



## NFV orchestration

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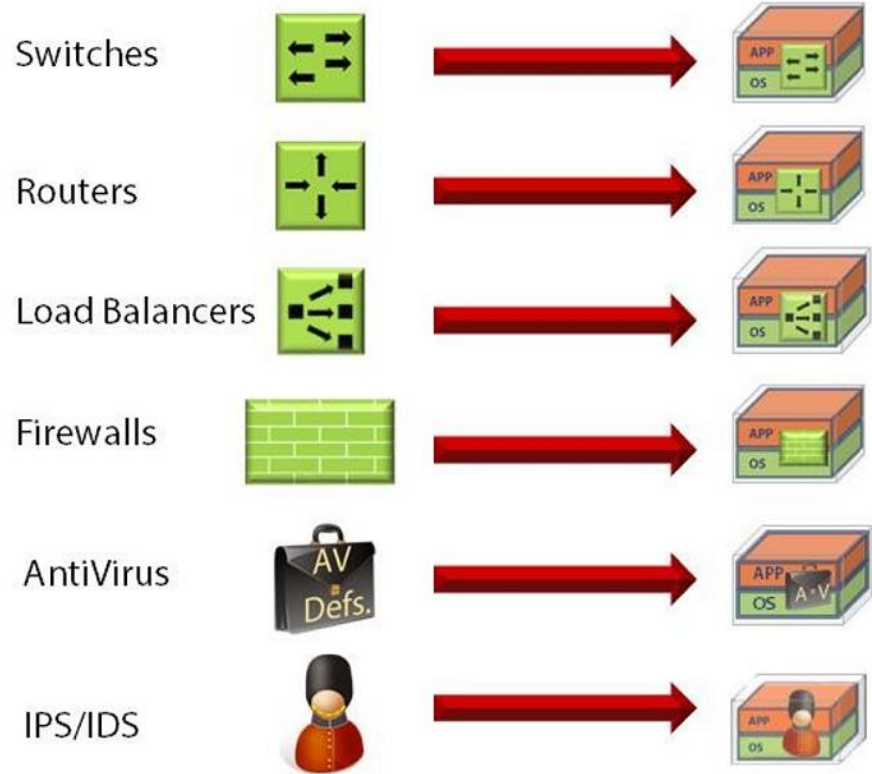
JUNE 2017



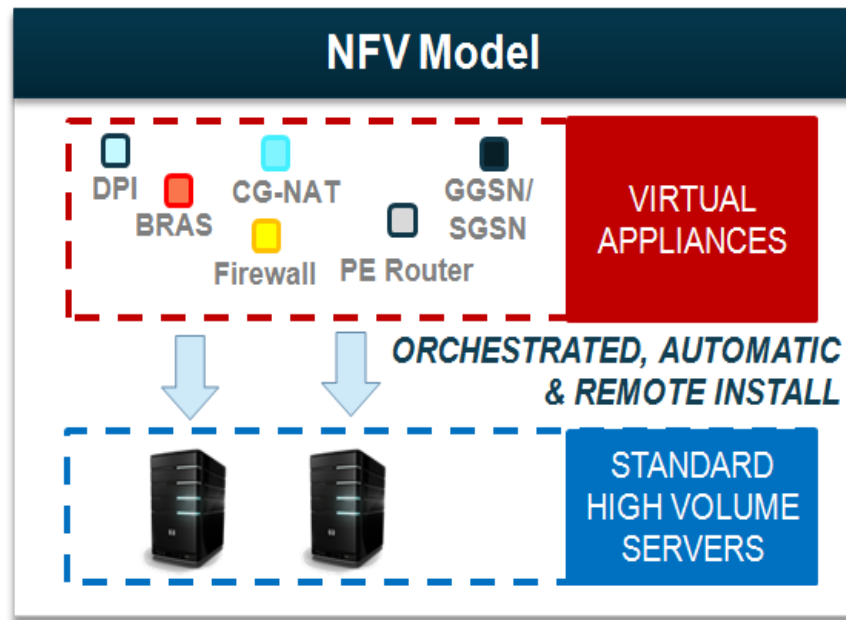
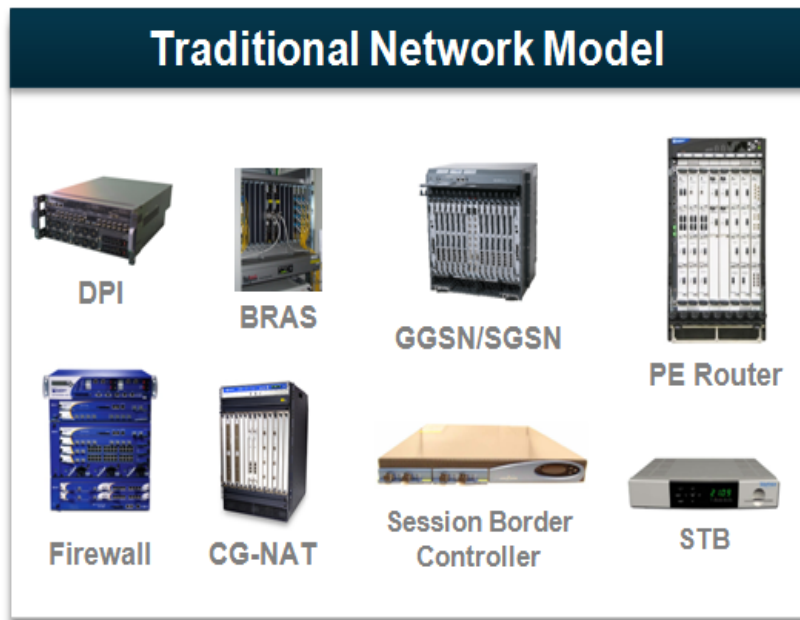
# Virtual Network Function (VNF)

Network equipment are provided as software components

Functions are both basic networking functions (switching, routing) and middleboxes (firewalls, IDS, ...)



# Network Function Virtualisation (NFV) objectives



Removing tightly coupled network function's software from underlying hardware

# NFV History



**NFV: an operator-led initiative with direct impact on the Telecommunications industry business model**



# NFV principles

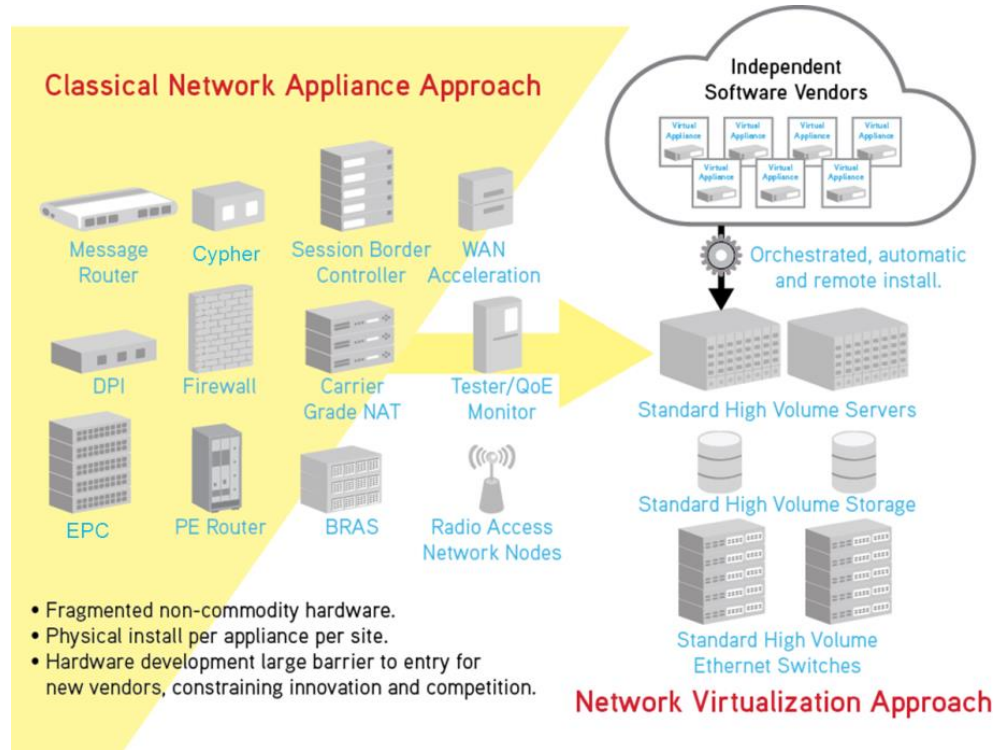
## Convergence of IT and Network

## Service-oriented multi-tenant systems

- pay as you go, on demand...

## Orchestration

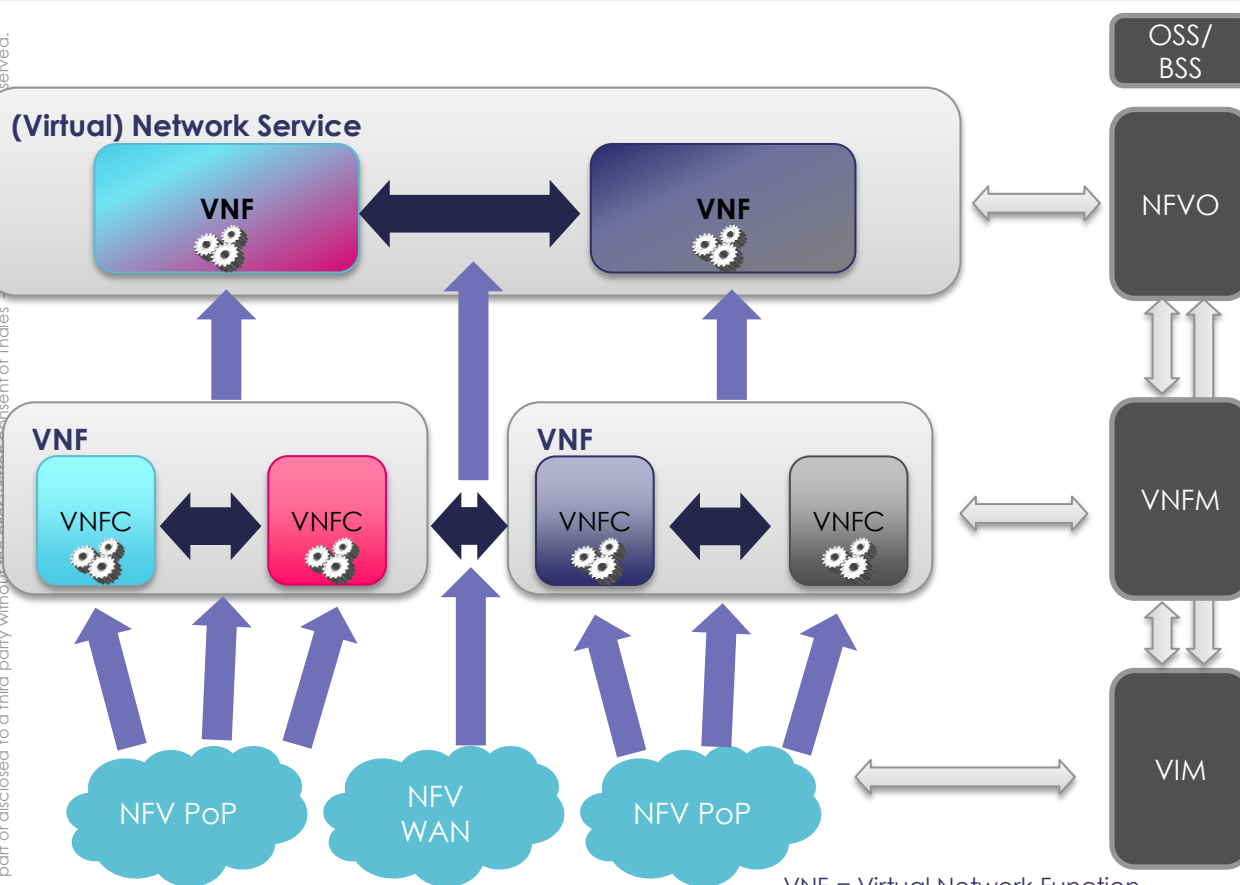
- programmability, virtualization, automation...





# ETSI NFV Reference Architectural Framework

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VNF = Virtual Network Function  
VNFC = VNF Container  
PoP = Point of Presence

## NFV Orchestrator:

- on-boarding of new Network Service (NS), VNF-FG and VNF Packages
- NS lifecycle management (including instantiation, scale-out/in, performance measurements, event correlation, termination)
- global resource management, validation and authorization of NFVI resource requests
- policy management for NS instances

## VNF Manager:

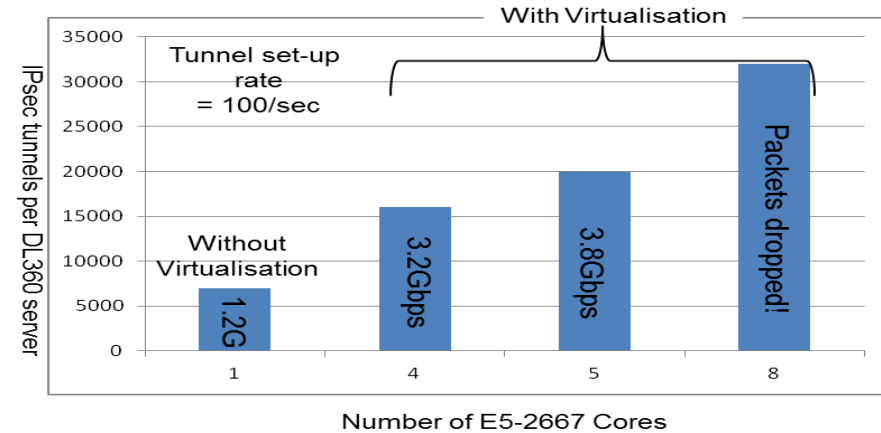
- lifecycle management of VNF instances
- overall coordination and adaptation role for configuration and event reporting between NFVI and the E/NMS

## Virtualized Infrastructure Manager (VIM):

- control and manage the NFVI compute, storage and network resources
- collection and forwarding of performance measurements and events

# NFV is on its way

- network functions can operate at the level of several millions of packets per sec, per CPU core
- standard high volume servers have sufficient processing performance to cost-effectively virtualize network appliances
- The hypervisor need not be a bottleneck
- The OS need not be a bottleneck
- Total Cost of Ownership advantages are a huge driver – e.g., energy savings
- A concerted industry effort is underway to accelerate this vision by encouraging common approaches which address the challenges for NFV



Used KVM (redhat 6.3) with Ubuntu 10.04 LTS virtual machines



- **Networks are made of software : they need to be engineered, designed, planned and operated as such**
- **Major change in network engineering**
- **Why it matters and what does it change for system design : Thales business example**

# Mexico – largest urban security system

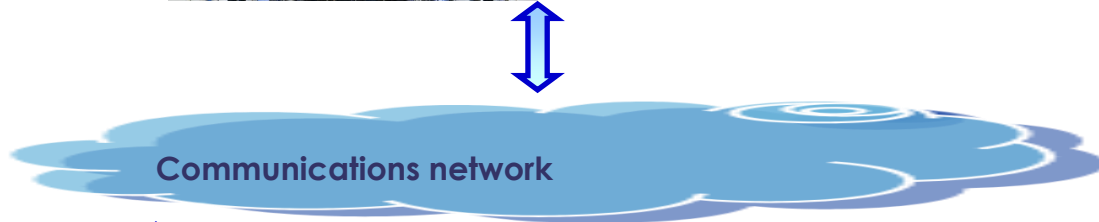
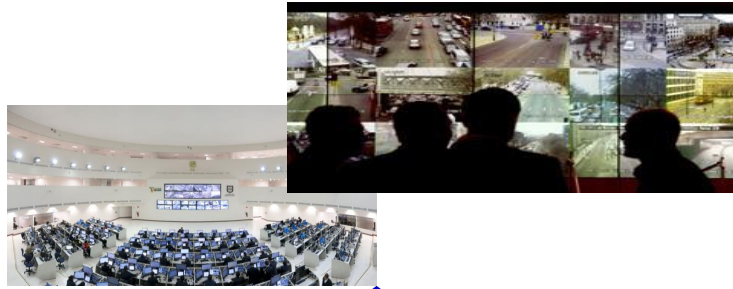
Mexico – 22 Million people

Mexico City's urban security system comprises: two mobile C2s, four MUAV drones, 210 number plate recognition cameras, integrated communications, 20000 advanced video surveillance cameras, centralisation of incidents and reporting



Multi-agencies coordination system  
Video surveillance- > 20K cameras  
Crisis management system  
Emergency response time cut by three  
Crime in the metro has fallen by 80%  
Car thefts reduced by 10%  
Criminal activity down by 35%.

# System architecture



## Central supervision

- Video surveillance control room

Up/Downlink  
Video Traffic



Uplink  
Video Traffic



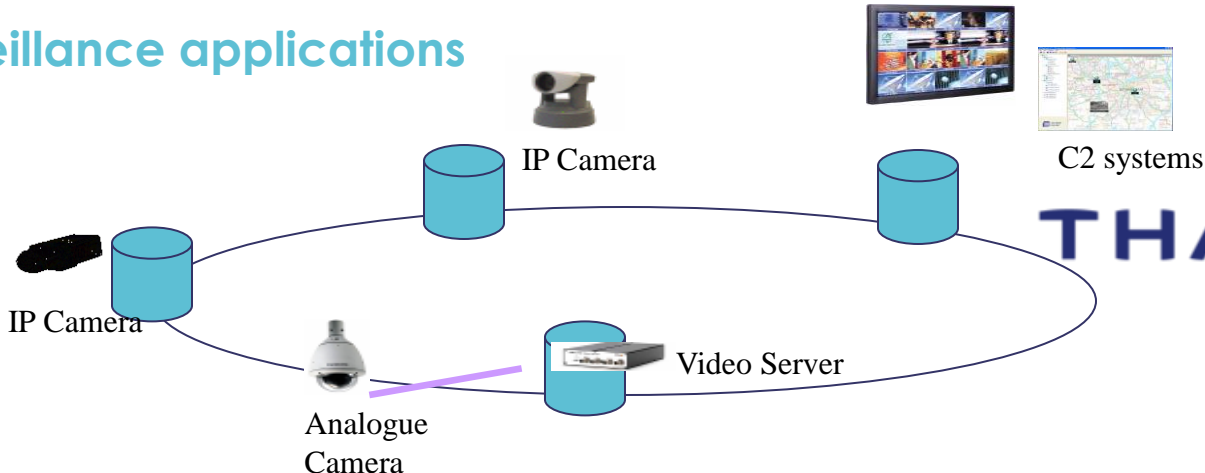
Downlink  
Video Traffic



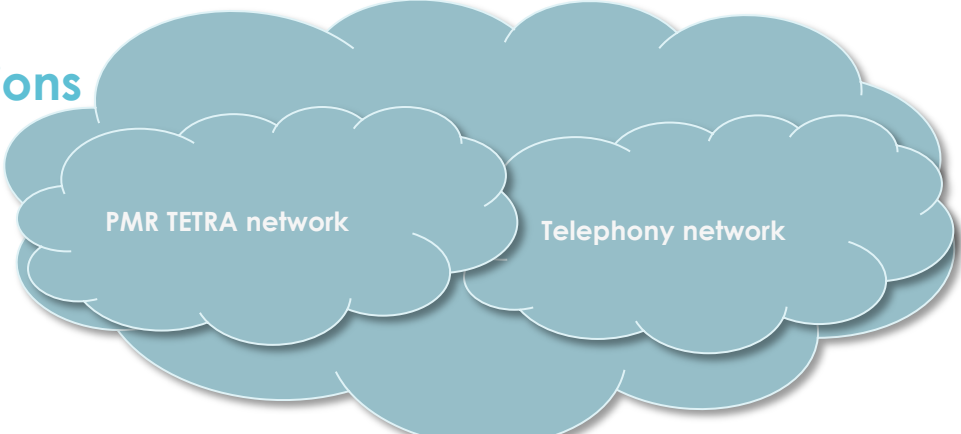
Group Call, Individual  
Call, Emergency Call

# Mexico surveillance business split

## Video surveillance applications



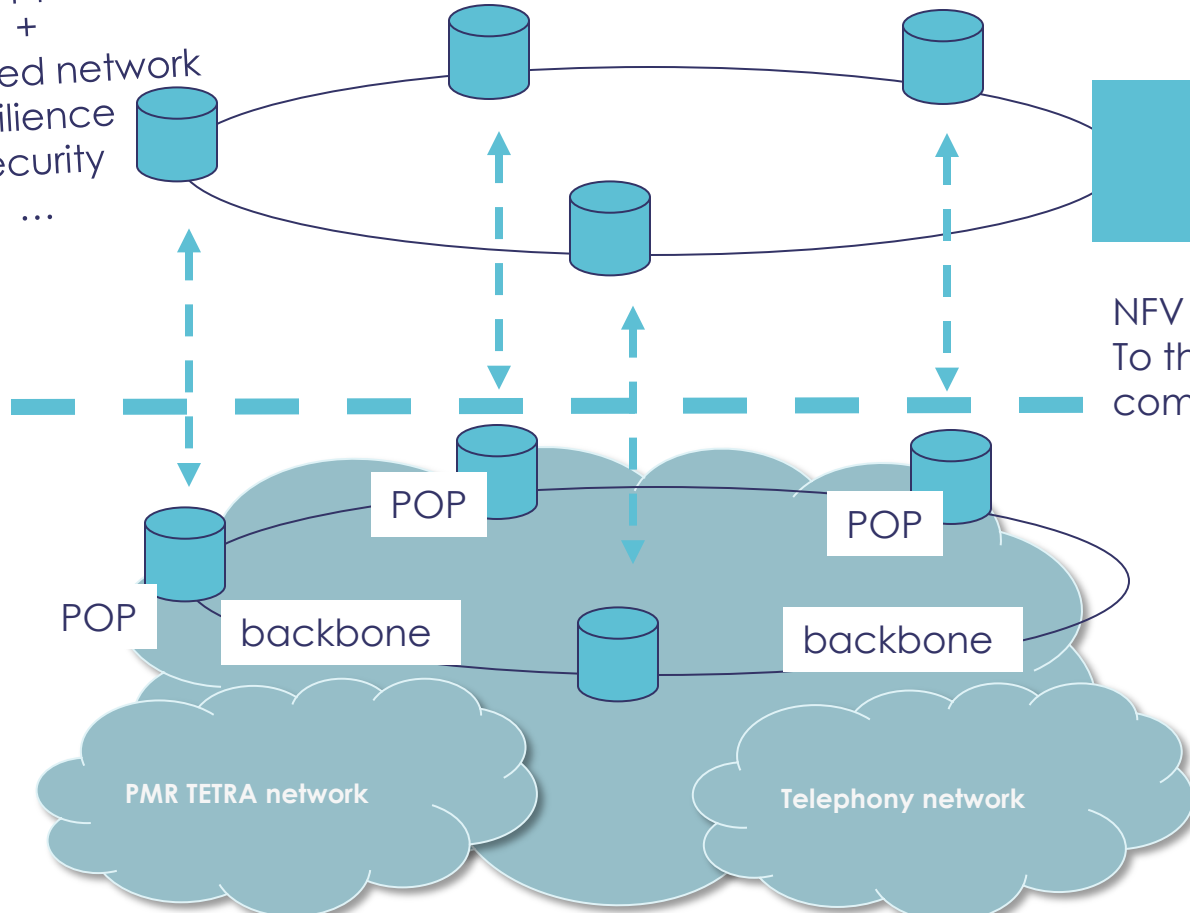
## Telecommunications network



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# NFV based virtualised videosurveillance solution

Business applications  
+  
Enhanced network  
resilience  
Security  
...



THALES

Automated NFV  
management

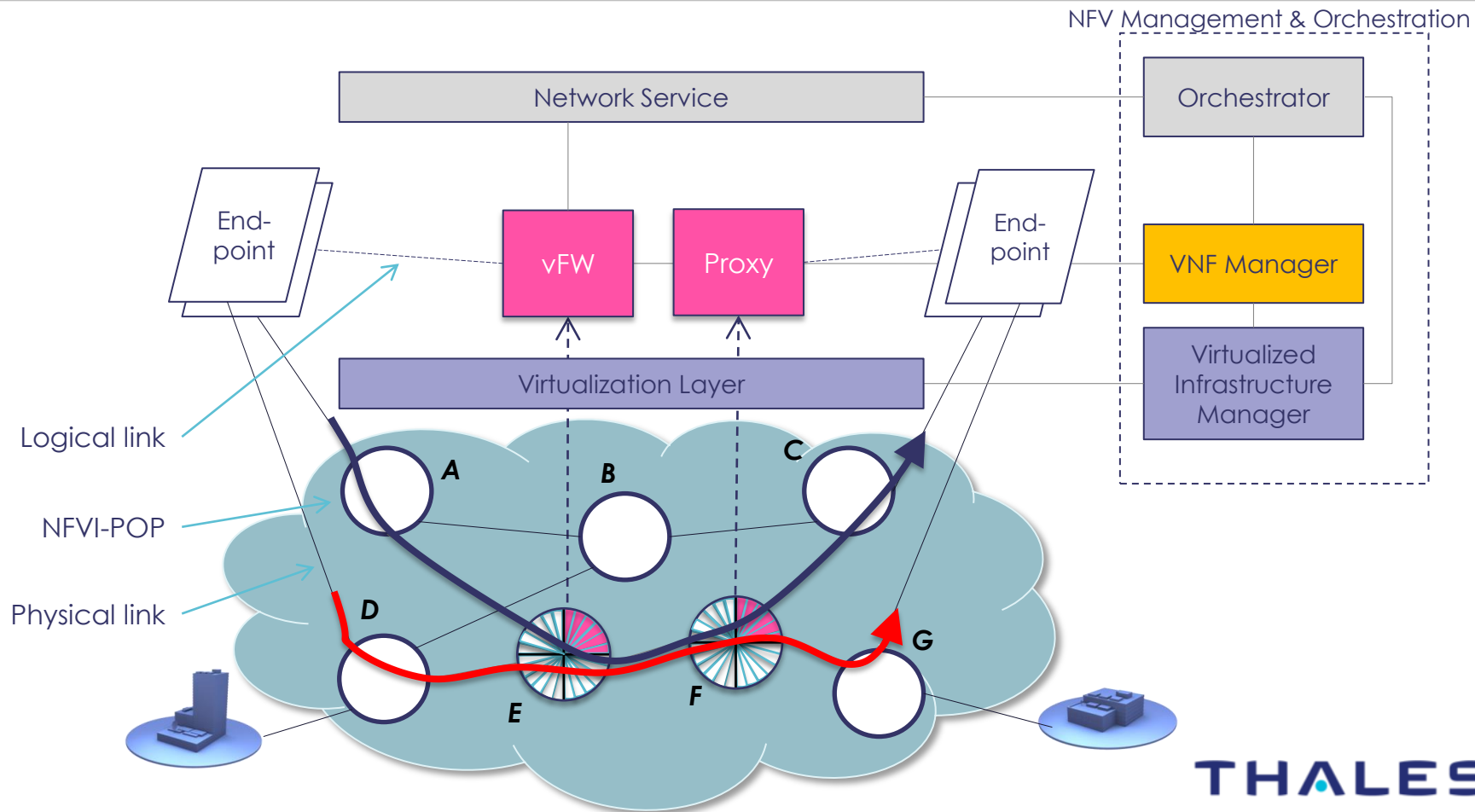
NFV APIs  
To the virtualised  
communications infrastructure

TELMEX®

NFVI

THALES

# NFV orchestration: placement and chaining challenge



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## ■ New for network design and operation: network build, run

## ■ New challenges of service orchestration and chaining

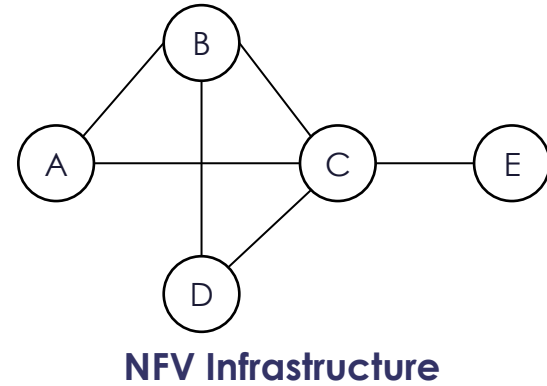
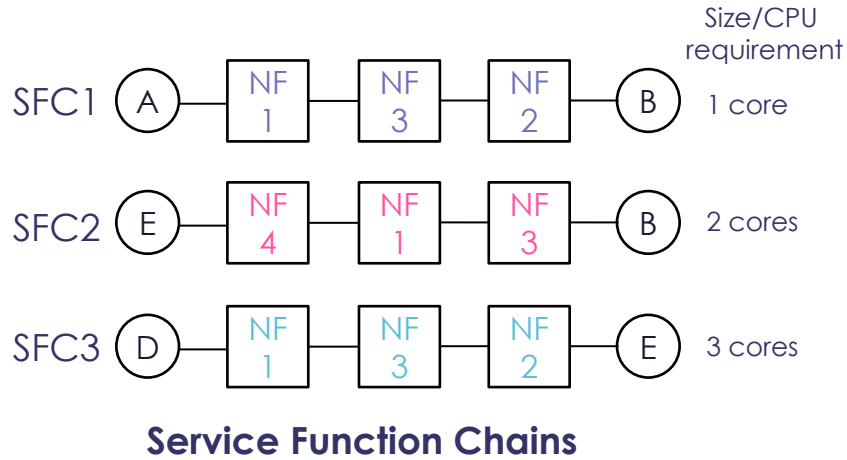
- Network build: Off-line (system provisioning)
- Network run: On-line (system operation)

# Off-line placement and chaining

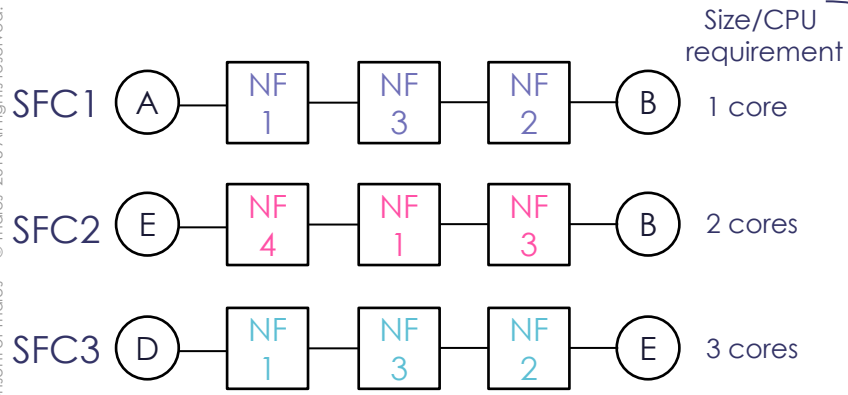
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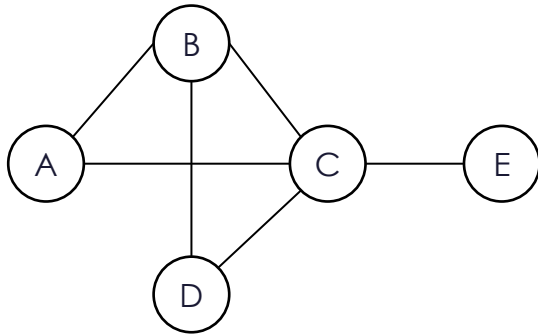
# Challenge overview



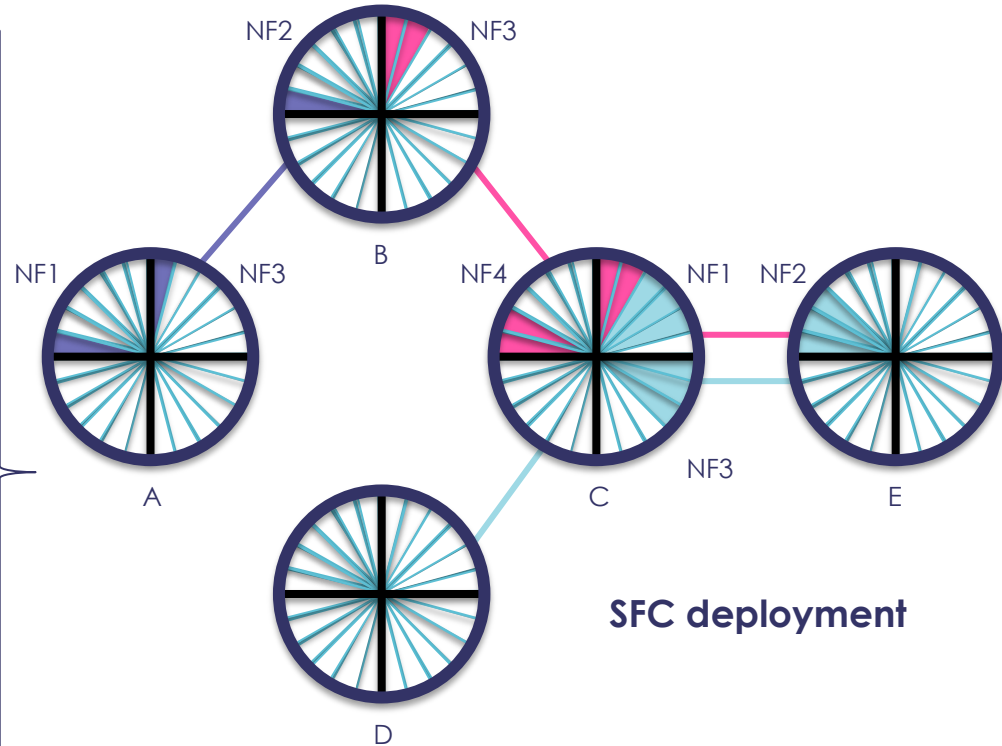
# Challenge overview



## Service Function Chains



## NFV Infrastructure



## SFC deployment

Trade-off between the number of VNF instances and service requests redirections (path stretch)

# Our service chaining problem

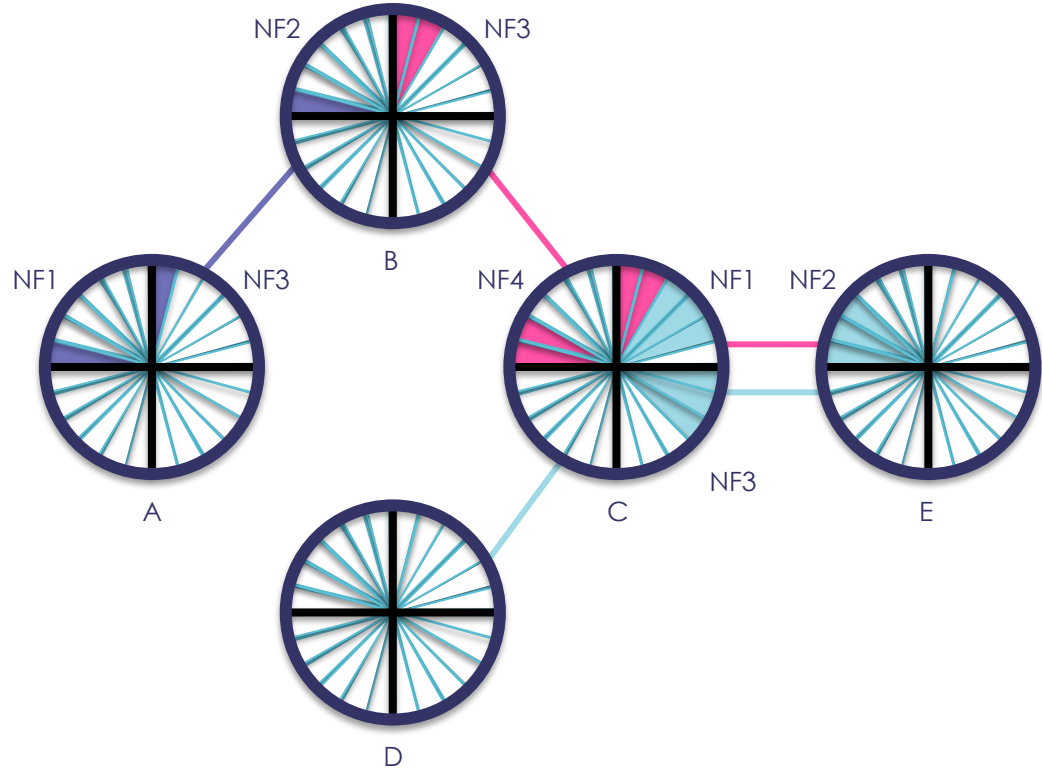
Goal: Minimize total deployment cost

Node cost: if at least one network function is assigned to a node (PoP), this node has a cost  $c$

Network cost: proportional to the number of hops and the CPUs used by the NFs

Hypotheses:

- No SLO penalties
- Link resources are “infinite”
- Only limitation on nodes’ (PoP) resources



# ILP formulation

## Objective:

$$\min \left( \sum_{n \in N} o_n \cdot N_c + \sum_{n_1 \in N, n_2 \in N} a_{n_1, n_2} \cdot \sum_{r \in R, l \in L} y_{r, l, n_1, n_2} \cdot L_c \right) \quad (1)$$

## Subject to:

$$x_{r, v_g, n, c}^c \leq x_{r, v_g, n} \quad \forall n \in N, v_g \in V_g, c \in C, r \in R \quad (2)$$

$$\sum_{r \in R, v_g \in V_g} x_{r, v_g, n, c}^c \cdot s_r \leq V_c \quad \forall n \in N, c \in C \quad (3)$$

$$\sum_{v \in V, c \in C} z_{v, n, c} \leq C_c \quad \forall n \in N \quad (4)$$

$$\sum_{v \in V} z_{v, n, c} \leq 1 \quad \forall n \in N, c \in C \quad (5)$$

$$l > u_r + 1 \Rightarrow y_{r, l, n_1, n_2} = 0 \quad \forall r \in R, n_1 \in N, n_2 \in N, l \in L \quad (6)$$

$$v_g > u_r \Rightarrow x_{r, v_g, n} = 0 \quad \forall r \in R, n \in N, v_g \in V_g \quad (7)$$

$$v_g > u_r \Rightarrow x_{r, v_g, n, c}^c = 0 \quad \forall r \in R, n \in N, v_g \in V_g, c \in C \quad (8)$$

$$v_g \leq u_r \Rightarrow x_{r, v_g, n, c}^c \leq z_{f_r, v_g, n, c} \\ \forall r \in R, n \in N, c \in C, v_g \in V_g$$

$$z_{v, n, c} \leq o_n \quad \forall v \in V, n \in N, c \in C$$

$$v_g \leq u_r \Rightarrow \sum_{n \in N, c \in C} x_{r, v_g, n, c}^c = 1 \\ \forall r \in R, v_g \in V_g$$

$$l^g \leq u_r \Rightarrow \\ \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, l^g, n_1, n_2} - \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, l^g, n_2, n_1} \\ = (x_{r, l^g - 1, n_1} - x_{r, l^g, n_1}) \cdot s_r \\ \forall r \in R, n_1 \in N, l^g \in L^g \quad (12)$$

$$\sum_{n_2 \in N} a_{I_r, n_2} \cdot y_{r, 1, I_r, n_2} - \sum_{n_2 \in N} a_{I_r, n_2} \cdot y_{r, 1, n_2, I_r} \\ = (1 - x_{r, 1, I_r}) \cdot s_r \\ \forall r \in R \quad (13)$$

$$n_1 \neq I_r \Rightarrow \\ \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, 1, n_1, n_2} - \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, 1, n_2, n_1} \\ = x_{r, 1, n_1} \cdot s_r \\ \forall r \in R, n_1 \in N \quad (14)$$

$$\sum_{n_2 \in N} a_{E_r, n_2} \cdot y_{r, u_r + 1, E_r, n_2} - \sum_{n_2 \in N} a_{E_r, n_2} \cdot y_{r, u_r + 1, n_2, E_r} \\ = (x_{r, u_r, E_r} - 1) \cdot s_r \\ \forall r \in R \quad (15)$$

$$n_1 \neq E_r \Rightarrow \\ \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, u_r + 1, n_1, n_2} - \sum_{n_2 \in N} a_{n_1, n_2} \cdot y_{r, u_r + 1, n_2, n_1} \\ = x_{r, u_r, n_1} \cdot s_r \\ \forall r \in R, n_1 \in N \quad (16)$$

$$l \leq u_r + 1 \Rightarrow a_{n_1, n_2} \cdot y_{r, l, n_1, n_2} \geq 0 \\ \forall r \in R, n_1 \in N, n_2 \in N, l \in L \quad (17)$$

# Our heuristic algorithm: presentation

## 3 steps:

- Step 1: Find the minimum number of nodes ( $N_{min}$ ) needed to allocate all requests. We program a heuristic to do it.
- Step 2: Rank nodes in a decreasing order according to a modified betweenness centrality. Select the  $N_{min}$  nodes.
- Step 3: Allocate the SFC requests on the selected  $N_{min}$  nodes using an adapted Viterbi algorithm (multi-stage graph).

The last step is the one which dominates in terms of computational time.

Time complexity:

$$\Theta(r)$$

$r$  number of SFCs

$d$  node degree

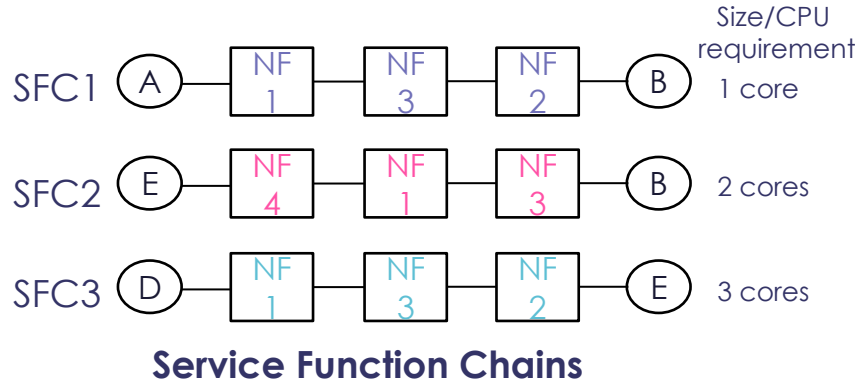
$n$  number of nodes

$m$  number of functions per SFC request

$$\Theta\left(r \cdot \frac{d+2}{2} \cdot n \cdot \log(n)\right)$$

$$\Theta\left(\frac{r^3}{16}(m-1) \cdot \frac{d+2}{2} \cdot n \cdot \log(n)\right)$$

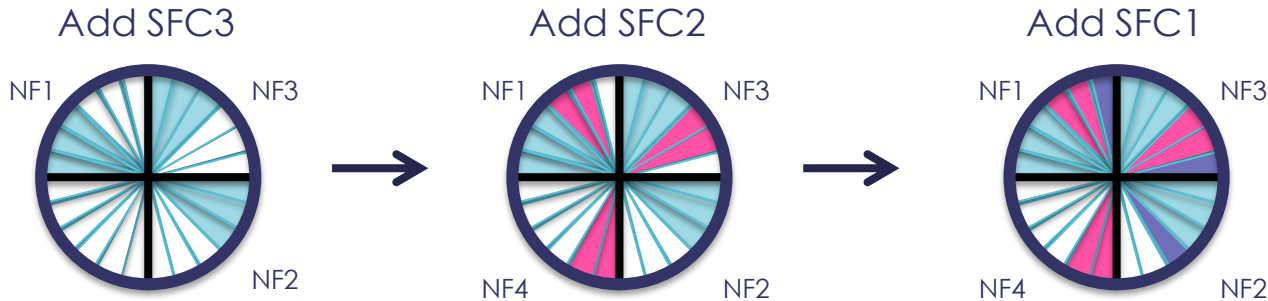
# Step 1: Find the minimum number of nodes



Rank SFC requests by decreasing CPU requirement



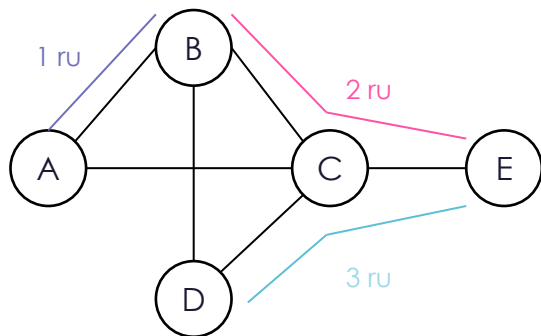
SFC3 > SFC2 > SFC1



Minimum node number = 1

# Step 2: Select the nodes based on their modified betweenness centrality

ru = resource unit



**NFV Infrastructure**

- Compute the betweenness centrality but only with paths from ingress to egress node of requests
- Weigh by CPU requirement

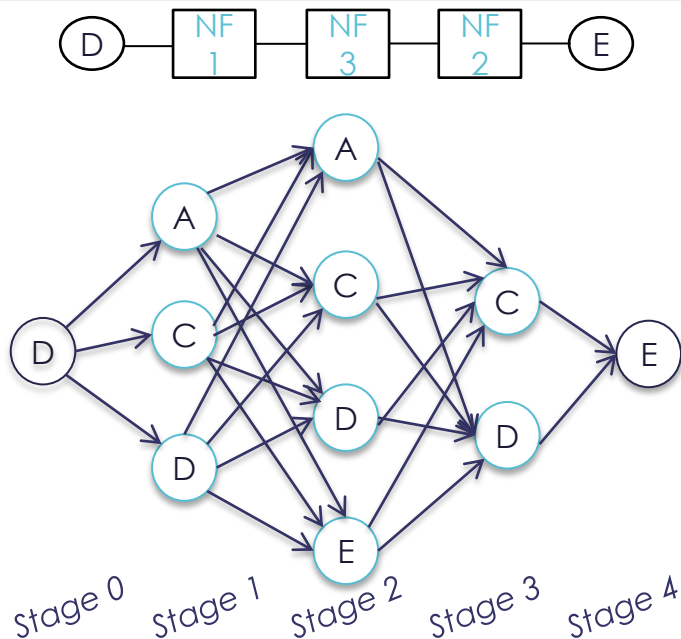
## Results:

A = 1  
B = 3  
C = 5  
D = 3  
E = 5



C and E have the highest centrality  
As we need only one node, C is chosen for example

# Step 3: Allocate the SFC requests with an adapted Viterbi algorithm



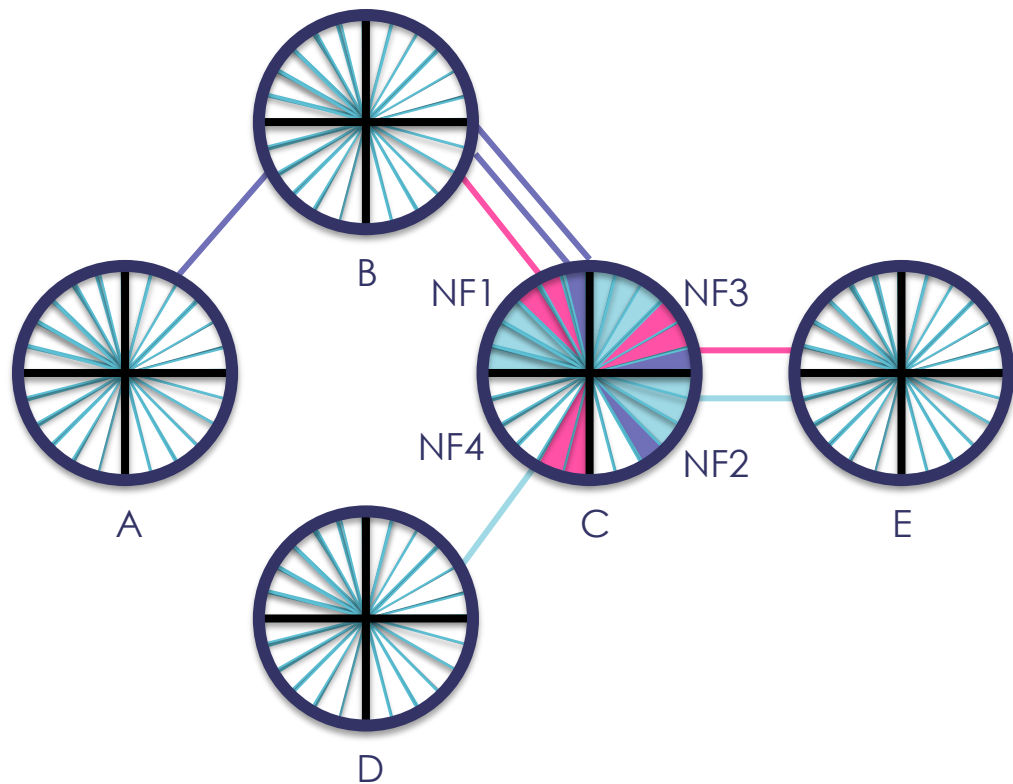
e.g.: minimum node number = 4 and centrality gives A,C,D,E

- Directed graph respecting the NF sequence order (SFC request)
- A graph representing for each NF the set of **nodes which have available resources** to host this NF
- A node at “step n-1” is linked to all “step n” nodes
- Each link has a **weight** representing the shortest path length
- The Viterbi Algorithm returns the sequence of nodes (one node by step) minimizing the path between the ingress and the egress nodes.

Our adaptation lies in the set of nodes formation. Our Viterbi graph is dynamic. It could change between two steps. The choice of a node at step n-1 influences the set of possible nodes at step n.



# Example of a final deployment with our heuristic



- Only one node instantiated
- One request redirected: SFC1 has two more hops than the shortest path between A and B

# Simulation

## ILP:

- CPLEX Optimization Studio

## Heuristic:

- Python 3

## Random graph model:

- Erdos Renyi model with degree 3

## SFC requests:

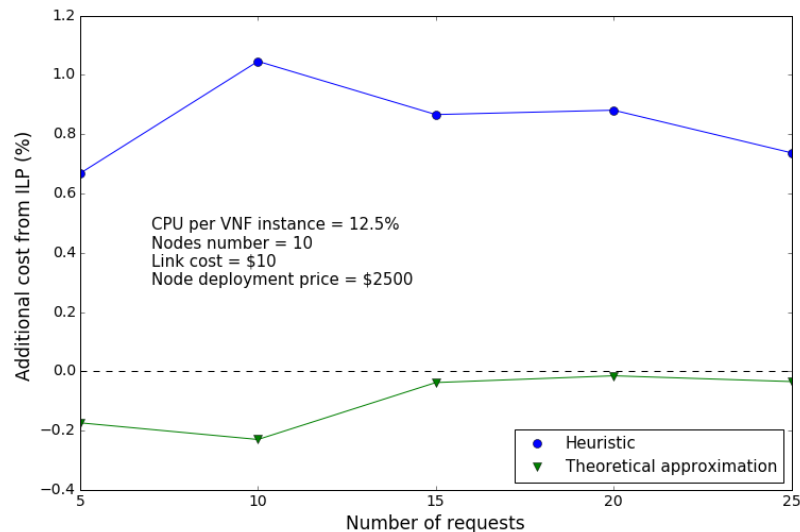
- CPU requirement at random, length of SFC request = 3, Number of NF types = 4

## 30 iterations

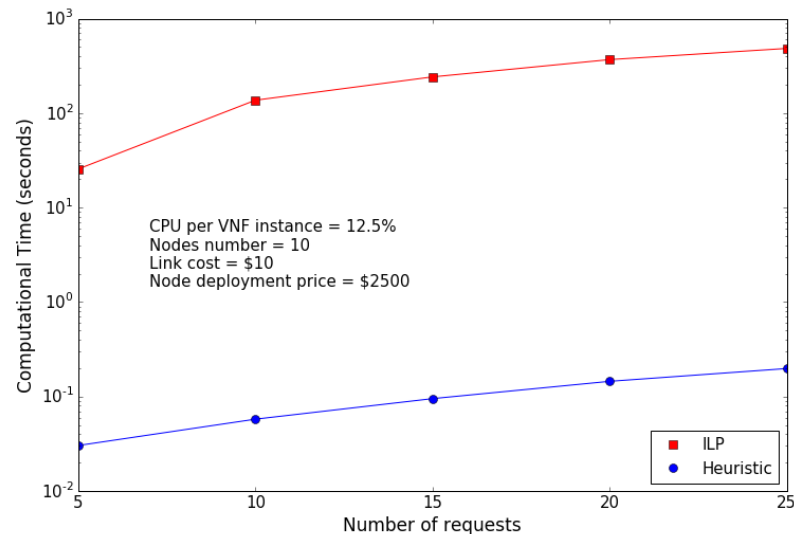
## « Theoretical approximation »:

- Lowest bound:  $N_{min}$  nodes, path length = shortest path
- Replace ILP for big instances

# Heuristic vs. ILP (vs. Theoretical approximation)



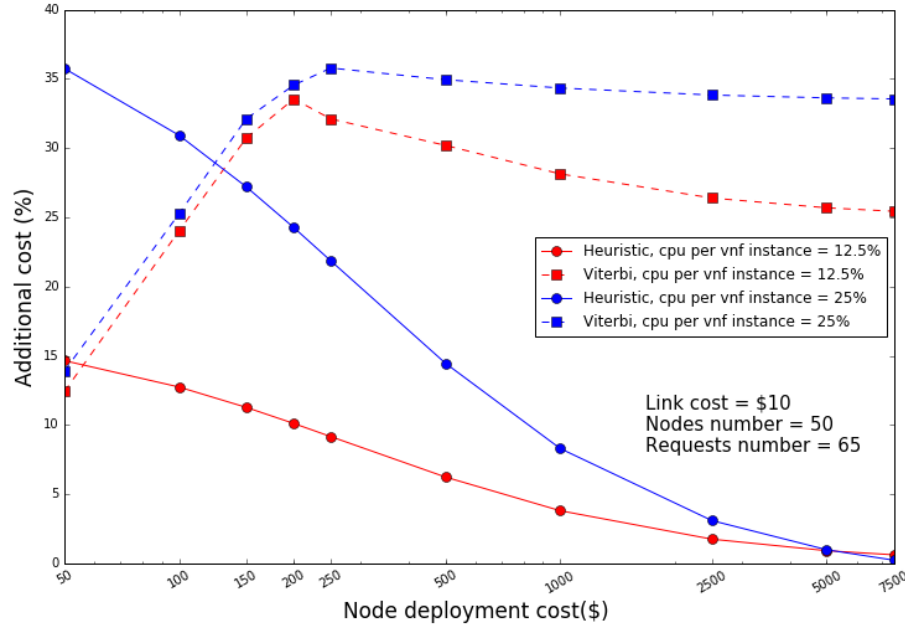
Heuristic cost close to the ILP solutions



Factor 1,000 between the heuristic and the ILP computation time

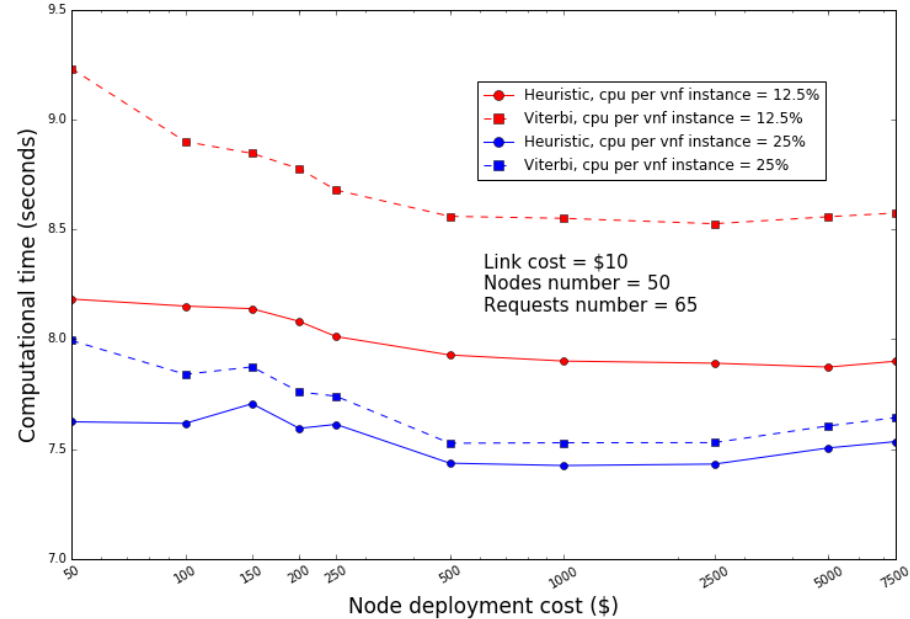
For large instances: the ILP will be replaced by the Theoretical approximation for biggest instances

# Heuristic vs. state of art “Viterbi-based” heuristic [1]



**Heuristic very efficient for node cost  $\gg$  link cost**

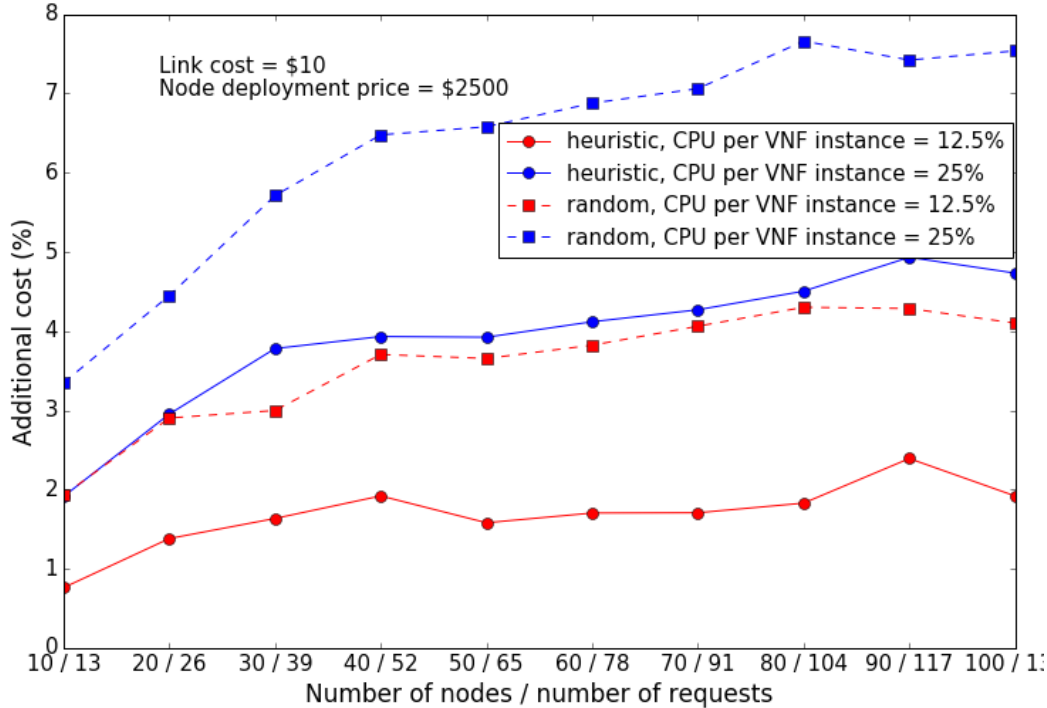
Blue = 4 cores / server  
Red = 6 cores / server



**Low computational time**

[1] M. F. Bari, S. R. Chowdhury, R. Ahmed, and R. Boutaba, “On orchestrating virtual network functions,” in CNSM 2015.

# Comparison Heuristic with centrality vs. Heuristic with random



- Centrality is worth to use (solid lines under dashed lines)
- “Random” corresponds to a random choice for the set of the min number nodes to instantiate

**Additional cost for different instance size for the heuristic  
- 2 strategies for node selection: Centrality vs. Random**

# Conclusion

**Goal: Find a cost-effective placement for the virtual network function chaining problem**

**Heuristic in 3 steps:**

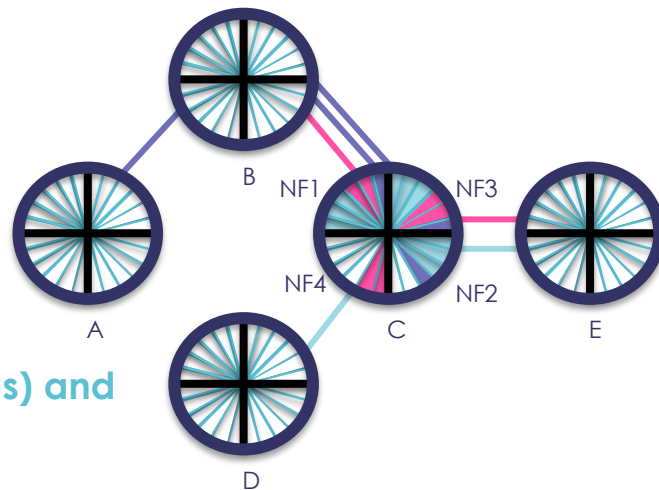
- Find min number of nodes to instantiate
- Centrality-based election of nodes
- Multi-stage graph allocation

**Our heuristic minimizes the number of used nodes (PoPs) and reroutings**

**Our heuristic is efficient, particularly for a node price larger than the flow unit price**

**Future work:**

- Add SLO penalties
- Online problem
- Tackle the reliability problem

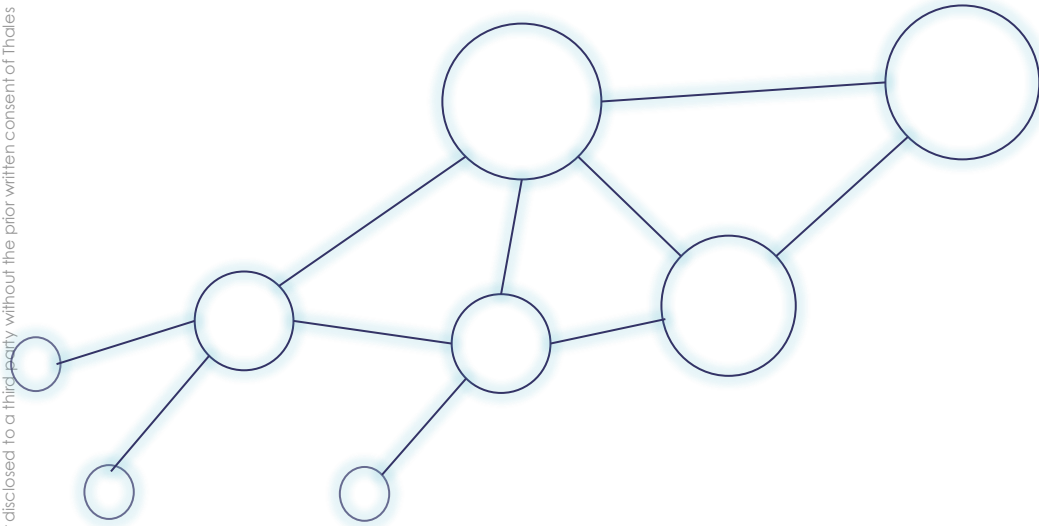


# On-line placement and chaining

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# Online NFV Orchestration – Problem Statement

## Online Orchestration



## VNF located in PoPs

FW

Firewall

DPI

Deep Packet Inspection

CA

Cache

VE

Video Encoder

IDS

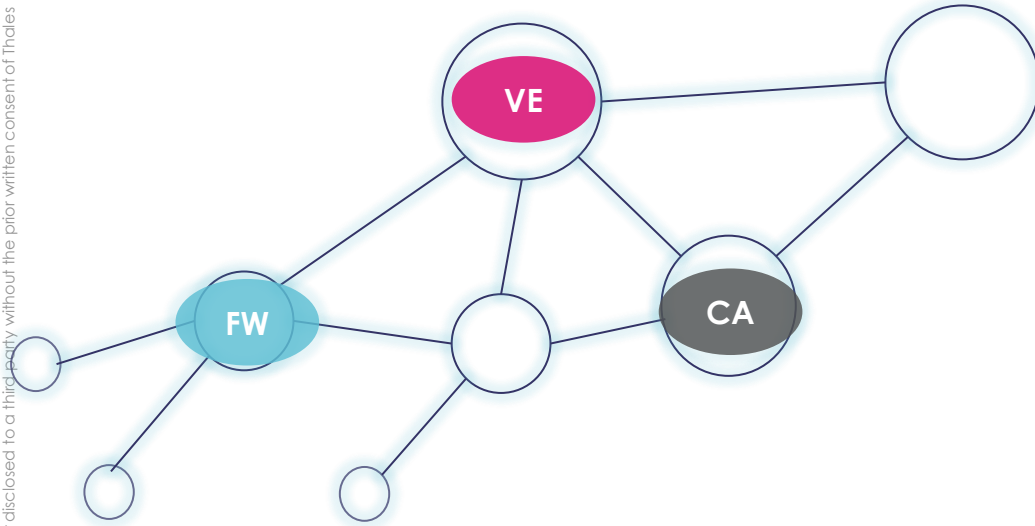
Intrusion Detection System



# Online NFV Orchestration - Problem Statement

## Online Orchestration

➤ VNF location



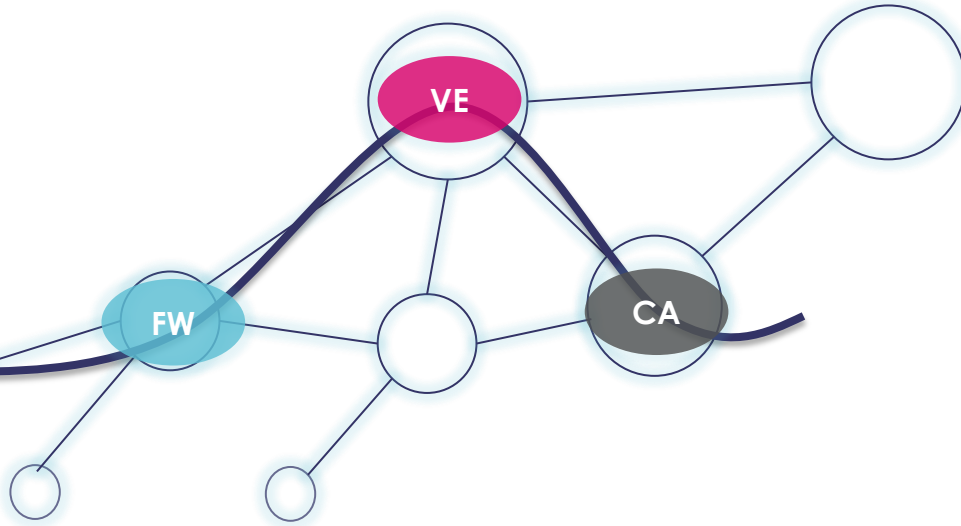
## VNF located in PoPs

- FW** Firewall
- DPI** Deep Packet Inspection
- CA** Cache
- VE** Video Encoder
- IDS** Intrusion Detection System

# Online NFV Orchestration - Problem Statement

## Online Orchestration

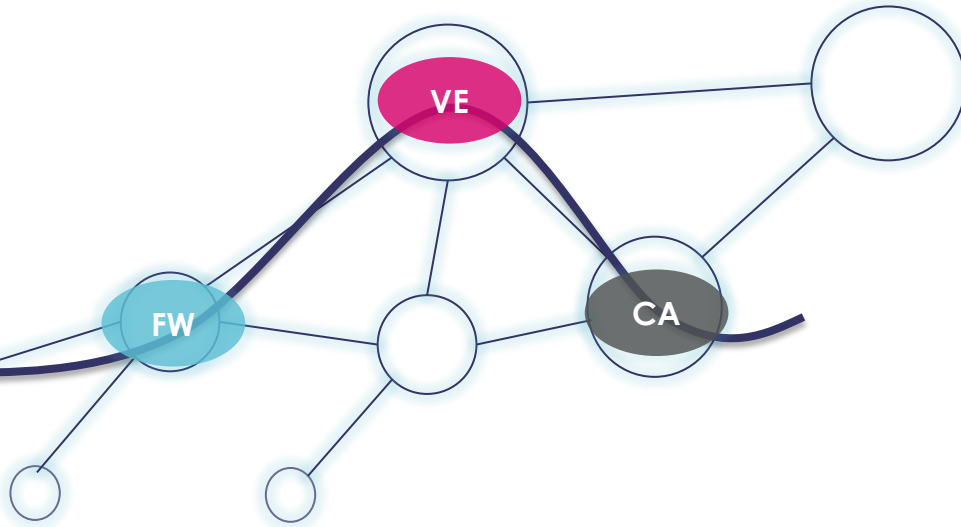
- VNF location
- Routing



# Online NFV Orchestration - Problem Statement

## Online Orchestration

- VNF location
- Routing



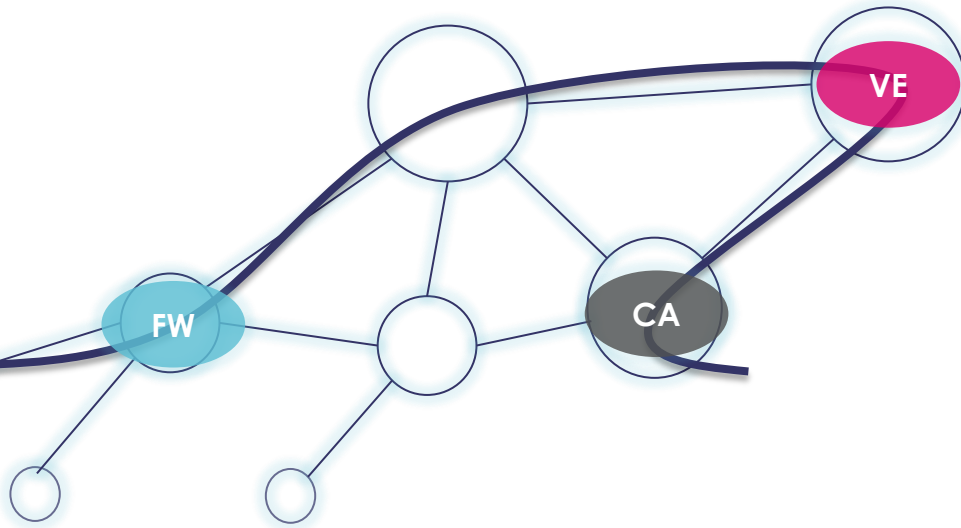
## Joint problem

- VNF placement constrains possible routing
- Optimal placement depends on load
- Load depends on routing

# Online NFV Orchestration - Problem Statement

## Online Orchestration

- VNF location
- Routing



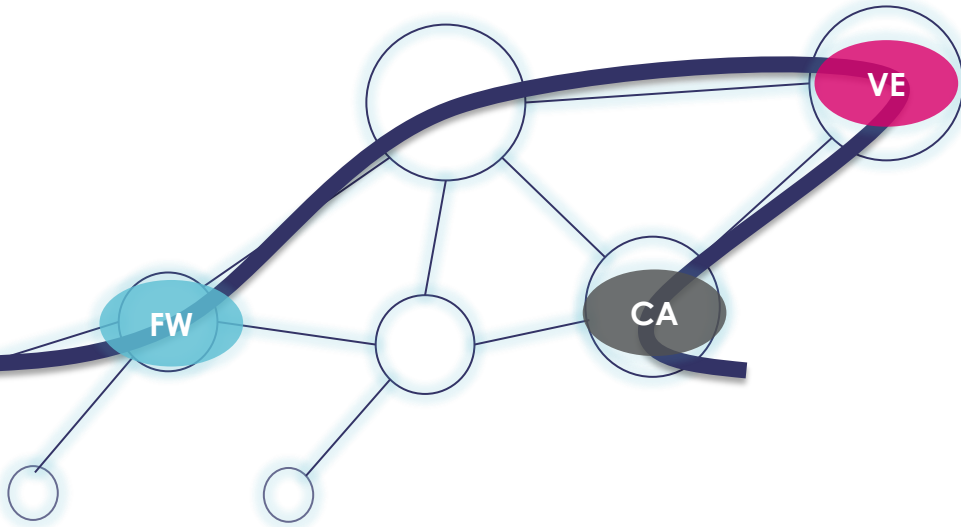
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# Online NFV Orchestration - Problem Statement

## Online Orchestration

- VNF location
- Routing



## Joint problem

- VNF placement constrains possible routing
- Optimal placement depends on load
- Load depends on routing

## Online problem:

- New flows
- Changing loads
- Optimal placement changes

# Online NFV Orchestration - Problem Statement

## ➤ Competing goals:

- Minimize network cost
- Keep number of rerouted flows low

## ➤ Solved with:

- ILP: gives optimal results on small topologies in terms of cost and number of rerouted flows
- Game theory algorithm:
  - Gives a theoretical bound of how far the cost is from the optimal
  - Is quicker than the ILP
  - Can be tuned to favor either a low cost or a low number of rerouted flows
  - Can be distributed

# COST MODEL

■  $C = C_l + C_p + C_o$

■  **$C_l$ : Links**

- Linear Cost on each link w.r.t to bandwidth

■  **$C_p$ : Computing**

- Piece-wise linear w.r.t load on the PoP
  - Cost grows faster as load grows
  - Energy
  - Limited PoP capacity

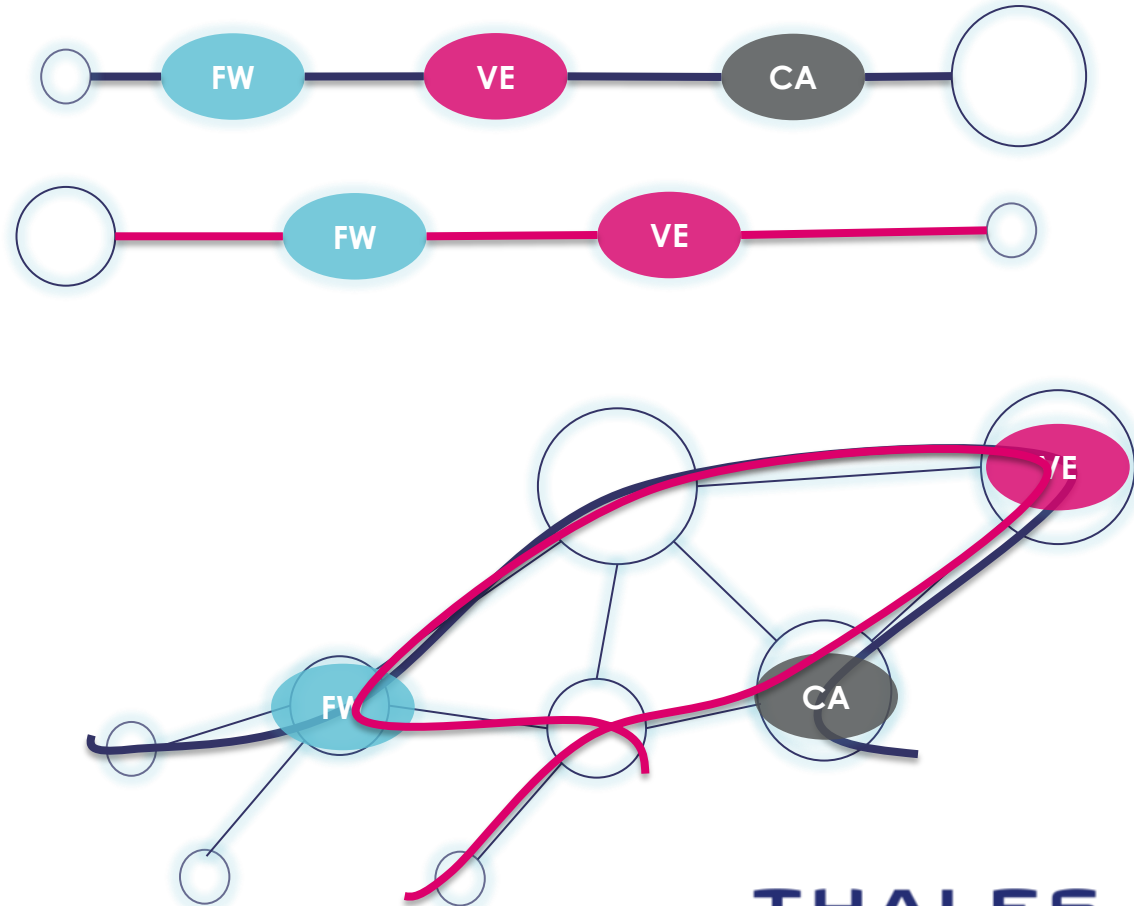
■  **$C_o$ : Opening Cost**

- Constant on each VNF

# Online NFV Orchestration – Game theory algorithm

## Game theory heuristic

- Each Service chain is a player
- Each player tries to minimize their cost:
  - link cost
  - computing cost
  - opening cost
- Cost paid by each request is the proportion of each global cost

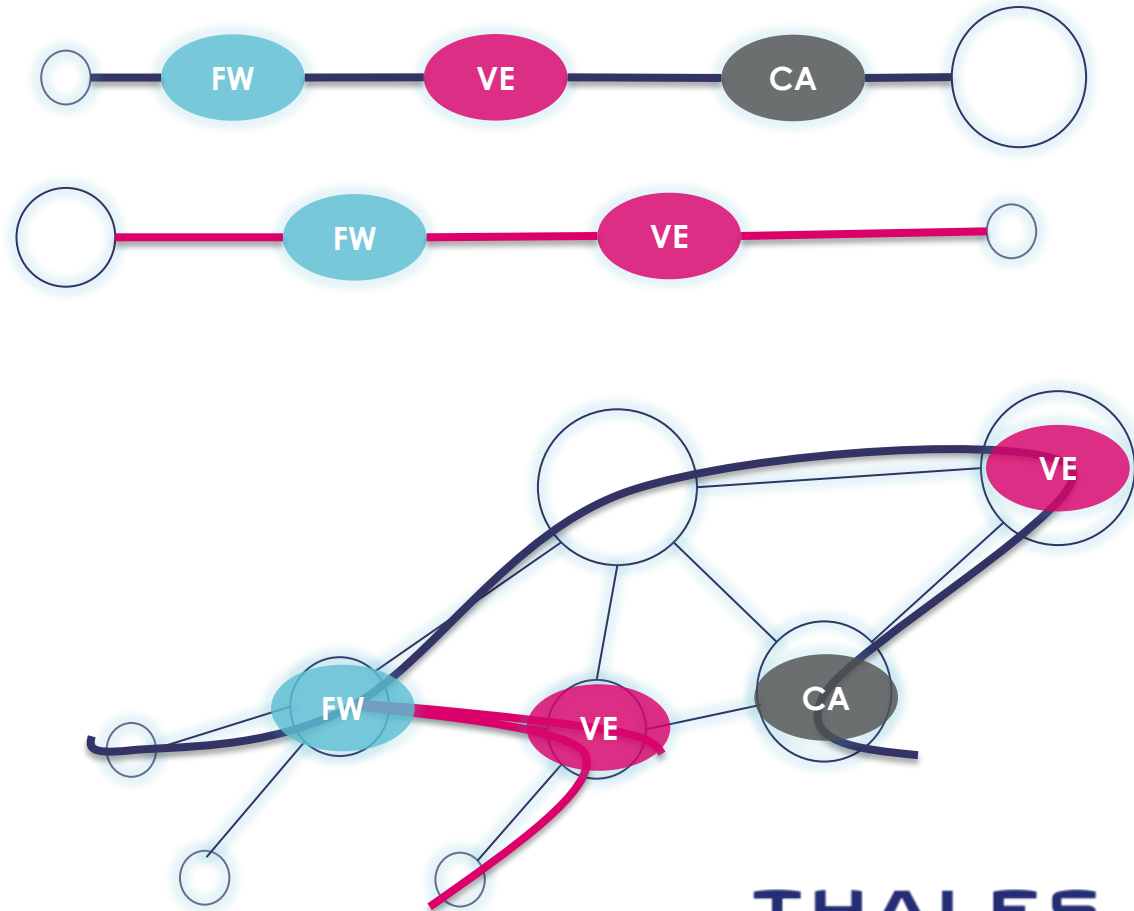




# Online NFV Orchestration – Game theory algorithm

## Game theory heuristic

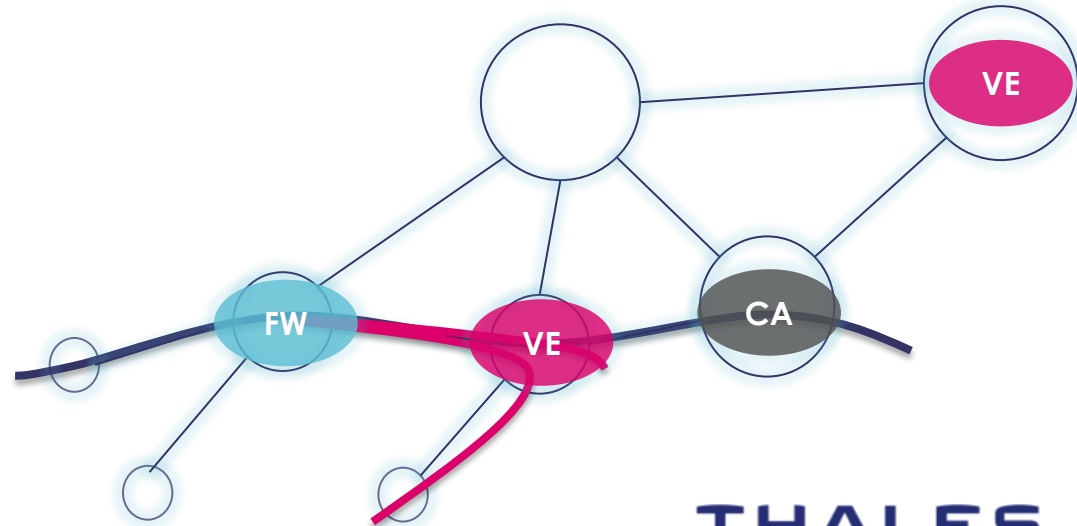
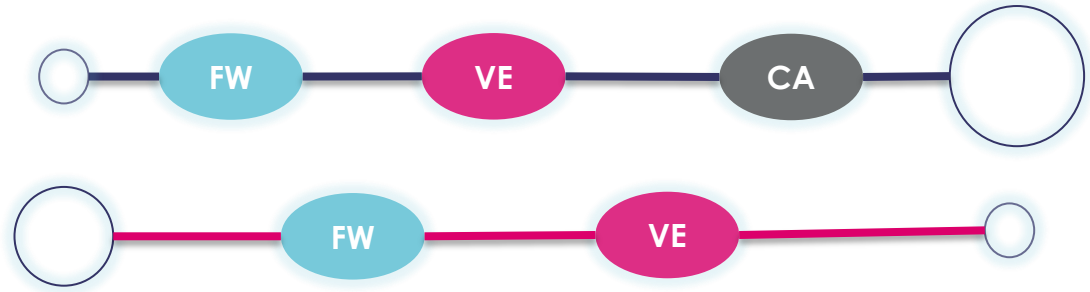
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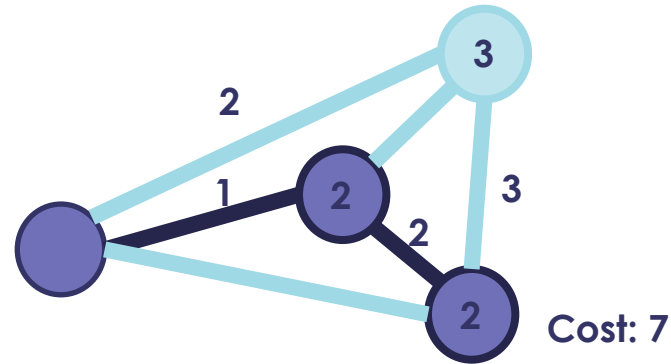
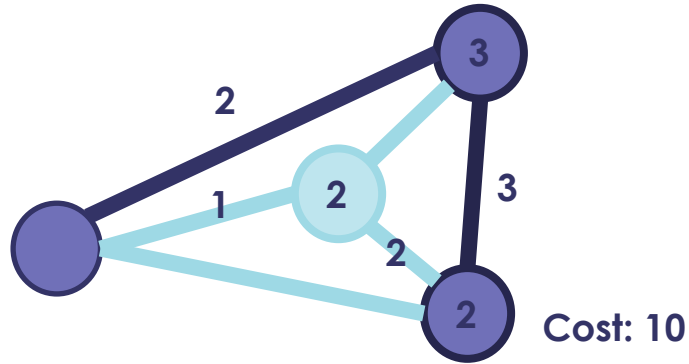
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  - link cost
  - computing cost
  - opening cost
- Cost paid by each request is the proportion of each global cost
- Each player's decision can be made independently
- Cost depends on other player placement



# Online NFV Orchestration – Game theory algorithm



## Tuning reroutings with parameter $\alpha$

- $\alpha = 0$  no rerouting, we keep the first offline solution
- $\alpha = 1$  every « interesting rerouting »

$\alpha$  close to 0  
Higher cost  
Less reroutings  
Shorter convergence time



$\alpha$  closer to 1  
Lower cost  
more reroutings  
longer convergence time

## Topology

- The measured intensity of traffic is equal to request size
- Traffic Matrix: All to All
- Real traffic matrix

Uhlig et al. Providing public intradomain traffic matrices to the research community. ACM SIGCOMM Computer Communication Review, 36(1):83–86, 2006.

- Request are chains of either 3 or 5 VNFs



# Online NFV Orchestration – Evaluation, comparison with optimal cost

## Cost comparison

### PoP capacity:

total traffic/Nb of PoPs

### Computing cost:

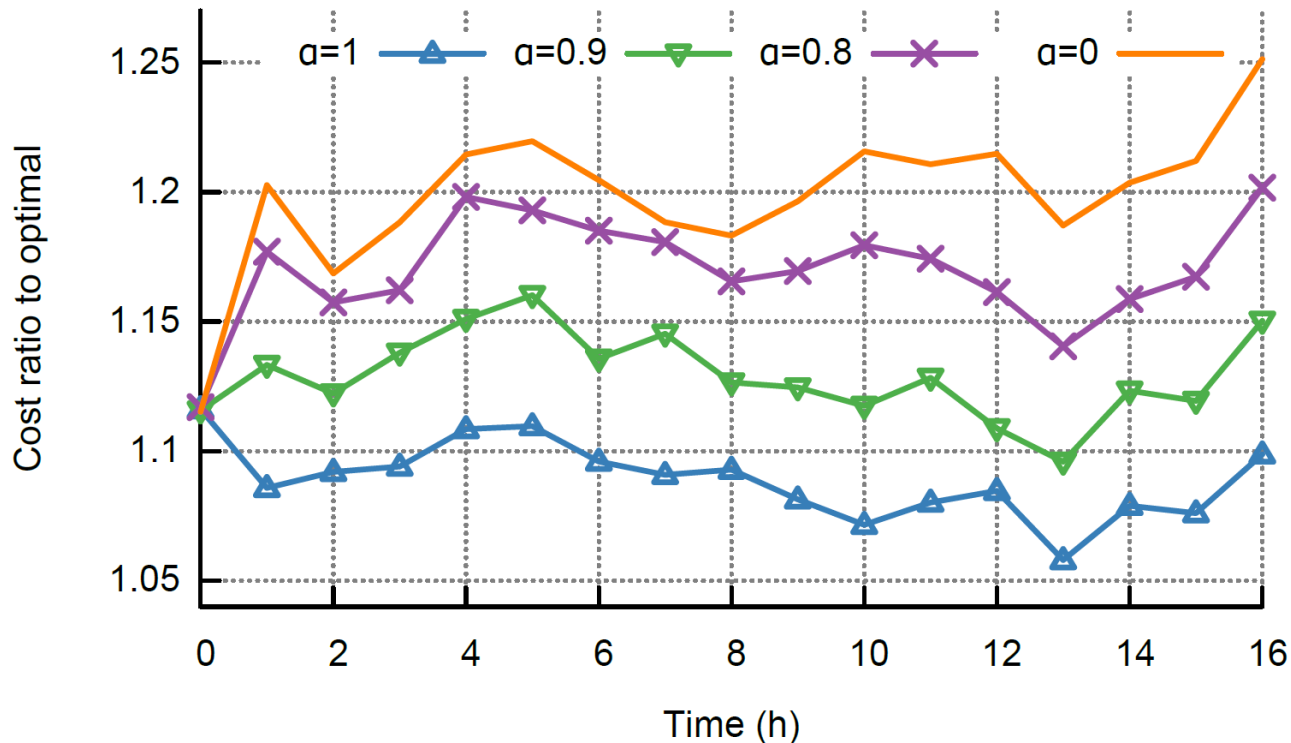
Under cap=\$1

Over cap= \$5

Link cost=\$1

Opening cost=\$20

- Alpha can be tuned to give close to optimal cost if it is equal to 1
- Lower values of alpha give results farther from the optimal



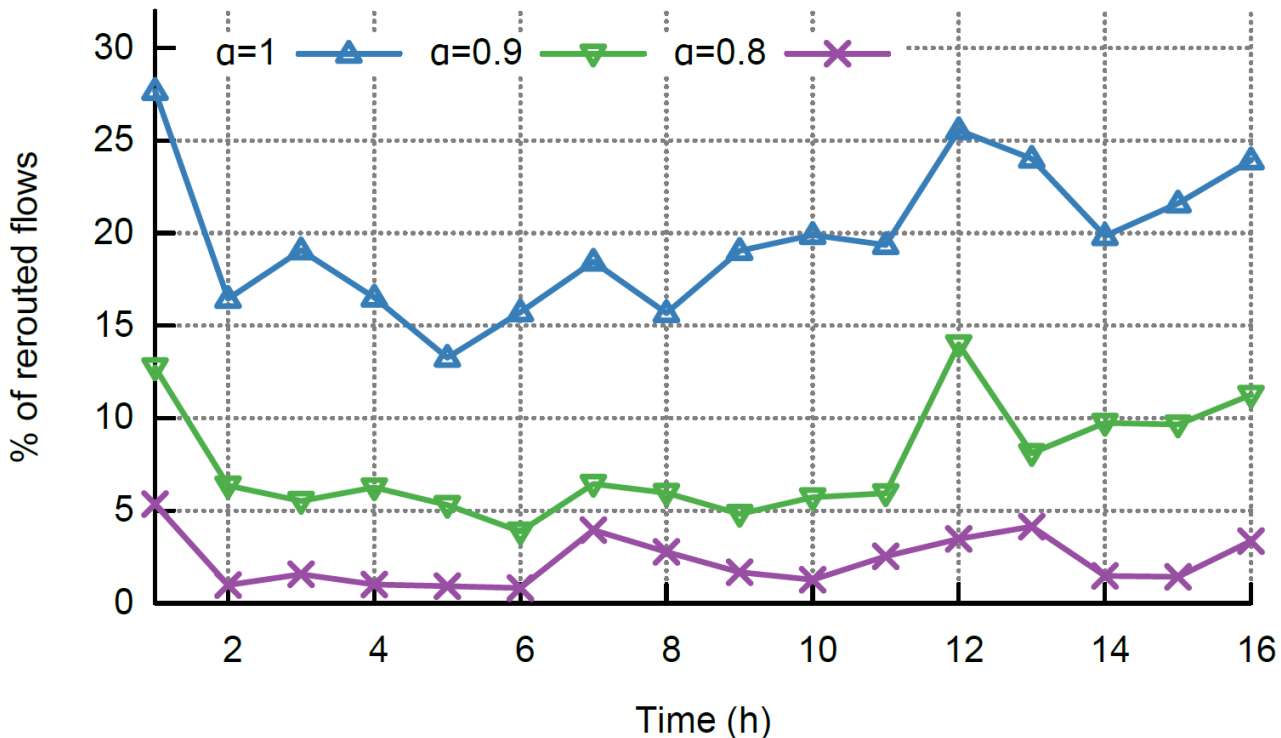
# Online NFV Orchestration – Evaluation

## Rerouted flows

**PoP capacity:**  
total traffic/Nb of PoPs

**Computing cost:**  
Under cap=\$1  
Over cap= \$5  
Link cost=\$1  
Opening cost=\$20

- When alpha is equal to 1 the number of rerouted flows can be high
- It is much lower for lower values of alpha



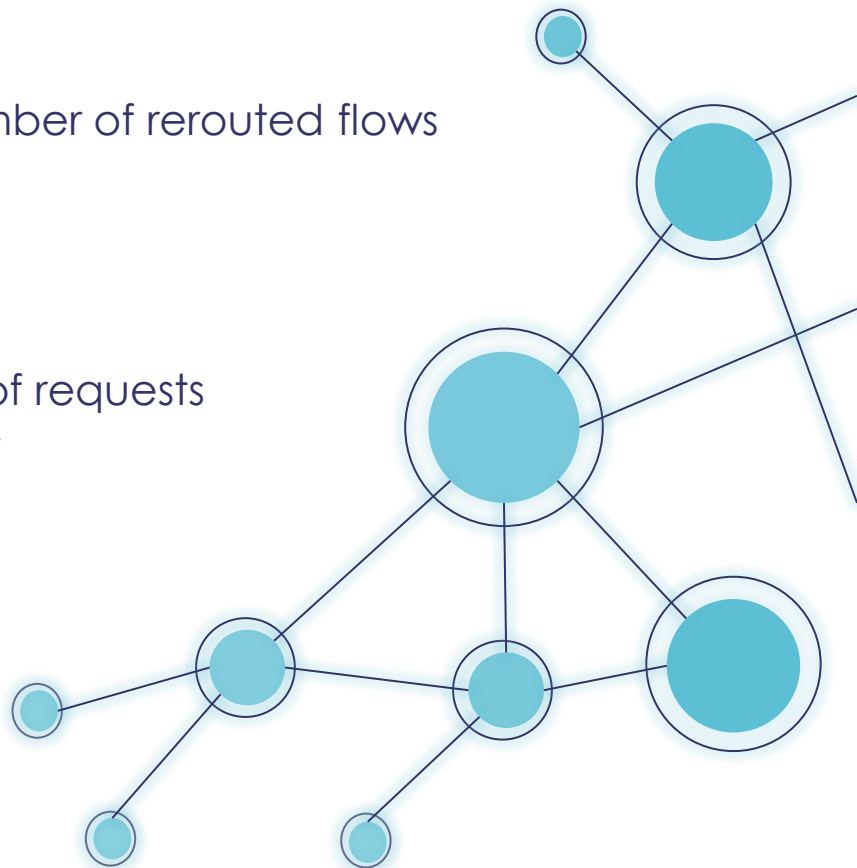
# Online NFV Orchestration – Take away

## ILP

- Gives optimal placement and optimal number of rerouted flows
- Works on small topologies

## Heuristic

- Works on big topologies and high number of requests
  - Tested on data center and WAN topology
- Can be tuned to be either
  - Closer to optimal but with more rerouting
  - Quicker with a low number of rerouting
- Can be distributed



# Conclusions

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# NFV is part of a major shift in networking

## TODAY

- IP networks
- Static provisioning of topology and SLAs
- Tight mapping of services onto resources
- Low interoperability (basic IP support)
- Dedicated infrastructure
- Silo systems

## TOMORROW

- Software Defined Networks
- Dynamic control of network resources
- Unbundling of resource & service layers
- Rich set of API based interoperability
- On-demand resource & services
- Network data analytics

# NFV is about IT and network convergence

## ■ A network is made of software

- Software methodology applies: build, run, manage

## ■ A network is more than software

- Requires orchestration of VNFs (placement and chaining)

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- Online NFV orchestration with game theory, RESCOM 2017,
  - Mathis OBADIA, Mathieu Bouet, Vania Conan, Luigi Iannone, Jean-Louis Rougier
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  - Nicolas Tastevin, Mathis Obadia, Mathieu Bouet
  - IFIP/IEEE IM 2017