

YATES: Rapid Prototyping for Traffic Engineering Systems

Praveen Kumar (Cornell)

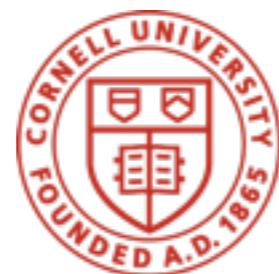
Yang Yuan (Cornell)

Chris Yu (CMU)

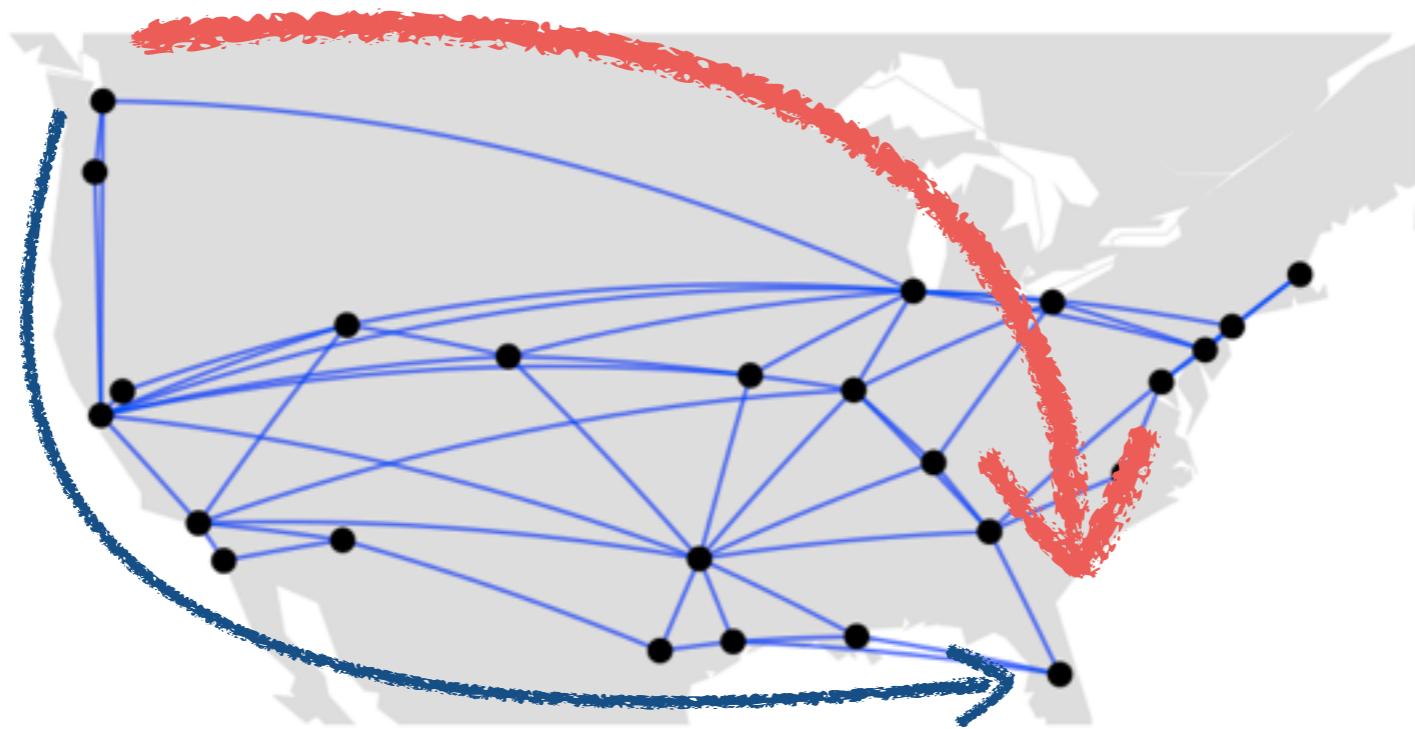
Nate Foster (Cornell)

Robert Kleinberg (Cornell)

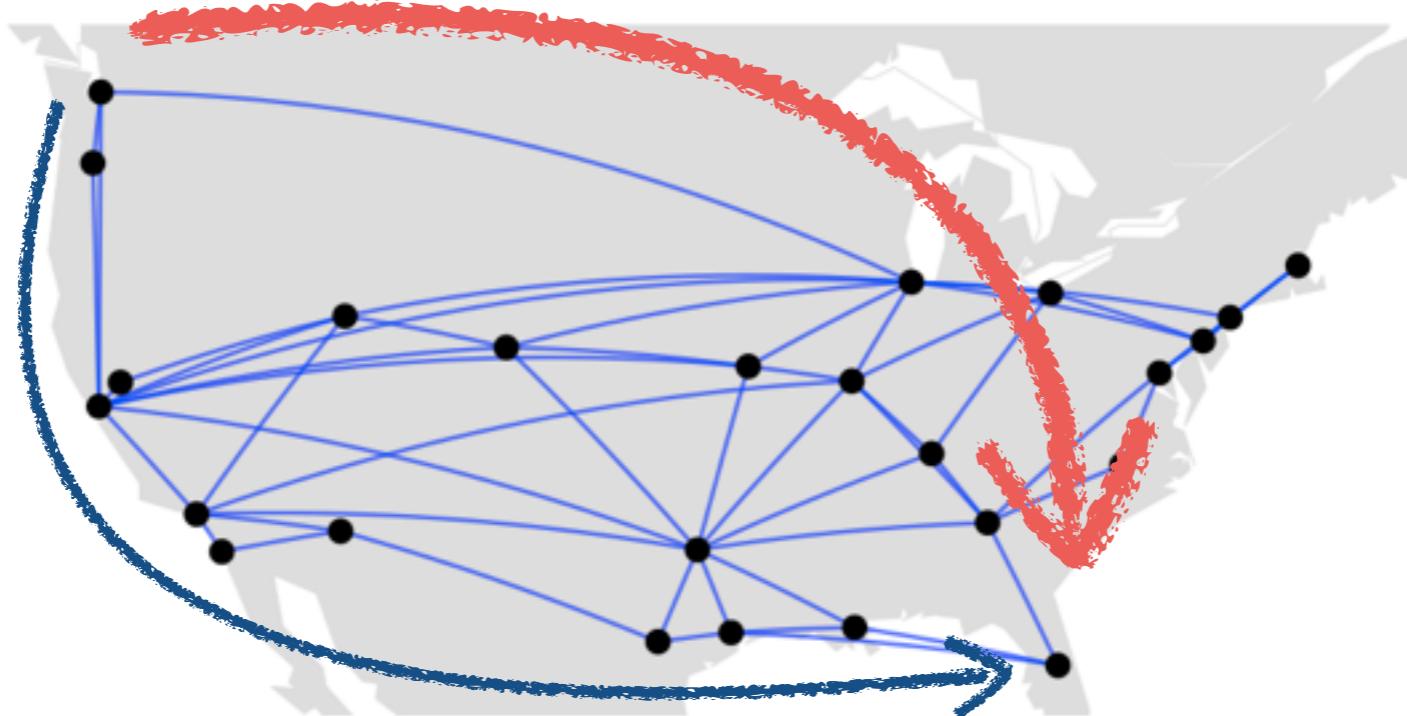
Robert Soulé (USI Lugano)



WANTE - Example



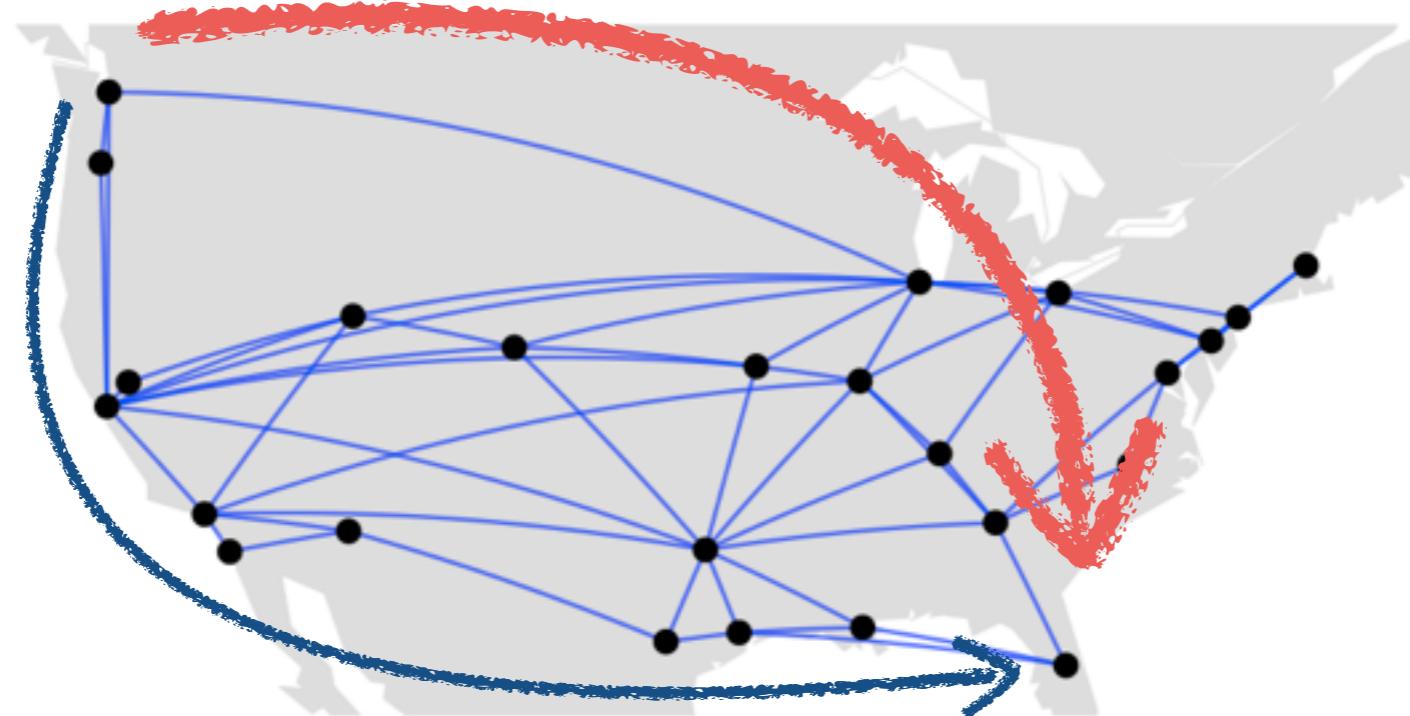
WAN TE - Example



Network Operator

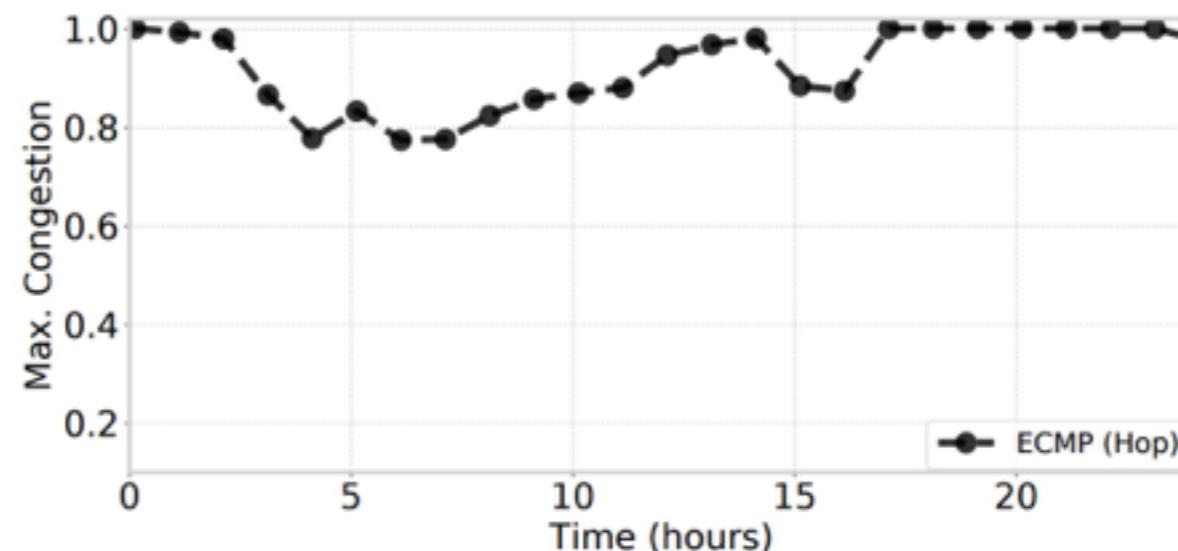
Configure the network to forward traffic using equal-cost multi-path (ECMP)

WAN TE - Example



Network Operator

Configure the network to forward traffic using equal-cost multi-path (ECMP)



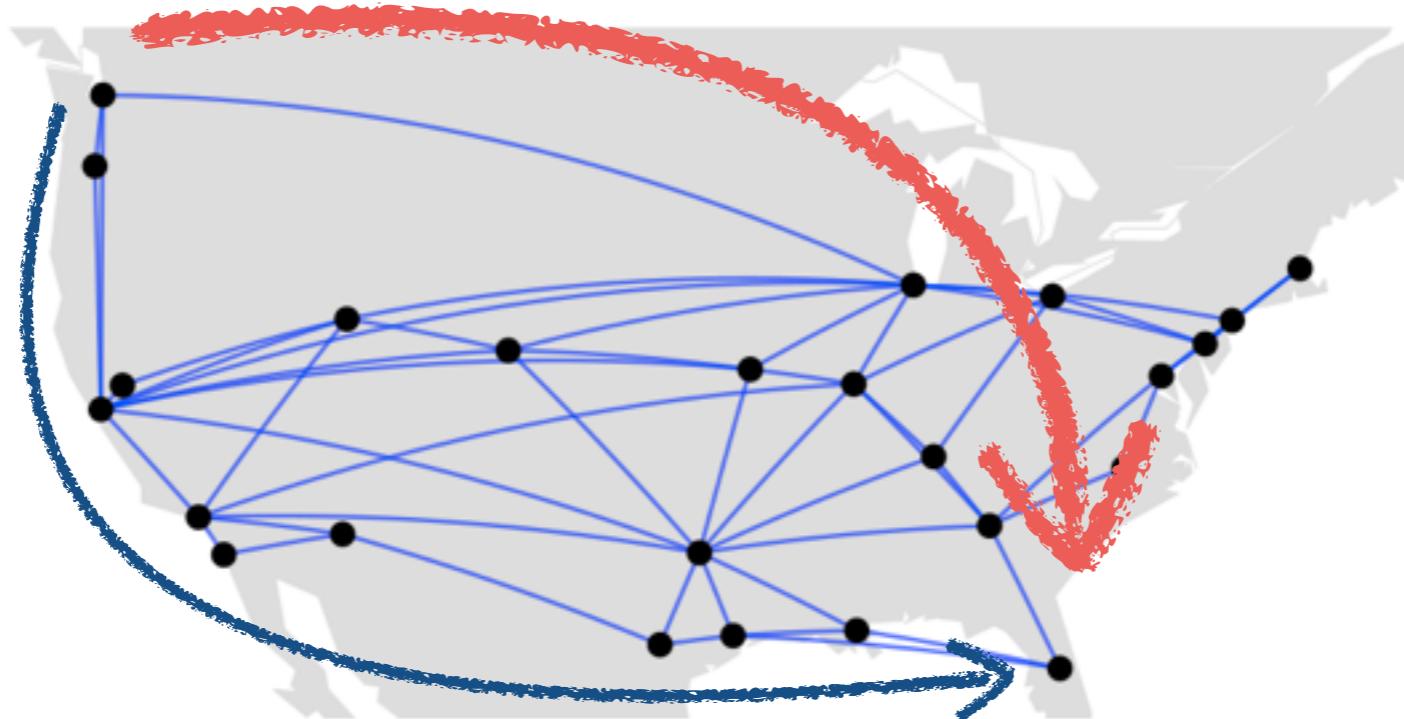
WAN TE - Example

CSPF?

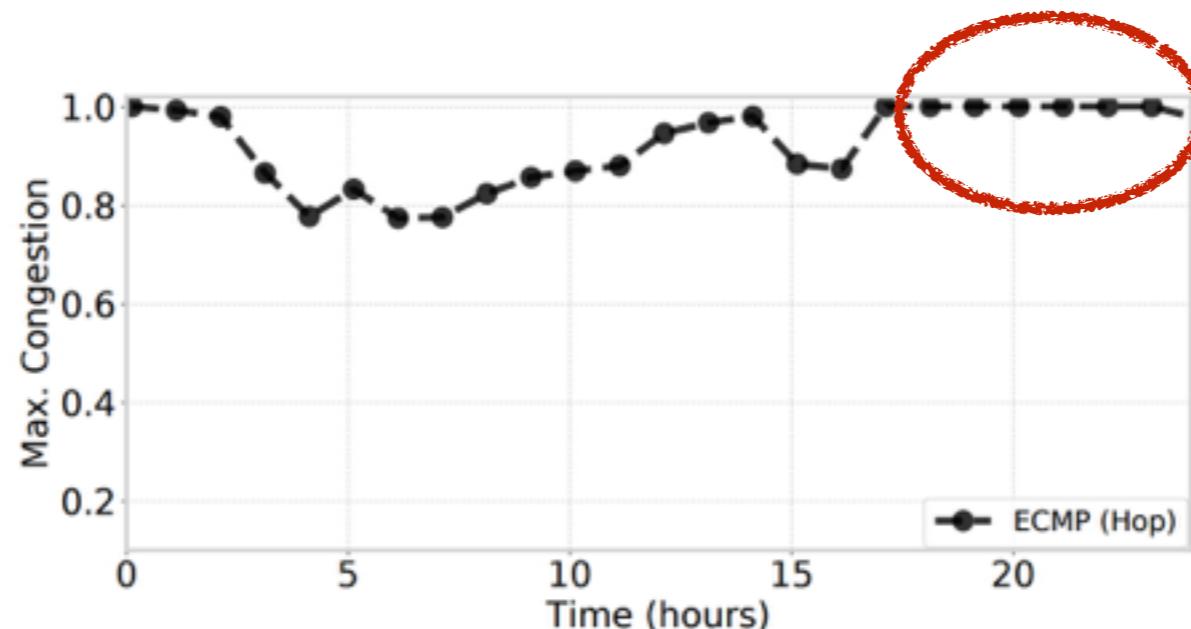


Network Operator

weights?



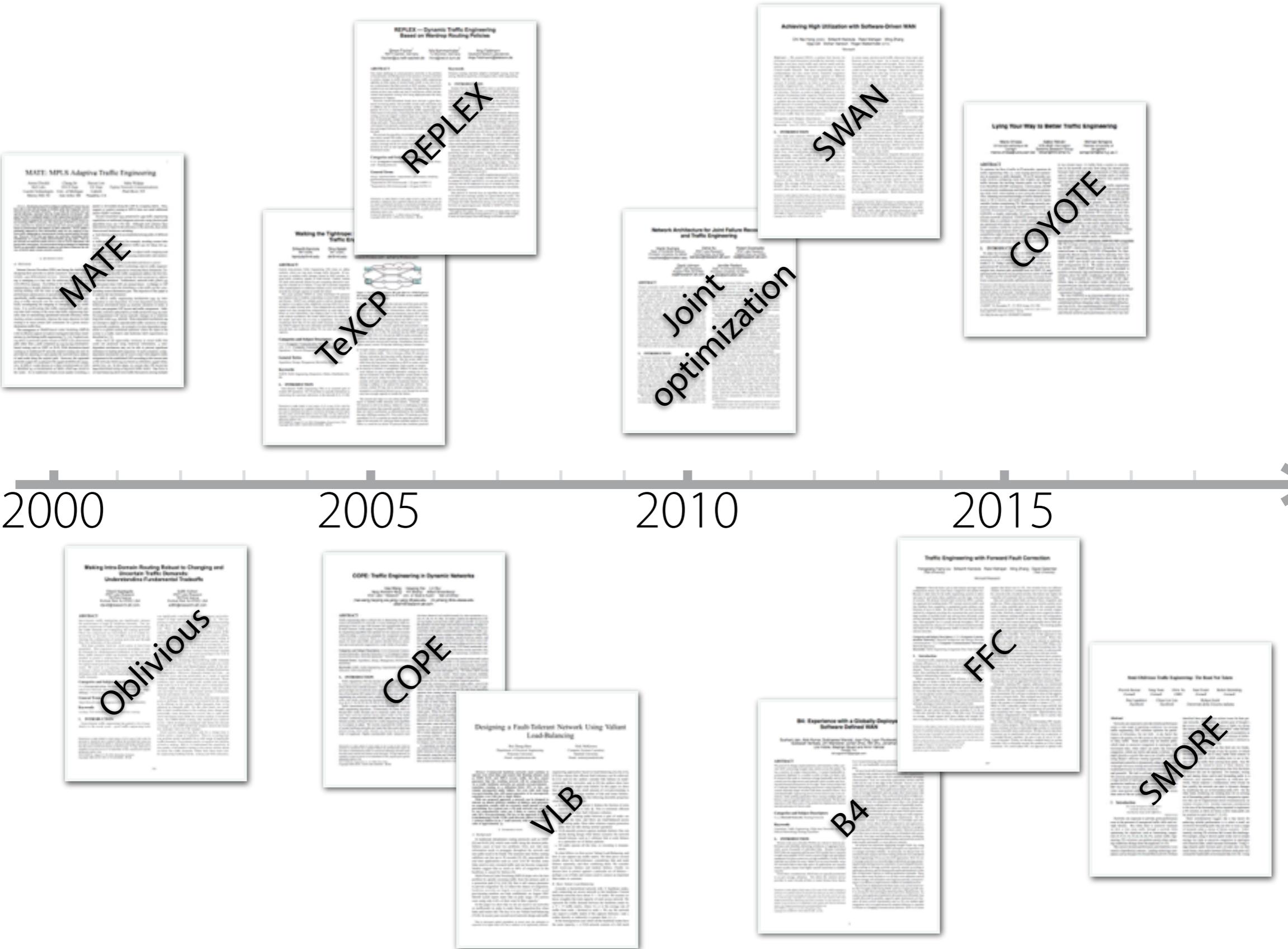
Configure the network to forward traffic using equal-cost multi-path (ECMP)



TE Systems

TE Systems

OSPF
CSPF
ECMP
MCF



TE Systems

OSPF



MATE



REPLEX



Joint Failure Recovery and Traffic Engineering



SWAN



COYOTE

- Difficult to compare



ECMP



Oblivious



COPE

MCF



VLB



B4



FFC



SMORE

TE Systems

OSPF



MATE



REPLEX



SWAN



COYOTE

- Difficult to compare
- High cost of evaluation



ECMP



Oblivious



COPE

MCF



VLB

— 2000 —



B4



FFC



SMORE

YATES

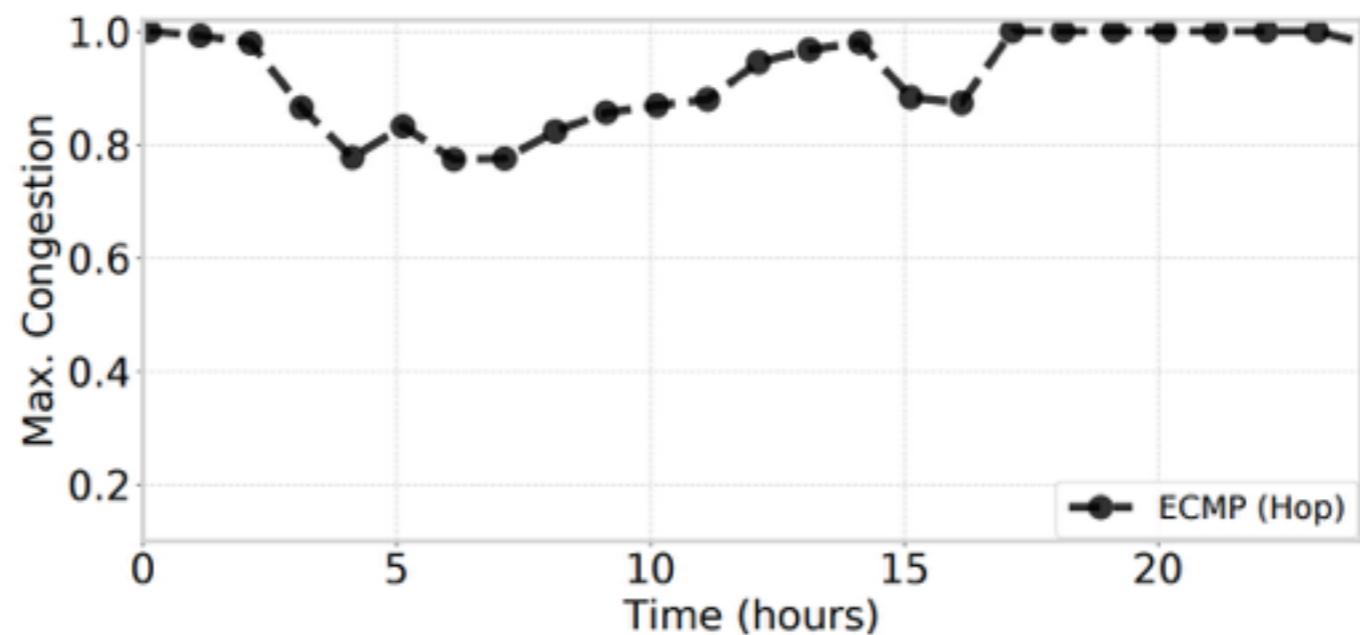
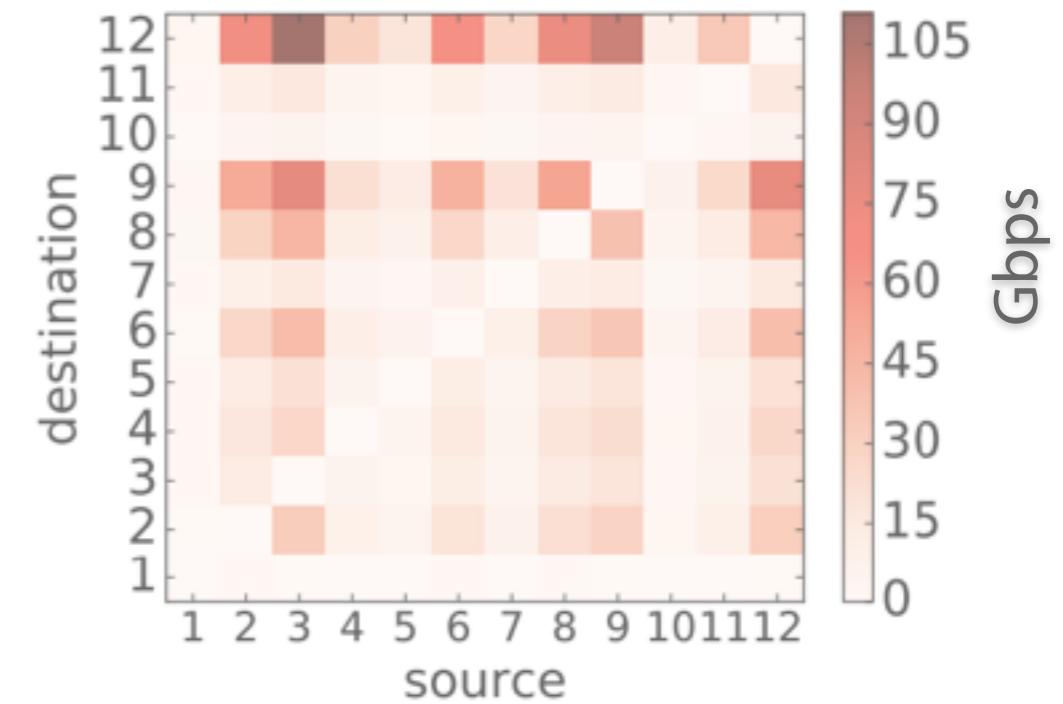
(Yet Another Traffic Engineering System)

- Open-source TE framework
- High-level abstractions
- Modular interface for implementing TE elements
- Libraries and tools for
 - generating traffic demands,
 - modeling failures,
 - prediction errors, etc.

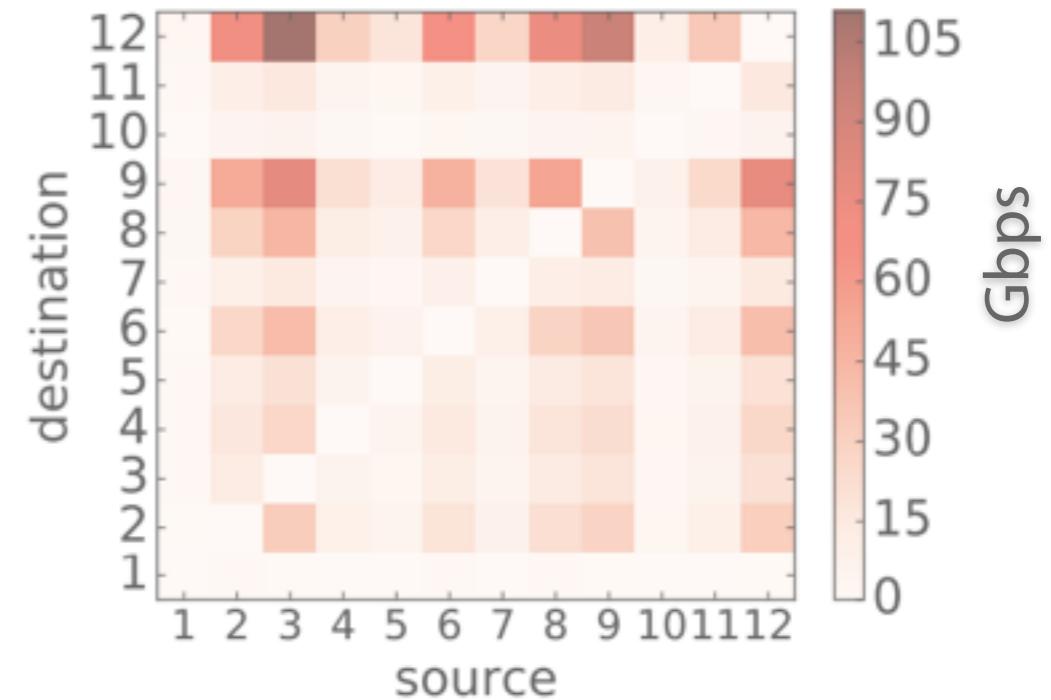
YATES - Example



Network Operator



YATES - Example

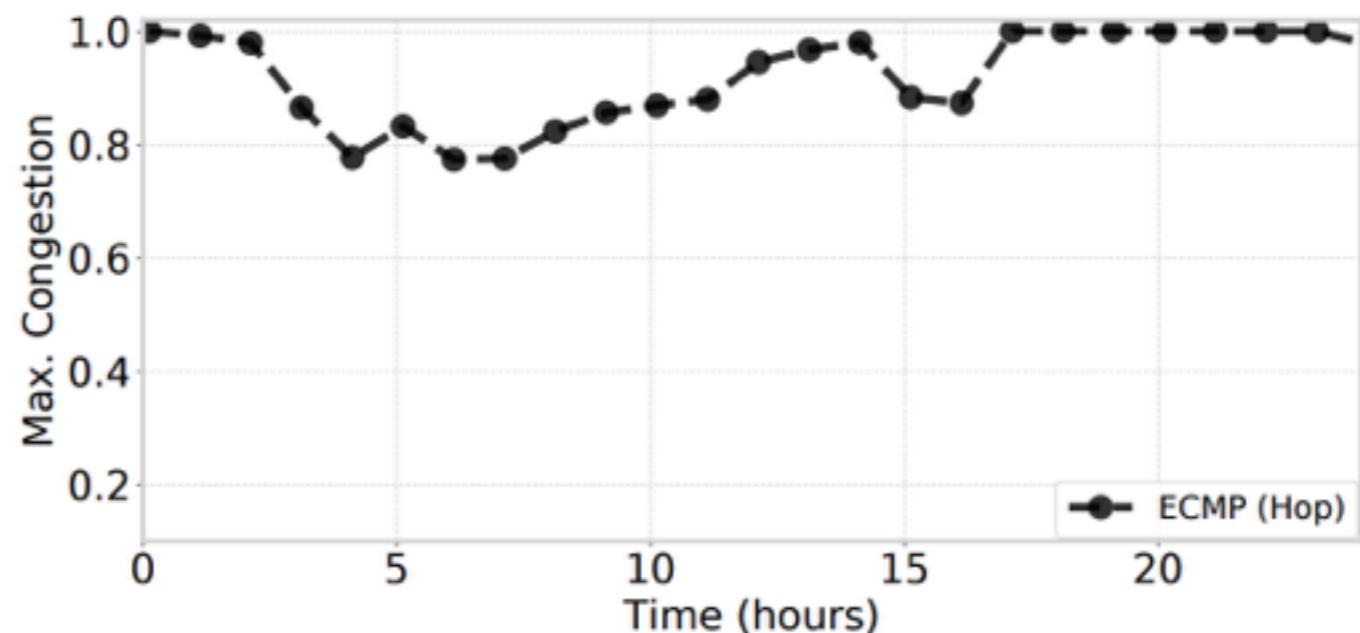


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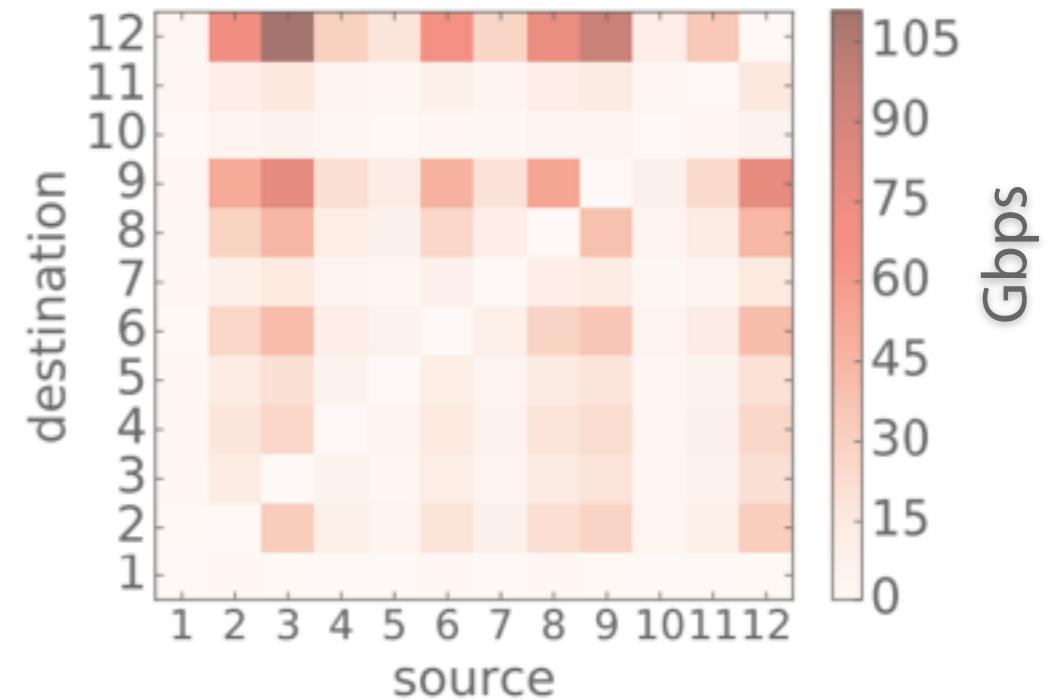
Network Operator

CSPF?

Link weight? (1 or RTT)



YATES - Example

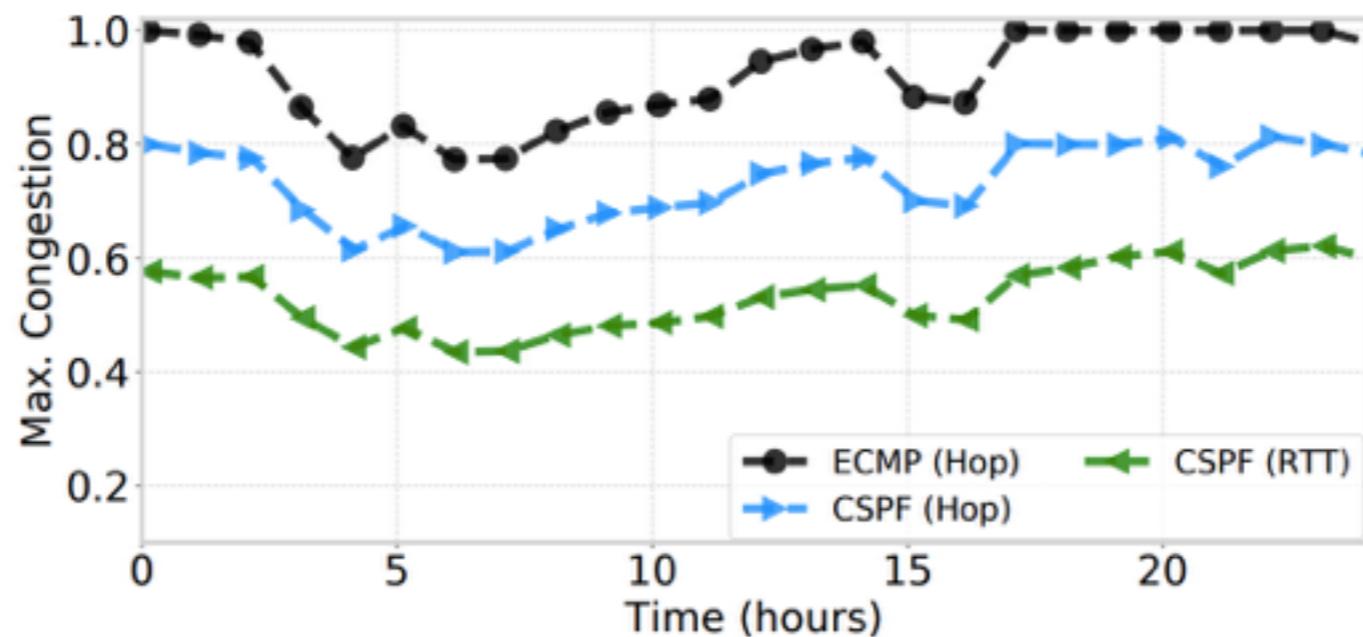


YATES > . . .

Network Operator

CSPF?

Link weight? (1 or RTT)



YATES Interface

High-level and modular interface

YATES Interface

High-level and modular interface

```
(* Map from src-dst pairs to traffic demands *)
type demands = float SrcDstMap.t
```

```
(* Map from src-dst pairs to path distributions *)
type scheme = (float PathMap.t) SrcDstMap.t
```

```
module type Algorithm = sig
  val initialize : scheme -> unit
  val solve : topology -> demands -> scheme
end
```

YATES Interface

High-level and modular interface

```
(* Map from src-dst pairs to traffic demands *)
type demands = float SrcDstMap.t
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(* Map from src-dst pairs to path distributions *)
type scheme = (float PathMap.t) SrcDstMap.t
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Modular Implementation

Achieving High Utilization with Software-Driven WAN

Chi-Yao Hong (UIUC) Srikanth Kandula Ratul Mahajan Ming Zhang
Vijay Gill Mohan Nanduri Roger Wattenhofer (ETH)

Microsoft

Abstract— We present SWAN, a system that boosts the utilization of inter-datacenter networks by centrally controlling when and how much traffic each service sends and frequently re-configuring the network's data plane to match current traffic demand. But done simplistically, these re-configurations can also cause severe, transient congestion because different switches may apply updates at different times. We develop a novel technique that leverages a small amount of scratch capacity on links to apply updates in a provably congestion-free manner, without making any assumptions about the order and timing of updates individual switches. Further, to scale to large networks and the lack of limited forwarding table capacity, SWAN grows a small set of entries that can host many update streams. It updates this set without disrupting traffic flow using a small amount of scratch capacity in forwarder tables, a key performance using a switch prototype. Evaluation on simulations of two production networks shows that SWAN can route 60% more traffic than the current practice.

Categories and Subject Descriptors C.2.1 [Computer Communication Networks]: Network Protocols and Design
Keywords Inter-DC WAN, network automation, networking

I. INTRODUCTION

The wide area network (WAN) that connects the data centers (DC) is critical infrastructure for providers of cloud services such as Amazon, Google, and Microsoft. Many services rely on low-latency inter-DC communication for a good user experience and on high-throughput links for scalability (e.g., when replicating updates). Given the need for high-capacity inter-DC traffic is a significant fraction of internet traffic and rapidly growing [29], its unique traffic characteristics, the inter-DC WAN is often a dedicated network, distinct from the WAN used for intra-DC traffic (backplane and users [25]). It is an expensive resource, with a capitalized annual cost of 100s of millions of dollars, yet it provides 10s of Gbps to Tbps of capacity over long distances.

However, providers are still not fully leveraging this investment today. In DCs, bandwidth is already poor efficiency; the average utilization of even our fastest links is 40-60%. One culprit is the lack of coordination among the services that interact with the network, i.e., coarse, static links

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¹In some networks, fault tolerance is another reason for low utilization; the network is provisioned such that there is ample capacity even after [common] failures. However, in inter-DC WANs, traffic that needs strong protection is a small subset of the overall traffic, and existing technologies can tag and protect such traffic in the face of failures [52].

(SIGCOMM '13)

Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

Modular Implementation

(* YATES modules *)

module KSP : Algorithm

module SemiMCF : Algorithm

(* Compute base set of k-shortest paths *)

let initial_scheme : scheme =

KSP.initialize empty_scheme;

KSP.solve topo empty_demands

(* Initialize SemiMCF with k-shortest paths *)

let () = SemiMCF.initialize initial_scheme in

(* For each traffic matrix, *)

let simulate_step (d:demands) : unit =

(* Compute updated routing scheme *)

let (s:scheme) = SemiMCF.solve topo d in

(* Record performance statistics ... *)

Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

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Categories and Subject Descriptors C.2.1 [Computer Communication Networks]: Network Protocols and Design
Keywords: Inter-DC WAN, network self-learning networking

I. INTRODUCTION

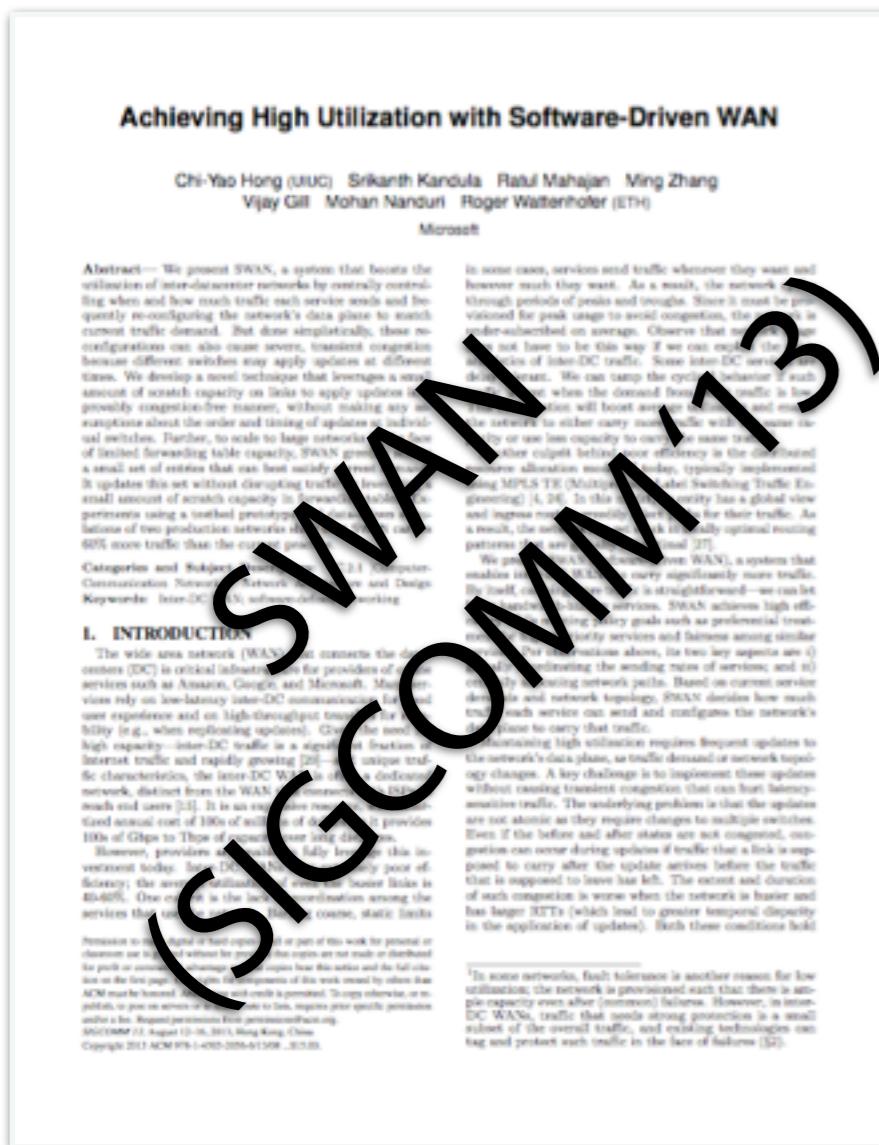
The wide area network (WAN) that connects the data centers (DC) is critical infrastructure for providers of cloud services such as Amazon, Google, and Microsoft. Many services rely on low-latency inter-DC communication for a good user experience and on high-throughput traffic for reliability (e.g., when replicating updates). Given the need for high-capacity inter-DC traffic in a significant fraction of internet traffic and rapidly growing [29], a unique traffic characteristic, the inter-DC WAN is often a dedicated network, distinct from the WAN connecting the data centers to each other [25]. It is an example of a specialized network of networks (SONET) that provides 100s of Gbps to 1Tbps of capacity over long distances.

However, providers are still largely failing to fully invest today in DC WANs to achieve a truly joint efficiency; the average utilization of even the fastest links is 40-60%. One reason is the lack of coordination among the services that the network carries, in contrast, static links

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(SIGCOMM '13)

Modular Implementation



```
(* YATES modules *)  
module KSP : Algorithm  
module SemiMCF : Algorithm
```

(* Compute base set of k-shortest paths *)

```
let initial_scheme : scheme =  
  KSP.initialize empty_scheme;  
  KSP.solve topo empty_demands
```

(* Initialize SemiMCF with k-shortest paths *)

```
let () = SemiMCF.initialize initial_scheme in
```

(* For each traffic matrix, *)

```
let simulate_step (d:demands) : unit =  
  (* Compute updated routing scheme *)  
  let (s:scheme) = SemiMCF.solve topo d in  
  (* Record performance statistics ... *)
```

Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

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(* YATES modules *)

module KSP : Algorithm

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Achieving High Utilization with Software-Driven WAN

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Categories and Subject Descriptors C.2.1 [Computer Communication Networks]: Network Protocols and Design
Keywords Inter-DC WAN, network reconfiguration, networking

I. INTRODUCTION

The wide area network (WAN) that connects the data centers (DC) is critical infrastructure for providers of cloud services such as Amazon, Google, and Microsoft. Many services rely on low-latency inter-DC communication for a good user experience and on high-throughput traffic for reliability (e.g., when replicating updates). Given the need for high-capacity inter-DC traffic in a significant fraction of internet traffic and rapidly growing [29], a unique traffic characteristic, the inter-DC WAN is often a dedicated network, distinct from the WAN connecting the data centers to each other [25]. It is an example of a recently centralized annual cost of 100s of millions of dollars that it provides 100s of Gbps to Tbps of capacity over long distances.

However, providers are still largely failing to keep this investment today. In DCs, the average link utilization is poor; for instance, the average utilization of even the fastest links is 40-60%. One reason is the lack of coordination among the services that share the same link. In other words, static links

fail to utilize the full capacity of the link. Another reason is that the traffic matrix is not updated frequently enough. In some cases, services send traffic whenever they want and however much they want. As a result, the network experiences periods of peaks and troughs. Since it must be provisioned for peak usage to avoid congestion, the network is under-subscribed on average. Observe that the network does not have to be this way if we can exploit the dynamics of inter-DC traffic. Some inter-DC services are delay-tolerant. We can damp the cyclic behavior if such services are not active when the demand from other services is high. This will boost utilization of the links and enable the network to either carry more traffic with the same capacity or use less capacity to carry the same traffic. Another culprit behind poor efficiency in the distributed resource allocation mechanism today, typically implemented using MPLS TR (Multi-Protocol Label Switching Traffic Engineering) [4, 20]. In this approach, each entity has a global view and ingress nodes actively compete for their traffic. As a result, the network may not pick the truly optimal routing paths (as are guaranteed in [27]).

We present SWAN (Software-Driven WAN), a system that enables inter-DC WANs to carry significantly more traffic.

By itself, our solution is straightforward—we can let each service update its own traffic. SWAN achieves high efficiency by setting key goals such as preferential treatment of latency-sensitive services and fairness among similar services. For illustration above, its two key aspects are i) dynamically estimating the sending rates of services; and ii) dynamically updating network paths. Based on current service demands and network topology, SWAN decides how much traffic each service can send and configures the network's data plane to carry that traffic.

Maximizing high utilization requires frequent updates to the network's data plane, as traffic demand or network topology changes.

A key challenge is to implement these updates without causing transient congestion that can hurt latency-sensitive traffic. The underlying problem is that the updates are not atomic as they require changes to multiple entities.

Even if the before and after states are not congested, congestion can occur during updates if traffic that a link is supposed to carry after the update arrives before the traffic that is supposed to leave first. The extent and duration of such congestion is worse when the network is busier and has larger RTTs (which lead to greater temporal disparity in the application of updates). Both these conditions hold

In some networks, fault tolerance is another reason for low utilization; the network is provisioned such that there is ample capacity even after (numerous) failures. However, in inter-DC WANs, traffic that needs strong protection is a small subset of the overall traffic, and existing technologies can tag and protect such traffic in the face of failures [52].

(* Compute base set of k-shortest paths *)

```
let initial_scheme : scheme =  
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Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

(SIGCOMM '13)

Modular Implementation

(* YATES modules *)

module KSP : Algorithm

module SemiMCF : Algorithm

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However, providers are still not fully taking this investment today. In DCs, bandwidth is a primary point of failure; the average utilization of even the fastest links is 40-60%. One reason is the lack of coordination among the services that share the link. In other words, static links

in some cases, services send traffic whenever they want and however much they want. As a result, the network experiences periods of peaks and troughs. Since it must be provisioned for peak usage to avoid congestion, the network is under-subscribed on average. Observe that this is not true to be this way if we can exploit the dynamics of inter-DC traffic. Some inter-DC services are delay-tolerant. We can damp the cyclic behavior if such services, but when the demand from other services is high, the network will burst as well. This is due to the fact that the network is either empty enough to carry the same traffic or has less capacity to carry the same traffic. Another culprit behind lower efficiency in the distributed resource allocation model is today, typically implemented using MPLS TE (MultiProtocol Label Switching Traffic Engineering) [4, 20]. In this model, each entity has a global view and ingress nodes explicitly seek paths for their traffic. As a result, the network does not always find the optimal routing path (see our discussion in [27]).

We present SWAN (Software-Driven WAN), a system that enables inter-DC WANs to carry significantly more traffic. By itself, our system is not straightforward—we can let only one type of services. SWAN achieves high efficiency by using key goals such as preferential treatment of latency-sensitive services and fairness among similar services. Per the discussions above, its two key aspects are i) frequently updating the sending rates of services; and ii) dynamically changing network paths. Based on current service demands and network topology, SWAN decides how much traffic each service can send and configures the network's data plane to carry that traffic.

Maximizing high utilization requires frequent updates to the network's data plane, as traffic demand or network topology changes. A key challenge is to implement these updates without causing transient congestion that can hurt latency-sensitive traffic. The underlying problem is that the updates are not atomic as they require changes to multiple switches. Even if the before and after states are not congested, congestion can occur during updates if traffic that a link is supposed to carry after the update arrives before the traffic that is supposed to leave first. The extent and duration of such congestion is worse when the network is busier and has larger RTTs (which lead to greater temporal disparity in the application of updates). Both these conditions hold

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However, providers are still not fully taking this investment today. In DCs, the link utilization is poor; for instance, the average utilization of even the fastest links is 40-45%. One reason is the lack of coordination among the services that share the same link, i.e., coarse, static links

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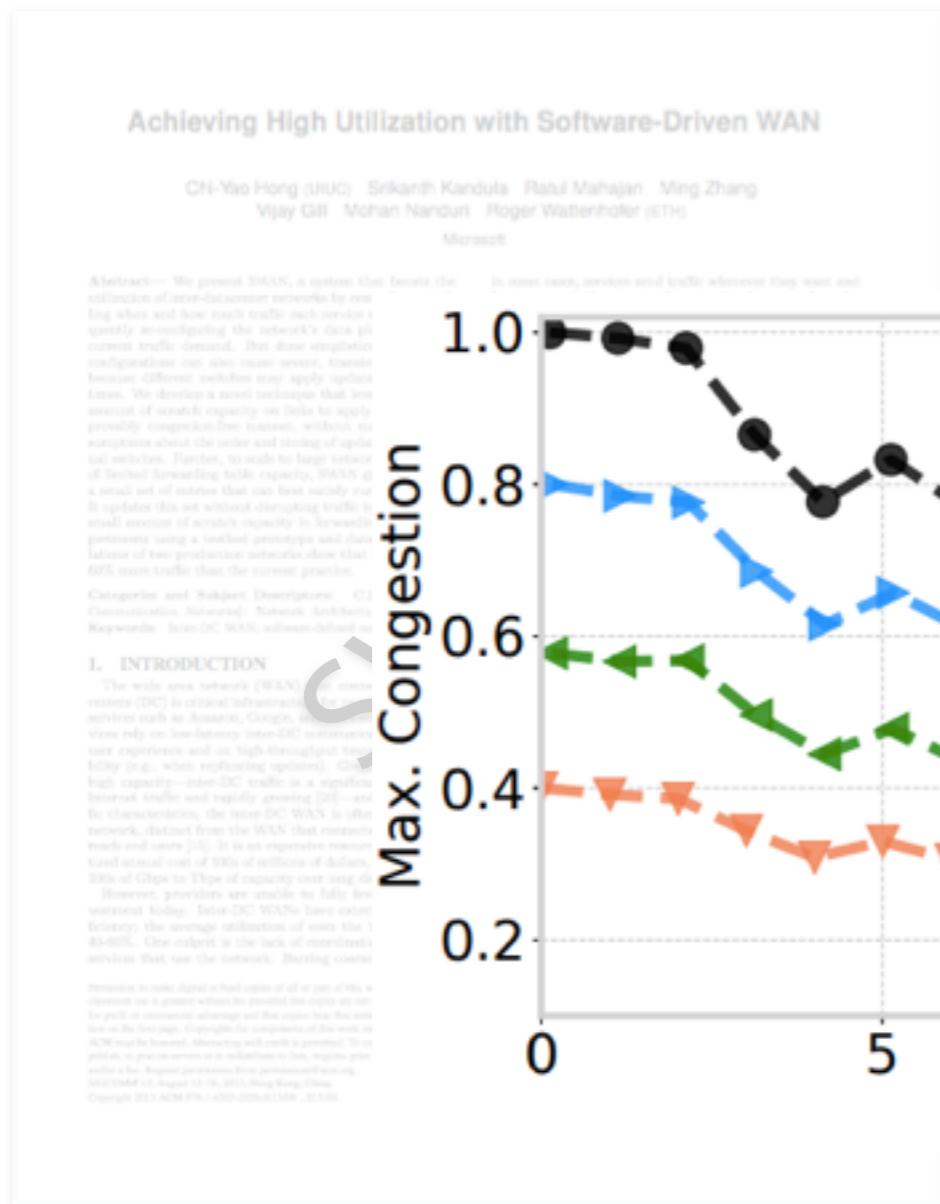
```
let () = SemiMCF.initialize initial_scheme in
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(* For each traffic matrix, *)

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let simulate_step (d:demands) : unit =  
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  (* Record performance statistics ... *)
```

Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

Modular Implementation



```
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module KSP : Algorithm
module SemiMCF : Algorithm
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ap.empty in
tMap.empty in
paths *)
cheme in
x *)
= )
d in
(* record performance statistics ... *)
```

```
module KSP : Algorithm
module SemiMCF : Algorithm
(* Compute base set of k-shortest paths *)
```

Simplified version: dynamically load-balance (MCF) traffic over k-shortest paths (KSP)

YATES Framework

Software Infrastructure

- High-level abstractions
 - Library of 18 different TE approaches
 - Tools for modeling operational conditions

- Simulator
 - Scalable
 - Steady-state
 - Macroscopic properties
 - SDN Backend
 - Implementations: static paths and source routing

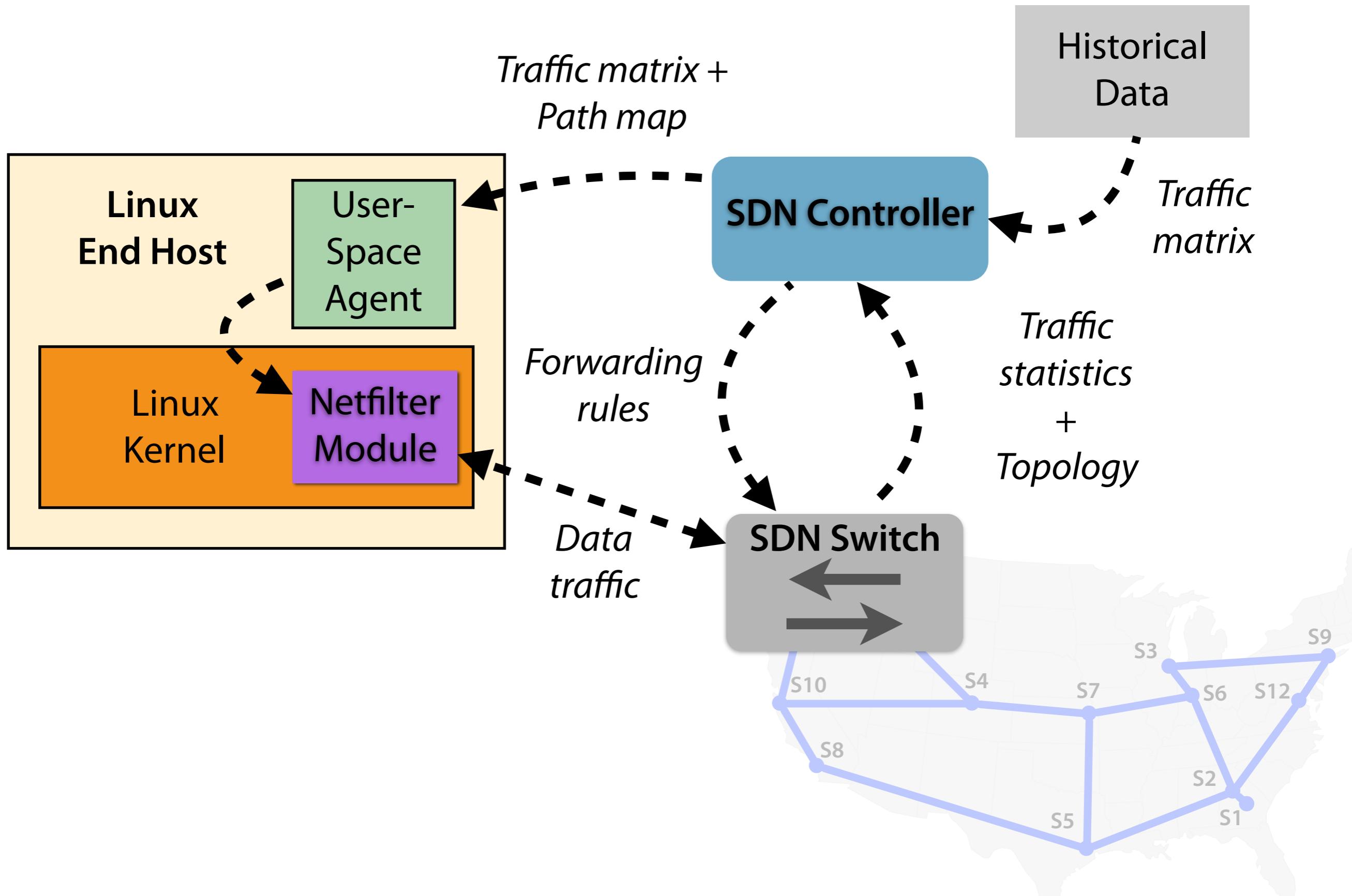
YATES Framework

Software Infrastructure

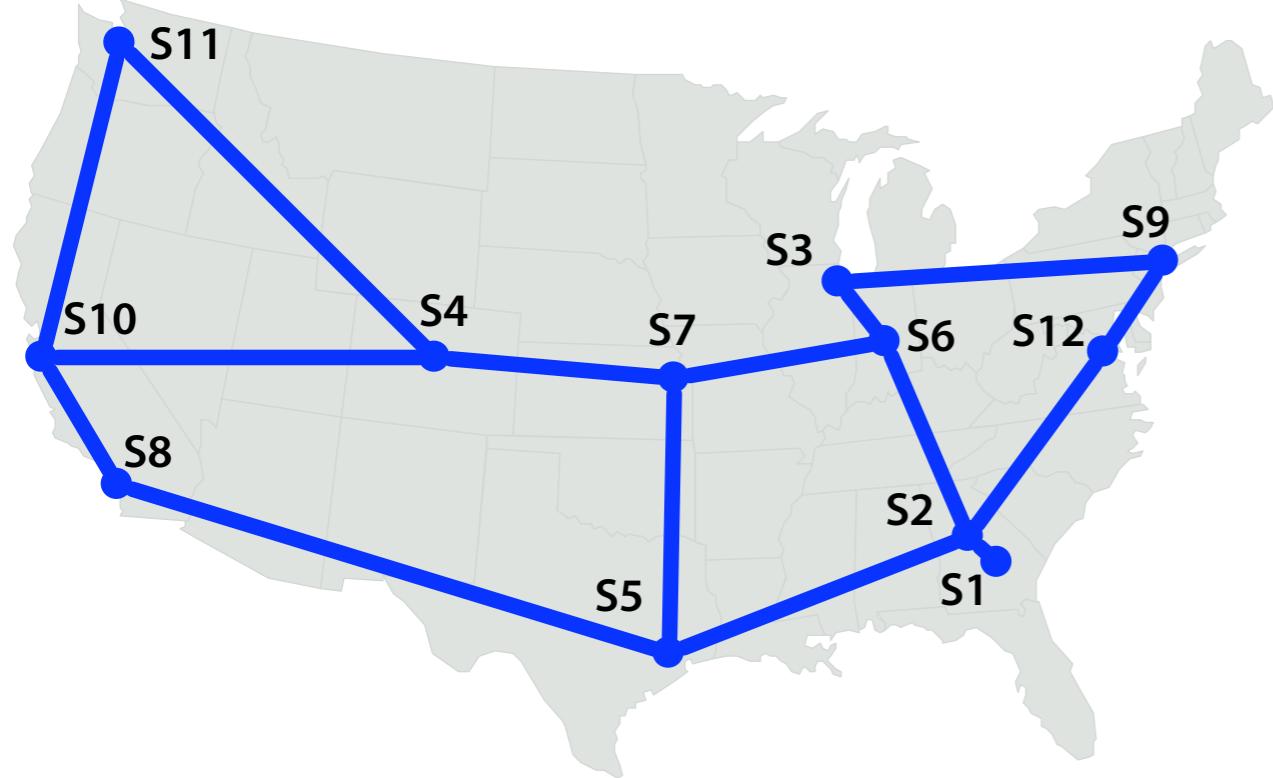
- High-level abstractions
 - Library of 18 different TE approaches
- Tools for modeling operational conditions

-
- **Simulator**
 - Scalable
 - Steady-state
 - Macroscopic properties
 -
 -
 -
 -
- **SDN Backend**
 - Implementations: static paths and source routing
 -
 -
 -
 -

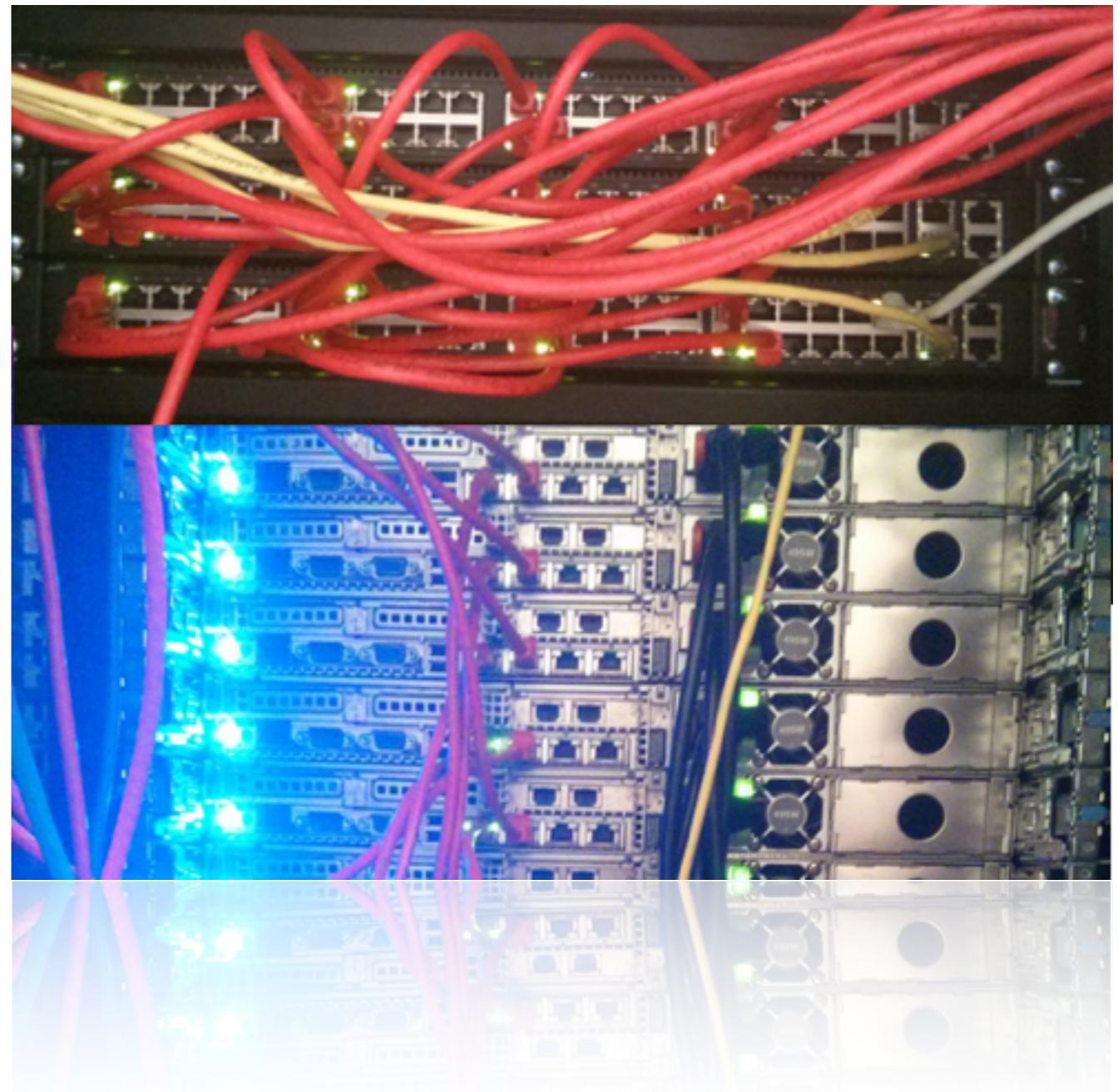
SDN Backend



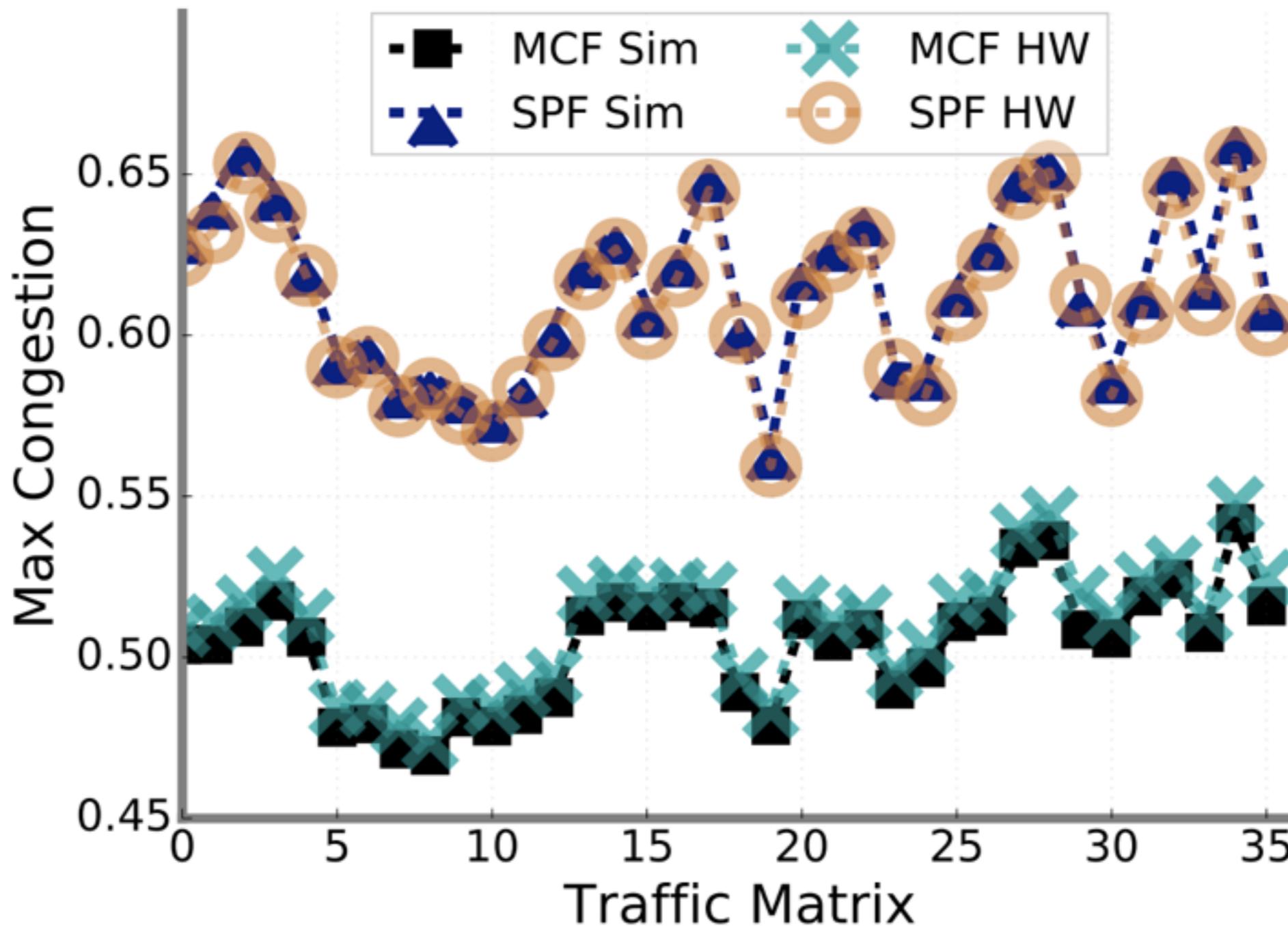
Hardware Testbed



Abilene Backbone Network



Simulator Calibration



PCC = 0.996

Take Aways

- YATES lowers the bar to perform credible TE research
- **Easy to prototype** and evaluate new TE systems
- **Modular design** allows composing pieces together
- Tools to model **operational conditions**
- **Calibrated** with deployments to ensure credible results

Questions?

Try out YATES!

<https://github.com/cornell-netlab/yates>