



Application-driven Virtual Network Slicing for Future Broadcast Core Network

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Future Broadcast Core Networks

❑ Fast Development

- ❑ Global Internet users: 5.3 billion by 2023 (66% of total population).
- ❑ Networked devices: 29.3 billion by 2023 (11% of them will be connected TVs).

❑ Architectural Scalability

- ❑ Global traffic: annual growth rate of 25%, more than 32 ZB by 2023.
- ❑ Average access speed: broadband at 110 Mbps, Wi-Fi at 92 Mbps, by 2023.
- ❑ Now, ICT consumes more than 5% of total power used in the United States.

❑ Resource Utilization

- ❑ Average utilization: Servers ~20%, Storage ~25%, Network ~30% (dynamic and unbalanced)

❑ Management Agility

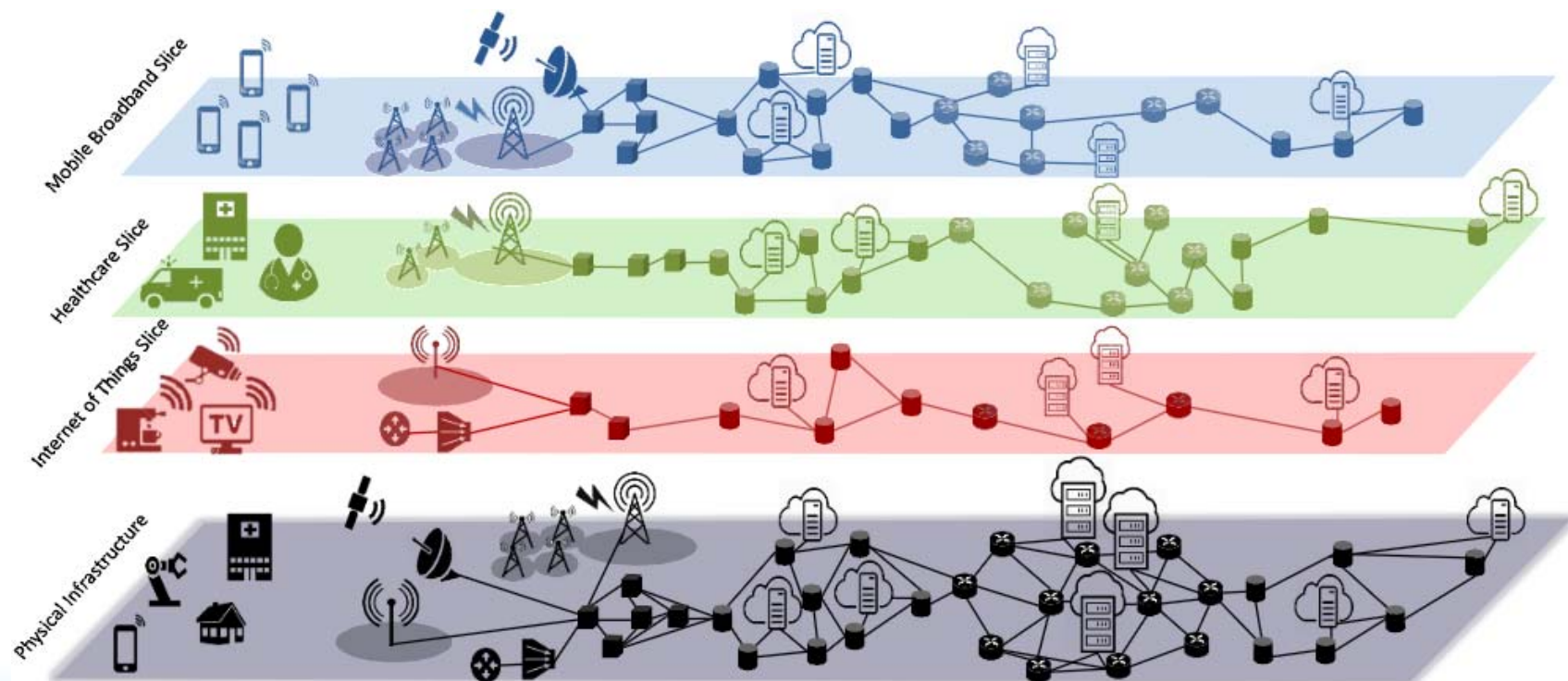
- ❑ Long lead time to deploy new services

[1] Cisco Annual Internet Report, 2018-2021, White Paper.

[2] Z. Kerravala, "A Data Center Fabric is Critical to a Next-Generation Unified Data Center," Yankee Group White Paper.

Virtual Network Slicing Contributes a Potential Solution

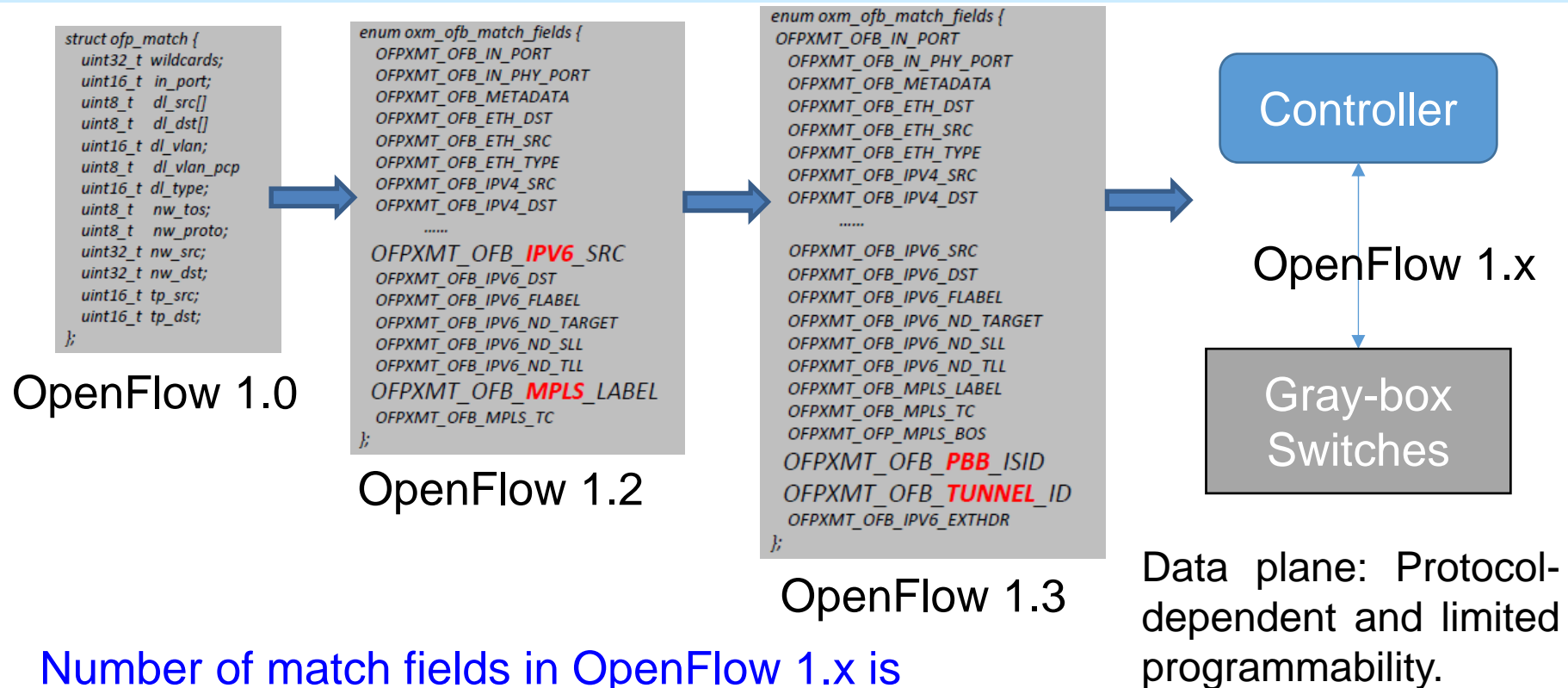
- ❑ Virtualize network and IT resources in core networks.
- ❑ Create network slices dynamically to adapt to service demands.
- ❑ Make network slices share the same substrate resources but with proper isolation.



Enabling Techniques for Virtual Network Slicing

- ❑ Software-Defined Networking (SDN)
 - ❑ Separation of control and data planes to make the creation and management of virtual network slices easier, faster and more efficient.
- ❑ Data Plane
 - ❑ Network elements should enable resource virtualization and isolation.
 - ❑ Switches should be protocol independent for future-proof application support.
- ❑ Virtualization Layer
 - ❑ Sit in between the control and data planes.
 - ❑ Virtualize, allocate and isolate substrate resources in the data plane to build virtual network slices according to applications' QoS demands.
- ❑ Control Plane
 - ❑ Have the adaptivity to provision services in virtual network slices cost-effectively in dynamic network environments.
 - ❑ Can leverage artificial intelligence (AI) to achieve smart and timely decisions.

Data Plane: Limitations of OpenFlow



Number of match fields in OpenFlow 1.x is increasing fast to adapt to more protocols!

OpenFlow-based data plane is NOT future-proof.

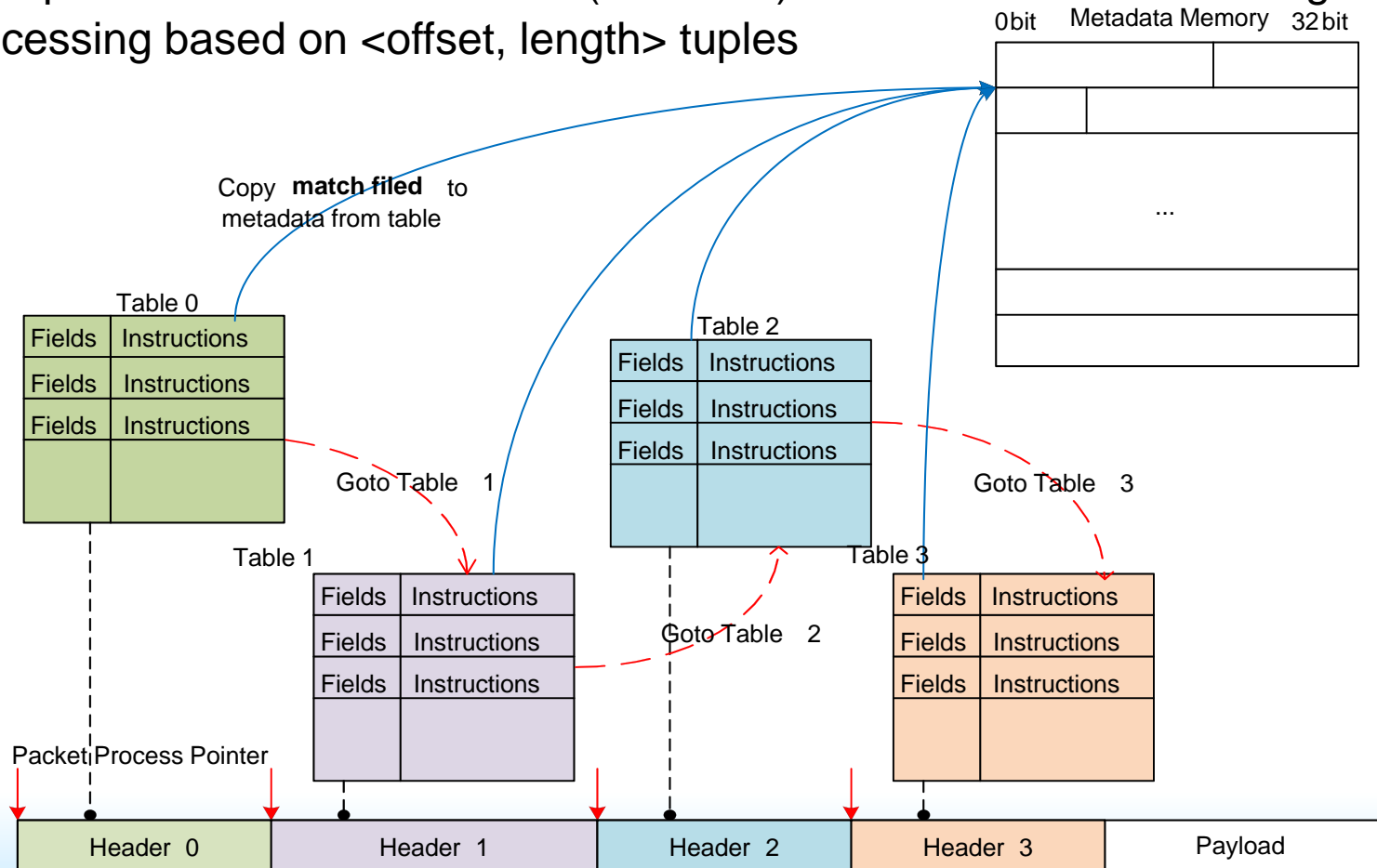
Programmable Data Plane (PDP)

- ❑ Protocol Independent Forwarding (PIF)
 - ❑ Open Networking Foundation (ONF) project with two approaches: P4 and POF.
- ❑ P4: Programming Protocol-Independent Packet Processors
 - ❑ Provide guidance on how to write and compile packet processing programs.
 - ❑ Program a switch in two stages: configuration and runtime, *i.e.*, a P4-based PDP switch needs to go offline to update packet processing pipelines.
 - ❑ Hardware solution: Barefoot switches with Tofino ASIC; Software solution: BMv2 software switch.
- ❑ POF: Protocol-Oblivious Forwarding
 - ❑ Provide guidance on what the underlying primitive instruction set should be.
 - ❑ Program a switch in runtime by installing flow tables (similar to OpenFlow), *i.e.*, a POF-based PDP switch can update packet processing pipelines dynamically.
 - ❑ Only has software solution, but hardware solution is not available.

Protocol-Oblivious Forwarding (POF)

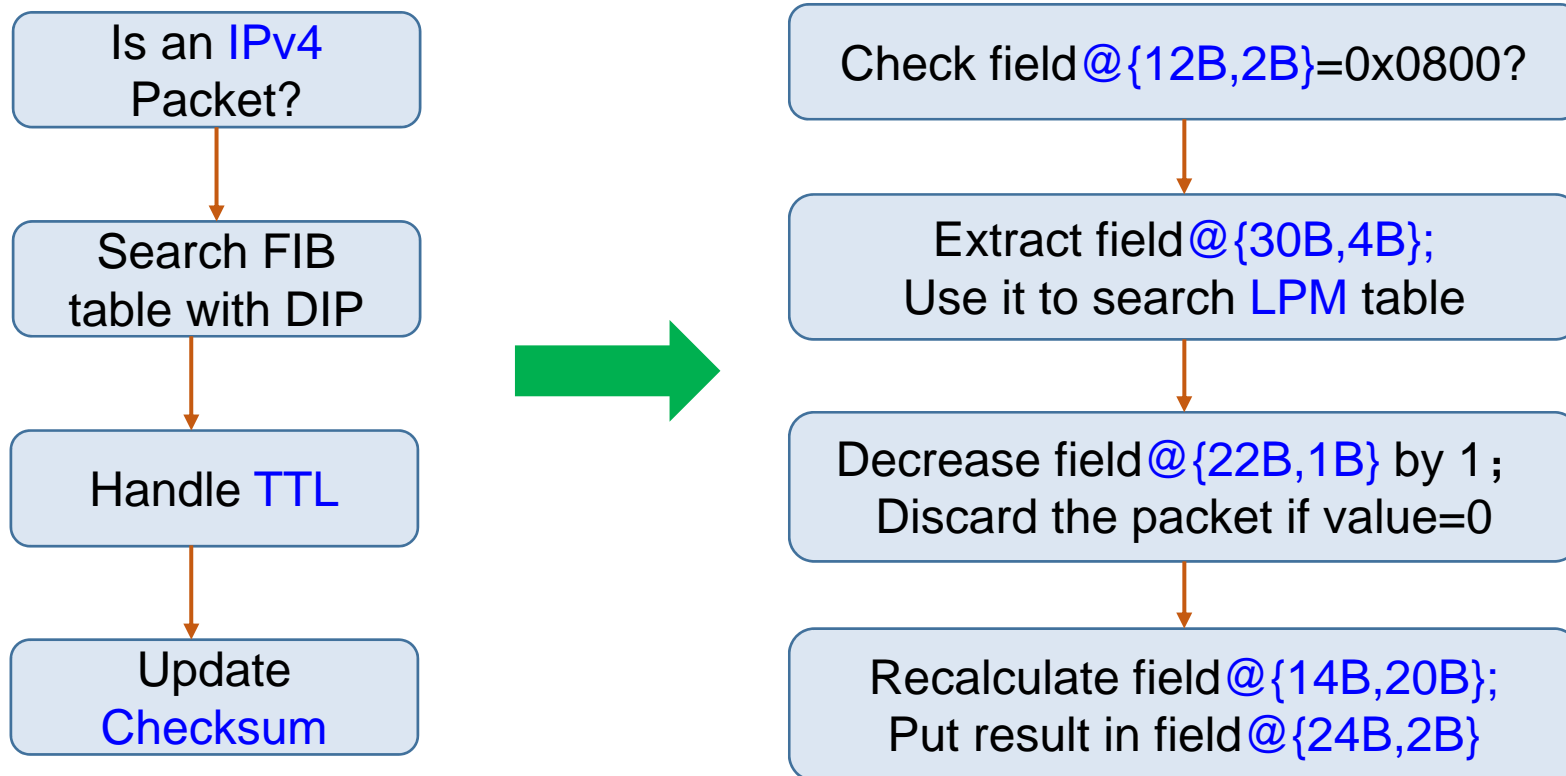
The data plane with POF is completely **protocol-independent**

- POF locates data fields in packets through **<offset, length> tuples** without a protocol parser
- POF provides an instruction set (POF-FIS) to facilitate table matching and packet processing based on **<offset, length> tuples**



An Example on POF

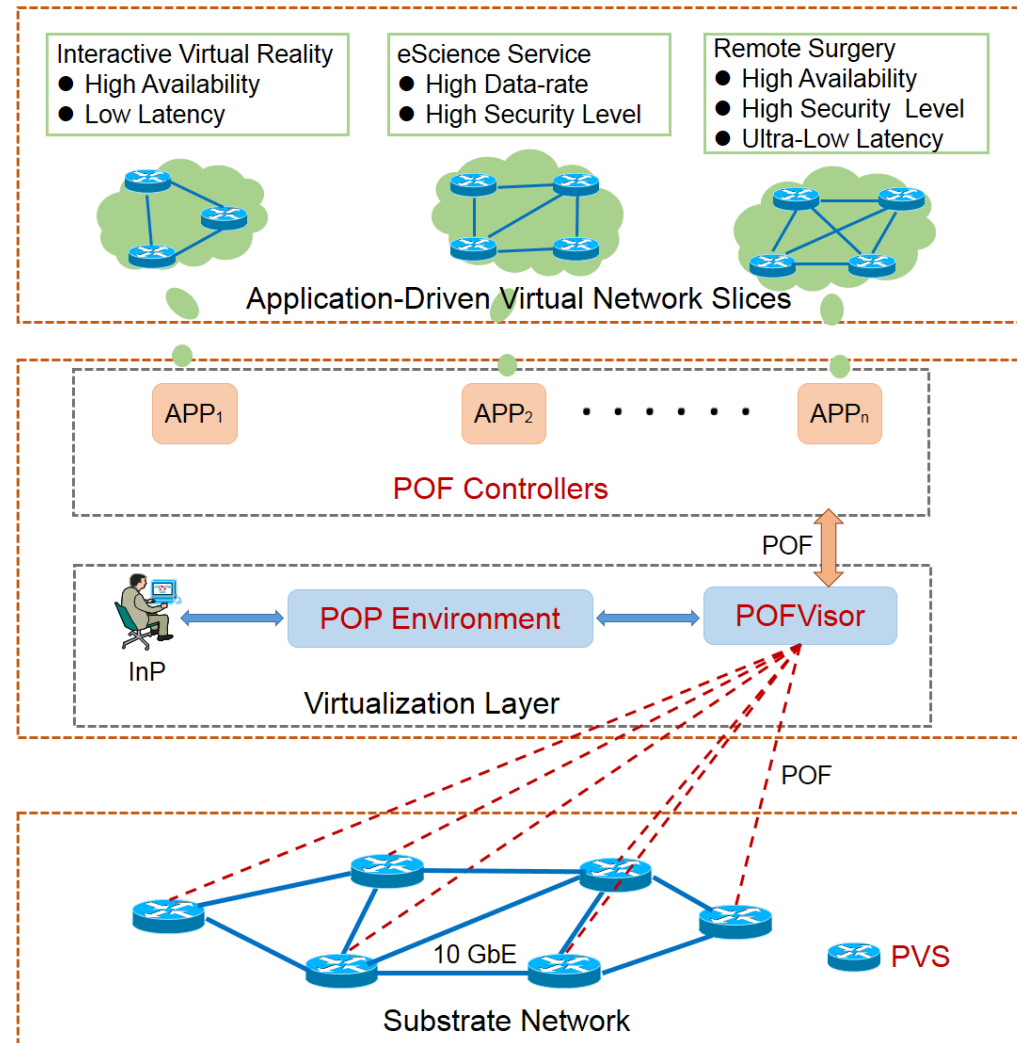
To Process and Forward an IPv4 Packet



As a protocol-independent protocol, POF does not need to know “what” but only need to know “how”.

POF-based Virtual Network Slicing System

- Control Plane:
 - POF Controller
- Virtualization Layer:
 - POFVisor
 - POF Programming (POP) Environment
- Data Plane:
 - High-Throughput POF Software Switch (PVS)



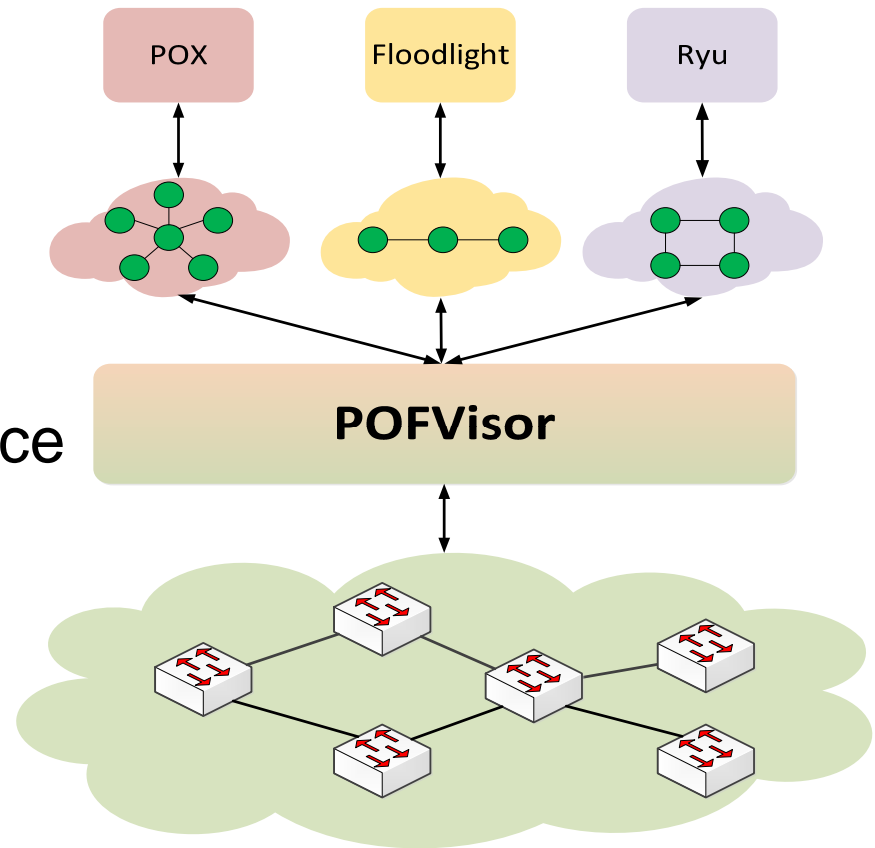
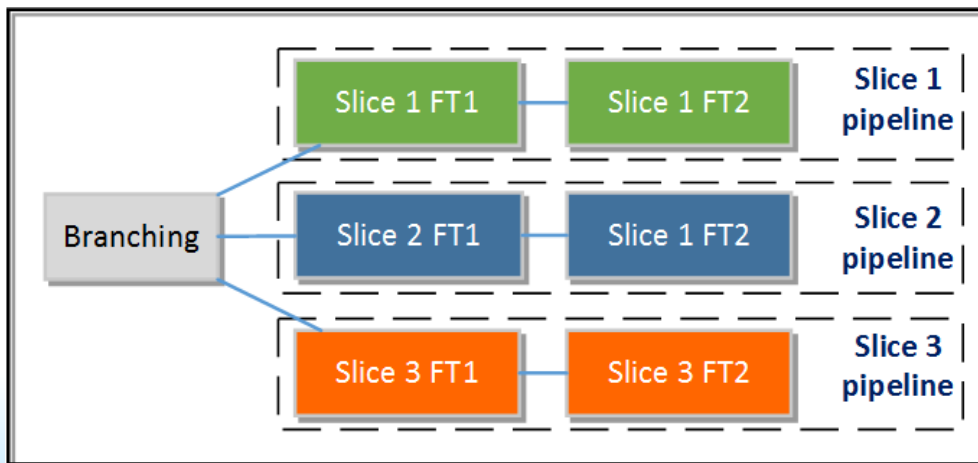
POFVisor: Network Virtualization Hypervisor

Isolation / QoS guarantee

- Isolation via **pipeline branching** in substrate switch
- **Per slice QoS management** by metering individual pipeline

Deep programmability for each slice

- **Full protocol header manipulation**
- Self-defined header structures and sequences

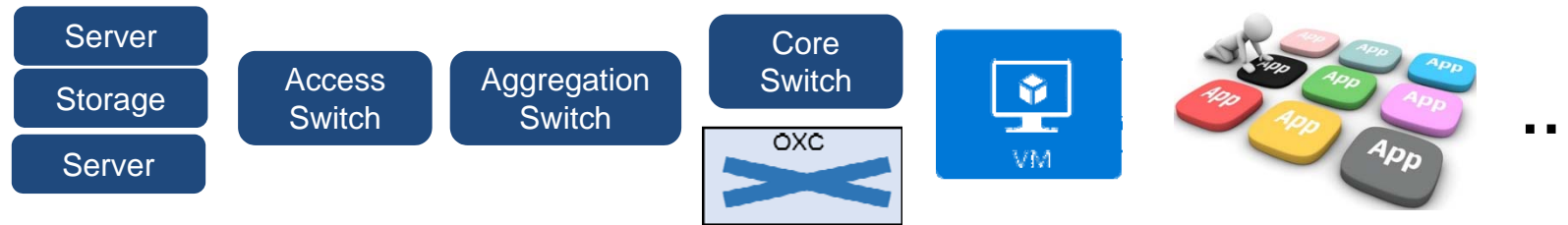


Agile virtual-to-substrate network mapping

- One-to-many / many-to-one
- Big switch

Intelligent Control Plane for Application-driven Virtual Network Slicing

- Control plane needs to manage a large variety of network elements for virtual network slicing

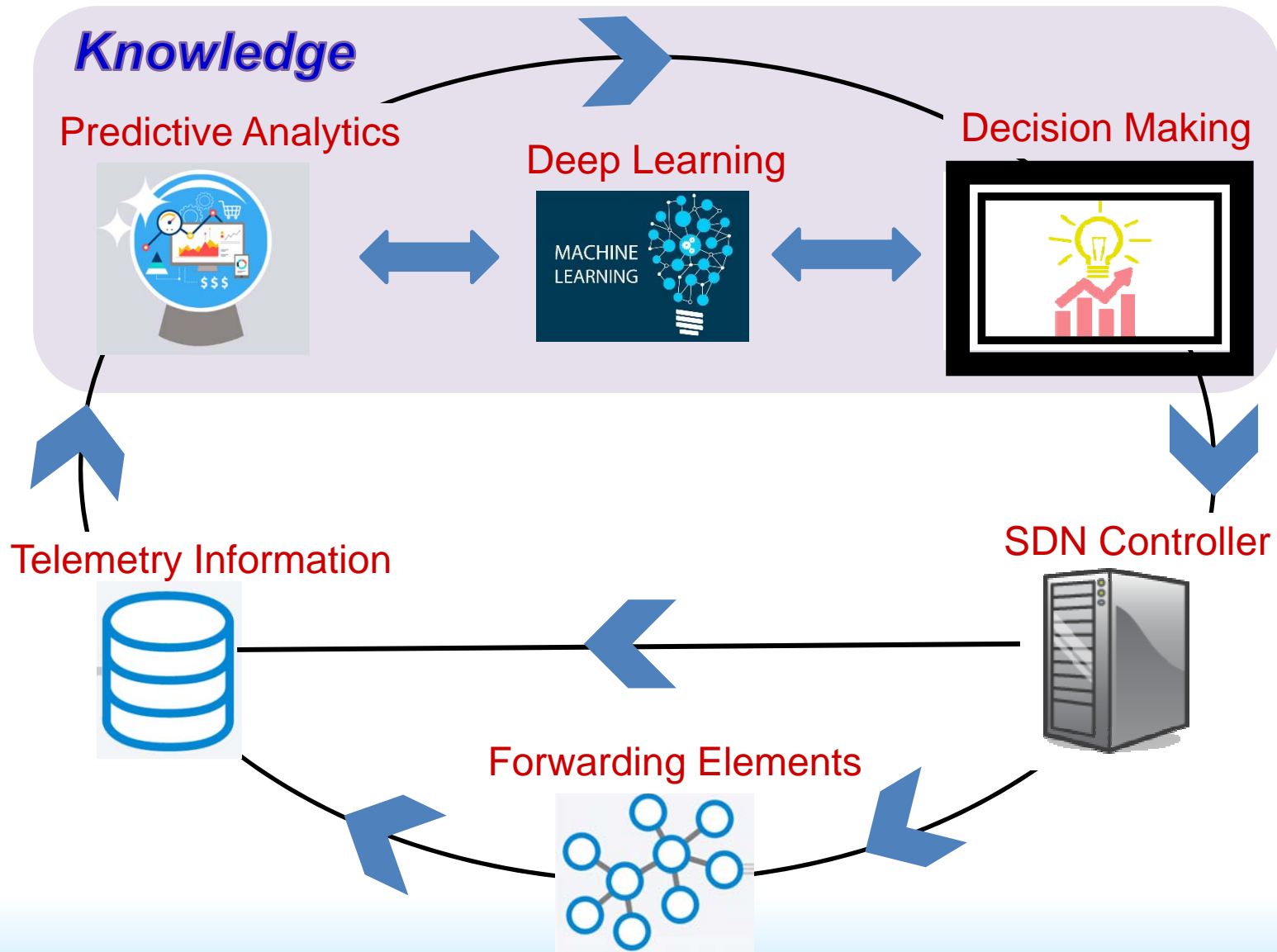


- Control plane needs to make automatic and timely decisions to ensure various QoS/QoE to applications
 - Latency is an important metric for many applications: Global average fixed latency of cloud services **31 msec**, Asia Pacific 21 msec, Europe 27 msec [1]
 - A 1 msec advantage in trading applications can be worth **\$100 million a year** to a major brokerage firm [5].

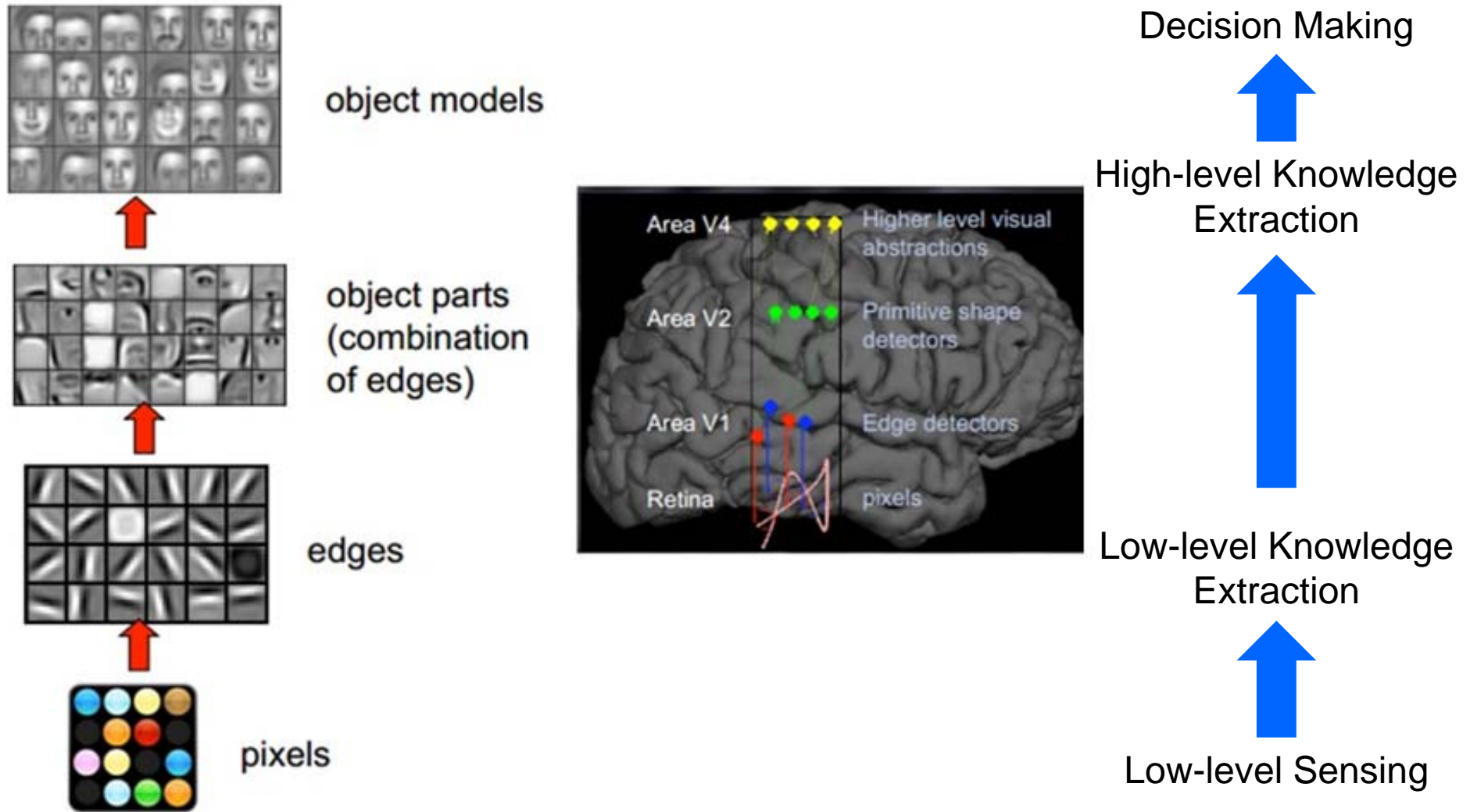
[1] Cisco Global Cloud Index, Forecast and Methodology, 2016-2012 White Paper.

[5] Information Week Magazine.

Knowledge-defined Control Plane

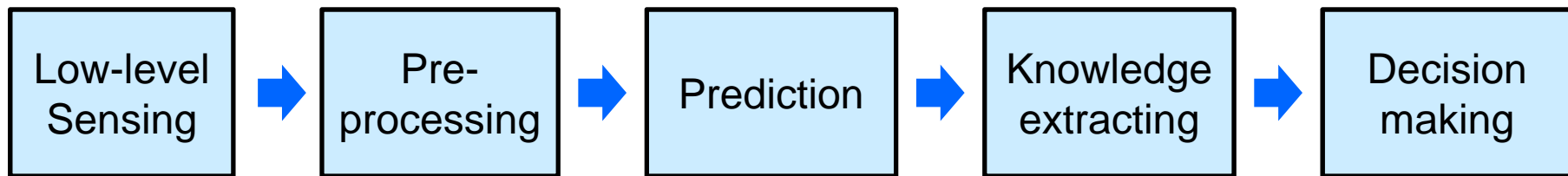


Human Brain: Levels of Knowledge



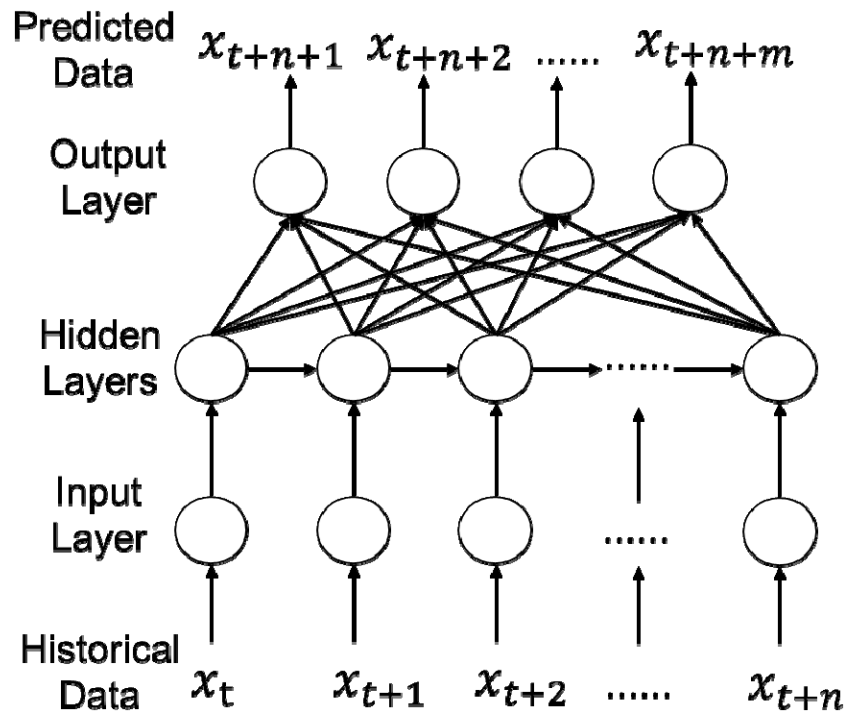
Predictive Analytics

- Predictive analytics: Forecast based on **memory** + Decision making based on **knowledge**.



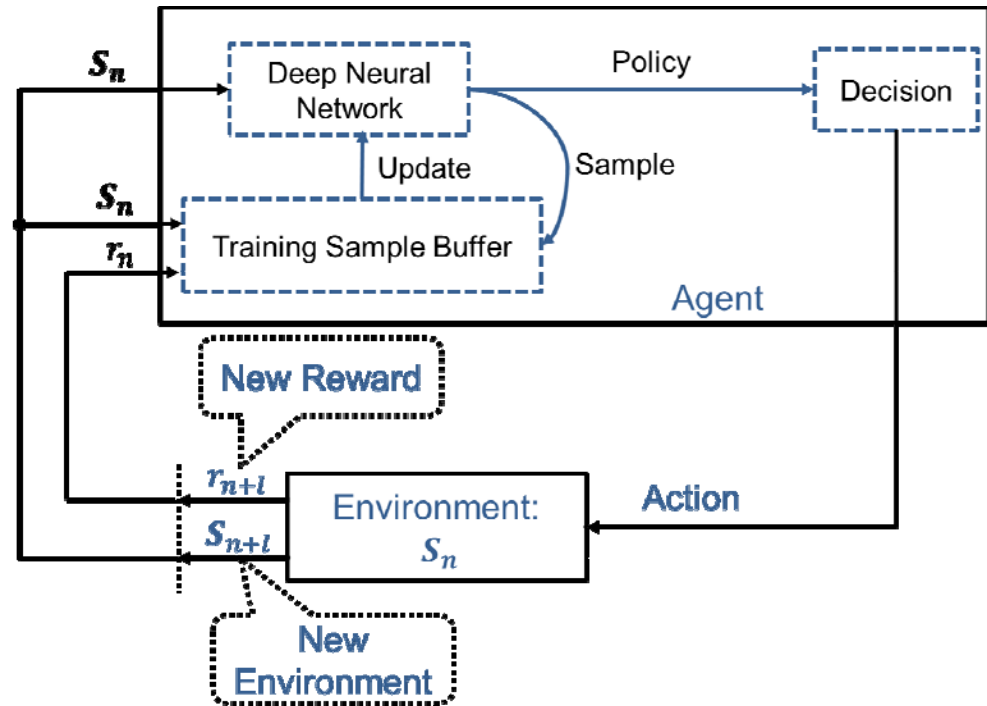
- We design the control plane to include **multiple AI modules**
 - AI modules **coordinate to handle** the complex tasks of knowledge-defined network orchestration (KD-NO).
 - AI modules extract **different levels of knowledge** from the telemetry data collected in the substrate network.
 - Modular design, better scalability, and easier to train and maintain the AI modules.

AI: Deep Learning and Deep Reinforcement Learning



Deep Learning

- Offline Training,
- Online Transfer Learning
- Prediction



Deep Reinforcement Learning

- Online Training
- Decision Making



Preprocessing and Prediction: Low-level Knowledge Extraction

- ❑ Analyzing telemetry data of all the VMs and network elements and managing them accordingly **would not be feasible**.
 - ❑ **Numerous** VMs and network elements in virtual network slices
 - ❑ **Huge volume** of telemetry data to analyze, if we want full coverage
- ❑ Preprocessing:
 - ❑ Screening telemetry data to find the “**major contributors**”
 - ❑ Determining predictability by checking the **auto-correlation** of data
 - ❑ Minimizing allocated predictors with **cross-correlation**: traces with strong cross-correlation can be forecasted with the same predictor.
- ❑ Prediction:
 - ❑ Offline training: only train the necessary predictors with historical traces
 - ❑ **Online transfer learning**: light-weighted retraining with online data

High-level Knowledge Extraction

- High-level knowledge:

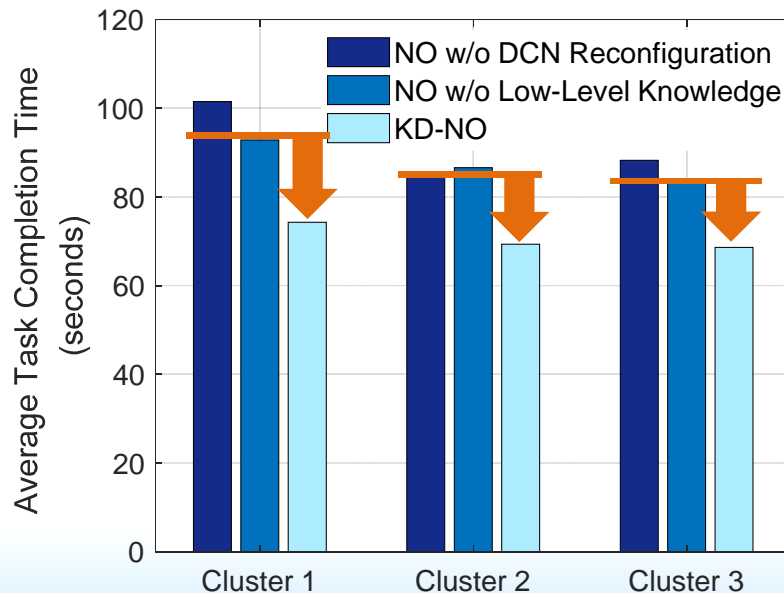
- **Matching degree** between the embedding schemes of virtual network slices and the applications running in them.

- **Hot-spots:**

- Highly-loaded servers and congested switch ports in the substrate network.

Experimental Scenarios and Parameters

- Run Hadoop applications in 9 VMs that belong to three Hadoop clusters (*i.e.*, three virtual network slices).
 - Each cluster processes tasks generated according to Google traces.
- Scale original 24-hour task pattern down to 12 minutes
 - Tasks: CPU-bound ones (high CPU usage, low I/O and traffic loads), and I/O-bound ones (high I/O and traffic loads, low CPU usage)



KD-NO reduces task completion time effectively.

FuNET: POF-enabled WAN Testbed

FuNET - Provide experimental services with sliced and virtualized WAN resources.

❖ Software

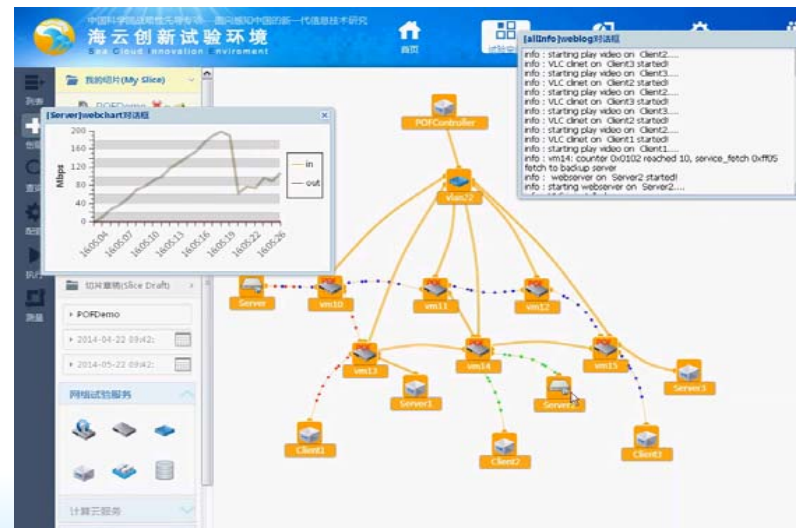
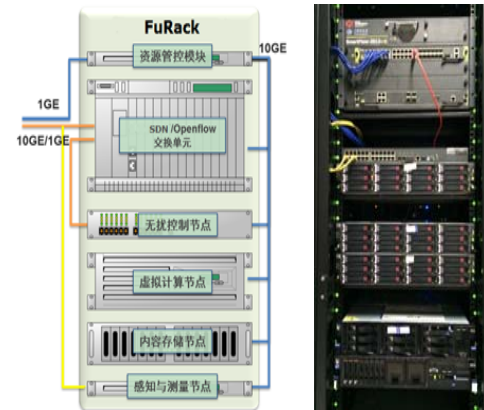
- FuOS
- FuES

❖ Devices

- FuRack

❖ Key technologies

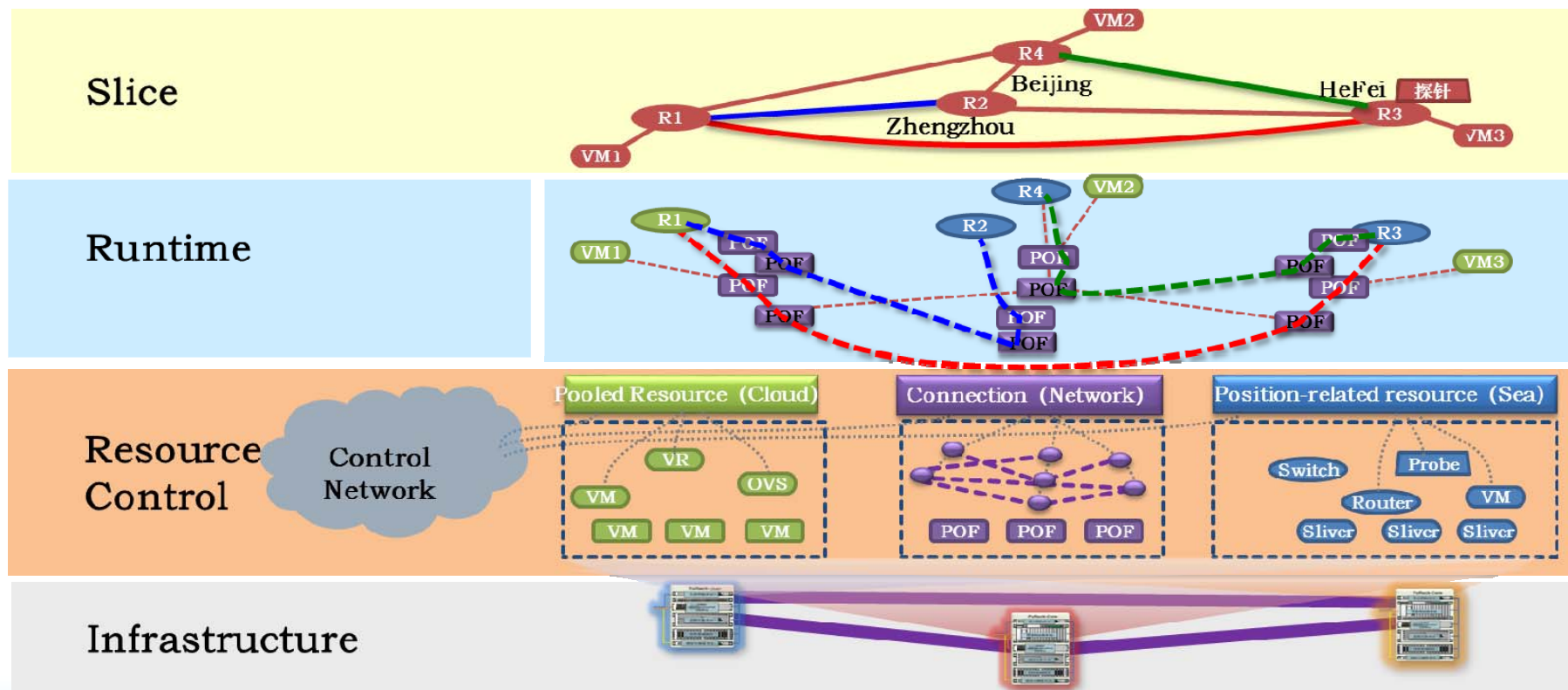
- POF
- SDN/NFV



FuNET: POF-enabled WAN Testbed

❖ System Functionalities

- Mapping between virtual and substrate resources.
- Generate and schedule virtual network slices on demand.



Takebacks

- ❑ We discuss recent advances on the network slicing technologies for effectively supporting applications in future networks.
- ❑ To satisfy stringent QoS demands of applications, we cover innovations in data plane, virtualization layer, and control plane.
- ❑ For data plane, we introduce the PDP techniques that can make packet processing and forwarding protocol-independent.
- ❑ We show the open-source platform that can make virtualization layer work seamlessly with PDP.
- ❑ We implement AI-based techniques in control plane, to reach smart and timely orchestration decisions.

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