Cerberus:

The Power of Choices in Datacenter Topology Design (A Throughput Perspective)

Chen Avin & Stefan Schmid

"We cannot direct the wind, but we can adjust the sails."

(Folklore)

Acknowledgements:

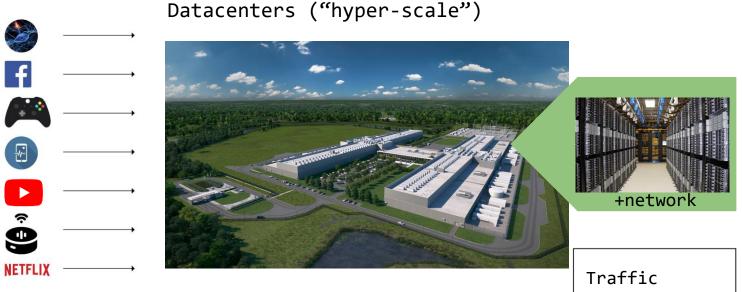




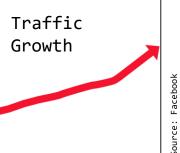
Joint work with Chen Griner (BGU), Johannes Zerwas (TU Munich), Andreas Blenk (TU Munich) and Manya Ghobadi (MIT)

Trend

Data-Centric Applications



Interconnecting networks:
a critical infrastructure
of our digital society.



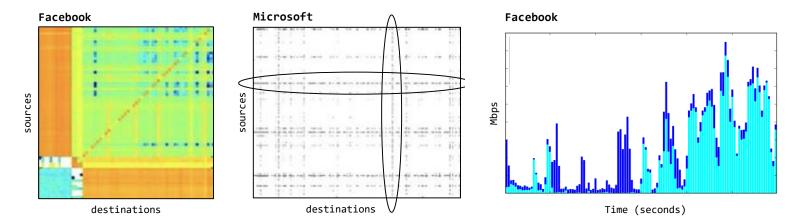
Communication Traffic:

Big But Structured

Traffic does not only grow but also has much structure:

traffic matrices sparse and skewed

traffic bursty over time

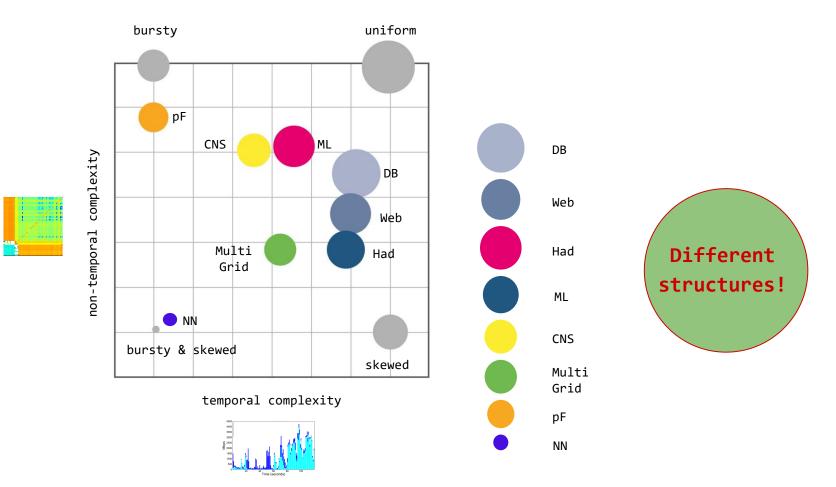


Recent Representation of Trace Structure: Complexity Map



4

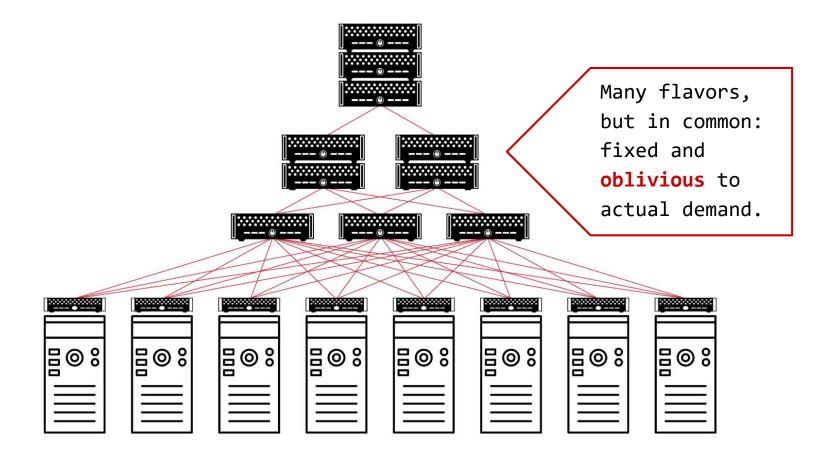
Recent Representation of Trace Structure: Complexity Map



5

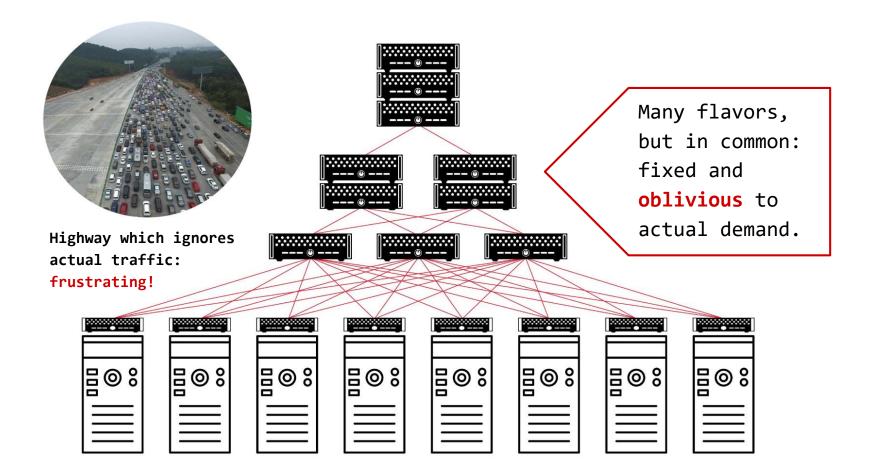
One Solution?

Today: Demand-Oblivious Topology



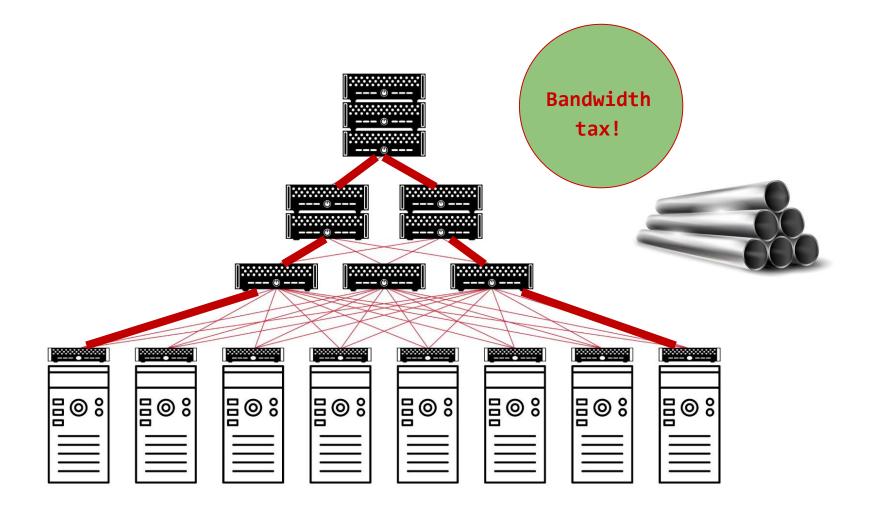
One Solution?

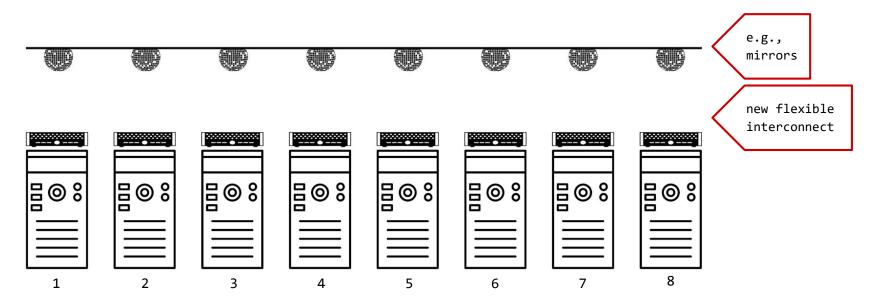
Today: Demand-Oblivious Topology

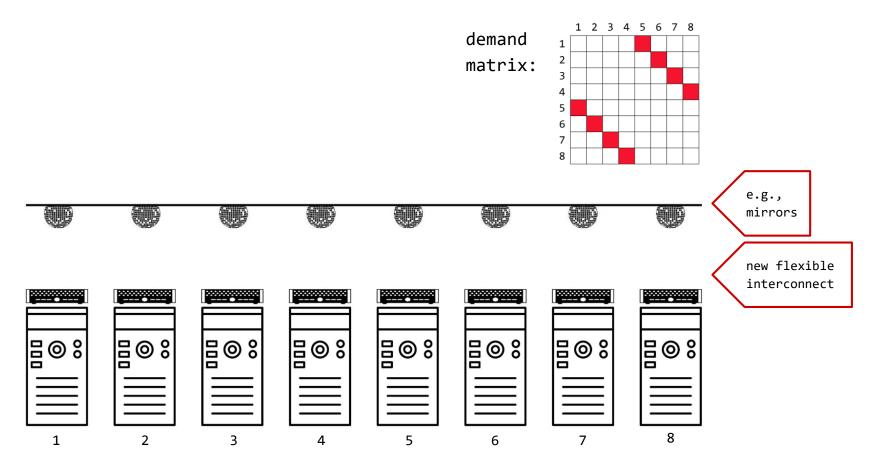


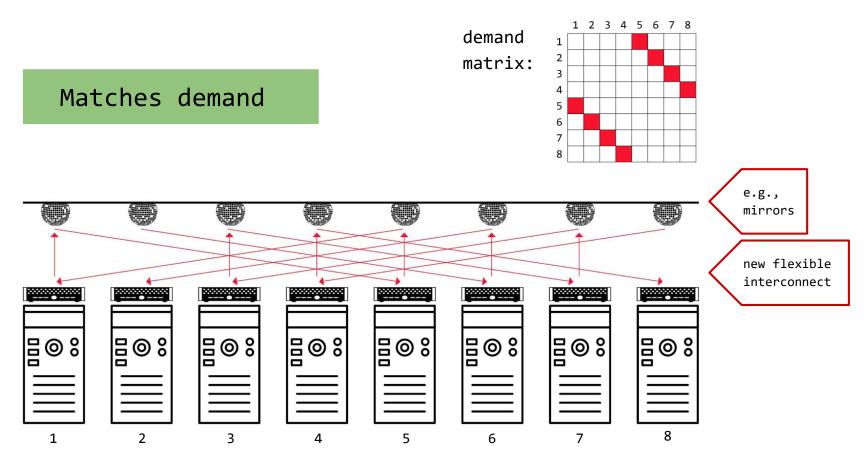
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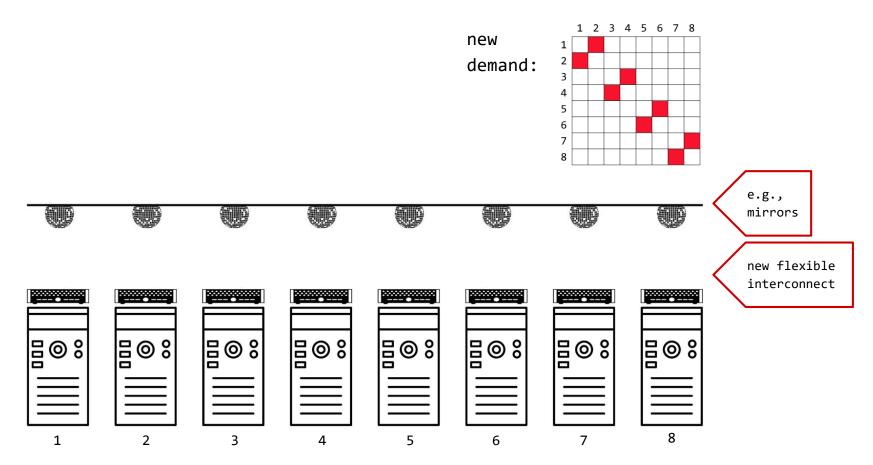
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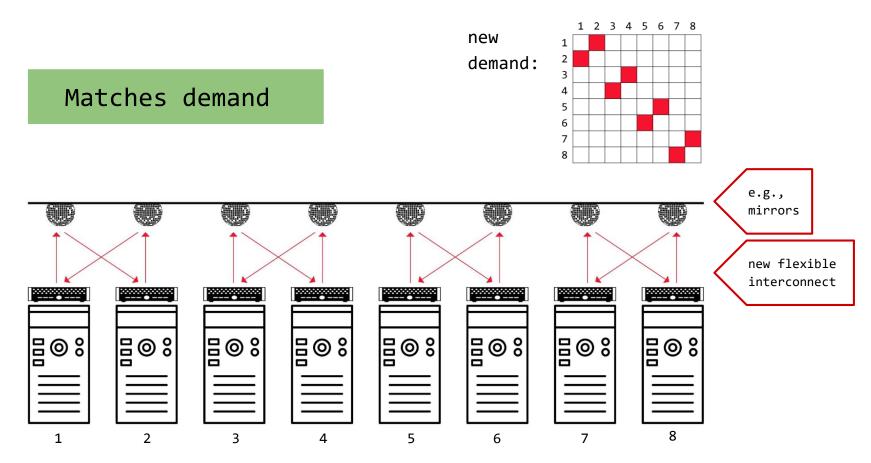








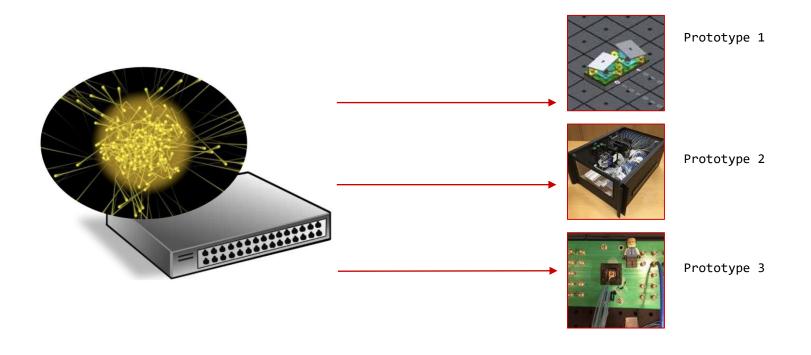




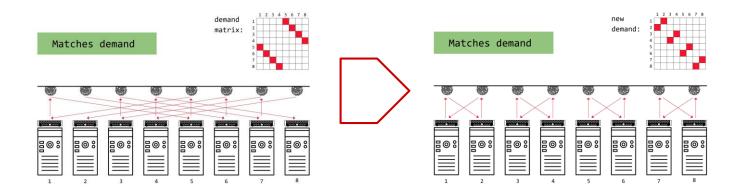


---> **Spectrum** of prototypes

- \rightarrow Different sizes, different reconfiguration times
- → From our ACM **SIGCOMM** workshop OptSys



But: Introduces Tradeoff



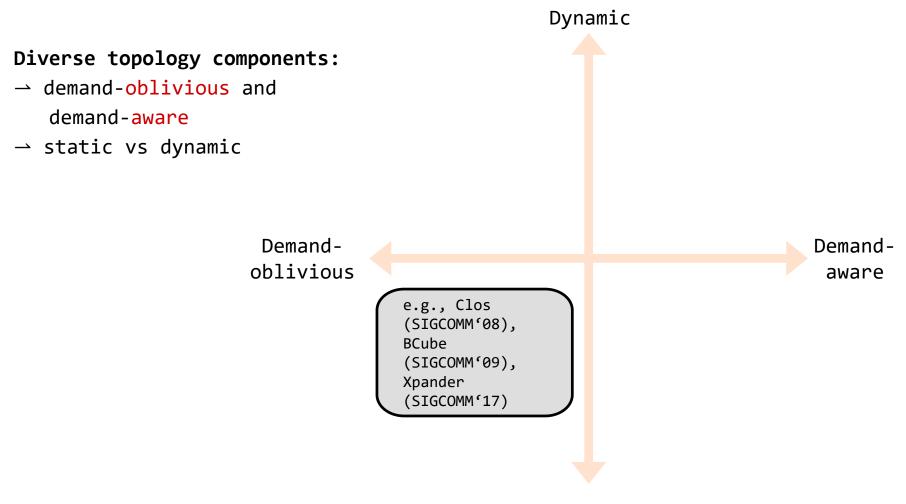
- ---> ProjecToR is **demand-aware** through reconfigurations
- ---> However, reconfigurations take time

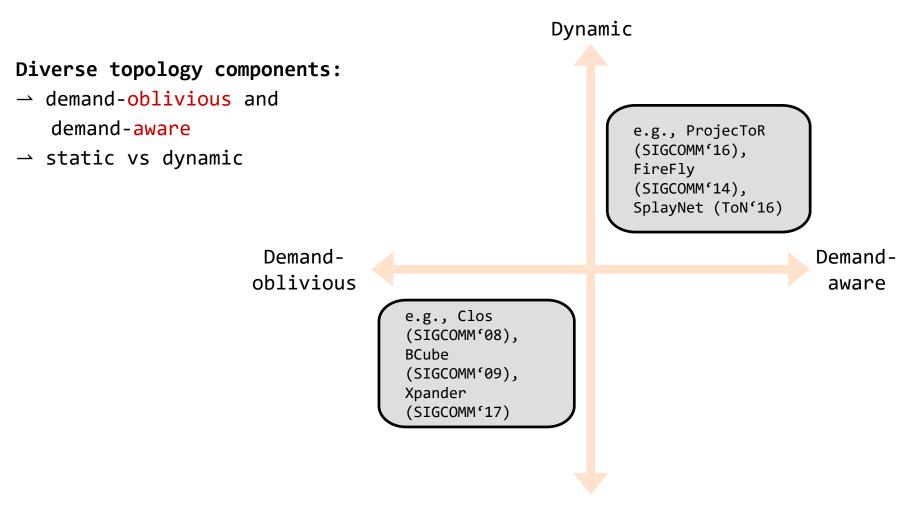


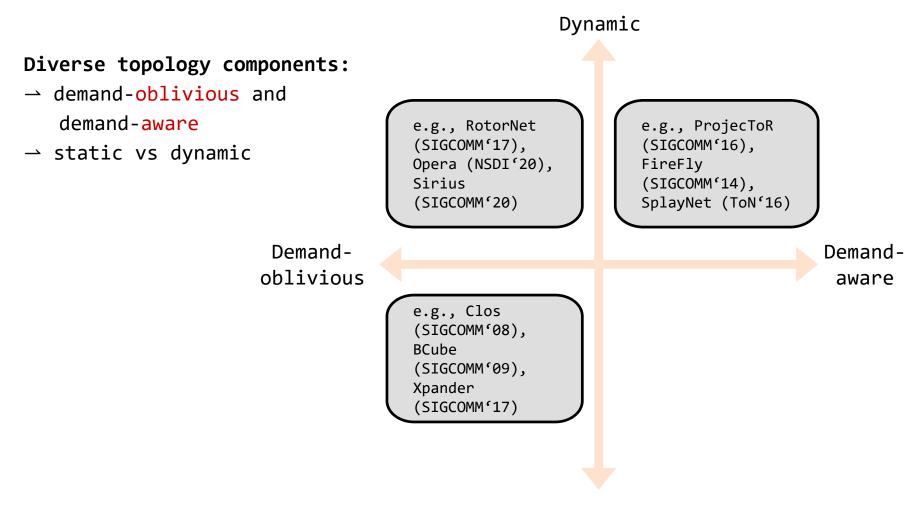
Diverse topology components:

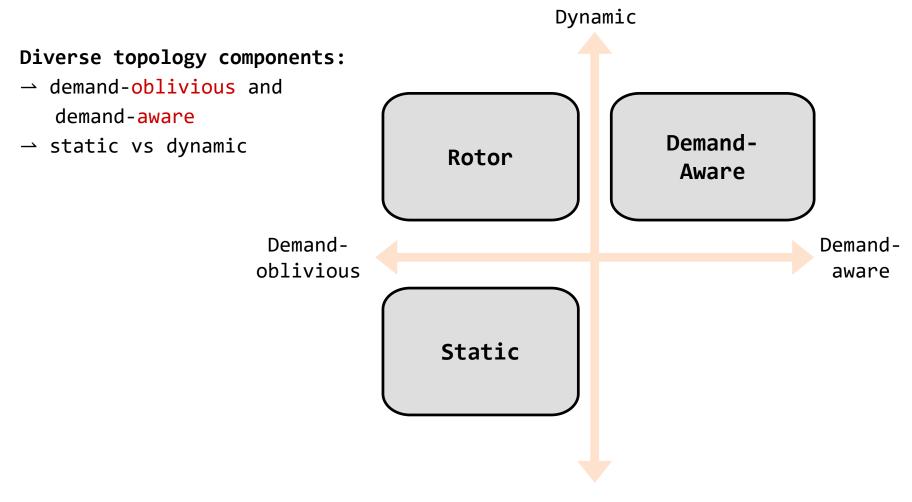
→ demand-oblivious and demand-aware

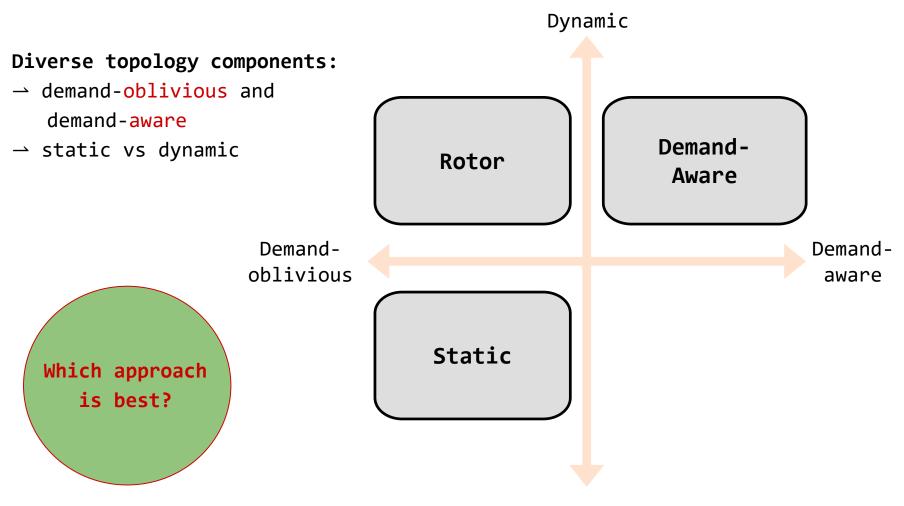
> Demandoblivious Demandaware

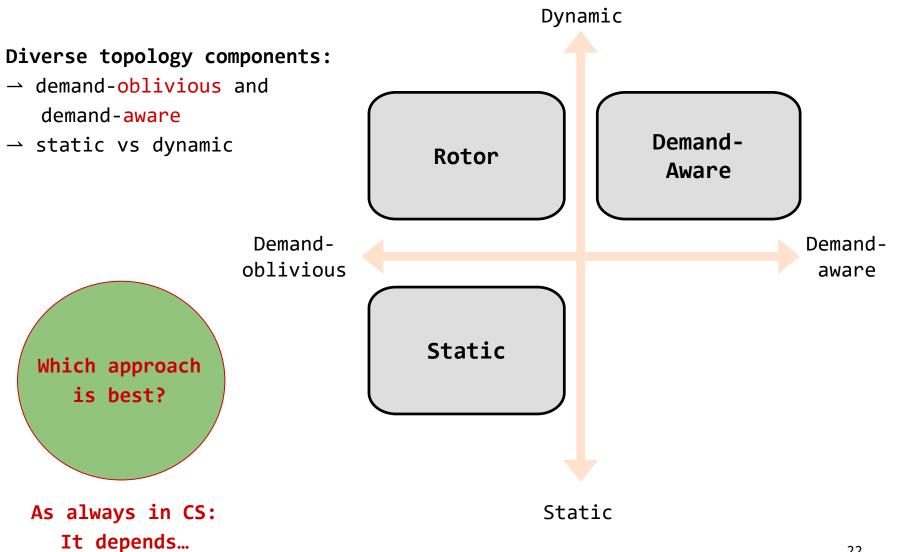






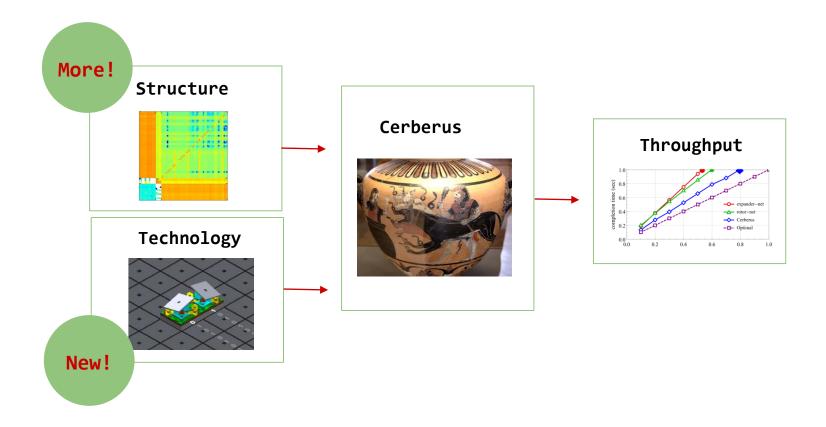






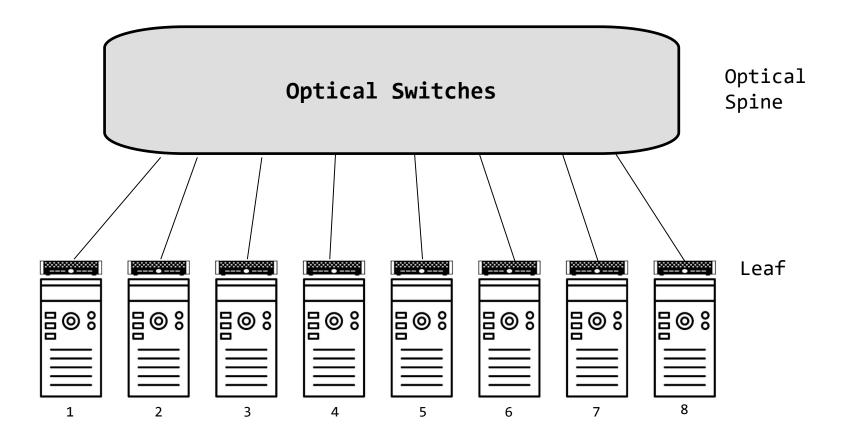


Exploit Trends for Throughput



Unified Network Model

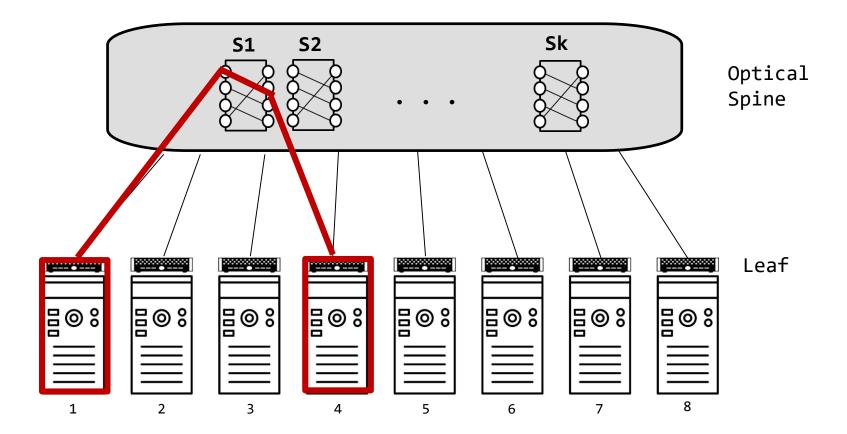
Two-Layers ToR Interconnect



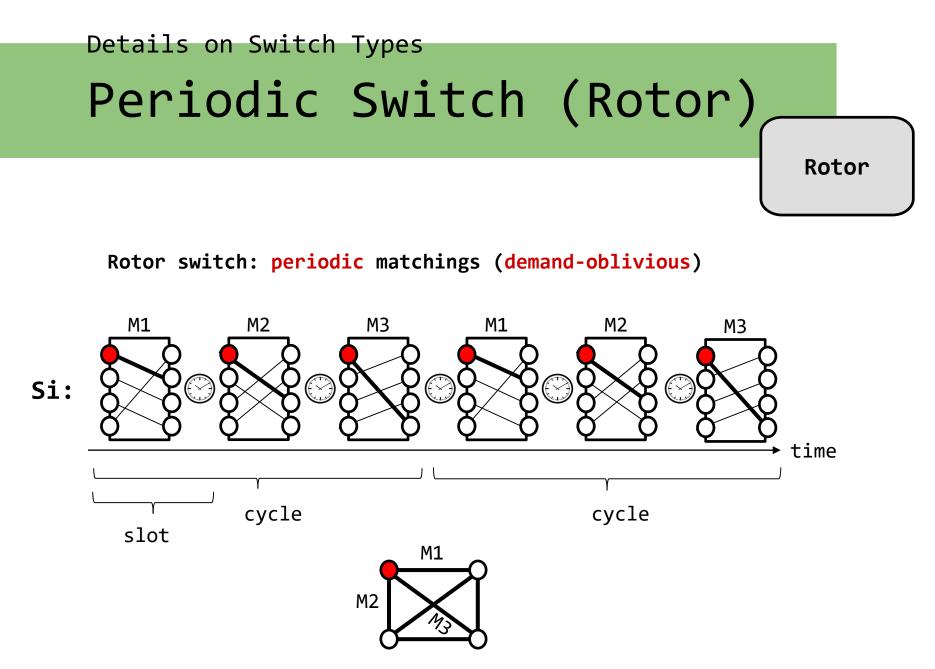
Typical rack internconnect: ToR-Matching-ToR (TMT) model

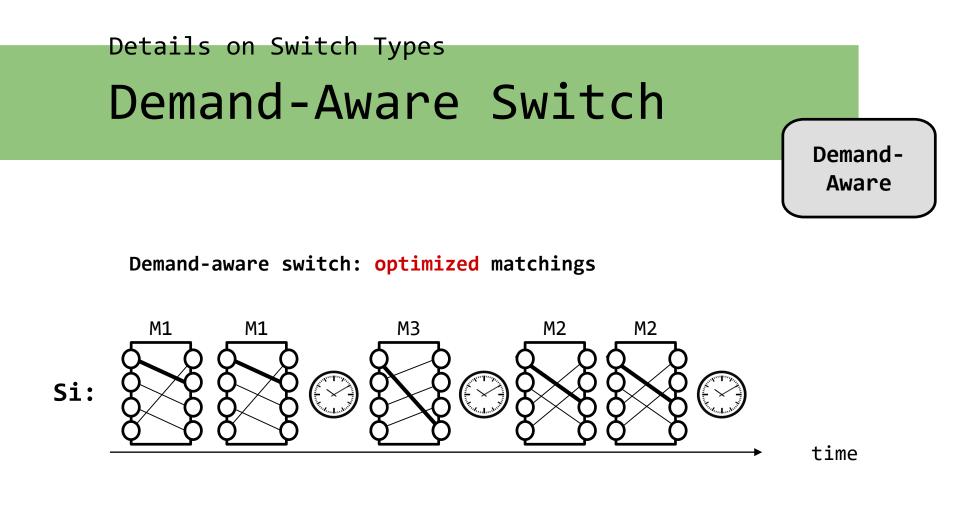
Unified Network Model

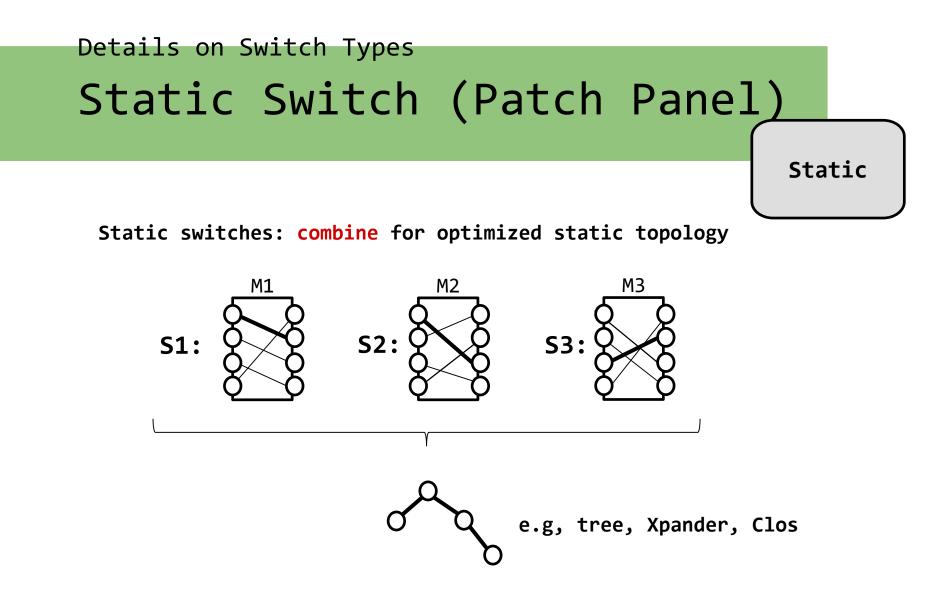
Two-Layers ToR Interconnect



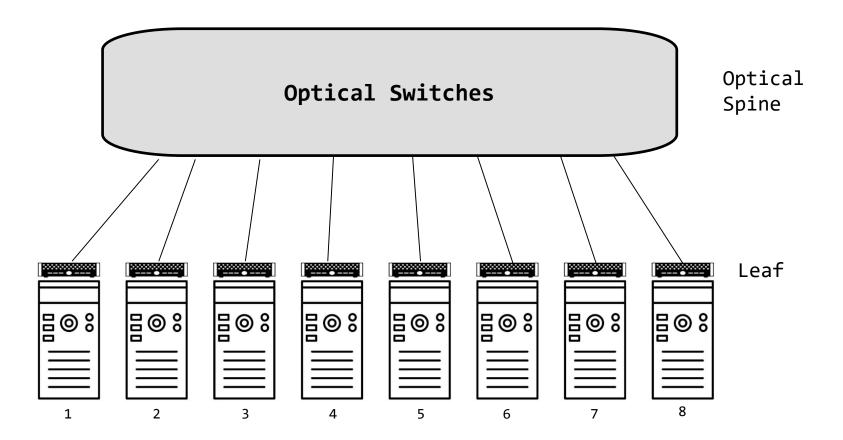
Typical rack internconnect: ToR-Matching-ToR (TMT) model







Unified Model: From Switches to Topologies

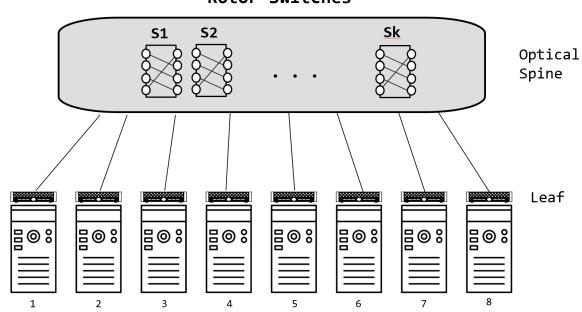


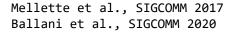
Typical rack internconnect: ToR-Matching-ToR (TMT) model

Unified Model

Rotor-Net

- \rightarrow All spine switches are rotor switches
- \rightarrow Can use 1 or 2 hop routings (VLB)
- → Emulating a **complete graph** using (TDMA)





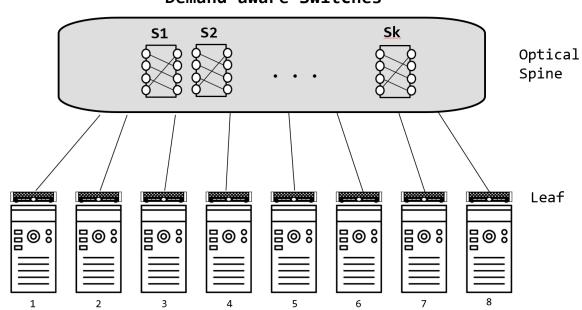
Rotor Switches

Rotor

Unified Model

Demand-Aware Net

- \rightarrow All spine switches are demand-aware switches
- \rightarrow Can use only 1 hop routings (multi-hop, in on-going work)
- \rightarrow Temporal / dynamic network



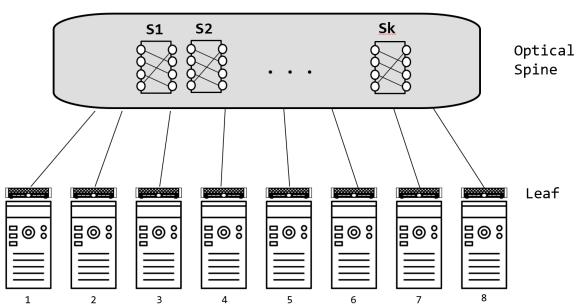
Demand-aware Switches

Demand-

Aware



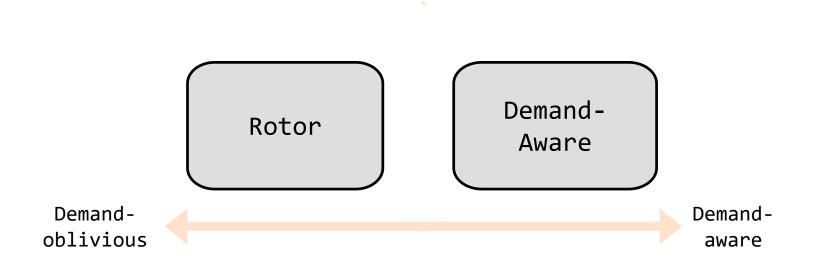
- \rightarrow All spine switches are static switches
- \rightarrow Uses multi-hop routing
- \rightarrow Use known static topologies: e.g., Xpander^{*}, Clos, electrical



Static Switches

Design Tradeoffs (1)

The "Awareness-Dimension"



Good for all-to-all traffic!

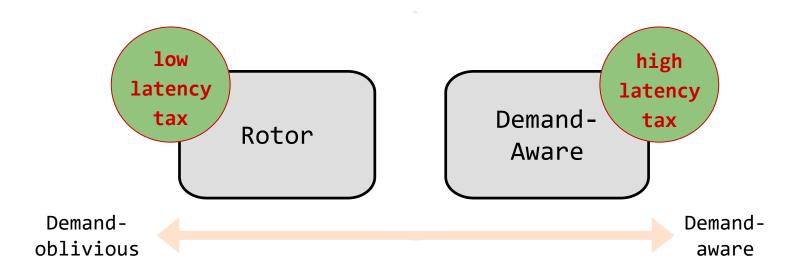
- → Oblivious: very fast
 - periodic <mark>direct</mark> connectivity
- \rightarrow Simpler control plane?

Good for elephant flows!

- → Optimizable toward traffic
- \rightarrow But slower

Design Tradeoffs (1)

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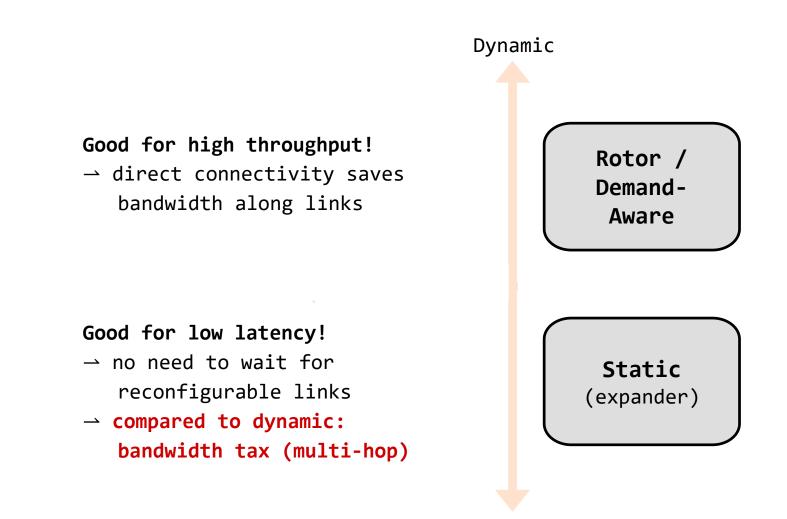
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Compared to static networks: latency tax!



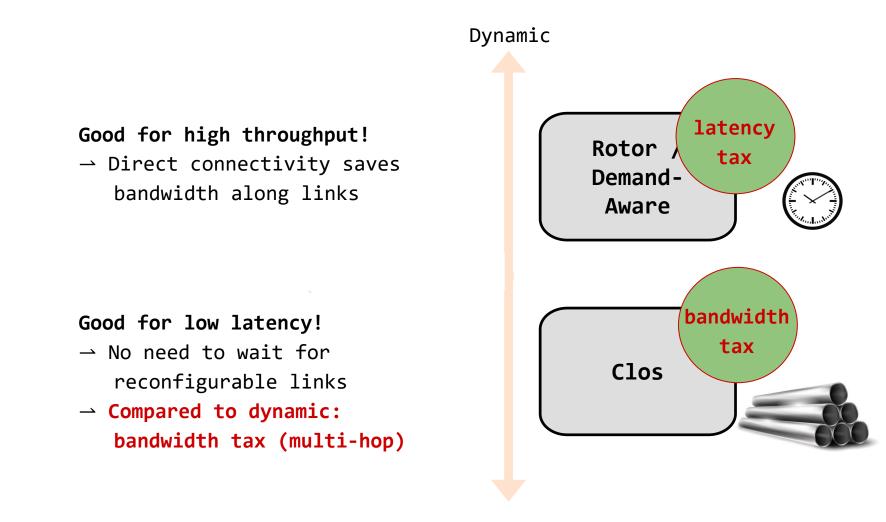
Design Tradeoffs (2)

The "Flexibility-Dimension"

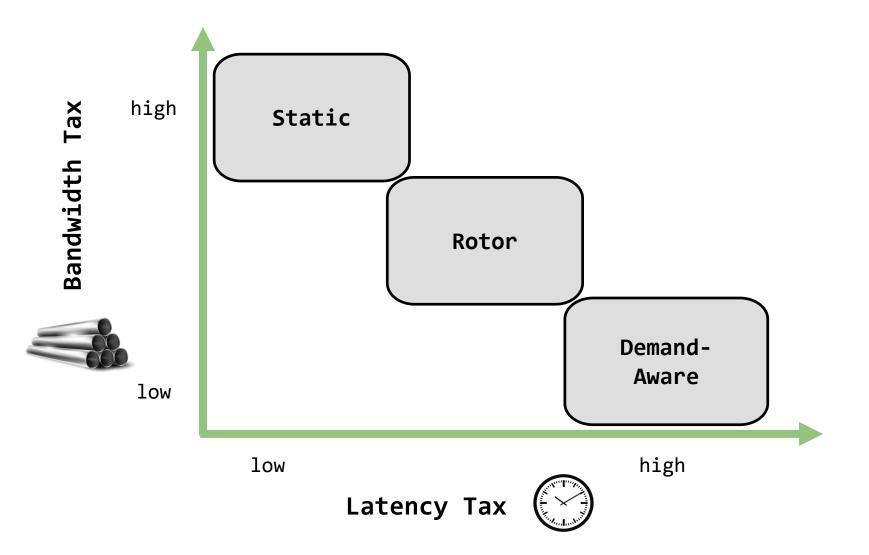


Design Tradeoffs (2)

The "Flexibility-Dimension"



Summary: Tax Map



The Spectrum of Traffic

Diverse patterns:

- → Shuffling/Hadoop: all-to-all
- → All-reduce/ML: ring or tree traffic patterns → Elephant flows
- → Query traffic: skewed → Mice flows
- → Control traffic: does not evolve but has non-temporal structure

Diverse requirements:

→ ML is bandwidth hungry, small flows are latencysensitive



Main Observations

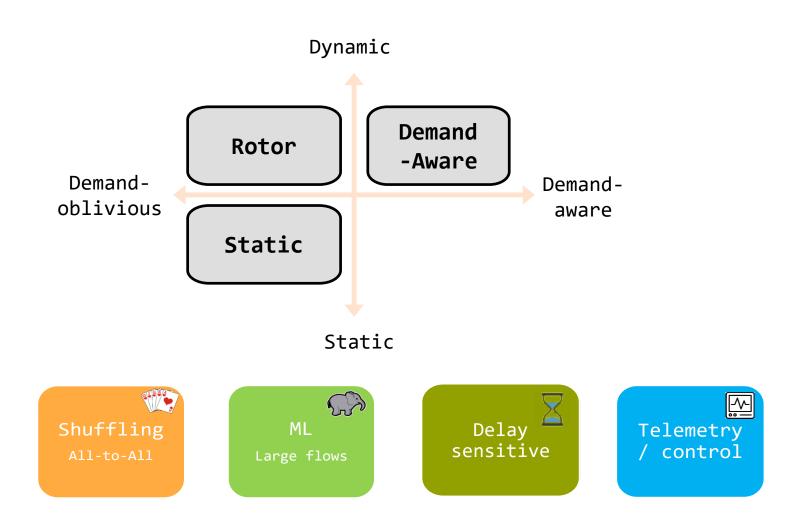
- Observation 1: Different topologies provide
 different tradeoffs.
- ---> **Observation 2:** Different traffic requires different topology types.
- Observation 3: A mismatch of demand and topology can decrease throughput and increase flow completion times.

Main Observations

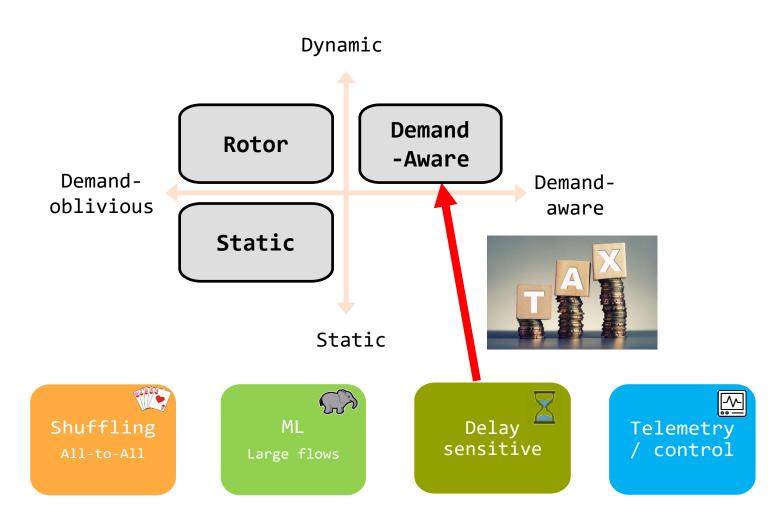
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So: Can we match traffic to topology?

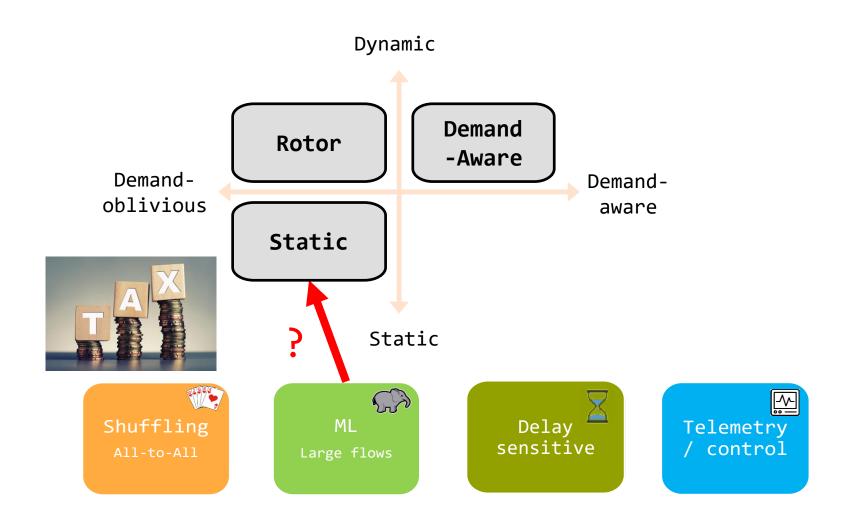
Examples: Match or Mismatch?



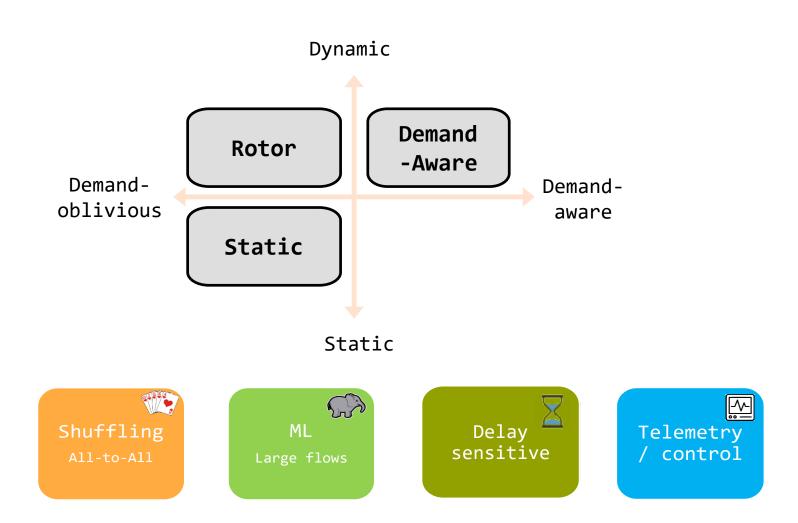
Examples: Match or Mismatch?



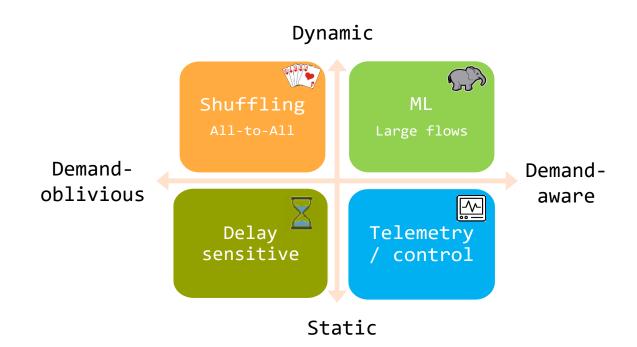
Examples: Match or Mismatch?



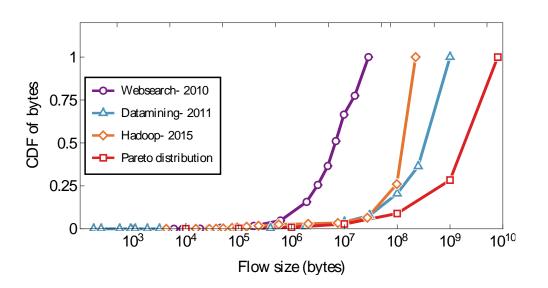




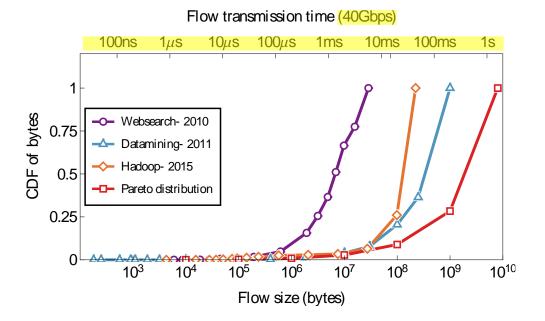




Our system Cerberus* serves traffic on the "best topology"!

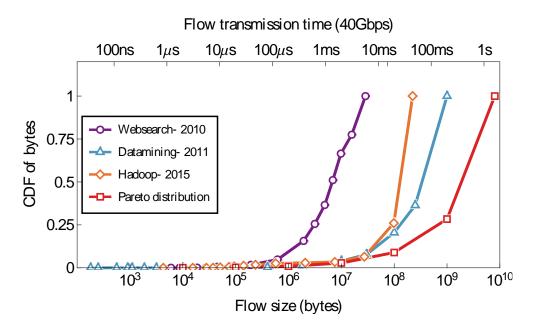


---> Observation 1: Most flows are small, most bytes in big flows.

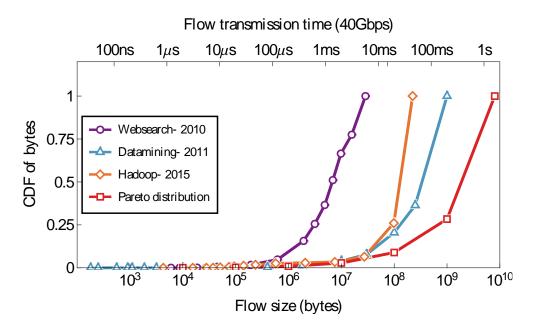


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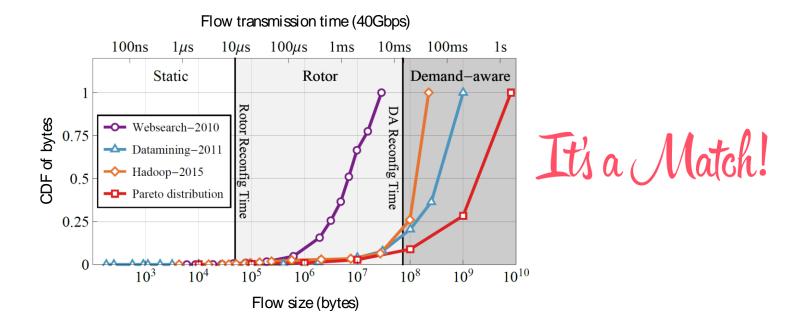
---- Observation 2: The transmission time of a flow depends on its size.



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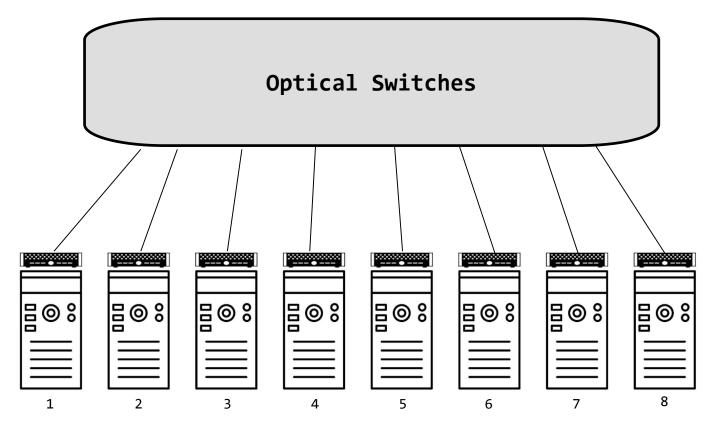
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- ---> Observation 4: For large flows, reconfiguration time may amortize.



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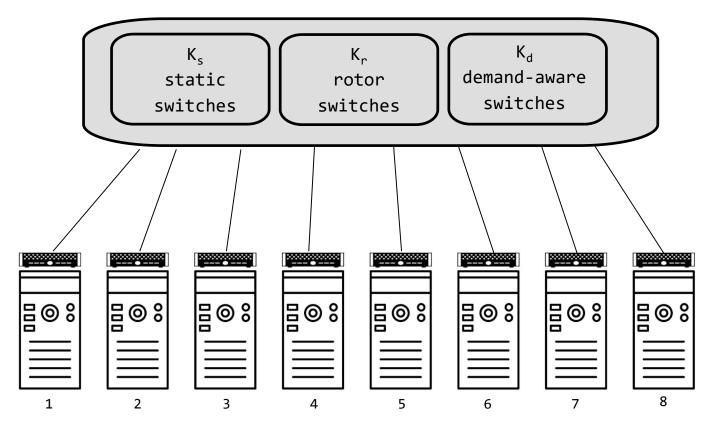






Cerberus*

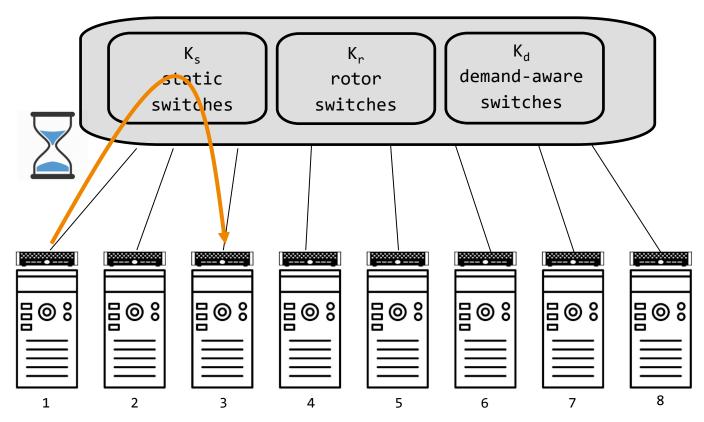




* 3-headed dog from Greek mythology

Cerberus

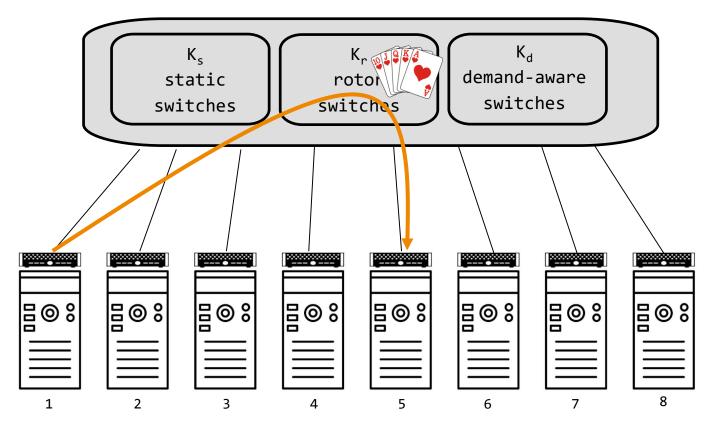




Scheduling: Small flows go via static switches...

Cerberus

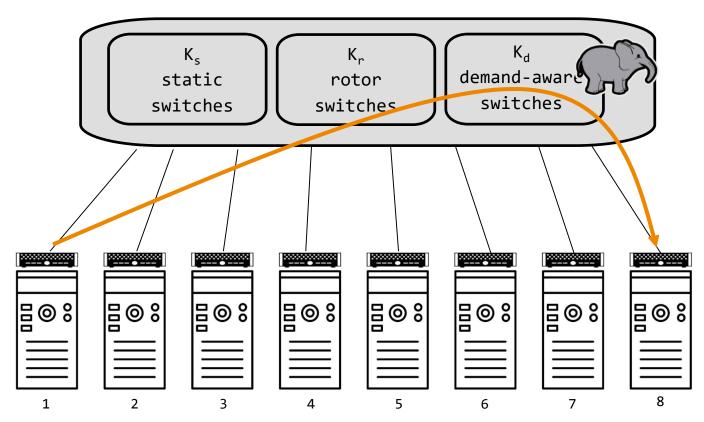




Scheduling: ... medium flows via rotor switches...

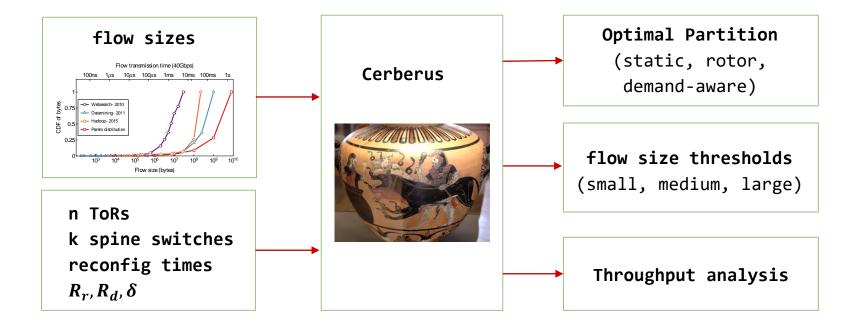
Cerberus





Scheduling: ... and large flows via demand-aware switches (if one available, otherwise via rotor).

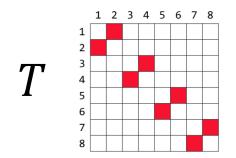
Cerberus Framework



vs Rotor-Net and Expander-Net

Throughput Analysis

Demand Matrix



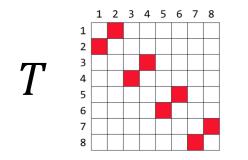
Metric: throughput
of a demand matrix...

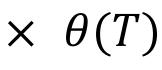
Abdu et al., SC 2016 Namyar et al., SIGCOMM 2021

58

Throughput Analysis

Demand Matrix





Metric: throughput					
of	а	demand	matrix		

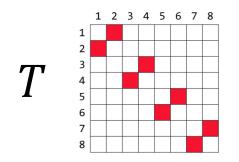
... is the maximal scale down factor by which traffic is feasible $0 \le \theta(T) \le 1$.

> Abdu et al., SC 2016 Namyar et al., SIGCOMM 2021

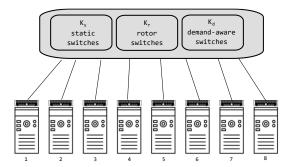
59

Throughput Analysis

Demand Matrix



 $\times \theta(T) =$



Metric: throughput
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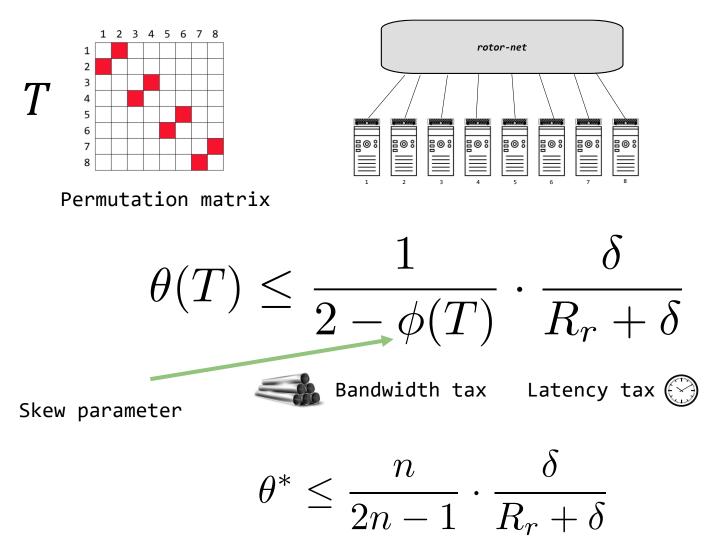
... is the maximal scale down factor by which traffic is feasible $0 \le \theta(T) \le 1$.

Throughput of network θ^* : worst case T

Abdu et al., SC 2016 Namyar et al., SIGCOMM 2021 60

Throughput: Rotor-Net

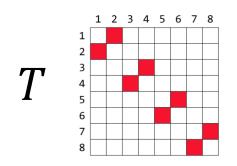
Demand Matrix



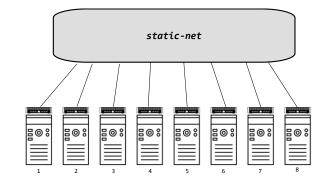
61

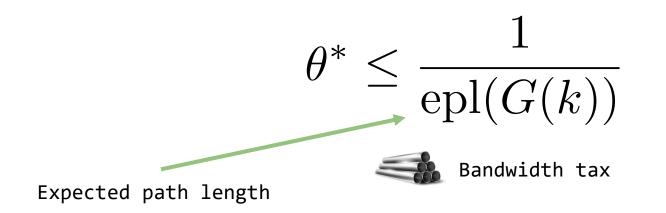
Throughput: Expander-Net

Demand Matrix



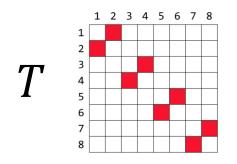
Permutation matrix

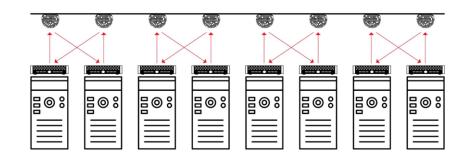




Throughput: Demand-Aware

Demand Matrix

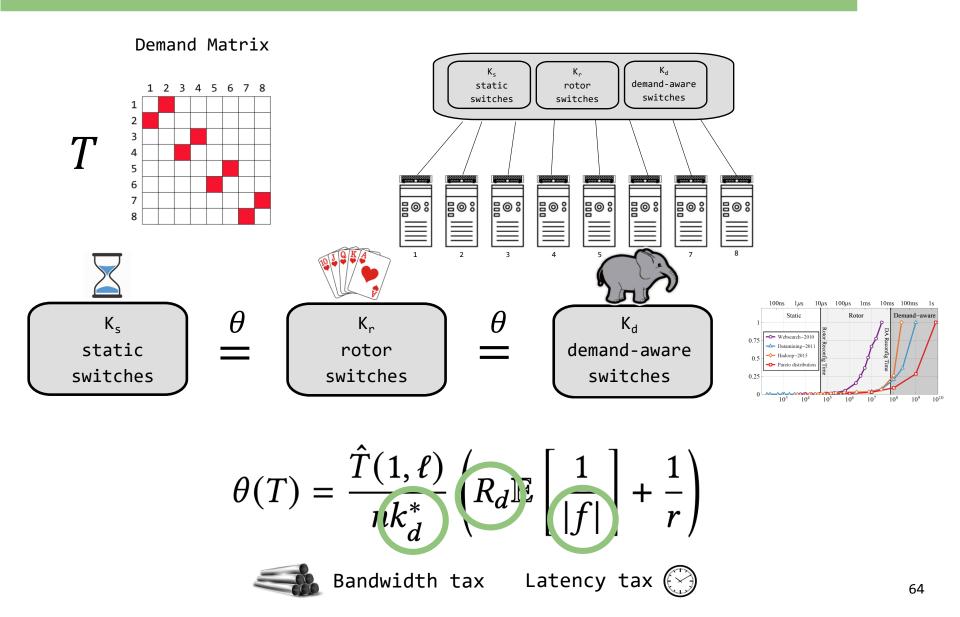




Permutation matrix

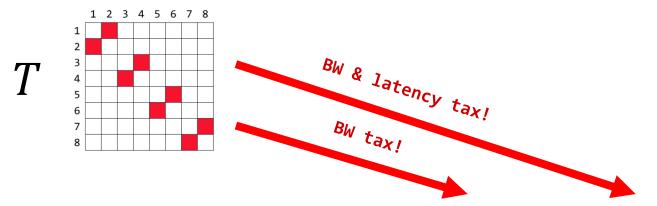
Permutation matrix is the best demand matrix for demand-aware net!

Throughput: Cerberus



Throughput: Summary

Demand Matrix



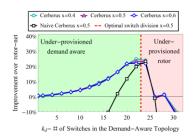
	expander-net	rotor-net	Cerberus
BW-Tax	 ✓ 	✓	×
LT-Tax	×	✓	✓
$\theta(T)$	Thm 2	Thm 3	Thm 5
$ heta^*$	0.53	0.45	Open
Datamining	0.53	0.6	0.8 (+33%)
Permutation	0.53	0.45	$\approx 1 \ (+88\%)$
Case Study	0.53	0.66	0.9 (+36%)

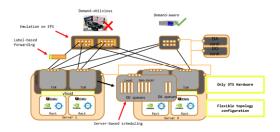
For the given input parameters:

 n, k, R_d, R_r

Conclusion

- Diverse traffic requires diverse technologies/topologies
- → Cerberus aims to assign traffic to its best topology → Depending on flow size
- ---> Skipped: simulations and prototype
- → Many challenges
 - \rightharpoonup Impact on routing and congestion control
 - → Sensitivity analysis
 - \rightarrow Simulation & prototyping



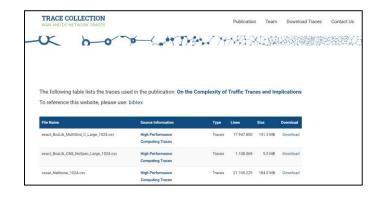


Zerwas et al., ANCS 2021



Websites





https://trace-collection.net/ Trace collection website

Thank you!

Further Reading

Cerberus: The Power of Choices in Datacenter Topology Design*

A Throughput Perspective

CHEN GRINER, School of Electrical and Computer Engineering, Ben Gurion University of the Negev, Israel

JOHANNES ZERWAS, Technical University of Munich, Germany ANDREAS BLENK, Technical University of Munich, Germany MANYA GHOBADI, Computer Science and Artificial Intelligence Laboratory, MIT, USA STEFAN SCHMID, Faculty of Computer Science, University of Vienna, Austria CHEN AVIN, School of Electrical and Computer Engineering, Ben Gurion University of the Negev, Israel

The bandwidth and latency requirements of modern datacenter applications have led researchers to propose various topology designs using static, dynamic demand-oblivious (rotor), and/or dynamic demand-aware switches. However, given the diverse nature of datacenter traffic, there is little consensus about how these designs would fare against each other. In this work, we analyze the throughput of existing topology designs under different traffic patterns and study their unique advantages and potential costs in terms of bandwidth and latency "tax". To overcome the identified inefficiencies, we propose CERBERUS, a unified, two-layer leaf-spine optical datacenter design with three topology types. CERBERUS systematically matches different traffic patterns

On the Complexity of Traffic Traces and Implications

CHEN AVIN, School of Electrical and Computer Engineering, Ben Gurion University of the Negev, Israel MANYA GHOBADI, Computer Science and Artificial Intelligence Laboratory, MIT, USA CHEN GRINER, School of Electrical and Computer Engineering, Ben Gurion University of the Negev, Israel

STEFAN SCHMID, Faculty of Computer Science, University of Vienna, Austria

This paper presents a systematic approach to identify and quantify the types of structures featured by packet traces in communication networks. Our approach leverages an information-theoretic methodology, based on iterative randomization and compression of the packet trace, which allows us to systematically remove and measure dimensions of structure in the trace. In particular, we introduce the notion of *trace complexity* which approximates the entropy rate of a packet trace. Considering several real-world traces, we show that trace complexity can provide unique insights into the characteristics of various applications. Based on our approach,

Further Reading

Static DAN

Demand-Aware Network Designs of Bounded Degree

Chen Avin Kaushik Mondal Stefan Schmid

Abstract Traditionally, networks such as datacenter 1 Introduction nterconnects are designed to optimize worst-case p formance under arbitrary traffic patterns. Such network signs can however be far from optimal when considering the actual workloads and traffic patterns which they serve. This insight led to the development of demandare datacenter interconnects which can be reconfigured depending on the workload.

Motivated by these trends, this paper initiates the leorithmic study of demand-aware networks (DANs). and in particular the design of bounded-degree networks. The inputs to the network design problem are a liscrete communication request distribution, D, defined ver communicating pairs from the node set V, and a bound, Δ , on the maximum degree. In turn, our obective is to design an (undirected) demand-aware network N = (V, E) of bounded-degree Δ , which provides short routing paths between frequently communicating nodes distributed across N. In particular, the designed network should minimize the expected path length on Nwith respect to D, which is a basic measure of the

The problem studied in this paper is motivated by the advent of more flexible datacenter interconnects, such as ProjecToR [29,31]. These interconnects aim to overcome a fundamental drawback of traditional datacenter network designs: the fact that network designers must decide in advance on how much capacity to provision between electrical packet switches, e.g., between Topof-Rack (ToR) switches in datacenters. This leads to an undesirable tradeoff [42]: either capacity is overprovisioned and therefore the interconnect expe-(e.g., a fat-tree provides full-bisection bandwidth), or one may risk congestion, resulting in a poor cloud appli cation performance. Accordingly, systems such as Pro jecToR provide a reconfigurable interconnect, allowing to establish links flexibly and in a demand-aware manner. For example, direct links or at least short commu nication paths can be established between frequently communicating ToR switches. Such links can be implemented using a bounded number of lasers, mirrors

Robust DAN

rDAN: Toward Robust Demand-Aware Network Designs

Chen Avin¹ Alexandr Hercules¹ Andreas Loukas² Stefan Schmid³ ¹ Ben-Gurion University, IL ² EPFL, CH ³ University of Vienna, AT & TU Berlin, DE

Abstract

We currently witness the emergence of interesting new network topologies optimized towards the traffic matrices they serve, such as demand-aware datacenter interconnects (e.g., ProjecToR) and demand-aware peer-to-peer overlay networks (e.g., SplayNets). This paper introduces a forma framework and approach to reason about and design robust demand-aware networks (DAN). I particular, we establish a connection between the communication frequency of two nodes and the path length between them in the network, and show that this relationship depends on the entropy of the communication matrix. Our main contribution is a novel robust, yet sparse, family of networks, short rDANs, which guarantee an expected path length that is proportional to the entropy of the communication patterns

Overview: Models

Toward Demand-Aware Networking: A Theory for Self-Adjusting Networks

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ABSTRACT

The physical topology is emerging as the next frontier in an ongoing effort to render communication networks more flexible. While first empirical results indicate that these flexibilities can be exploited to reconfigure and optimize the network toward the workload it serves and, e.g., providing the same bandwidth at lower infrastructure cost, only little is known today about the fundamental algorithmic problems underlying the design of reconfigurable networks. This paper initiates the study of the theory of demand-aware, self-adjusting networks. Our main position is that self-adjusting networks should be seen through the lense of self-adjusting datastructures. Accordingly, we present a taxonomy classifying the different algorithmic models of demand-oblivious, fixed demand-aware, and reconfigurable demand-aware networks. introduce a formal model, and identify objectives and evaluaon metrics. We also demonstrate, by examples, the inheren



Figure 1: Taxonomy of topology optimization

design of efficient datacenter networks has received much attention over the last years. The topologies underlying modern datacenter networks range from trees [7, 8] over hypercubes [9, 10] to expander networks [11] and provide high connectivity at low cost [1]. Until now, these networks also have in common that their topology is *fixed* and *oblivious* to the actual demand (i.e.,

Dynamic DAN

SplayNet: Towards Locally Self-Adjusting Networks

Stefan Schmid*, Chen Avin*, Christian Scheideler, Michael Borokhovich, Bernhard Haeupler, Zvi Lotker

Abstract—This paper initiates the study of bacily self: toward static metrics, such as the diameter or the length of igniting networks three topology adapts dynamically in the longest route; the self-adjusting paradigm has not spilled and in a decentralized manner, to the communication pattern σ . Or vision can be seen as a distributed generalization of the distributed networks yet. Our vision can be seen as a distributed generalization of the distributed networks yet. The initial the study of a distributed generalization of the distributed networks yet. In this paper, initiate the study of a distributed generalization of the distributed interview. This is a non-trivial network was the distributed parameter of the distributed and the study of a distributed generalization of the distributed distributed and the non-trivial network was the distributed generalized on the distributed distributed distributed generalized on the distributed distributed generalized on the distributed distributed distributed generalized on the distributed distributed generalized on the distrib lookup costs from a single node (namely the tree root), we seek to minimize the routing cost between arbitrary communication pairs in the network.

pairs in the network. As a first step, we study distributed binary search trees (BSTs), which are attractive for their support of greedy routing, We introduce a simple model which captures the fundamental tradeoff between the benefits and costs of self-adjusting networks, We present the SplayNet algorithm and formally analyze its we present the spany-ter augorithm and normany analyze its performance, and prove its optimility in specific case studies. We also introduce lower bound techniques based on interval cuts and edge expansion, to study the limitations of any demand-optimized network. Finally, we extend our study to multi-tree networks, and highlight an intriguing difference between classic and distributed splay trees.

I. INTRODUCTION

In the 1980s, Sleator and Tarjan [22] proposed an appealing new paradigm to design efficient Binary Search Tree (BST) datastructures: rather than optimizing traditional metrics such

generalization of the classic splay tree concept: While in classic BSTs, a lookup request always originates from the same node, the tree root, distributed datastructures and networks

such as skip graphs [2], [13] have to support routing requests between arbitrary pairs (or peers) of communicating nodes; in other words, both the source as well as the destination of the requests become variable. Figure 1 illustrates the difference between classic and distributed binary search trees. In this paper, we ask: Can we reap similar benefits from self-

adjusting entire networks, by adaptively reducing the distance between frequently communicating nodes?

As a first step, we explore fully decentralized and self-adjusting Binary Search Tree networks: in these networks, nodes are arranged in a binary tree which respects node identifiers. A BST topology is attractive as it supports greedy routing: a node can decide locally to which port to forward a request given its destination address

Static Optimality

ReNets: Toward Statically Optimal Self-Adjusting Networks

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Abstract

This paper studies the design of *self-adjusting* networks whose topology dynamically adapts to the workload, in an online and demand-awary manner. This problem is motivated by emerging optical technologies which allow to reconfigure the datacenter topology at runtime. Our main contribution is *ReNet*, a self-adjusting network which maintains a balance between the benefits and costs of reconfigurations. In particular, we show that ReNets are statically optimal for arbitrary sparse communication demands, i.e., perform at least as good as any fixed demand-aware network designed with a perfect knowledge of the future demand. Furthermore, ReNets provide compact and local routing, by leveraging ideas from self-adjusting datastructures.

1 Introduction

Modern datacenter networks rely on efficient network topologies (based on fat-trees [1], hypercubes [2, 3], or expander [4] graphs) to provide a high connectivity at low cost [5]. These datacenter networks have in common that their topology is fixed and oblivious to the actual demand (i.e., workload or communication pattern) they currently serve. Rather, they are designed for all-to-all communication patterns, by ensuring properties such as full bisection bandwidth or $O(\log n)$ route lengths between any node pair in a constant-degree n-node network. However, demand-oblivious networks can be inefficient for more specific demand patterns, as they usually arise in

Concurrent DANs

CBNet: Minimizing Adjustments in Concurrent Demand-Aware Tree Networks

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