

# Cloud-Edge Continuum

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# Cloud-Edge Continuum

## Motivations

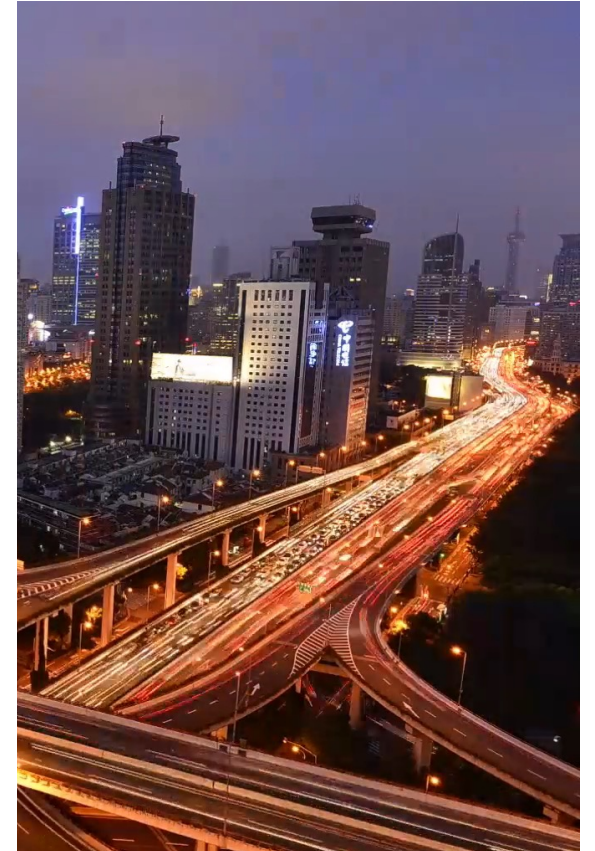
# Pervasive IoT applications



Embedded AI



Energy production plants




Smart Cities

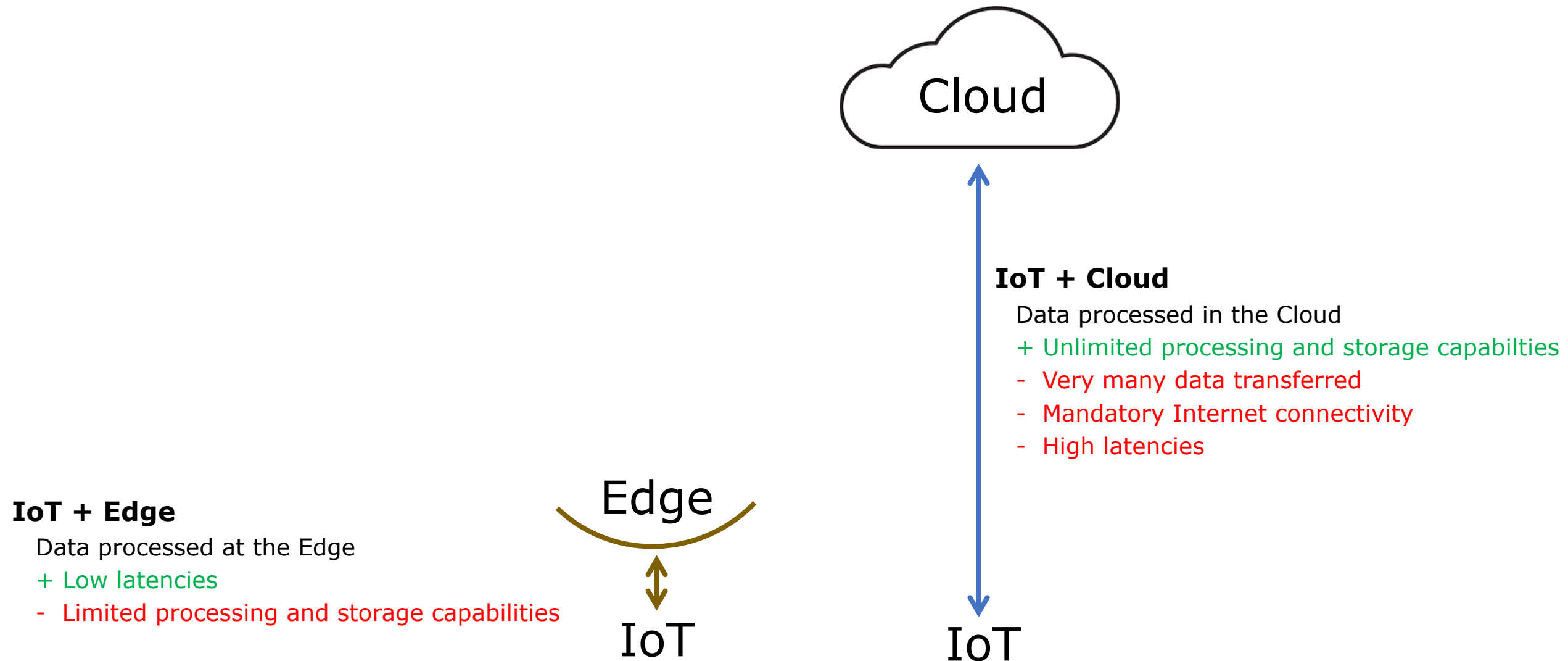
# IoT applications

**sense | process | actuate**

**where?**



# Traditional deployment models



# So much data, really?



[www.leverage.com/calculator](http://www.leverage.com/calculator)



1

Moisture Sensor

SIZE: 8 bytes



1min



1

pH Sensor

SIZE: 8 bytes



1min



1

Thermometer

SIZE: 8 bytes



1h



1

Water Quality Monitor

SIZE: 56 bytes



1h



1

Videocamera

SIZE: 56250 bytes



1s



## Resources Used

Data Transfer

145800.74

MB / month

146 GB/month

Cloud Storage

437402.21

MB / month

437 GB/month  
5.2 TB/year

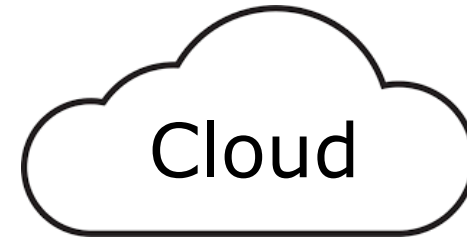
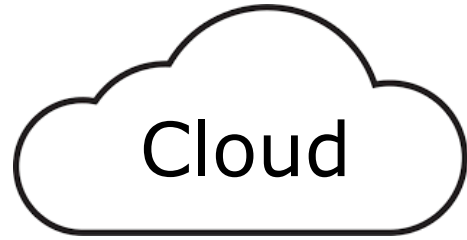
Updates

~2.68 M

per month

# Mandatory Internet connectivity

e.g. water flooding management must work in critical situations

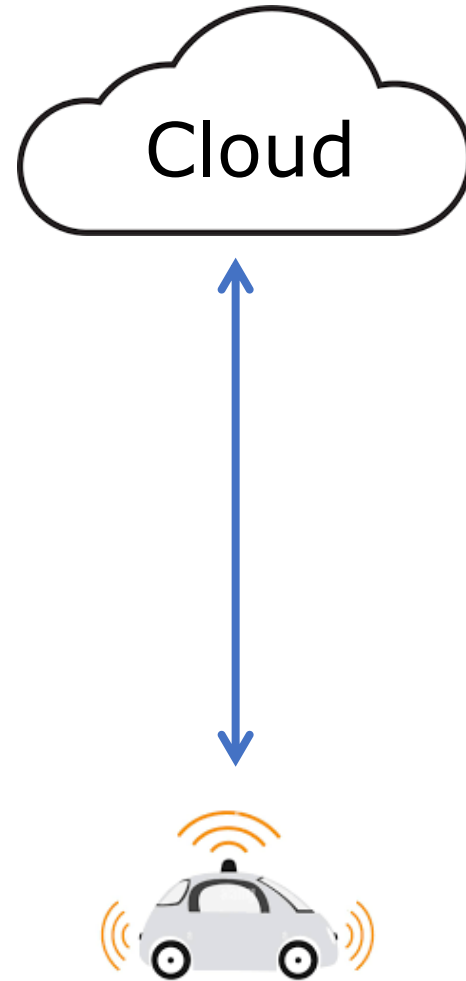


X



# High latencies

e.g. autonomous vehicles need to stop promptly





# [Autonomous vehicles: ethics issues, too]



Scenario:

- After turning right, vehicle detects children in the middle of the street
- The children are too close for the vehicle to be able to stop in time
- What should the vehicle (be programmed to) do?

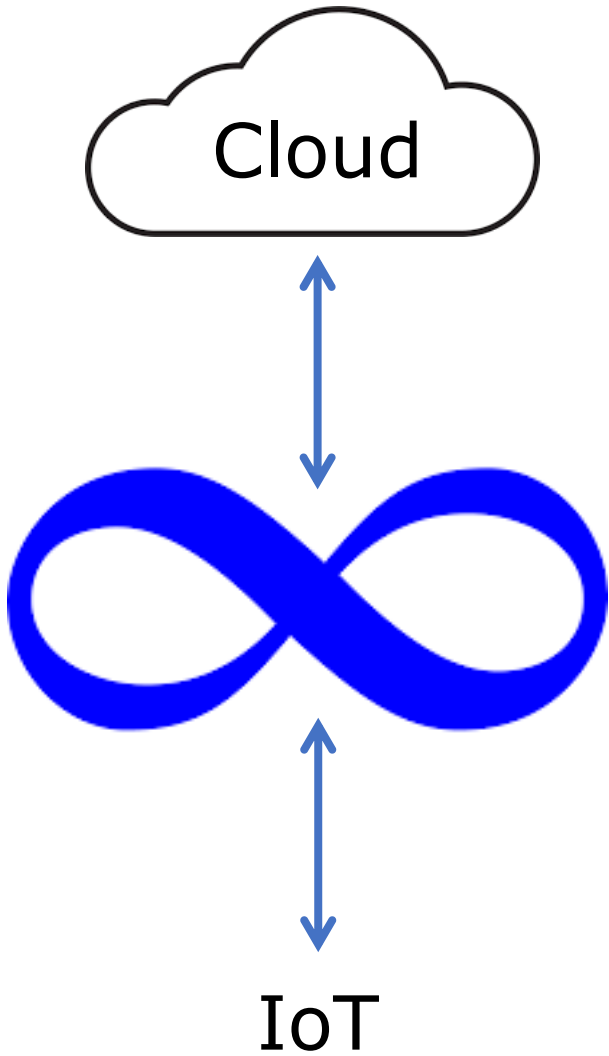


# Cloud-Edge Continuum

Motivations

The idea

# Cloud-Edge Continuum



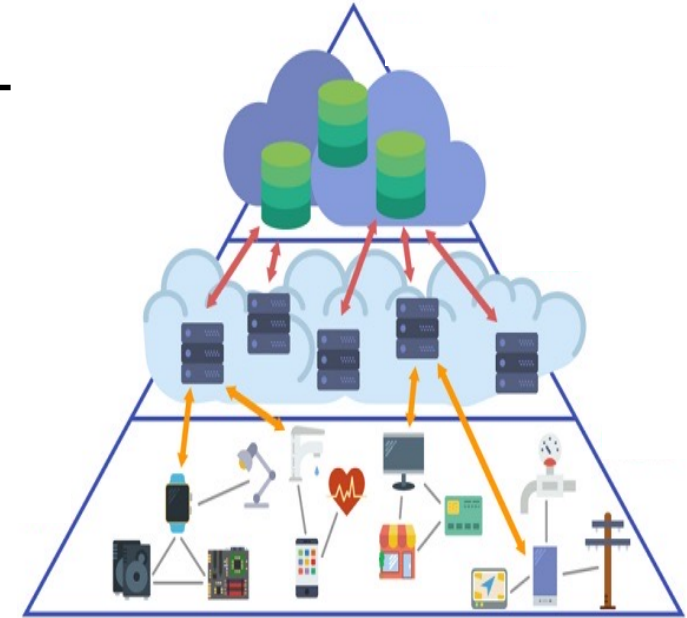
Extending the Cloud towards the IoT  
with a **distributed, heterogenous  
infrastructure**

to get the "best of both worlds"

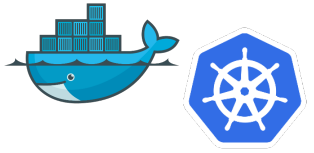
computing power ✓

connectivity ✓

latency ✓



# Next-gen applications

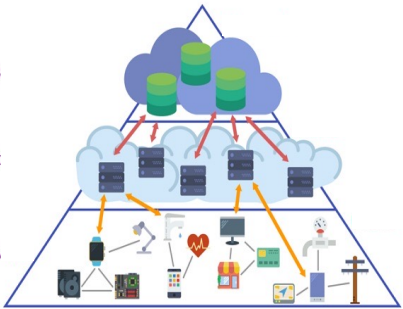


**Containerised,**



**microservice-based** applications

deployed on



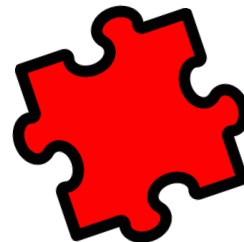
a **continuous Cloud-Edge infrastructure**

# Cloud-Edge Continuum Application placement

# How to suitably **place** a composite application in the Cloud-Edge Continuum?

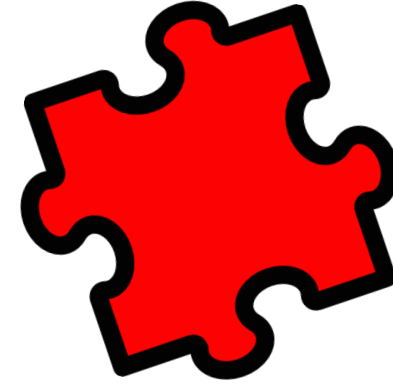


It is challenging (and NP-hard)



## **Application** requirements

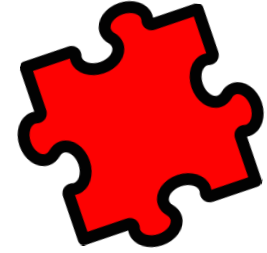
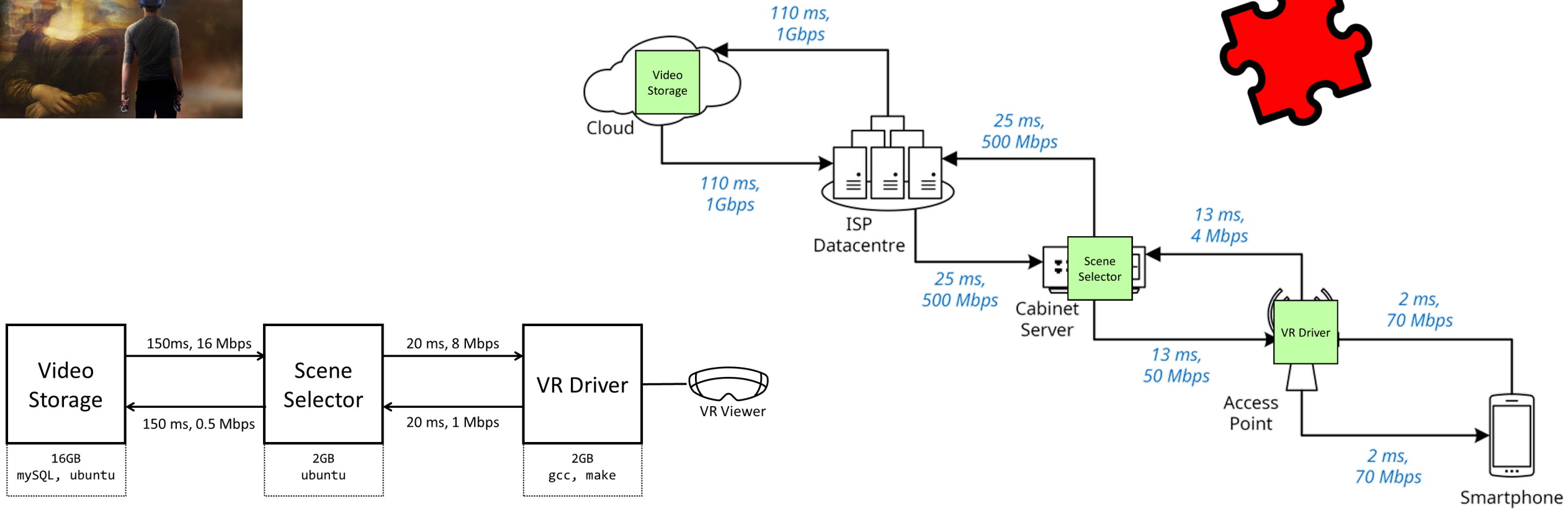
- Hardware
- Software
- QoS (e.g. response time, reliability)
- Data awareness
- Security and trust
- ...



## **Infrastructure** is

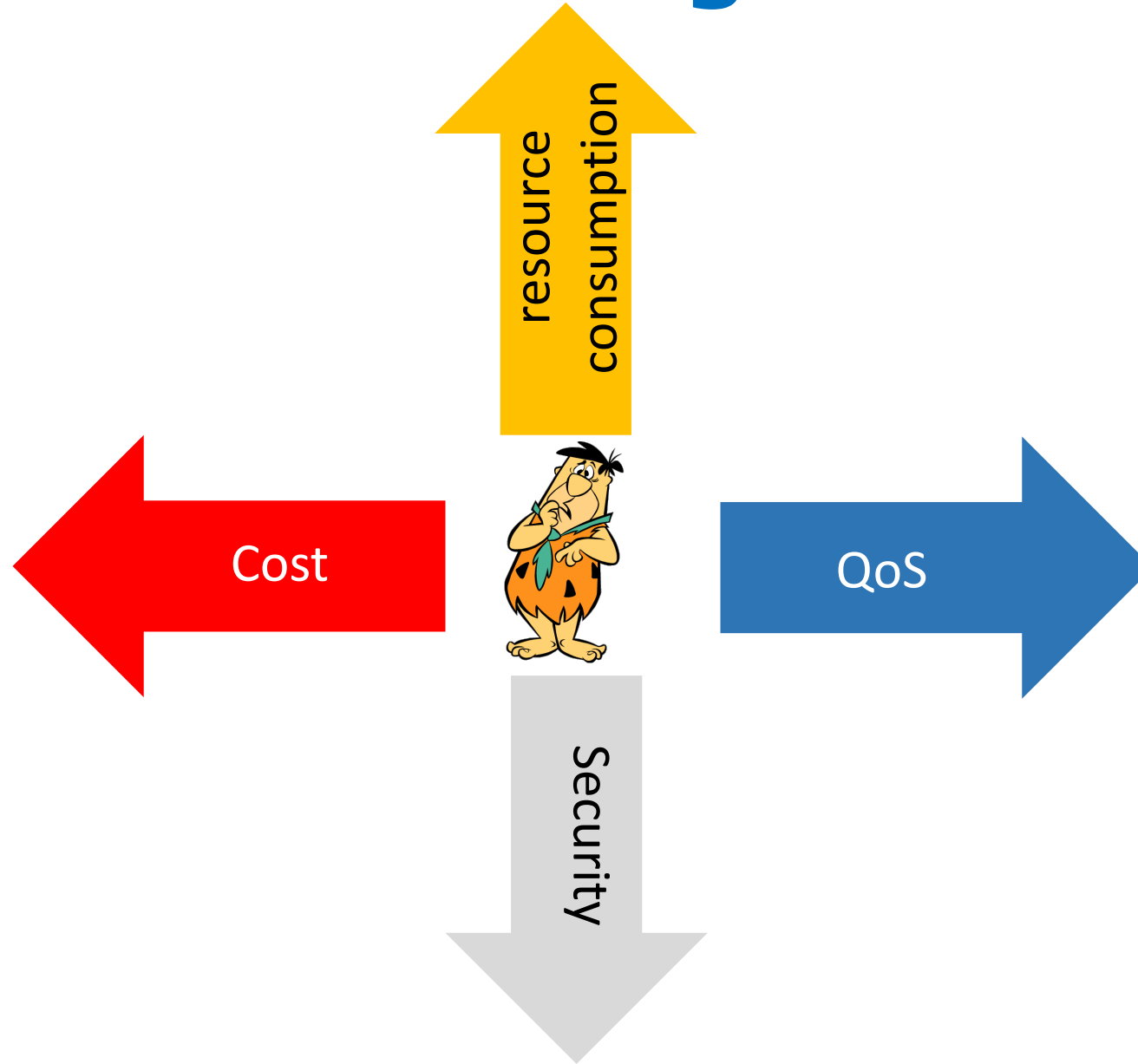
- Heterogeneous
- Large\*
- Dynamic\*\*

# Example: Simple VR Application



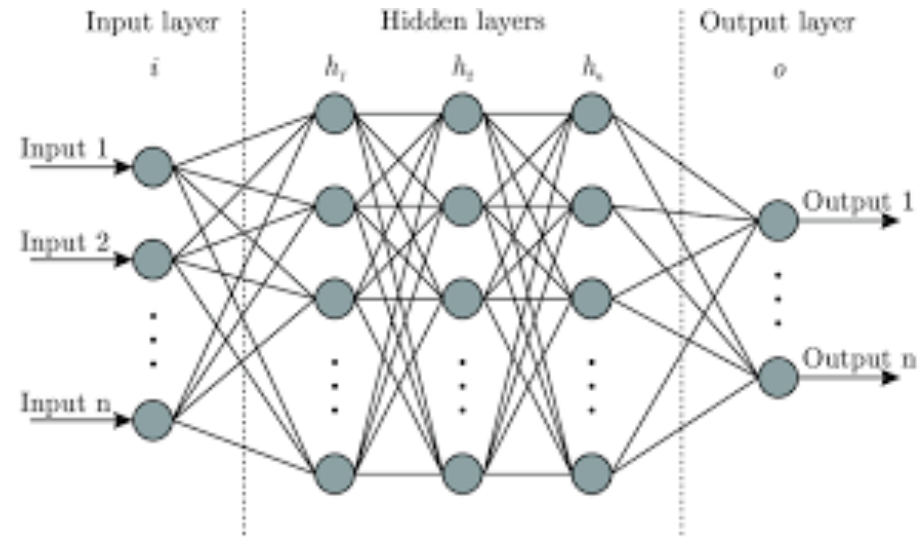


# Need to master orthogonal dimensions



# Application placement: approaches (1/3)

## ML



Infrastructure is very dynamic

Lack of explainability

# Application placement: approaches (2/3)

## MILP

- $X_{ij}^k = \text{BINARY}$
- $\sum_{j=1}^n X_{0j}^k = \sum_{i=1}^n X_{i0}^k = 1; k=1,2,\dots,m$  : Every route should start from depot and end on depot only,
- $\sum_{i=1}^n X_{ih}^k = \sum_{j=1}^n X_{hj}^k \leq 1, h=1,2,\dots,n; k=1,2,\dots,m$  : every node should be selected at most once and every node served should have a in as well as out arc,
- $\sum_{k=1}^m \sum_{j=1}^n X_{hj}^k = \sum_{k=1}^m \sum_{i=1}^n X_{ih}^k = 1; h=1,2,\dots,n$  : Every node should be selected at least once,
- $\sum_{j=1}^n \sum_{i=1}^n D_i X_{ij}^k \leq Q; k=1,2,\dots,m$  : Carrier can't carry more than  $Q$  quantity,
- $\sum_{k=1}^m \sum_{j=1}^n \sum_{i=1}^n D_i X_{ij}^k = \sum_{i=1}^n D_i$  : Total supply to nodes should equal to total demand,
- $X_{hj}^k + X_{ih}^k \leq 1; \text{for } i,j=1,2,\dots,n; h=1,2,\dots,n \text{ for every } k=1,2,\dots,m$  : Every node visited should have an arc to other then its preceding node.

Finds optimal solutions

Hard to read, hard to code non-numerical info

Slow to run

# Application placement: approaches (3/3)

## Declarative programming

### 1) Declare what an eligible placement is

*service S can be placed on node N if  
hardware reqs of S are met by N **and**  
software reqs of S are met by N*

*services S1 ... S<sub>m</sub> can be placed on nodes N1 ... N<sub>m</sub> if  
service S1 can be placed on node N1 **and**  
... **and**  
service S<sub>m</sub> can be placed on node N<sub>m</sub> **and**  
QoS reqs of S1 ... S<sub>m</sub> are met*

### 2) Let the inference engine look for it!

*? placement([s1,..s<sub>m</sub>],P).*



Easy to read

Easy to code non-numerical info

Explainable



Cloud-Edge Continuum  
Application placement  
Application management

# Things change ...

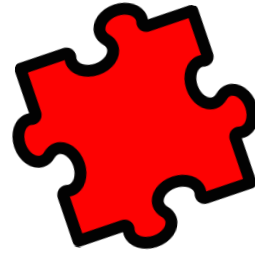
Wile E. Coyotes's syndrome



# Things constantly change ...

- Infrastructure constantly changes

- Node's workload changes
- Latency and bandwidth vary
- Nodes can join and (suddenly) leave
- Nodes and connections can (temporarily) fail
- ...

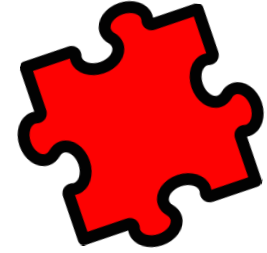
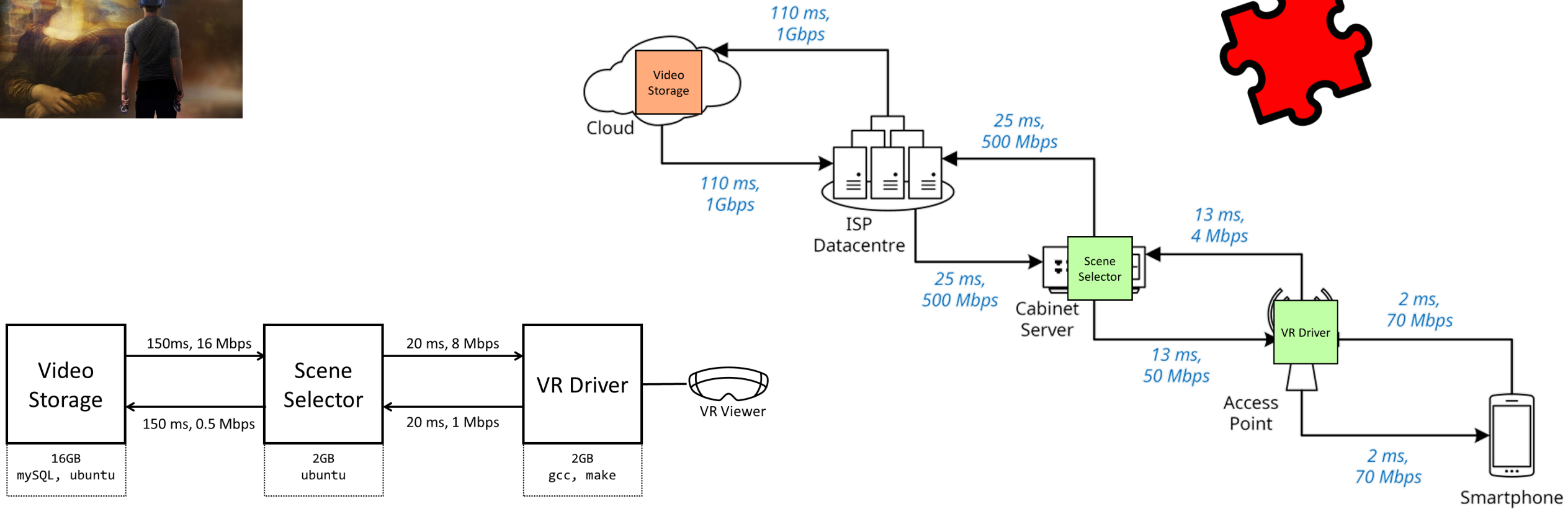


- Applications change too



- Codebase's changes
- Reqs can change
- ...

# Example: Simple VR Application





How to  
constantly and suitably **manage**  
application deployments  
after first deployment?

# Monitoring



Need of effective (lightweight, fault-tolerant) monitoring of

- applications
- infrastructure

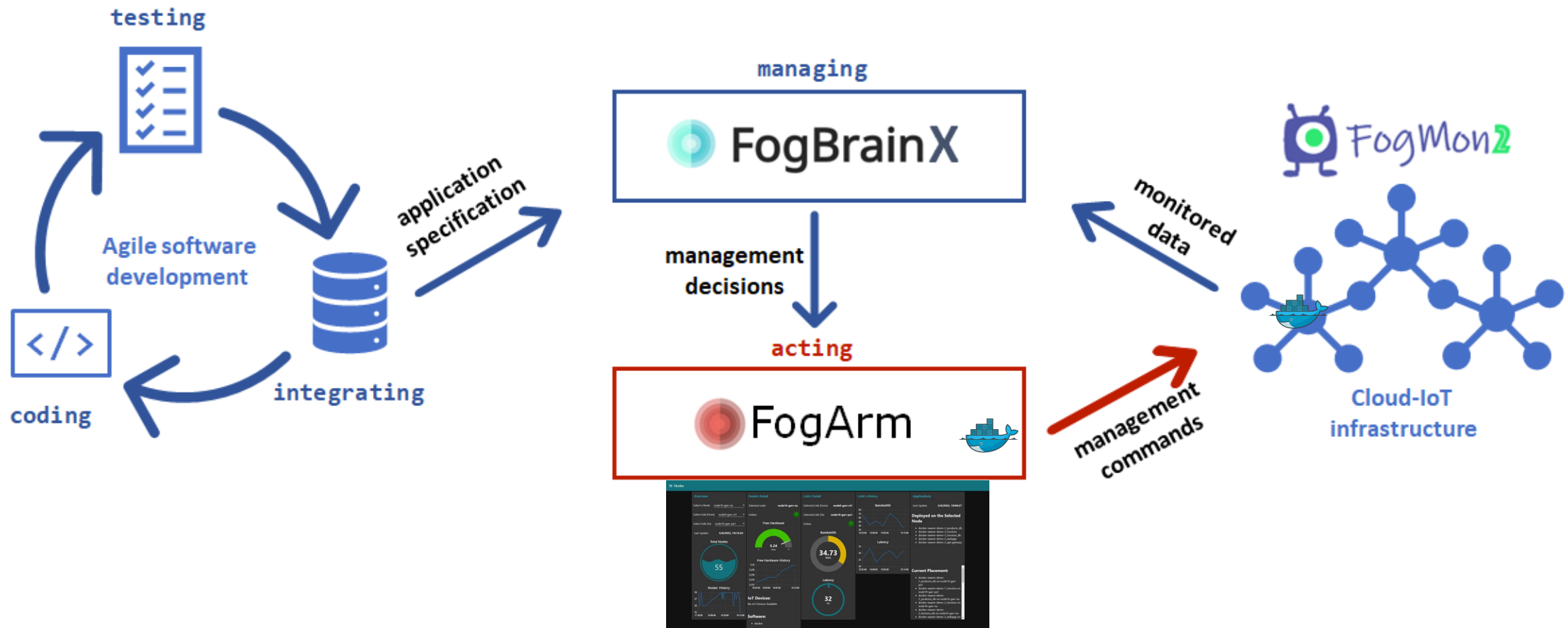
# Continuous reasoning

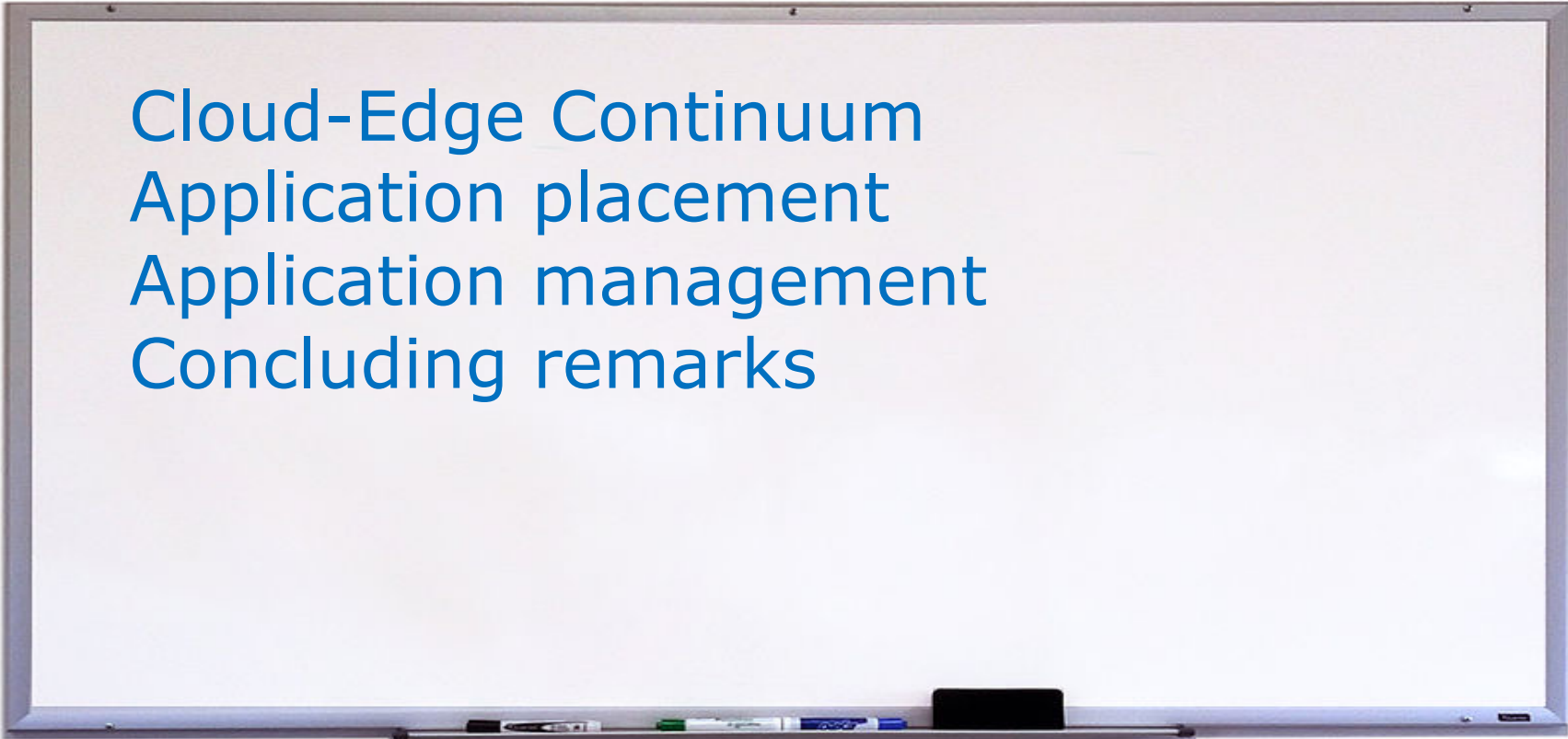
Differential analysis

- focusing on last changes
- re-using previously computed results

to re-place/migrate, restart, scale application services

# Monitor | Reason | Enact





Cloud-Edge Continuum  
Application placement  
Application management  
Concluding remarks



<https://www.youtube.com/watch?v=ICQ0AAYO0mQ>

# Some directions for future work

Security & privacy

Resilience

Continuum  $\longleftrightarrow$  AI

Sustainability

Business models