



## Panel 2

### Challenges in Internet Sensors-based Systems and Services

(energy, security, deployment, data collection, management, replacement, etc.)

NetWare  
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#### Panellist Summary

### Overcoming the Edge Constraints with Scheduling Optimization between Edge and Cloud

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- Intelligent Edge Computing
- Unified Orchestration between Edge and Cloud
- Scheduling Optimization

→ Fast-growing Internet sensor-based systems and services drive computing to the edge.

→ Edge computing can leverage cloud resources to overcome its resource constraints.

→ Dynamic scheduling among different locations optimizes performance and resource utilization.



# Overcoming the Edge Constraints with Scheduling Optimization between Edge and Cloud

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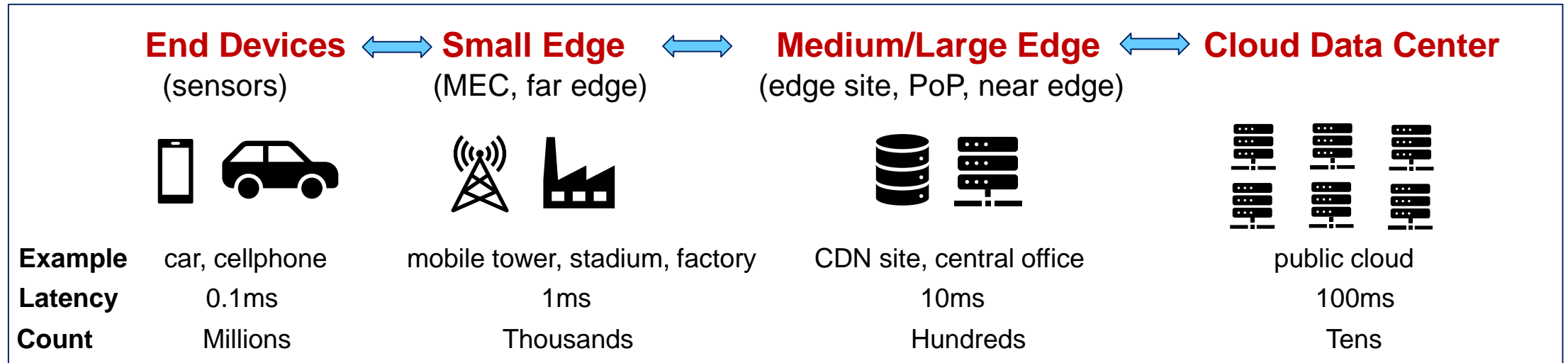
# Booming of Internet Sensor-based Systems

- **Fast-growing Internet of Things (IoT) market**
  - Field: Industrial 4.0, Smart City (meter, lights, video), Smart farming (irrigation, animal tracking), Autonomous Vehicle
  - Industrial edge computing market: \$11B 2020 → \$30B 2025 \*
- **5G enables massive machine type communication**
  - High device density: 1 million devices per km<sup>2</sup>
  - Low power: up to 10-year battery life for low power IoT devices
- **Intelligent edge enables new set of opportunities**
  - Elastic infrastructure with edge computing and cloud computing
  - Distributed software applications



# Edge Computing Definition

- Where is the edge?



- Edge Computing:** a distributed computing paradigm, brings computation and data storage closer to users, to improve response times and save bandwidth.

# Edge Computing Challenges

- Open architecture, various communication protocols
- Large volume of data (hard to transport back to cloud)
- Require real-time decision
- Dynamic scenarios, static rule-based solutions not enough
- Resource constraints, limited compute and storage resource
- Limited network connectivity

**What operational models and technologies will be able to effectively unlock the edge potential?**

# Industry Movements

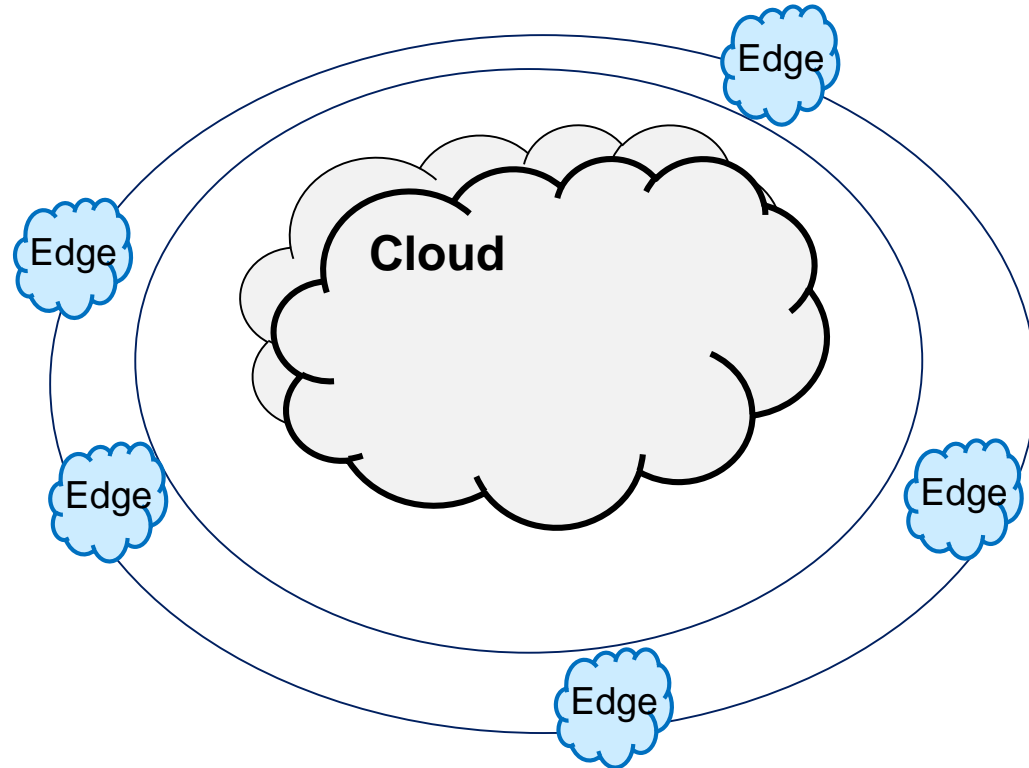
- **Cloud Providers**

- Extend cloud to edge, with the same cloud services on at the edge, uniformly manage edge computing as part of a broader cloud footprint
- AWS Outposts; Azure Arc, Stack Edge; Google Anthos

- **Challengers**

- CDN (content delivery networks), colocation and telecom providers challenge from the edge with their global network locations and experience
- Akami, Equinix, AT&T place edge sites near customers and offer cloud-like services

# Intelligent Edge with Cloud Computing



- **Elastic Infrastructure**, workloads move seamlessly between Cloud and Edge, and Edge to Edge
- **Edge Intelligence**, data preprocessing and compression, time/location/context aware
- **Global Optimization**, scheduler, scaler, continuous resource allocation optimization
- **Resource-aware Application Design**, split into microservices based on the requirements of latency, computation complexity, state, etc.

**Continuous Optimization, Federation and Collaboration**

# Scheduling Optimization between Edge and Cloud

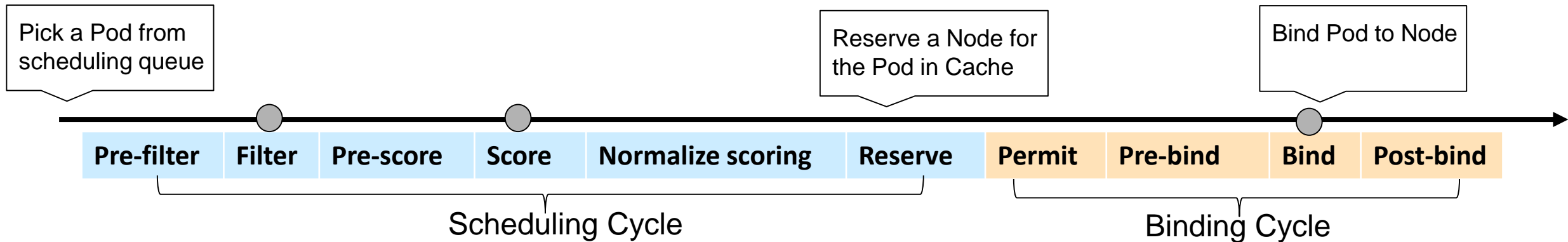
Application Type	Schedule Requirements	Optimization Goal	Algorithms
<ul style="list-style-type: none"><li>• Scientific workflow</li><li>• Large-scale data</li><li>• Real-time</li><li>• Cloud storage</li><li>• Throughput intensive</li><li>• Delay sensitive</li><li>• Network services</li></ul>	<ul style="list-style-type: none"><li>• Workload dependency</li><li>• Resource affinity</li><li>• Resource quota</li><li>• Latency, geo-proximity</li><li>• Throughput</li></ul>	<ul style="list-style-type: none"><li>• Deployment cost</li><li>• Service reliability</li><li>• Resource utilization</li><li>• Response time</li><li>• Energy cost</li><li>• Operation cost</li></ul>	<ul style="list-style-type: none"><li>• Decision tree</li><li>• ILP (Integer Linear Programming)</li><li>• Graph neural network</li><li>• Greedy algorithm</li><li>• Dynamic programming</li><li>• Genetic algorithm</li><li>• Particle swarm optimization</li></ul>

- Find a tradeoff between cost and performance
- Scheduled jobs could be dynamically rescheduled for optimization purpose



# Kubernetes-based Scheduling Example

- Kubernetes is a popular container orchestration platform, considered as Cloud OS
- Scheduling framework: filter (by predicate) and score (by priority) with rich extension



- Scheduling Framework Optimization:
  - **Co-scheduling**, schedule a group of pods instead of one considering workload dependency
  - **Multi-profile scheduling**, combine different filter and score function for different workload
  - **Priority function extension**, add customized functions to be location/latency/energy aware
  - **De-scheduling**, periodically audit scheduling requirements, evict unsatisfied pods

# Takeaways

- Edge is the next computing frontier after Cloud
- Edge computing strategies are critical for unleashing the full potential of Internet Sensor-based Systems and Services
- Global scheduling optimization can bring the best out of Edge and Cloud
- Resource-aware applications are easy to deploy and achieve better performance