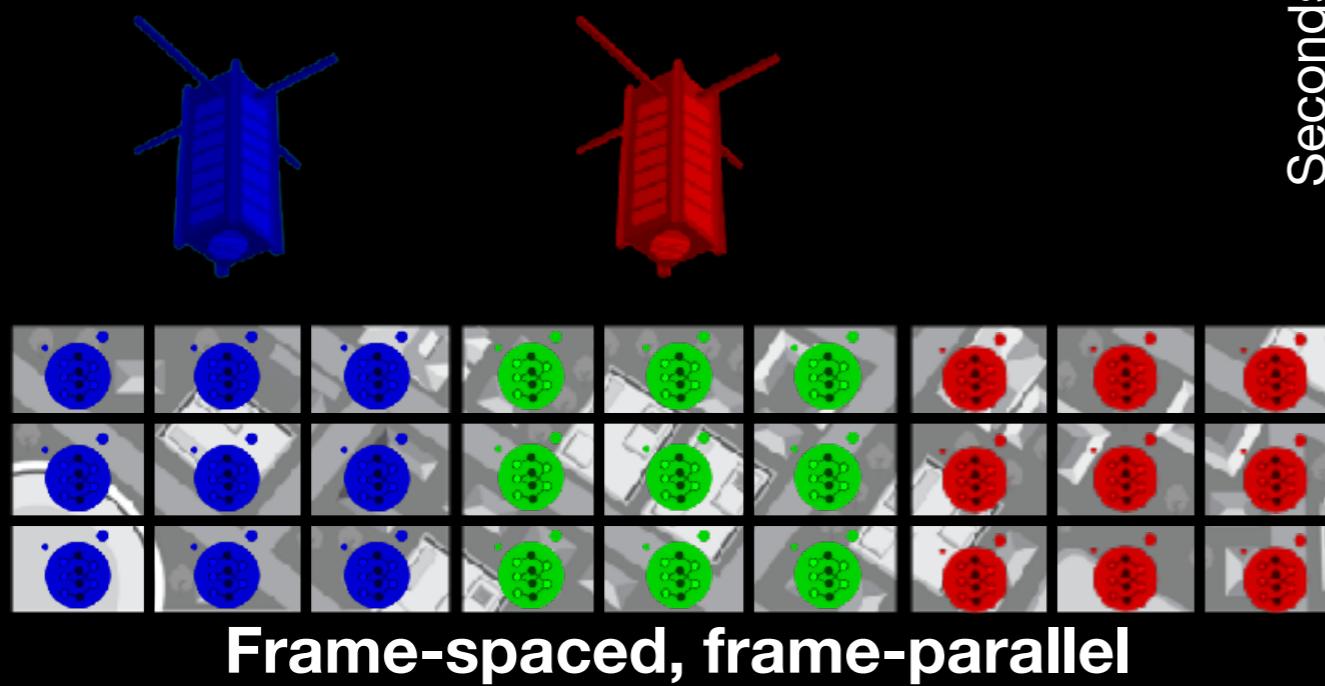
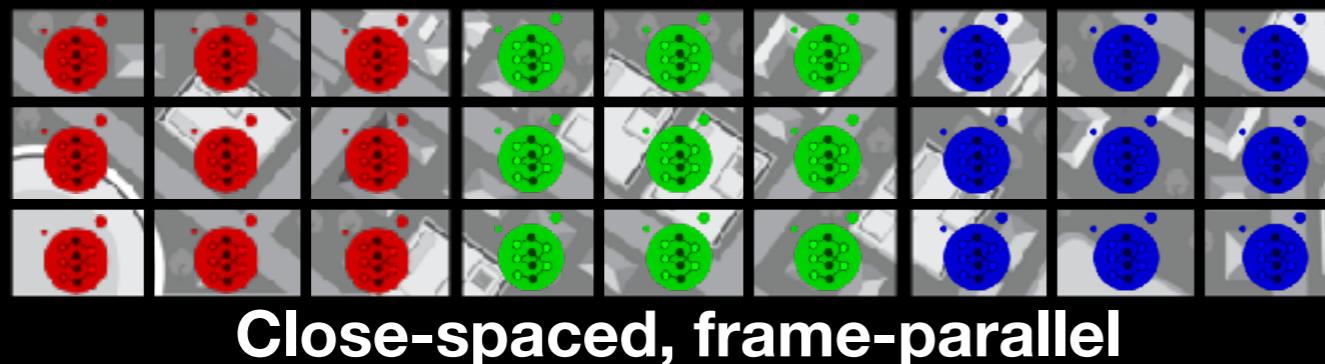
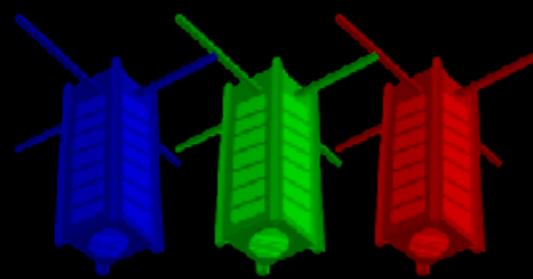
Close-spaced, tile-parallel



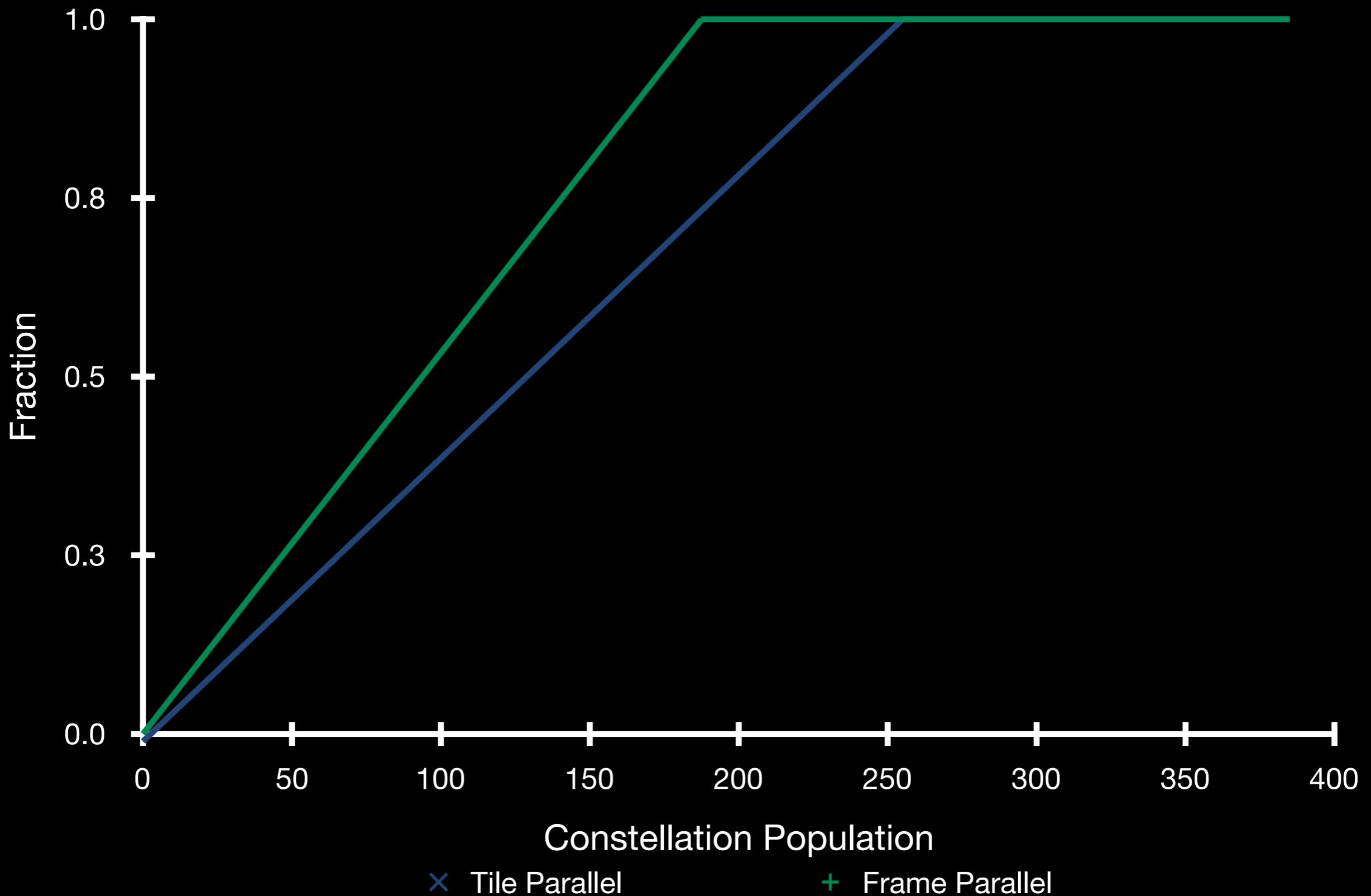
Frame-spaced, tile-parallel



# Frame Parallel Configurations



# Ground Track Coverage



# Summary

**Tile-parallel processing requires close-spaced configuration for low latency**

**Frame-parallel processing cannot provide low latency, but physical distribution has no affect**

**OEC gives full ground track coverage with populations matching existing constellations**

