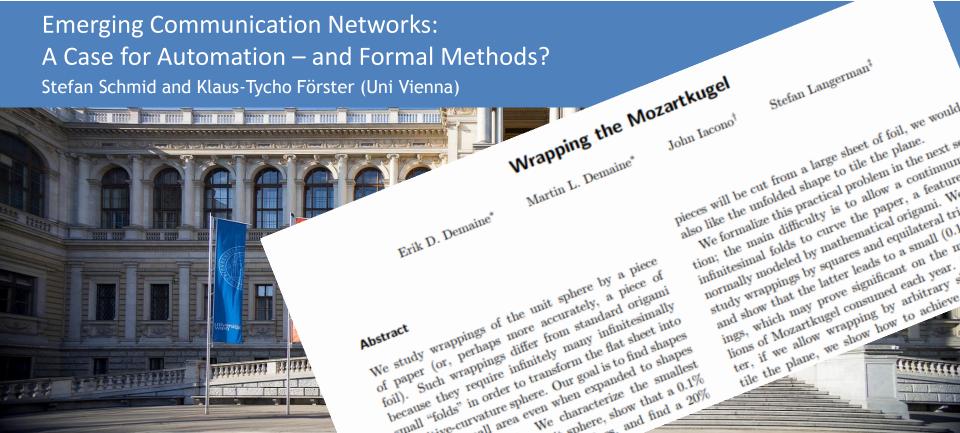
#### Emerging Communication Networks: A Case for Automation – and Formal Methods? Stefan Schmid and Klaus-Tycho Förster (Uni Vienna)



#### Emerging Communication Networks: A Case for Automation – and Formal Methods? Stefan Schmid and Klaus-Tycho Förster (Uni Vienna)













#### Flexibilities: Great Time for Networking Research!



Passau, Germany Inn, Donau, Ilz

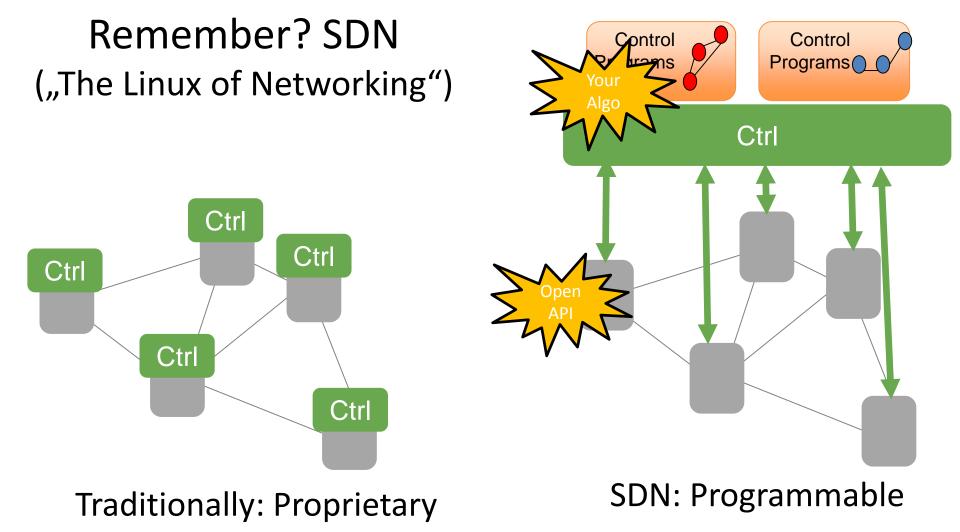
#### Flexibilities: Great Time for Networking Research!



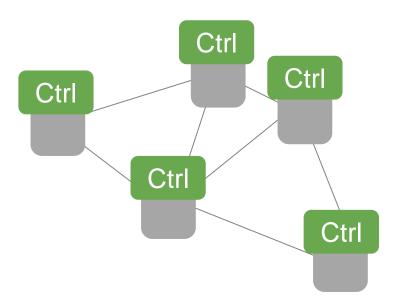
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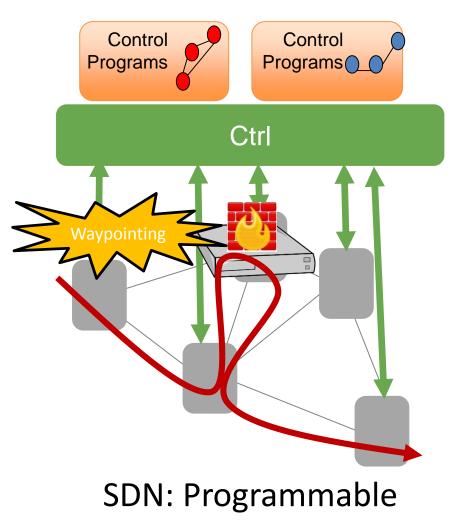




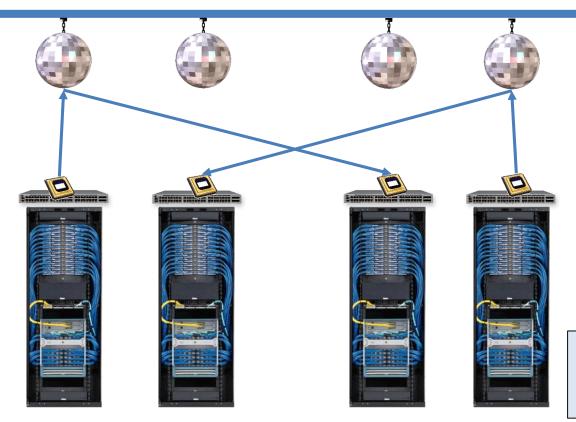
Virtualization (Flexible Placement and New Services)



Traditionally: Proprietary



## **Remember?** Topology Programming

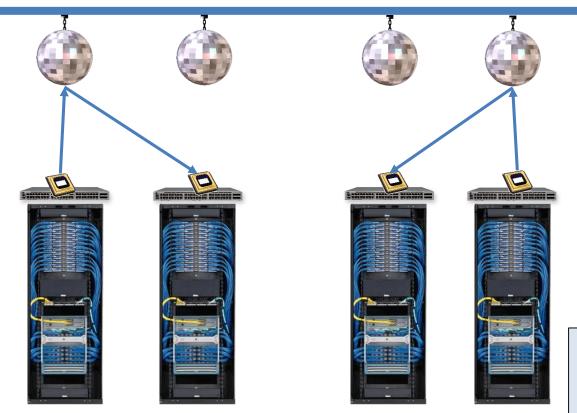


 Reconfigure networks towards needs



**Toward Demand-Aware Networking: A Theory for Self-Adjusting Networks.** Avin et al. ACM SIGCOMM CCR, 2018.

## **Remember?** Topology Programming



 Reconfigure networks towards needs



**Toward Demand-Aware Networking: A Theory for Self-Adjusting Networks.** Avin et al. ACM SIGCOMM CCR, 2018.

# Opportunity

# Challenge



#### Additional dimensions for

**optimization**: can be exploited to improve performance, utilization, ...

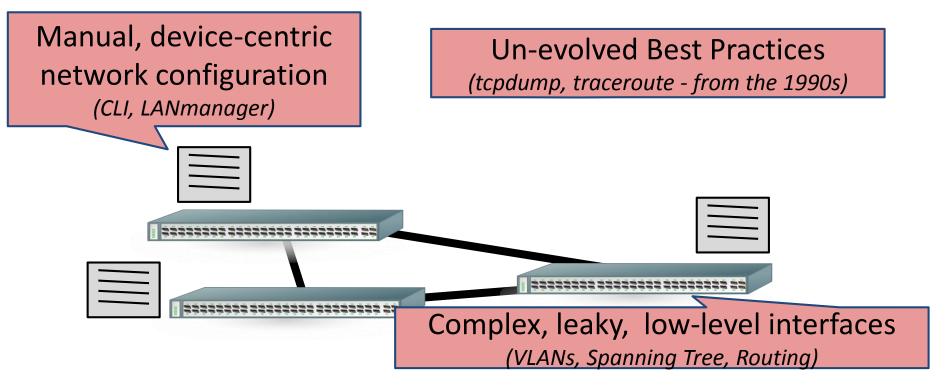


New network **services** (e.g., service chaining)



But: optimizations become harder and are somtimes not yet well-understood (e.g., embedding, topology programming)

# Another Challenge: Complexity



Operating networks today: manual and error-prone task.

# **Complexity is Problematic**

Datacenter, enterprise, carrier networks have become mission-critical infrastructure! But even techsavvy companies struggle to provide reliable operations.



We discovered a misconfiguration on this pair of switches that caused what's called a "bridge loop" in the network.

A network change was [...] executed incorrectly [...] more "stuck" volumes and added more requests to the re-mirroring storm

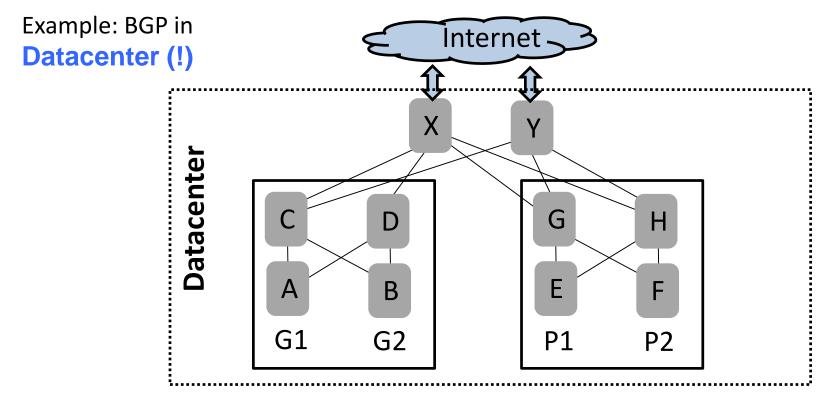


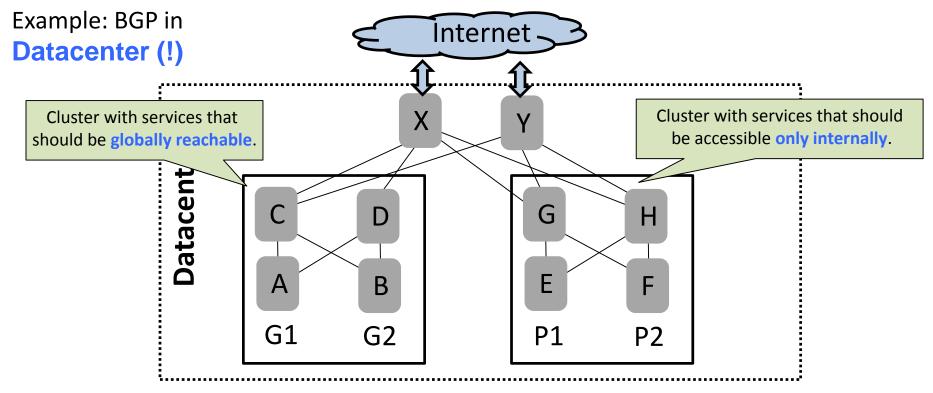


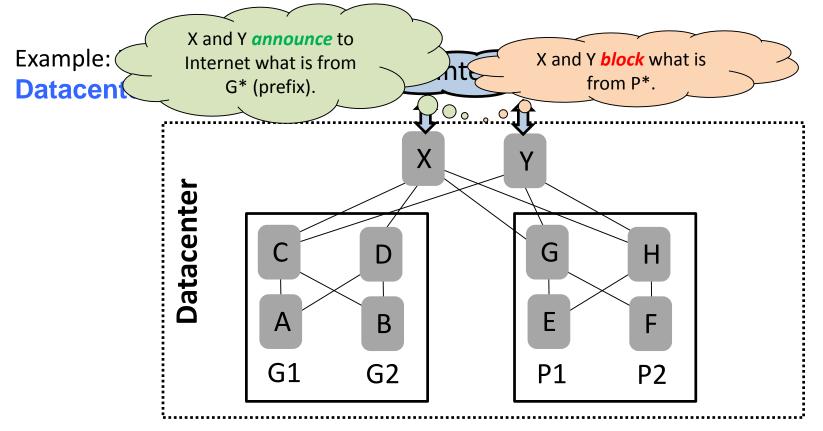
Service outage was due to a series of internal network events that corrupted router data tables

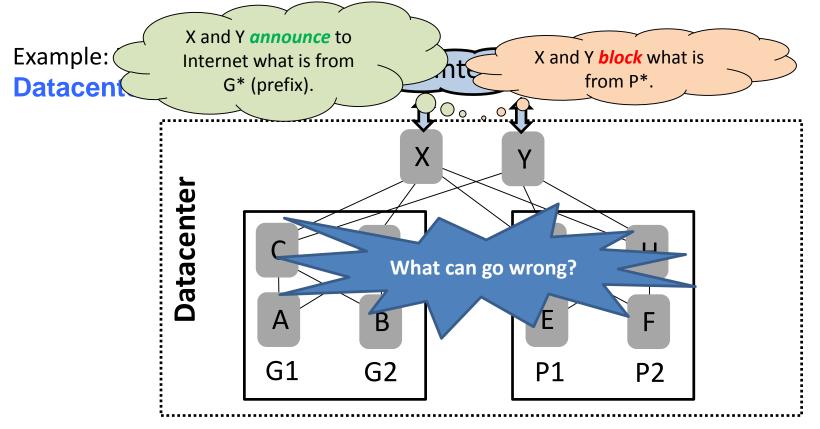
Experienced a network connectivity issue [...] interrupted the airline's flight departures, airport processing and reservations systems

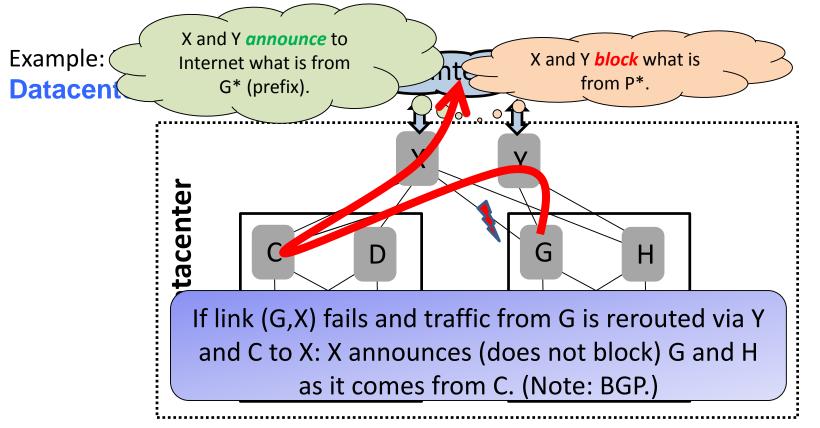














# Let's give up control: self-\* networks!

Self-repairing, self-optimizing, "self-driving", ...

> It's about automation!

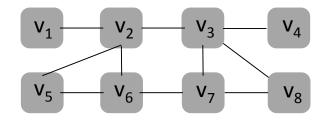
## Roadmap

- 1st Use Case for Automation: What-if Analysis
- 2nd Use Case for Automation: Consistent Rerouting



## Example: Self-Repairing MPLS Networks

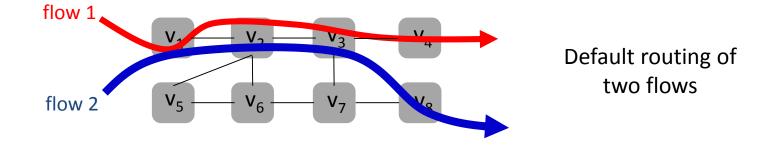
• MPLS: forwarding based on top label of label stack



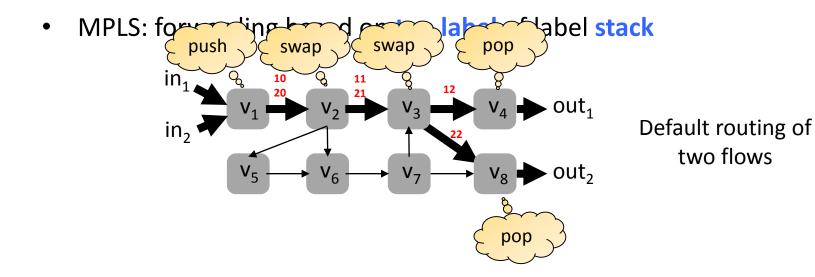
Default routing of two flows

## Example: Self-Repairing MPLS Networks

• MPLS: forwarding based on top label of label stack

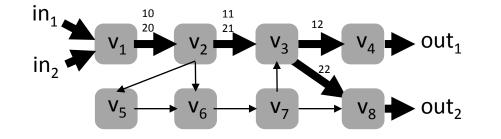


## Example: Self-Repairing MPLS Networks



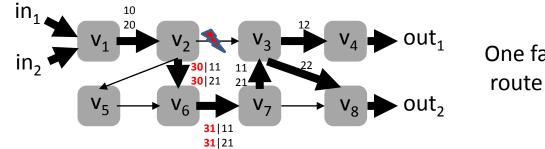
## Fast Reroute Around 1 Failure

• MPLS: forwarding based on top label of label stack



Default routing of two flows

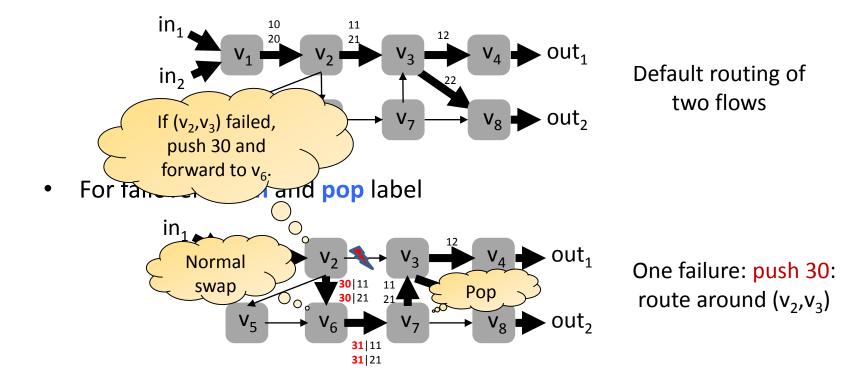
• For failover: push and pop label



One failure: push 30: route around  $(v_2, v_3)$ 

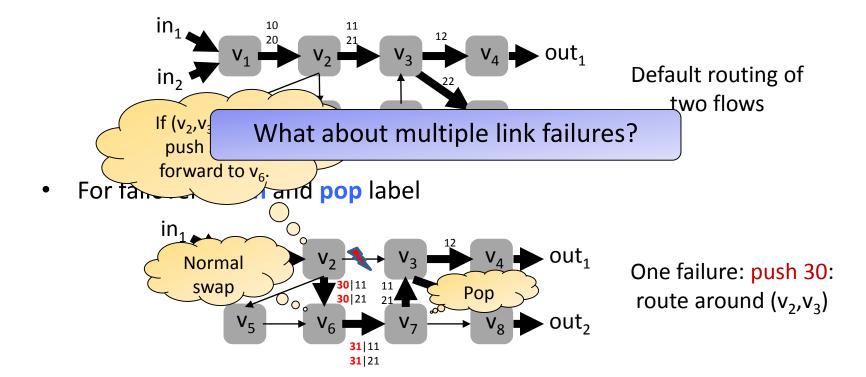
## Fast Reroute Around 1 Failure

• MPLS: forwarding based on top label of label stack

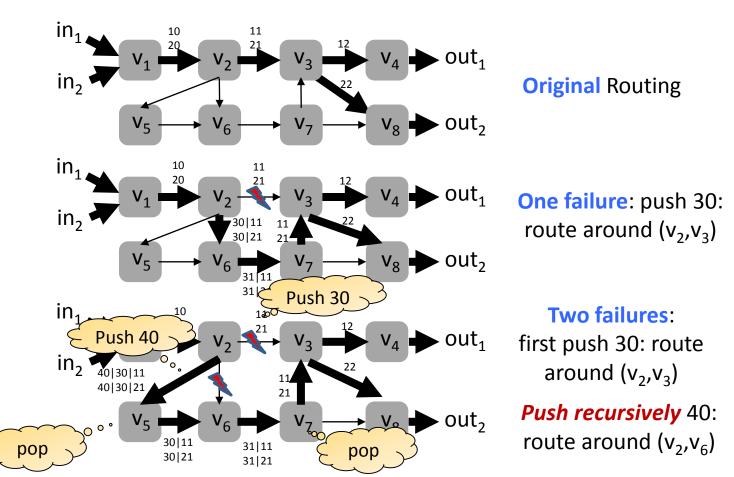


## Fast Reroute Around 1 Failure

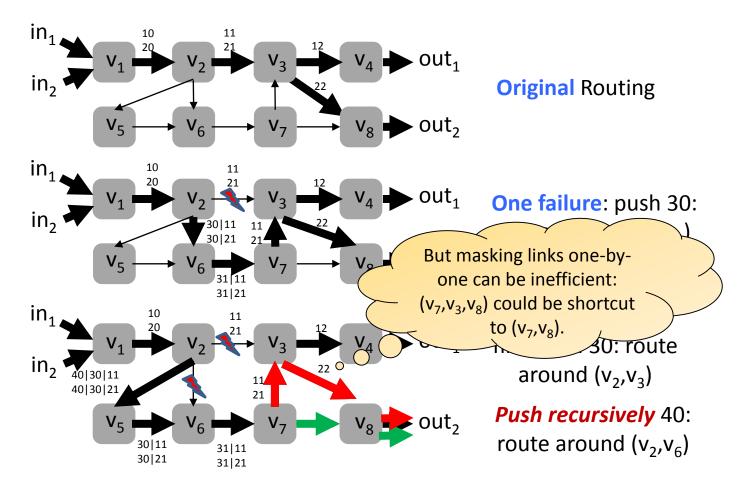
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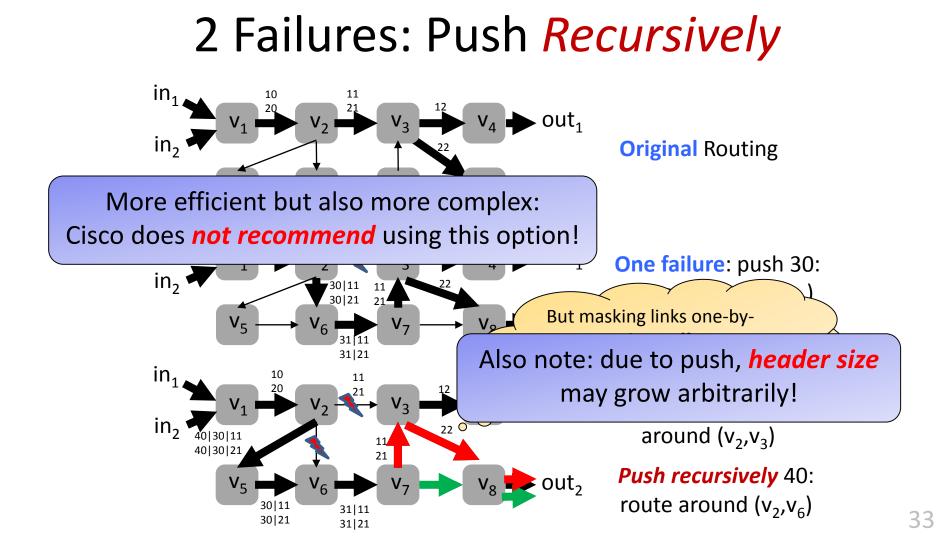


### 2 Failures: Push *Recursively*



### 2 Failures: Push *Recursively*





# Forwarding Tables for Our Example

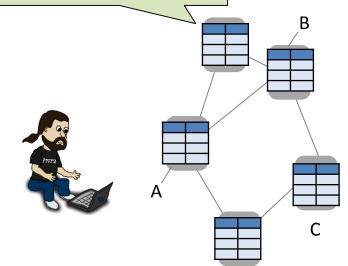
FT	In-I	In-Label	Out-I	op								
$ au_{v_1}$	$in_1$	$\perp$	$(v_1, v_2)$	push Pr	ot	ected)						
	$in_2$	$\perp$	$(v_1, v_2)$	pus		nk V		Alternat	ive 🔎			
$ au_{v_2}$	$(v_1, v_2)$	10	$(v_2, v_3)$	swa			$\succ$	link	7	)	~~~~	
	$(v_1, v_2)$	20	$(v_2, v_3)$	swap(21)	1				S		abel	3
$ au_{v_3}$	$(v_2, v_3)$	11	$(v_3, v_4)$	swap(12)		<u> </u>						
	$(v_2, v_3)$	21	$(v_3, v_8)$	swap(22)						°°		
	$(v_7, v_3)$	11	$(v_3, v_4)$	swap(12)		local FFT	Out-I	In-Label	Out-I	ор		
	$(v_7, v_3)$	21	$(v_3, v_8)$	swap(22)		$ au_{v_2}$	$(v_2, v_3)$	11	$(v_2, v_6)$	push(30)		
$ au_{v_4}$	$(v_3, v_4)$	12	$out_1$	pop			$(v_2, v_3)$	21	$(v_2, v_6)$	push(30)		
$ au_{v_5}$	$(v_2, v_2)$	40	for	pop			$(v_2, v_6)$	30	$(v_2, v_5)$	push(40)		
Version which does not				2010	•	global FFT	Out-I	In-Label	Out-I	op		
				(31)		$ au_{v_2}'$	$(v_2, v_3)$	11	$(v_2, v_6)$	swap(61)		
mask links individually!				swap(62)			$(v_2, v_3)$	21 61	$(v_2, v_6)$	swap(71) push(40)		
	$(v_5, v_6)$	71	$(v_6, v_7)$	swap(72)			$(v_2, v_6)  (v_2, v_6)$	71	$(v_2, v_5)  (v_2, v_5)$	push(40) push(40)		
$ au_{v_7}$	$(v_6, v_7)$	31	$(v_7, v_3)$	pop			(02, 06)	71	(02, 05)		]	
	$(v_6, v_7)$	62	$(v_7, v_3)$	swap(11)		_						
	$(v_6, v_7)$	72	$(v_7, v_8)$	swap(22)		F	ailo	ver Ta	bles			
$ au_{v_8}$	$(v_3, v_8)$	22	$out_2$	pop		-						
	$(v_7, v_8)$	22	$out_2$	pop								

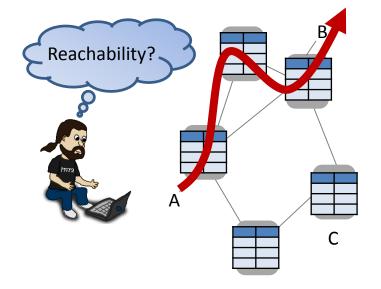
#### Flow Table

## MPLS Tunnels in Today's ISP Networks



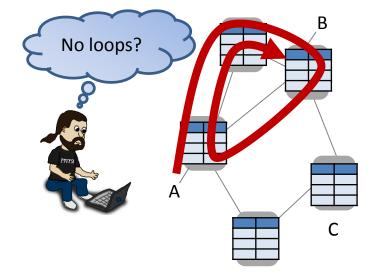
Routers and switches store list of forwarding rules, and conditional failover rules.





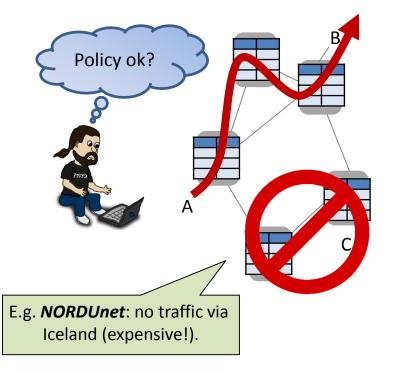
Sysadmin responsible for:

• **Reachability:** Can traffic from ingress port A reach egress port B?



Sysadmin responsible for:

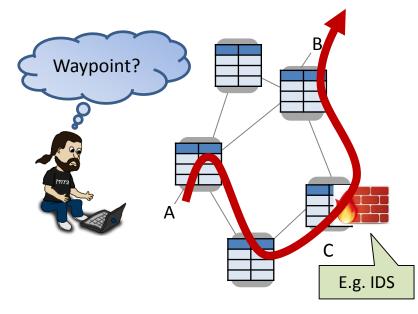
- **Reachability:** Can traffic from ingress port A reach egress port B?
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Sysadmin responsible for:

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## Responsibilities of a Sysadmin



Sysadmin responsible for:

- **Reachability:** Can traffic from ingress port A reach egress port B?
- **Loop-freedom:** Are the routes implied by the forwarding rules loop-free?
- **Policy:** Is it ensured that traffic from A to B never goes via C?
- Waypoint enforcement: Is it ensured that traffic from A to B is always routed via a node C (e.g., intrusion detection system or a firewall)?



k failures = ossibilities А E.g. IDS

... and everything even under multiple failures?!

Sysadmin responsible for:

- **Reachability:** Can traffic from ingress port A reach egress port B?
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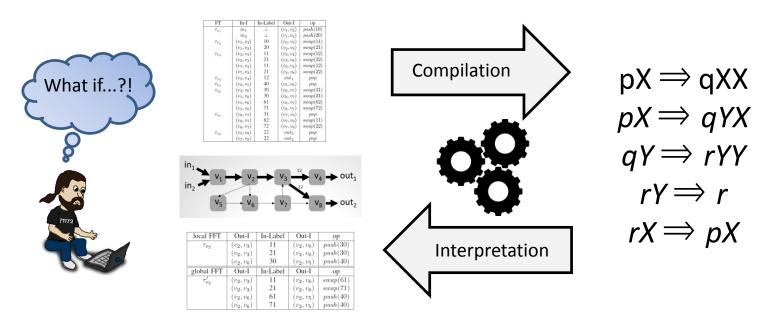
## Can we automate such tests or even self-repair?

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Yes! Automated What-if Analysis Tool for MPLS and SR in *polynomial time*. (INFOCOM 2018, CoNEXT 2018)

### Leveraging Automata-Theoretic Approach



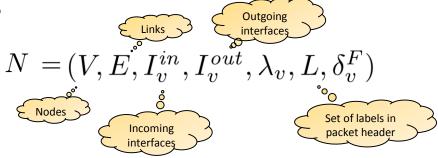
MPLS configurations, Segment Routing etc. Pushdown Automaton and Prefix Rewriting Systems Theory

#### ach Use cases: Sysadmin issues queries Leveraging Autor to test certain properties, or do it on a *regular basis* automatically! ° push(20) $\tau_{v_2}$ $(v_2, v_3)$ swap(11)swap(21) $\tau_{vz}$ swap(12) swap(22) Compilation swap(12) $pX \Rightarrow qXX$ $pX \Rightarrow qYX$ $(v_7, v_3)$ swap(22) $\tau_{v_4}$ $\tau_{v_5}$ $\tau_{v_6}$ $(v_3, v_4)$ out. What if...?! (v5. v6) $(v_2, v_6)$ swap(31 (15, 26) $(v_5, v_6)$ $(v_6, v_7)$ swap(72 $\tau_{v_7}$ $(v_6, v_7)$ 31 swap(11) (v7. v3) 72 22 22 $(v_7, v_8)$ swap(22) $(v_6, v_7)$ $\tau_{v_{\theta}}$ $(v_3, v_8)$ out<sub>2</sub> pop $qY \Rightarrow rYY$ $rY \Rightarrow r$ $rX \Rightarrow pX$ local FF1 Out-I In-Label Out-I op push(30) $(v_2, v_3)$ $(v_2, v_6)$ Interpretation $(v_2, v_3)$ 21 $(v_2, v_6)$ push(30)30 push(40) $(v_2, v_6)$ $(v_2, v_5)$ global FFT Out-I In-Label Out-I op $\tau'_{v_2}$ $(v_2, v_3)$ 11 $(v_2, v_6)$ swap(61)21 swap(71) $(v_2, v_3)$ $(v_2, v_6)$ 61 push(40) $(v_2, v_6)$ $(v_2, v_5)$ 71 push(40) $(v_2, v_6)$ $(v_2, v_5)$

MPLS configurations, Segment Routing etc. Pushdown Automaton and Prefix Rewriting Systems Theory

## Mini-Tutorial: A Network Model

• Network: a 7-tuple



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• Network: a 7-tuple

$$N = (V, E, I_v^{in}, I_v^{out}, \lambda_v, L, \delta_v^F)$$

Interface function: maps outgoing interface to next hop node and incoming interface to previous hop node

 $\lambda_v: I_v^{in} \cup I_v^{out} \to V$ That is:  $(\lambda_v(in), v) \in E$  and  $(v, \lambda_v(out)) \in E$ 

## Mini-Tutorial: A Network Model

• Network: a 7-tuple

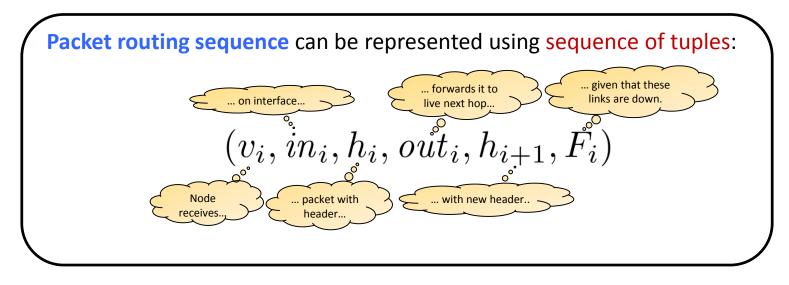
$$N = (V, E, I_v^{in}, I_v^{out}, \lambda_v, L, \delta_v^F)$$

**Routing function**: for each set of failed links  $F \subseteq E$ , the routing function

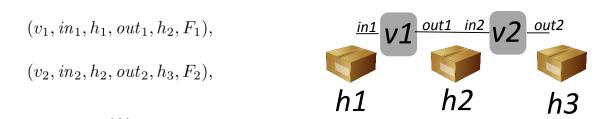
$$\delta_v^F: I_v^{in} \times L^* \to 2^{(I^{out} \times L^*)}$$

defines, for all incoming interfaces and packet headers, outgoing interfaces together with modified headers.

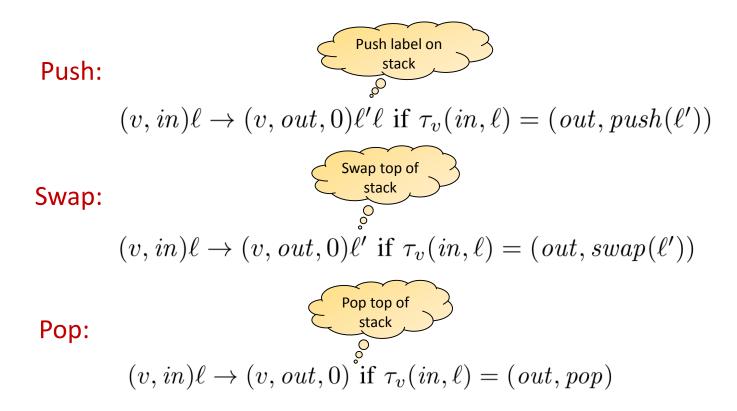
## Routing in Network



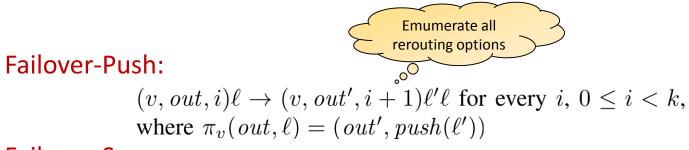
• Example: routing (in)finite sequence of tuples



#### Example Rules: *Regular Forwarding* on Top-Most Label



#### Example Failover Rules



Failover-Swap:

$$(v, out, i)\ell \rightarrow (v, out', i+1)\ell'$$
 for every  $i, 0 \le i < k$ ,  
where  $\pi_v(out, \ell) = (out', swap(\ell'))$ ,

Failover-Pop:

$$(v, out, i)\ell \rightarrow (v, out', i+1)$$
 for every  $i, 0 \leq i < k$ ,  
where  $\pi_v(out, \ell) = (out', pop)$ .

#### **Example rewriting sequence:**

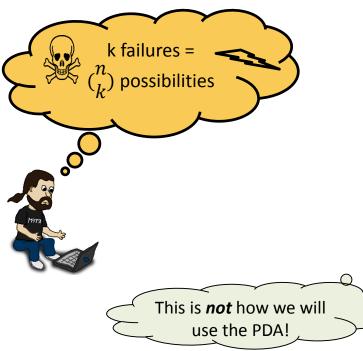
$$(v_1, in_1)h_1 \bot \rightarrow (v_1, out, 0)h \bot \rightarrow (v_1, out', 1)h' \bot \rightarrow (v_1, out'', 2)h'' \bot \rightarrow \ldots \rightarrow (v_1, out_1, i)h_2 \bot$$

#### A Complex and Big Formal Language! Why Polynomial Time?!



- Arbitrary number k of failures: How can I avoid checking all <sup>n</sup><sub>k</sub> many options?!
- Even if we reduce to push-down automaton: simple operations such as emptiness testing or intersection on Push-Down Automata (PDA) is computationally non-trivial and sometimes even undecidable!

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The words in our language are sequences of pushdown stack symbols, not the labels of transitions.

Time for Automata Theory! (*Or:* Swiss to the Rescue!)

- Classic result by **Büchi** 1964: the set of all reachable configurations of a pushdown automaton a is regular set
- Hence, we can operate only on Nondeterministic Finite Automata (NFAs) when reasoning about the pushdown automata



Julius Richard Büchi 1924-1984 Swiss logician

- The resulting regular operations are all polynomial time
  - Important result of model checking

#### **Tool and Query Language**

Part 1: Parses query and constructs Push-Down System (PDS)

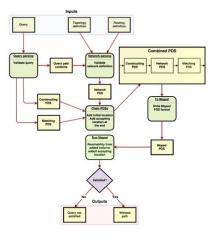
• In Python 3

Part 2: Reachability analysis of constructed PDS

• Using *Moped* tool

# failures header path header header

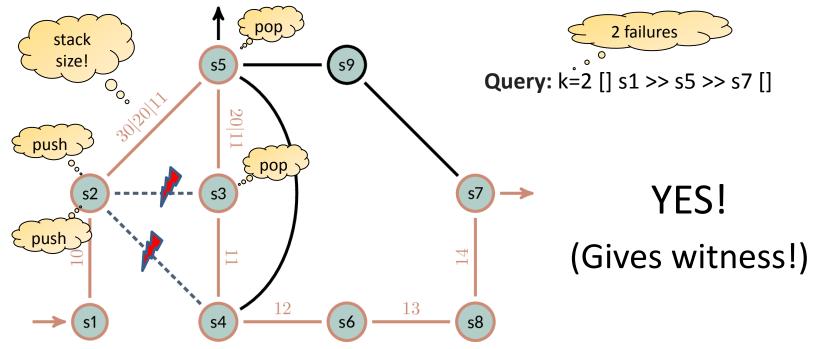
#### Regular query language



#### query processing flow

#### **Example: Traversal Testing With 2 Failures**

Traversal test with k=2: Can traffic starting with [] go through s5, under up to k=2 failures?



### Case Study: NORDUnet (thanks, Henrik <sup>(C)</sup>)

show route forwarding-table family mpls extensive
| display .ml
show isis adjacency detail | display .ml

- Small but complex network
  - 24 MPLS routers
- Between 20-90min, ca. ~GB memory



#### **Related Work**

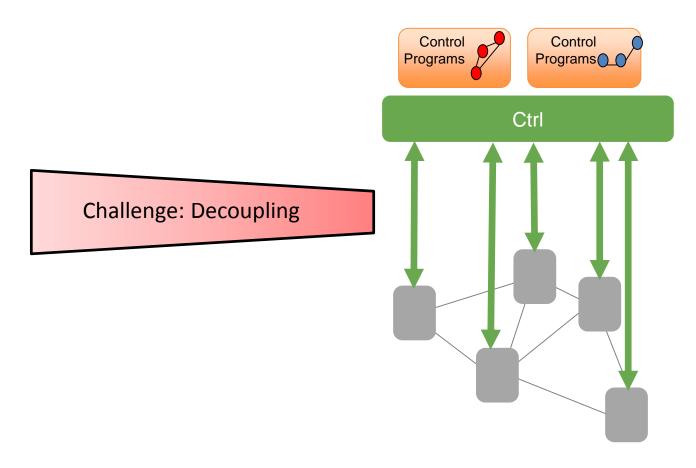
	P-Rex	NetKAT	HSA	VeriFlow	Anteater
Protocol Support	SR/MPLS	OF	Agn.	OF	Agn.
Approach	Autom.	Alg.	Geom.	Tries	SAT
Complexity	Polynom.	PSPACE	Polynom.	NP	NP
Static	$\checkmark$	$\checkmark$	$\checkmark$	χ	$\checkmark$
Reachability	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Loop Queries	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
What-if	$\checkmark$	N/A	$\checkmark$	N/A	χ
Unlim. Header	$\checkmark$	N/A	χ	χ	N/A
Performance	$\checkmark$	√ [1]	$\checkmark$	$\checkmark$	$\checkmark$
Waypointing	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	χ
Language	Py., C	OCaml	Py., C	Py.	C++, Ruby

## Roadmap

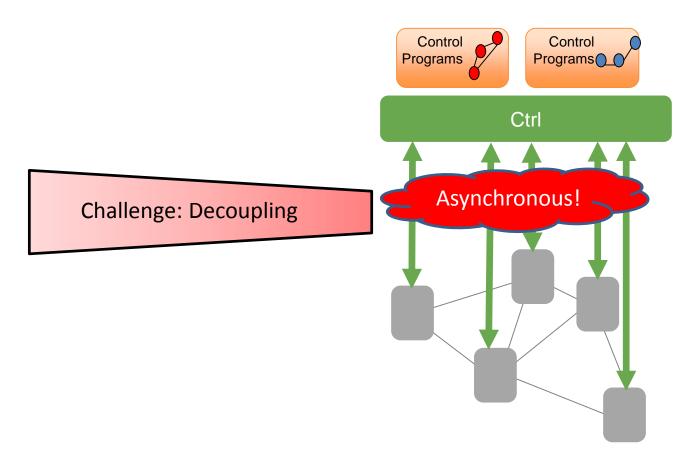
- 1st Use Case for Automation: What-if Analysis
- 2nd Use Case for Automation: Consistent Rerouting



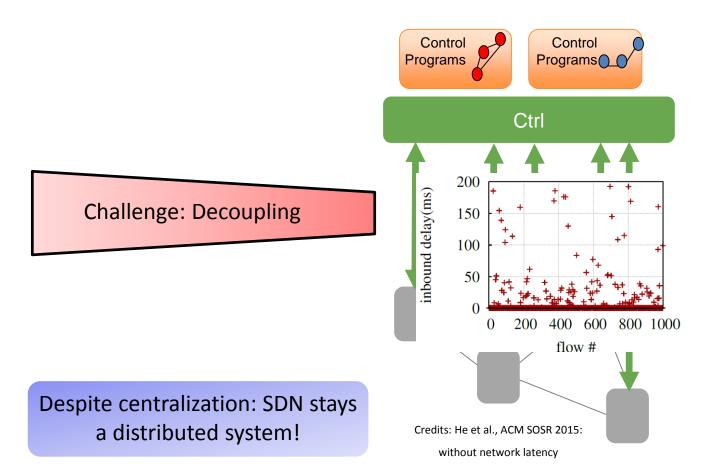
#### **Consistent Rerouting**



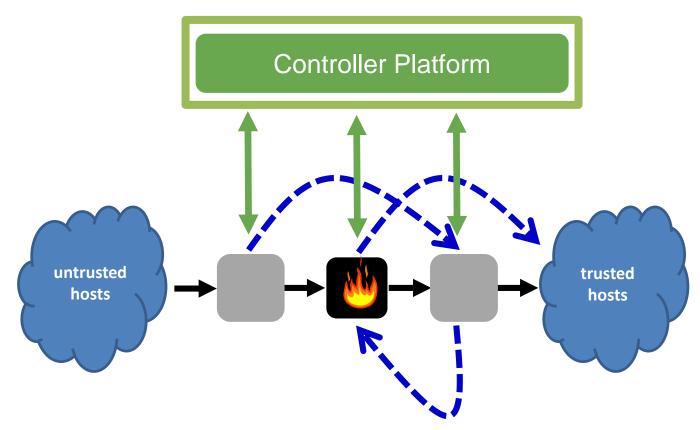
#### **Consistent Rerouting**



#### **Consistent Rerouting**

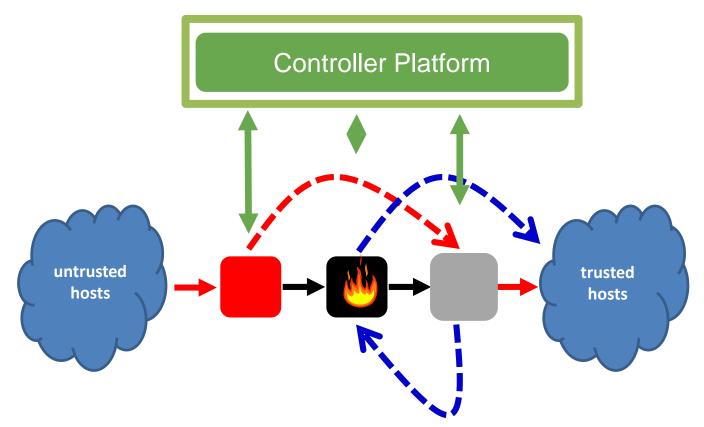


#### What could go wrong...?



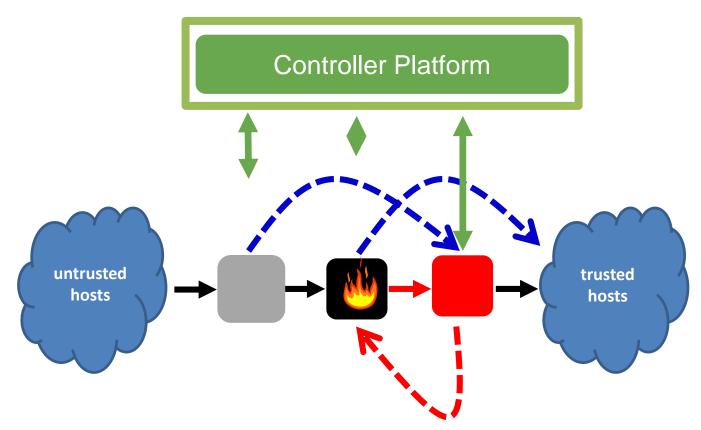
Invariant: Traffic from untrusted hosts to trusted hosts via firewall!

#### Problem 1: Bypassed Waypoint



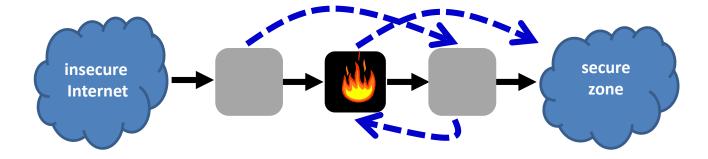
Invariant: Traffic from untrusted hosts to trusted hosts via firewall!

#### **Problem 2: Transient Loop**

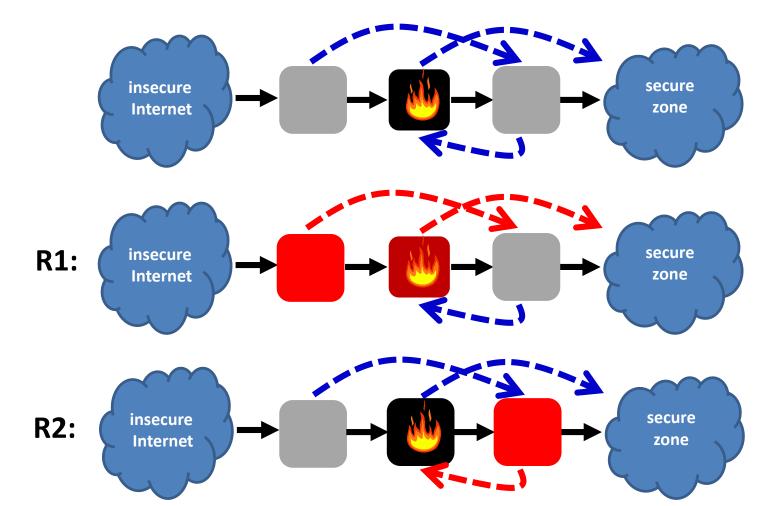


Invariant: Traffic from untrusted hosts to trusted hosts via firewall!

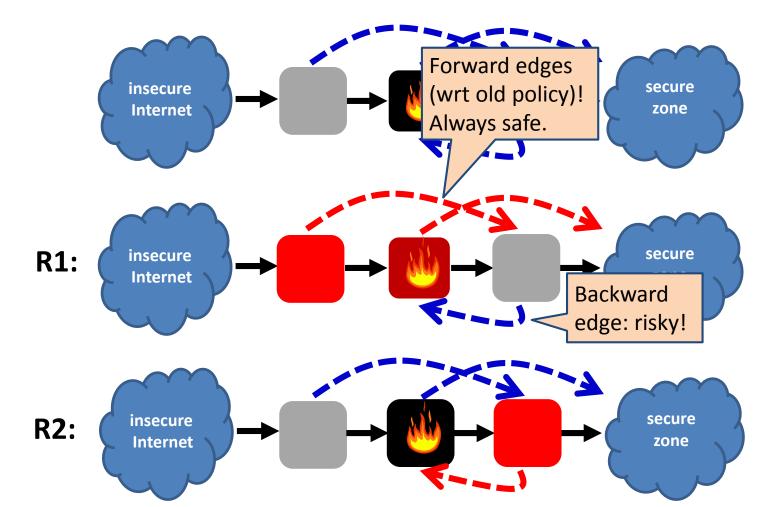
Loop-Free Update Schedule



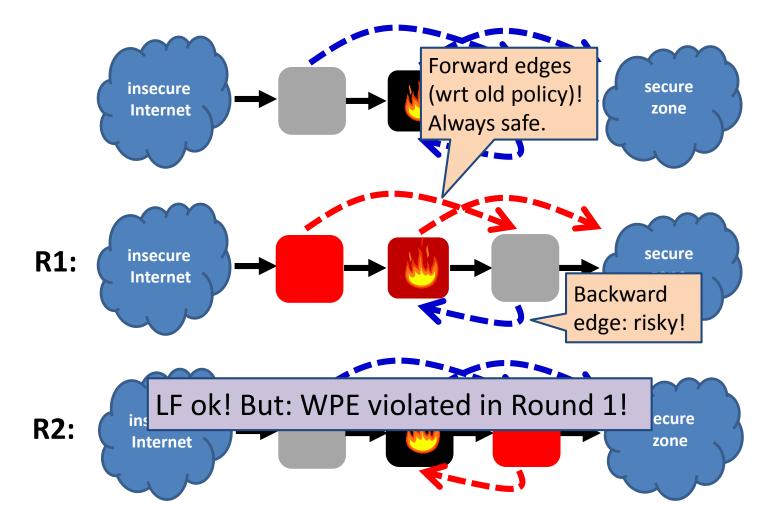
Loop-Free Update Schedule



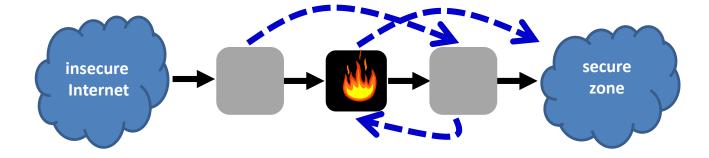
Loop-Free Update Schedule



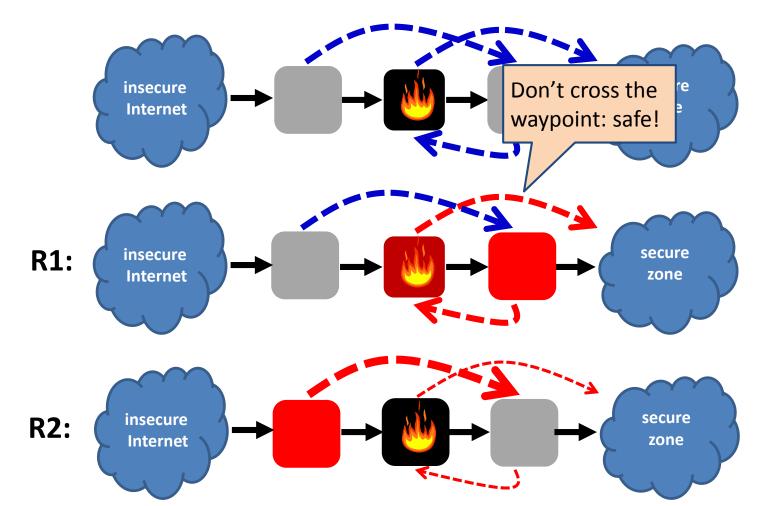
Loop-Free Update Schedule



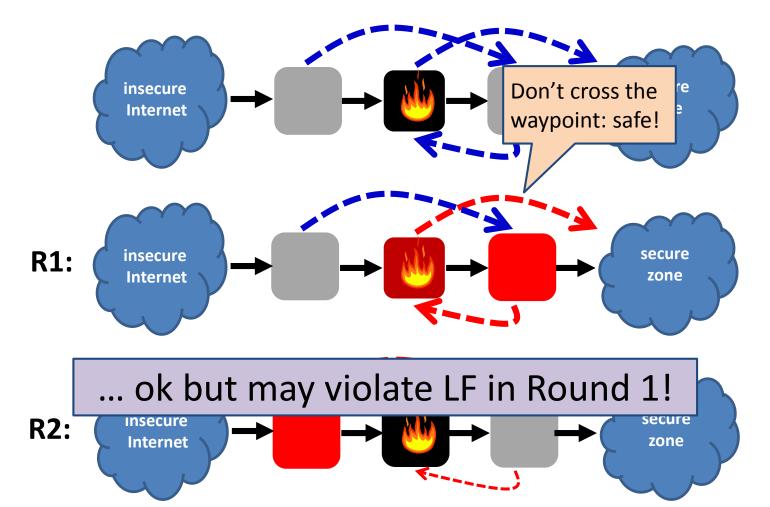
Waypoint Respecting Schedule



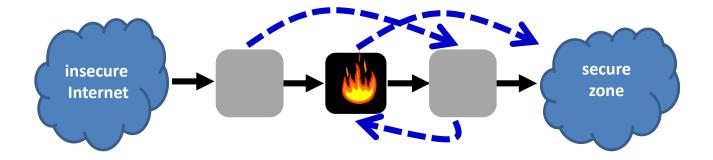
Waypoint Respecting Schedule



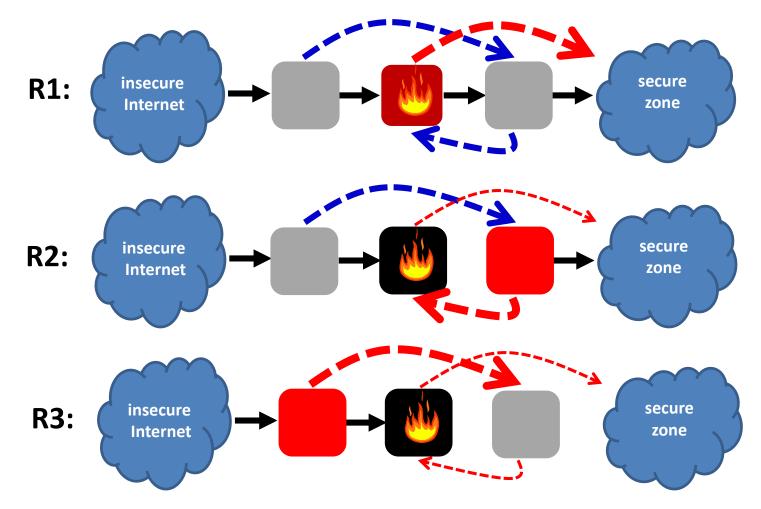
Waypoint Respecting Schedule



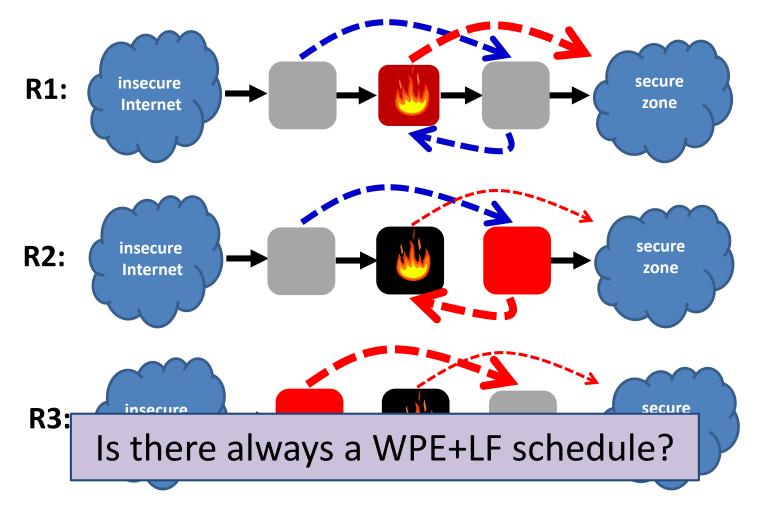
#### Can we have both LF and WPE?



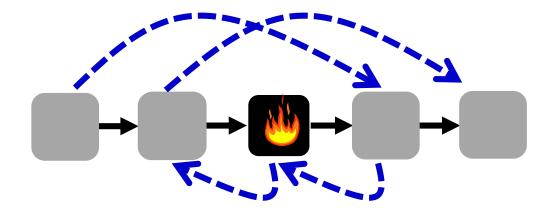
Yes: but it takes 3 rounds!



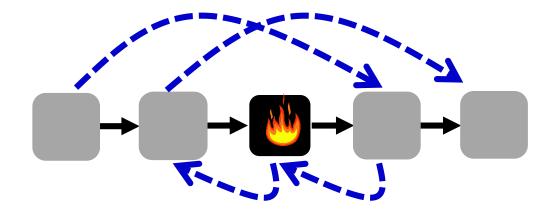
Yes: but it takes 3 rounds!



#### What about this one?



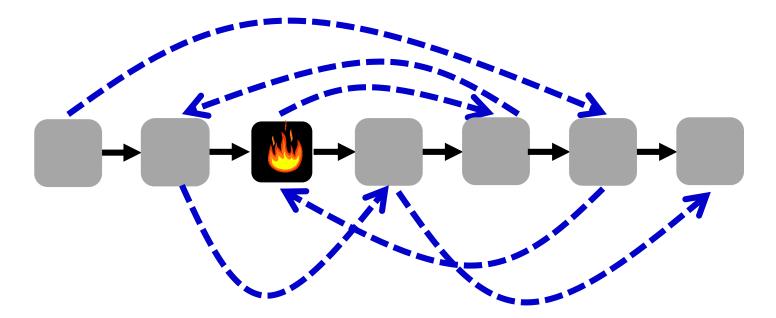
#### LF and WPE may conflict!



# Cannot update any forward edge in R1: WP Cannot update any backward edge in R1: LF

No schedule exists!

What about this one?



- LF & WPE may conflict
  - Deciding: NP-complete
- LF: Always possible in *n* rounds (*relaxed* version: O(log *n*) rounds)
  - Fastest schedule: NP-complete
  - Approximations? Unknown
- LF: Maximizing simultaneous updates: NP-complete
  - Can be approximated well (Feedback Arc Set / Max. Acyc. Subg.)
  - But: Can turn O(1) instances into  $\Omega(n)$  schedules

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None for **congestion** (bandwith/capacities)

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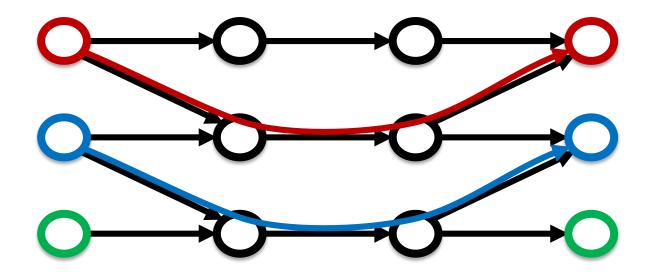
Some synthesis results already exist for LF & WPE (McClurg et al. PLDI'15, Zhou et al. NSDI'15)

What about congestion?

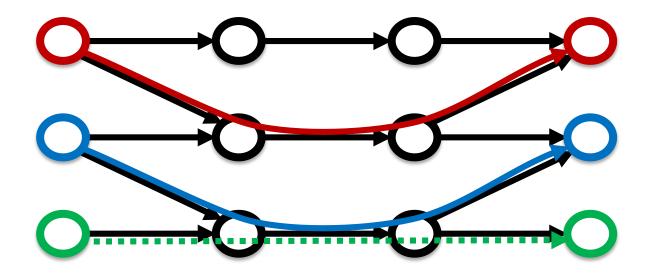
None for **congestion** 

(bandwith/capacities)

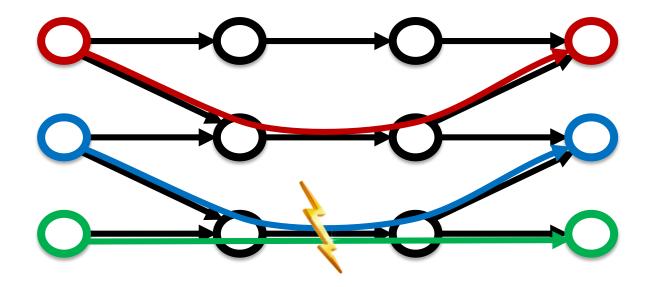
### A Small Sample Network



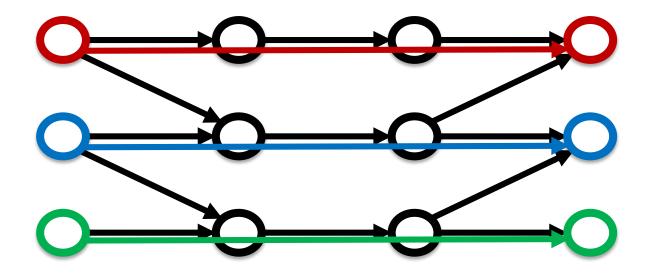
#### Green wants to send as well



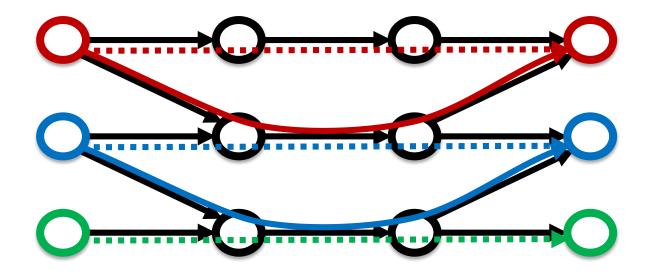
### Congestion!



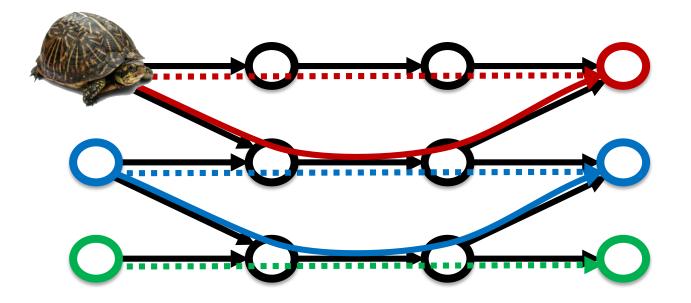
### This would work



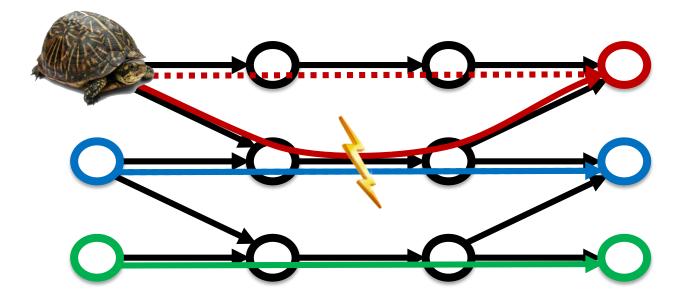
### So lets go back



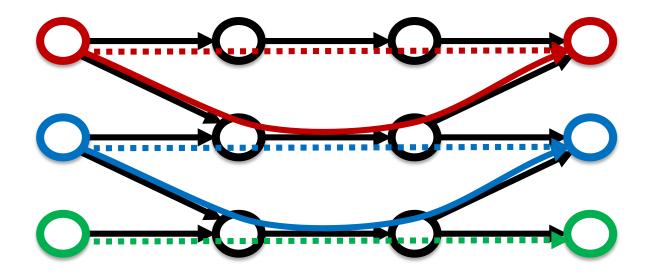
#### But Red is a bit Slow..



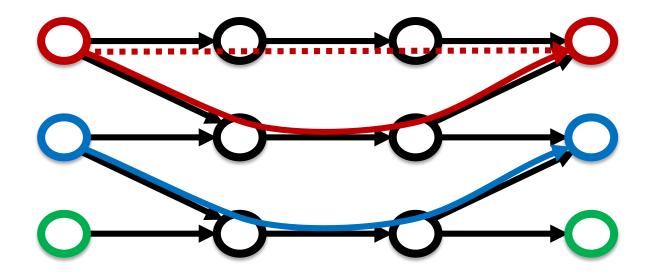
### **Congestion Again!**



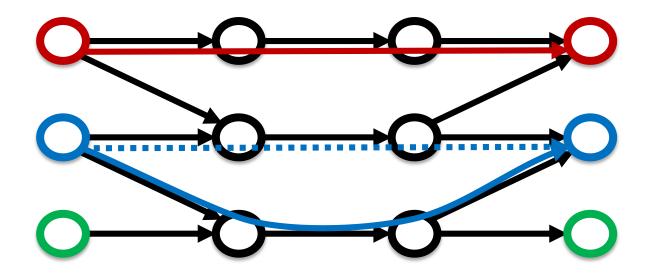
### So lets go Back ...



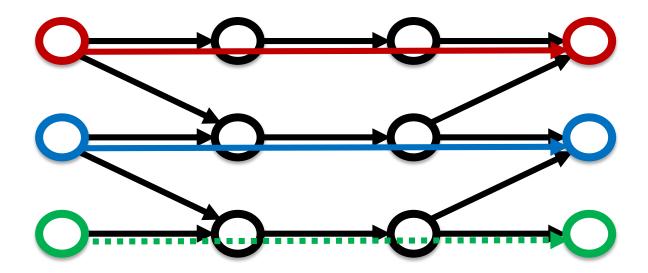
#### First, Red switches



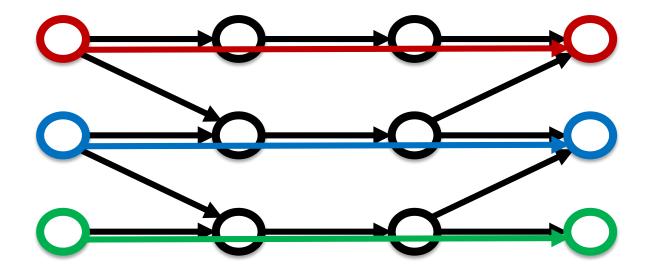
### Then, Blue ...



### And then, Green ...



#### Done



## **Consistent Migration of Flows**

Already for 2 flows

Open question:

Max schedule length *polynomial*?

#### Introduced in *SWAN* (Hong et al., SIGCOMM 2013) Idea: Flows can be on the **old** or **new** route

For all edges:  $\sum_{\forall F} \max(\mathbf{old}, \mathbf{new}) \leq capacity$ 

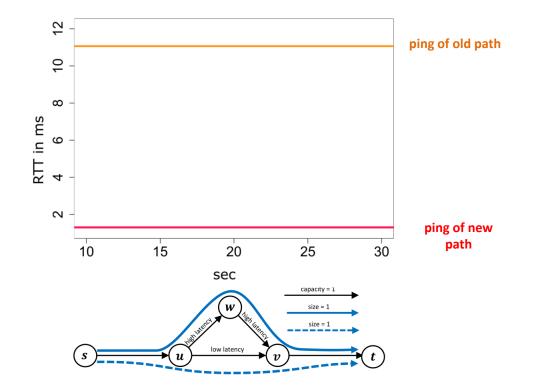
For unsplittable flows:

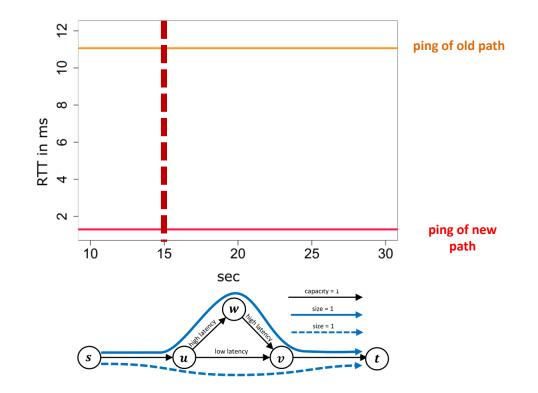
- Feasibility hardness: NP-hard
- Feasibility algorithm: EXPTIME

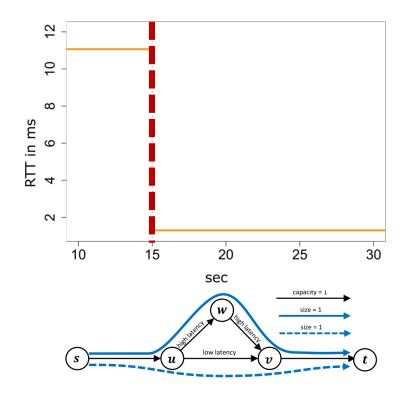
For splittable flows:

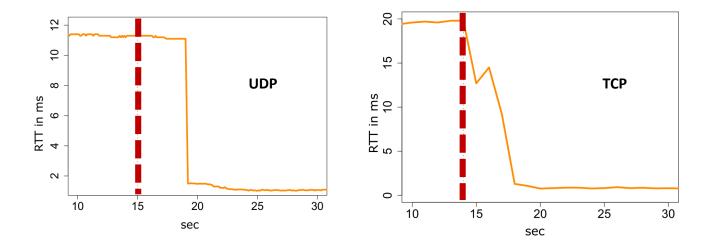
- Feasibility algorithm: P
  - Even for super-polynomial schedules
  - For shared destination flows\*: schedule length in O(#flows \* #edges)

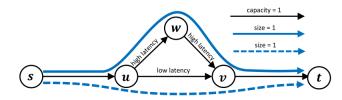
Consistent Migration = Lossless Migration? What are the effects of *time*?

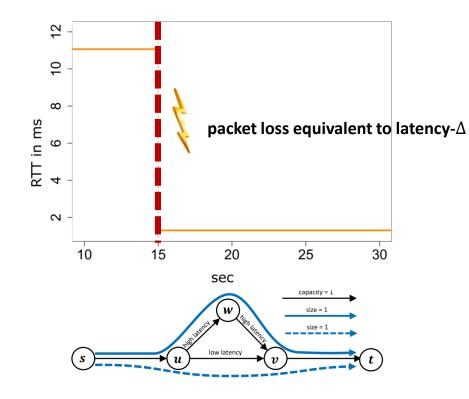






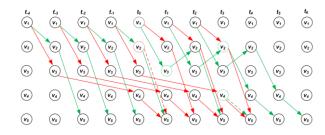






## Consistent Flow Migration & Time

- Fixed latencies & single splittable flow: **NP-hard** 
  - *Relax:* account for all imaginable latencies: Situation *without* Time
- What if we could enforce *synchronous*\* updates?
  - Introduced recently in Open Flow by Mizrahi et al. (TimedSDN project)
  - Still NP-hard in general
  - But e.g. for 1 flow and unit latencies:
    - Feasibility in P
      - Using Time-extended graphs



#### **Open Question:**

How to synthesize Congestion and/or Time constraints?

#### Conclusion

- Networks are **critical infrastructures** of our digital society
- But complex to manage and operate today
- Opportunities for automation and formal methods?
- Challenges, e.g.,
  - Can self-\* networks notice their limits? Or fall back to "safe/oblivious mode"?
  - Can we learn from self-driving cars?

#### Automated What-if Analysis

#### P-Rex: Fast Verification of MPLS Networks with Multiple Link Failures

Jesper Stenbjerg Jensen, Troels Beck Krogh, Jonas Sand Madsen, Stefan Schmid, Jiri Srba, and Marc Tom Thorgersen. 14th International Conference on emerging Networking EXperiments and Technologies (**CoNEXT**), Heraklion, Greece, December 2018. Polynomial-Time What-If Analysis for Prefix-Manipulating MPLS Networks

Stefan Schmid and Jiri Srba.

37th IEEE Conference on Computer Communications (INFOCOM), Honolulu, Hawaii, USA, April 2018.

#### Automated Network Updates

Survey of Consistent Software-Defined Network Updates Klaus-Tycho Foerster, Stefan Schmid, and Stefano Vissicchio. IEEE Communications Surveys and Tutorials (COMST), to appear.