

# Breaking Service Function Chains with *Khaleesi*

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# Service Function Chaining (SFC)

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Network policies often require packets to traverse an ordered set of Network Functions



Service chain for a Web Service



Service chain in enterprise Data Center Networks

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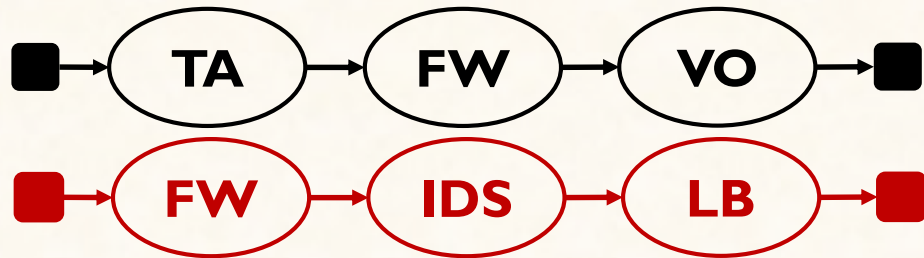


Service chain in enterprise Data Center Networks

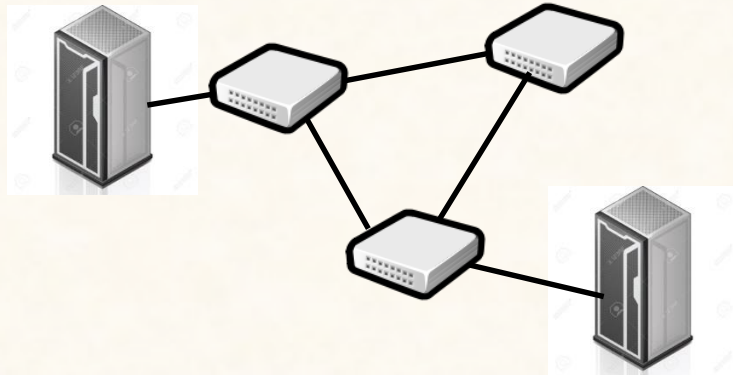
*Traditionally, network functions have been realized by hardware middleboxes*

# SFC Orchestration in NFV

Given



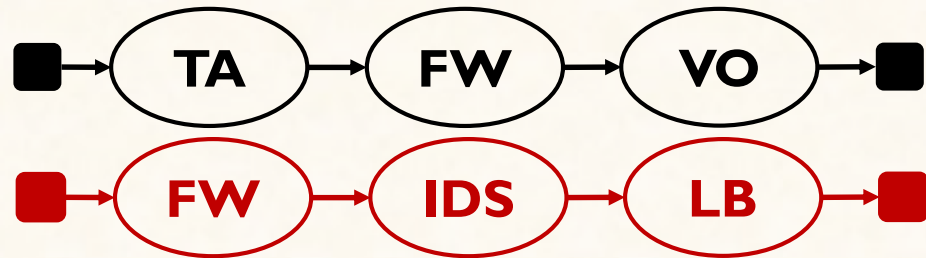
A set of SFC requests



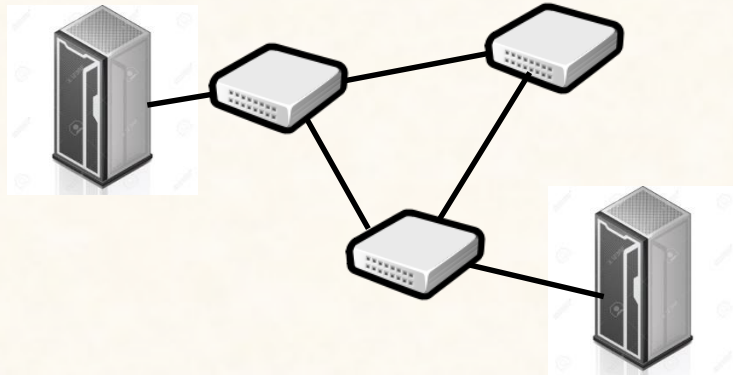
A set of Physical Resources  
(Servers, Switches, Links)

# SFC Orchestration in NFV

Given



A set of SFC requests



A set of Physical Resources  
(Servers, Switches, Links)

Determine

Placement of NFs on Servers

Traffic Routing between VNFs

Objective: Minimize OPEX/  
Energy Cost/Network B.W, or  
Maximize Acceptance Ratio  
*etc.*

# SFC Orchestration: State-of-the-art

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$O(100)$  research papers on the topic

Different aspects have been considered

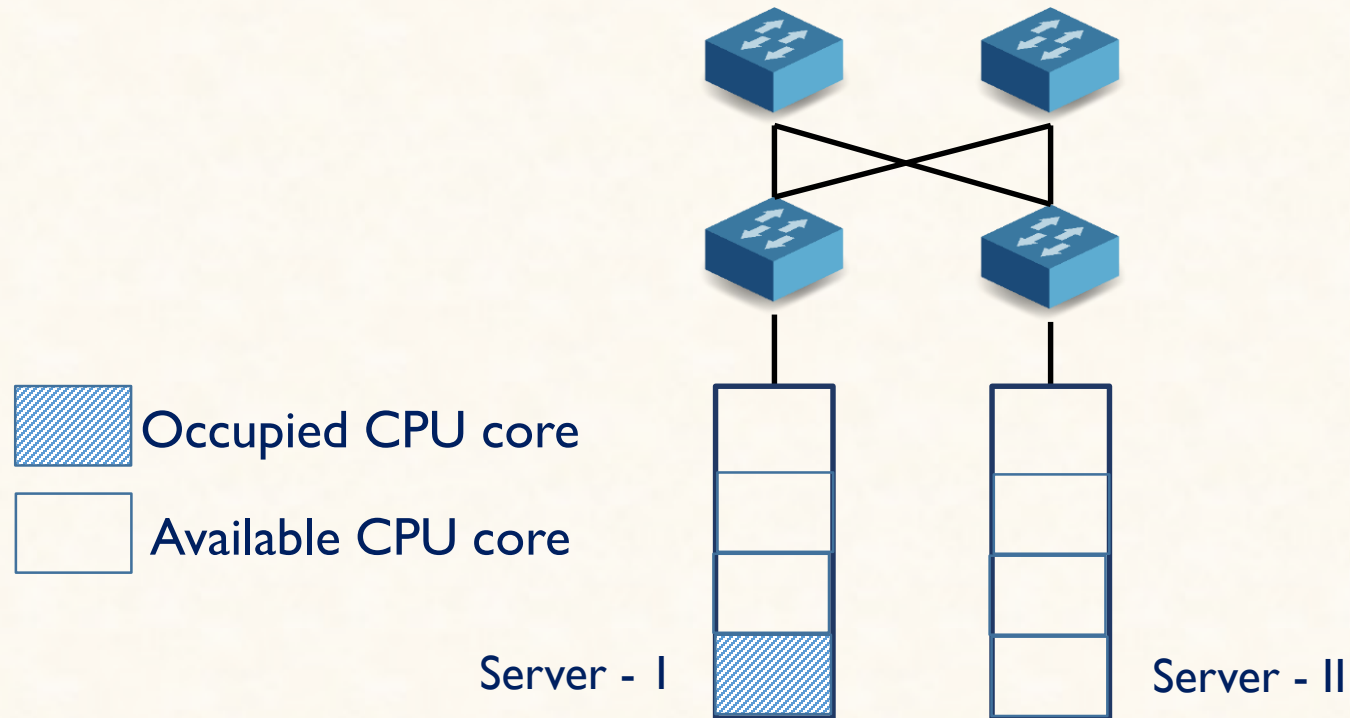
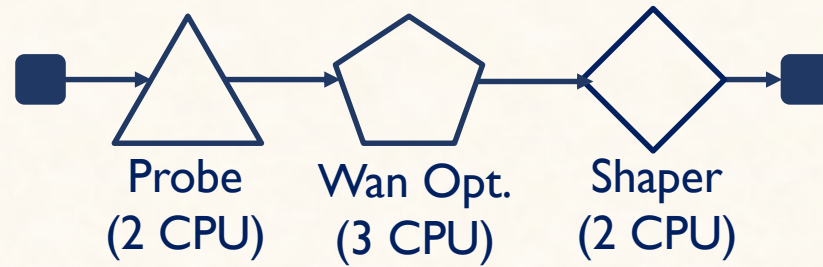
Minimization of energy, network bandwidth, SLO violation, etc.  
Maximization of availability, acceptance ratio, etc.

In most cases, the SFC is considered *rigid*, i.e., *traversal order of the NFs cannot be modified at all*

## Question:

Can we perform better resource allocation *if we break the traversal order* in an SFC?

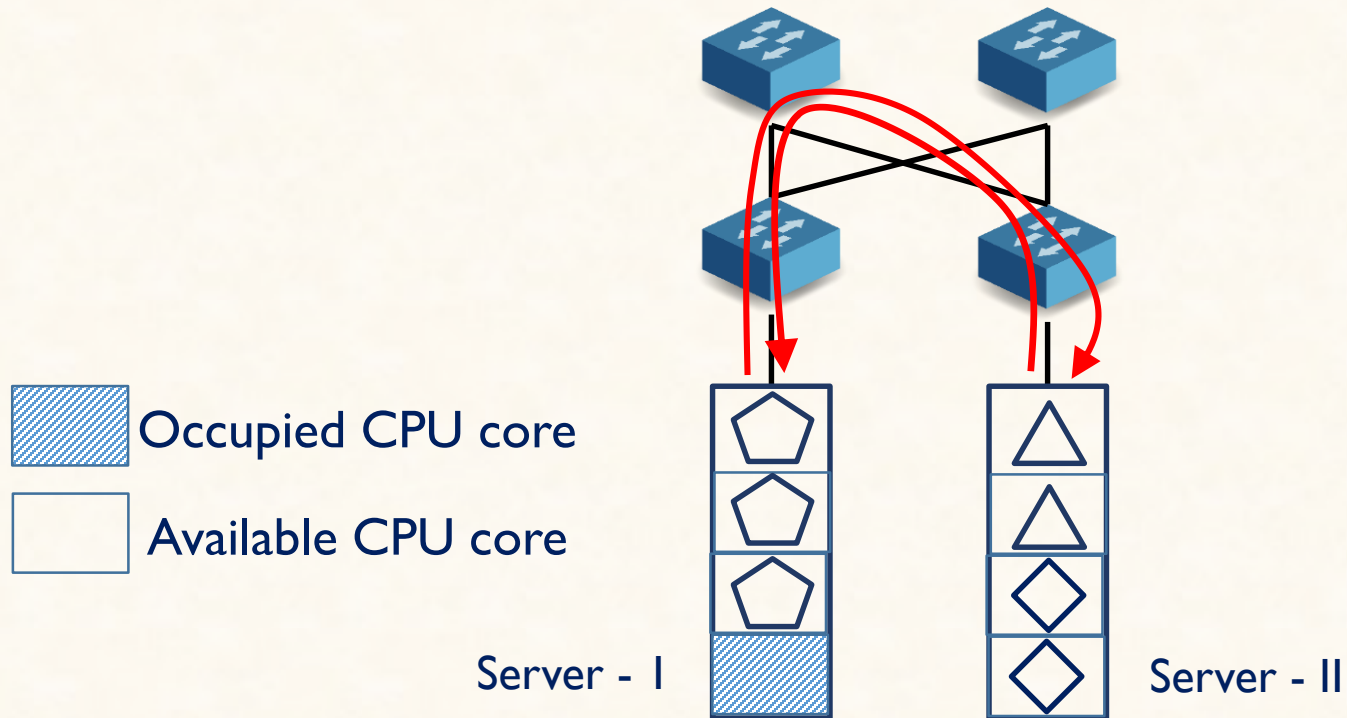
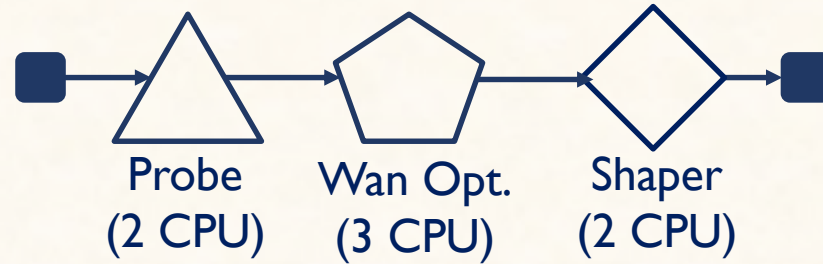
# Illustrative Example





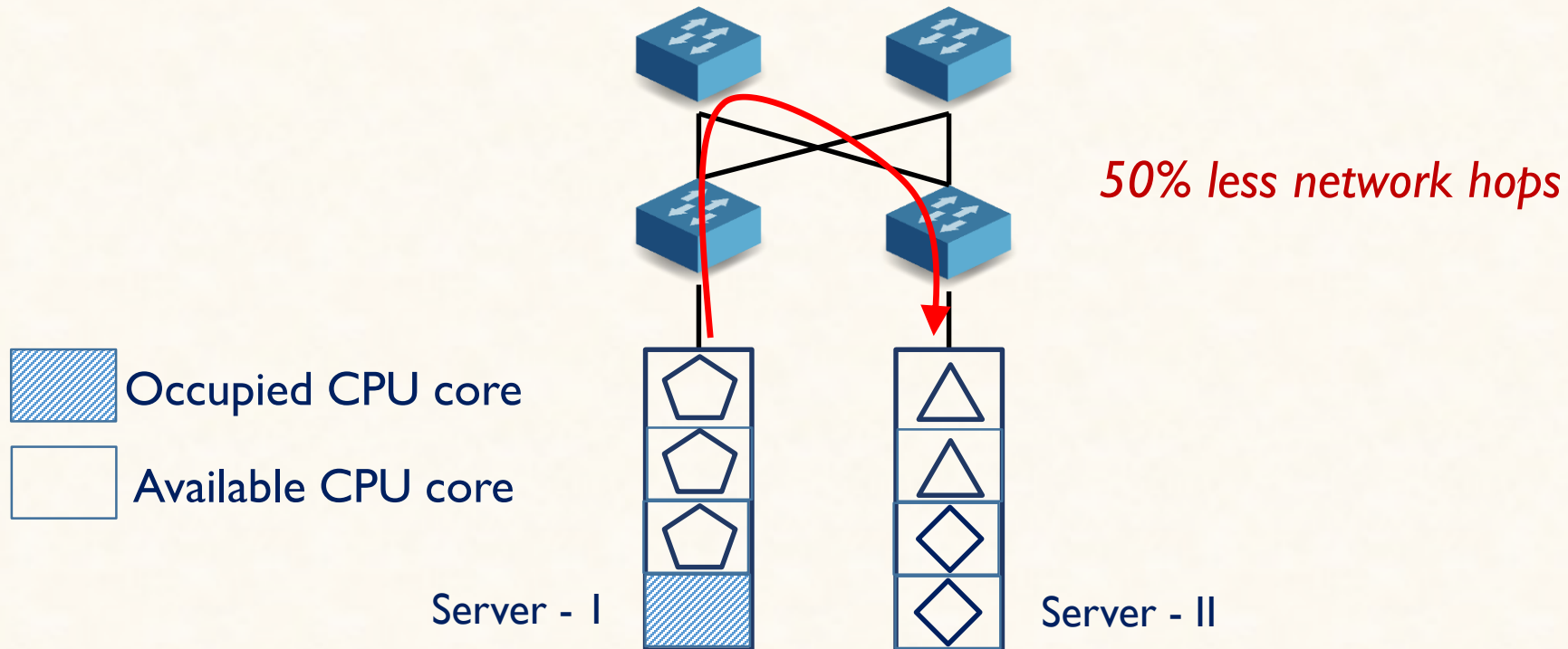
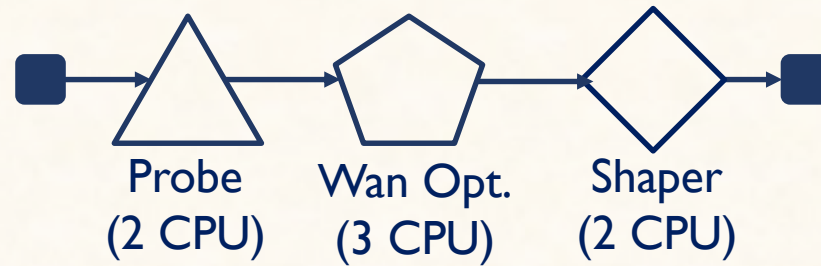
# Resource Allocation for Rigid SFC

Rigid SFC



# Resource Allocation for Flexible SFC

Flexible SFC  
*(Probe and Wan Opt. can be swapped)*



# More Questions

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How can we tell if NF traversal order can be *broken*?

How to *exploit* flexible SFCs in resource allocation?

How much *benefit* can we get from flexible SFCs?

# Our Contributions

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How can we tell if NF traversal order can be *broken*?

Theoretical analysis for detecting *re-order compatible* NFs

How to *exploit* flexible SFCs in resource allocation?

*Khaleesi\**: Suit of solutions for SFC Orchestration, *while breaking NF traversal order*

How much *benefit* can we get from flexible SFCs?

Empirical evaluation of *benefits*

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\*Character from the popular fantasy novel *A Song of Ice and Fire* (adapted as TV series *Game of Thrones*), who is also known as *the breaker-of-chains*

# Flexible SFC: State-of-the-art

## Language and Data Model<sup>1,2</sup>

*Flexibility is part of input; does not demonstrate any quantifiable benefit.*

## NF Execution Parallelization<sup>3,4</sup>

*Requires additional specialized components*

*Flexibility is determined from NF properties for finding Optimal Solution; empirically evaluated quantifiable benefits demonstrated*

1. S. Mehraghdam *et al.*, “Placement of services with flexible structures specified by a yang data model,” IEEE NetSoft, 2016
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# Flexible SFC: State-of-the-art

## Language and Data Model<sup>1,2</sup>

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## NF Execution Parallelization<sup>3,4</sup>

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## In our case

**Flexibility is determined from NF properties for finding Optimal Solution; empirically evaluated quantifiable benefits demonstrated**

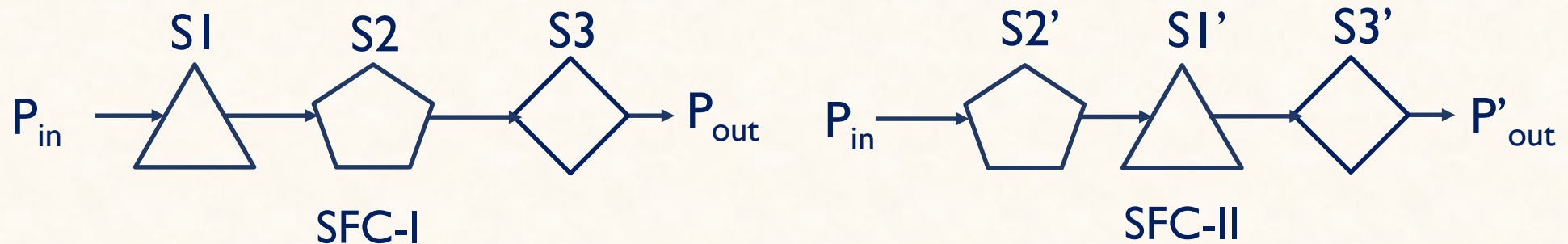
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# How to determine *re-order compatibility*?

When is a pair of NFs re-order compatible?

When swapping their order in an SFC results in *semantically equivalent SFCs*

What is *semantic equivalence*?



SFC-I & SFC-II are *semantically equivalent iff*  
 $P'_{out} = P_{out}$  and  $(S1, S2, S3) = (S1', S2', S3')$

# Conditions for Re-order Compatibility

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NF Operation  
involves:

Reads/Write *Packet Headers* → *Interest fields*

Update internal state based on *packet header* → *State fields*



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	Firewall	Proxy	IPS	Shaper	NAT	DPI	WANX	Probe
Firewall			✓	✓		✓	✓	
Proxy			✓	✓		✓		
IPS	✓	✓		✓				✓
Shaper	✓	✓	✓			✓	✓	
NAT							✓	
DPI	✓	✓		✓				✓
WANX	✓			✓	✓			✓
Probe			✓			✓	✓	

Re-order compatibility matrix of commonly used enterprise NFs

# Reorder Compatibility + SFC Orchestration

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Re-order Compatibility + SFC Orchestration  
= *Flexible SFC Orchestration*

*Khaleesi*: A suit of solutions to Flexible SFC Orchestration

**OPT-Khaleesi**

ILP-based Optimal Solution  
(NP-hard)

**FAST-Khaleesi**

Greedy Heuristic

# Assumptions

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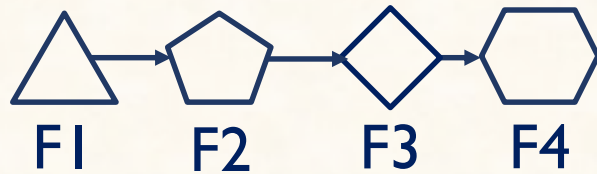
Linear Chain of NFs (no branches)

No change of data rate after swapping

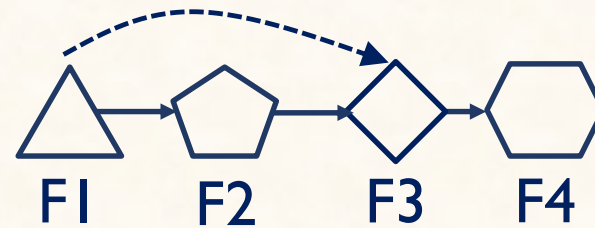
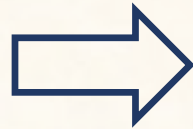
Heterogeneous servers

# OPT-Khaleesi\*

Augment the SFC with additional links according to re-order compatibility matrix such that all valid chains can be traced



Reorder(F1,F2) = true



If F2 is swapped with F1 then  
there can be a link from F1 to F3

ILP *selects the optimal set of virtual links* to form a valid SFC and performs *joint NF placement and virtual link routing* while minimizing network bandwidth usage

\* Details are in the paper

# OPT-Khaleesi\*

## Decision Variables

VNF Placement on Servers, Virtual Link Selection, Virtual Link Routing

## Constraints

- Select exactly  $F - 1$  virtual links ( $F =$  number of NFs)
- Selected virtual links should form a chain semantically equivalent to the input

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\* Details are in the paper

# FAST-Khaleesi: 4-Step Algorithm

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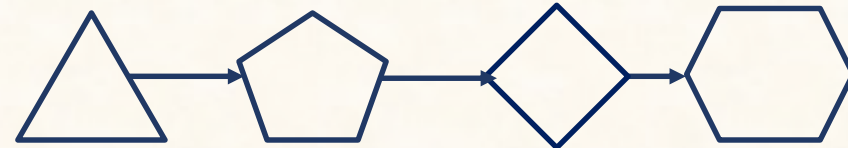
Step-I: Generate all possible SFCs

Step-II: Find Candidate Servers

Step-III: Place VNFs on servers to minimize cross-server traffic

Step-IV: Inter-server Routing

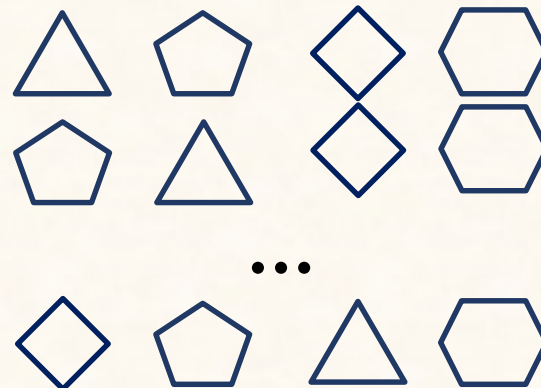
# Step – I: SFC Generation



Augment edges according to re-order compatibility matrix



DFS Traversal to generate all chains





# Step – II: Determine Candidate Servers

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II.1 Filter servers based on NF's CPU requirement

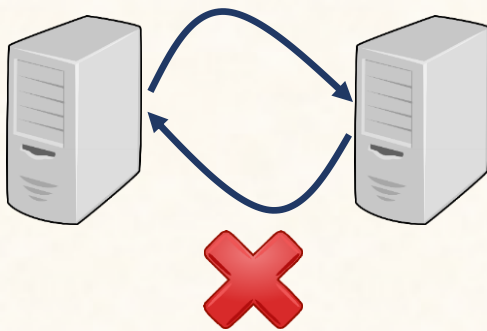
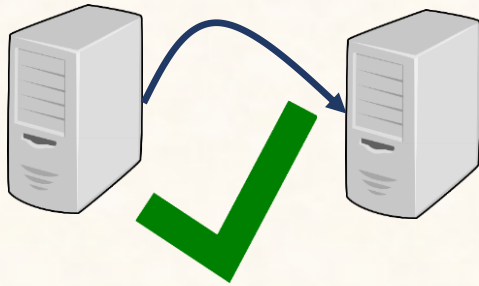
II.2 Sort servers in decreasing order of  $R$

$$R = \frac{\text{Residual number of cores}}{\text{Distance from ingress sw} + \text{Distance from egress sw}}$$



Prioritize servers with higher capacity and proximity to the SFC's ingress and egress nodes

# Step – III, IV: VNF Placement & Routing



III.1 Traverse servers in decreasing order of R

III.2 Keep placing VNFs from the beginning of a chain using first fit algorithm

III.3 Determine the number of cross server virtual links

III.4 Pick placement with minimum number of cross-server link

IV. Route virtual links between servers using Dijkstra's algorithm

# Evaluation: Setup

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- ❖ Comparison scenarios
  - ❖ OPT-Khaleesi compared with *optimal rigid SFC orchestration*\*
  - ❖ *An existing heuristic*\* for rigid SFC orchestration fed with all possible chains
  - ❖ FAST-Khaleesi compared with OPT-Khaleesi
- ❖ Substrate network
  - ❖ Small size campus data center (23 nodes, 42 links)
  - ❖ Moderate size ISP network from RocketFuel (79 nodes, 147 links)
- ❖ SFC request
  - ❖ 3 – 6 NFs/request
  - ❖ Poisson process (4 – 10 SFC/100 time unit avg., 1000 unit avg. lifetime)
  - ❖ Both real and synthetic traffic matrix

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\* Bari, et al. “Orchestrating Virtualized Network Functions“, IEEE TNSM 13(4): 913-926, 2016.

# Performance Highlights

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Heuristic's acceptance Ratio  
within 20% of optimal on avg.

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within 20% of optimal on avg.



~10% improvement in  
revenue/unit cost

Existing heuristic improves ~10%  
on revenue/cost without  
explicitly considering flexibility

# Summary

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We make a case for having flexibility in SFC traversal order

Two Solutions to Flexible SFC Orchestration:  
Khaleesi, FAST-Khaleeis

Presented quantifiable benefits of flexible SFC orchestration

# What's Next?

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Can we exploit re-order compatibility during failure restoration/re-optimization?

What is the impact on debugging and verification?

Can we automate middlebox characterization?





**Backup Slide**

# FAST-Khaleesi: Complexity

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$$O(N^2 \lg N + SN'F^2 + S(L + N \lg N))$$

N = Number of switches

N' = Number of Servers

F = Number of NFs

S = Number of possible chains  
( $O(F!)$  in the worst case)