Towards Self-Driving Networks: Automated What-if Analysis and Synthesis for Dependable Networks

Stefan Schmid (University of Vienna)



Communication Networks

- Critical infrastructure of digital society
 - Popularity of datacentric applications: health, business, entertainment, social networking, AI/ML, etc.
 - Evident during ongoing pandemic: online learning, online conferences, etc.
- Traffic is currently growing explosively
 - Especially in, to and, from datacenters

Increasingly stringent dependability requirements!



Facebook datacenter

Requirements vs Reality

Entire countries disconnected...

Data Centre • Networks

Google routing blunder sent Japan's Internet dark on Friday

Another big BGP blunder

By Richard Chirgwin 27 Aug 2017 at 22:35	
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40 🖵 SHARE 🔻

Last Friday, someone in Google fat-thumbed a border gateway protocol (BGP) advertisement and sent Japanese Internet traffic into a black hole.

The trouble began when The Chocolate Factory "leaked" a big route table to Verizon, the result of which was traffic from Japanese giants like NTT and KDDI was sent to Google on the expectation it would be treated as transit.

... 1000s passengers stranded...

British Airways' latest Total Inability To Support Upwardness of Planes* caused by Amadeus system outage

Stuck on the ground awaiting a load sheet? Here's why

By Gareth Corfield 19 Jul 2018 at 11:16



BA flights around the world were arounded as a result of the Amadous outpar

... even 911 services affected!

Officials: Human error to blame in Minn. 911 outage

According to a press release, CenturyLink told department of public safety that human error by an employee of a third party vendor was to blame for the outage

Aug 16, 2018

Duluth News Tribune

SAINT PAUL, Minn. — The Minnesota Department of Public Safety Emergency Communication Networks division was told by its 911 provider that an Aug. 1 outage was caused by human error.

Outages simply due to human error! (No attacks...)

109 SHARE V

Even Tech-Savvy Companies Struggle



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*.





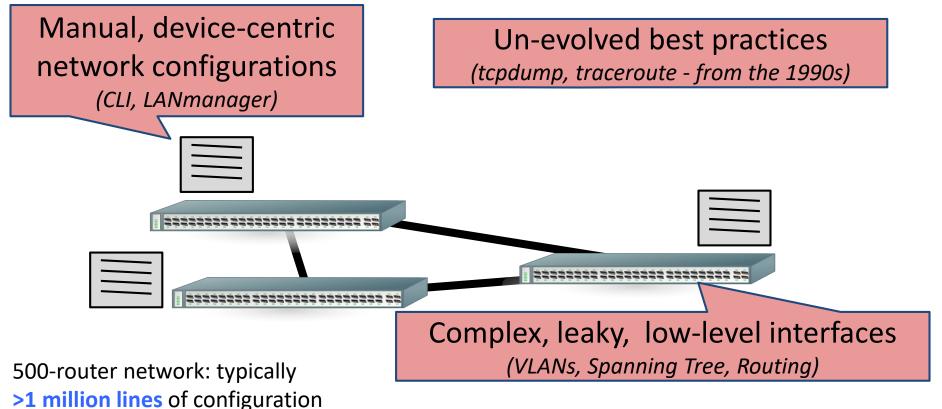
Service outage was due to a series of internal network events that corrupted router data tables.

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

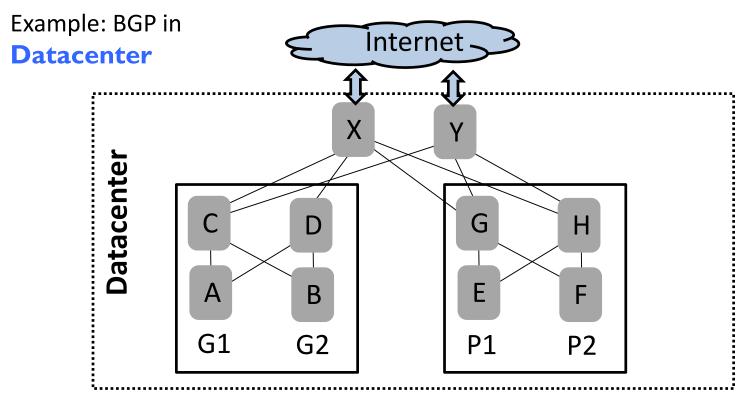


Also here: due to human errors.

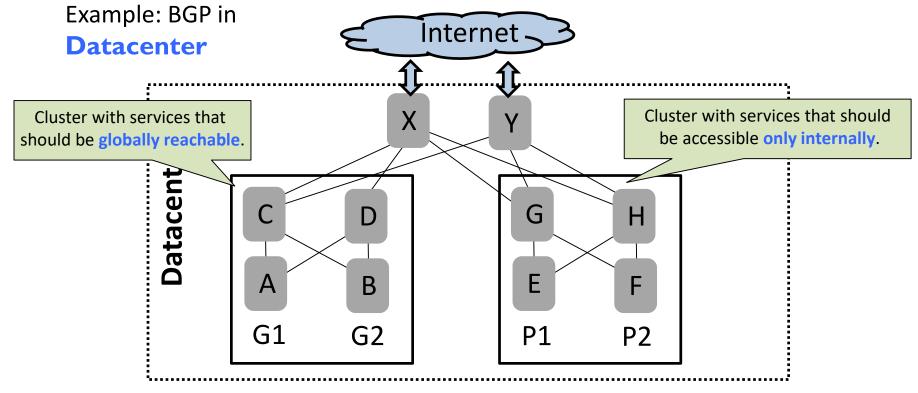
No Surprise: Networks Are Complex

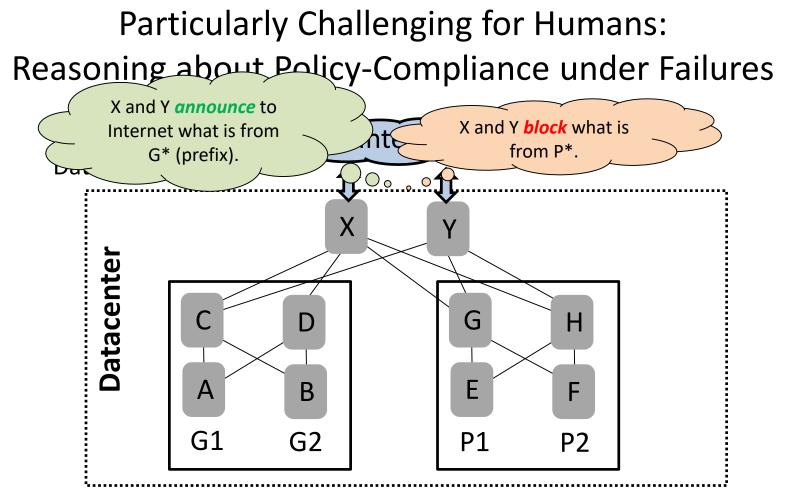


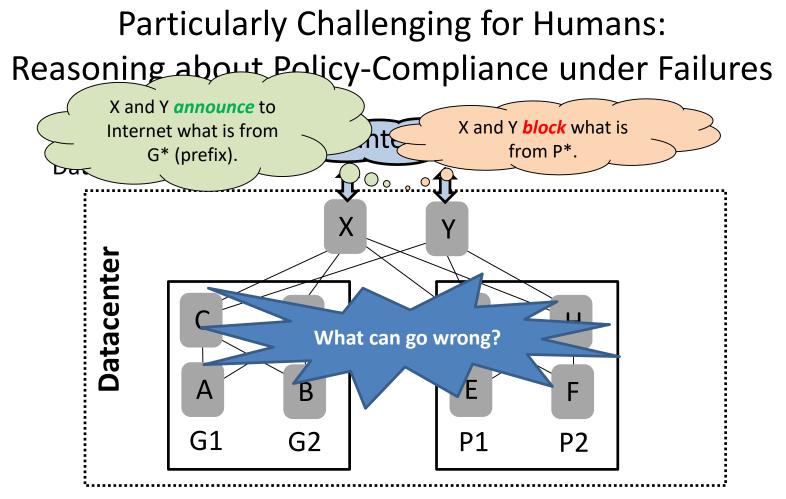
Particularly Challenging for Humans: Reasoning about Policy-Compliance under Failures



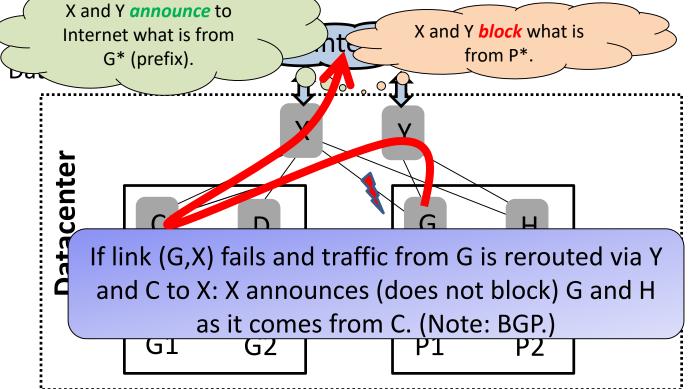
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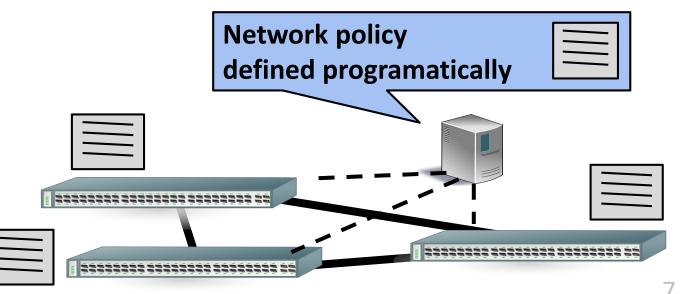
We're Falling Behind the Curve: Increasing Complexity, Software from the 90s

- Anecdote Wall Street bank: outage of a datacenter
 - Lost revenue measured in 1 mio\$/min
- Quickly, an emergency team was assembled with experts in compute, storage and networking:
 - The compute team: *reams of logs*, written experiments to reproduce and *isolate the error*
 - The storage team: *system logs* were affected, *workaround programs*.
 - "All the networking team had were two tools invented over twenty years ago to merely test end-to-end connectivity. Neither tool could reveal problems with the switches, the congestion experienced."



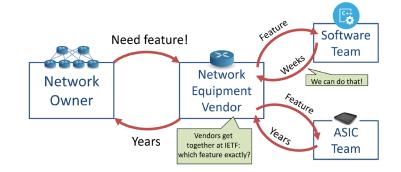
There is Hope: Software-Defined Networks

- Automation and abstraction
- Directly program routing behavior (i.e., push forwarding tables)
- Open interfaces: "the Linux of networking"



Remark (for the Network Experts...)

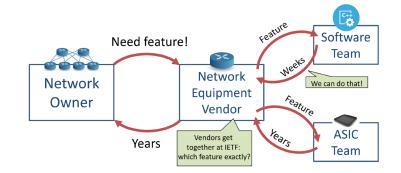
- Networks currently become *programmable* in the control plane and the data plane
 - Control plane: network-wide algorithms (e.g., routing)
 - Data plane: router/switch level algorithms (e.g., forwarding, filtering)
- Motivation in both cases: software usually trumps hardware in terms of *innovation speed*
- Software can be *fast*:
 - Our Tofino switch: operates at 6.5 Tb/s
 - Order of magnitude faster than our faculty's Internet connection: can switch entire *Netflix catalogue* in 20sec
 - While *running a 4000 line program* on any packet...
 - .. and not being more costly or consume more power



Example: VxLAN

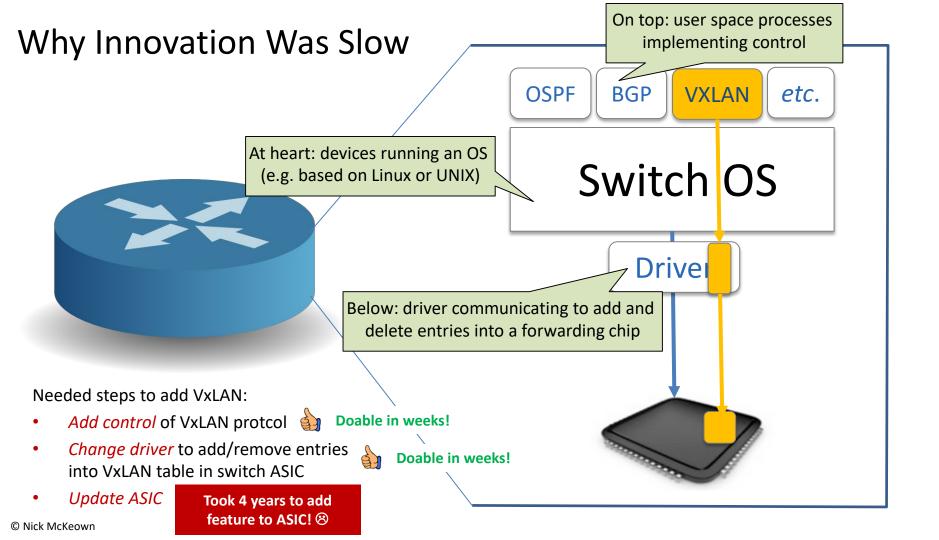
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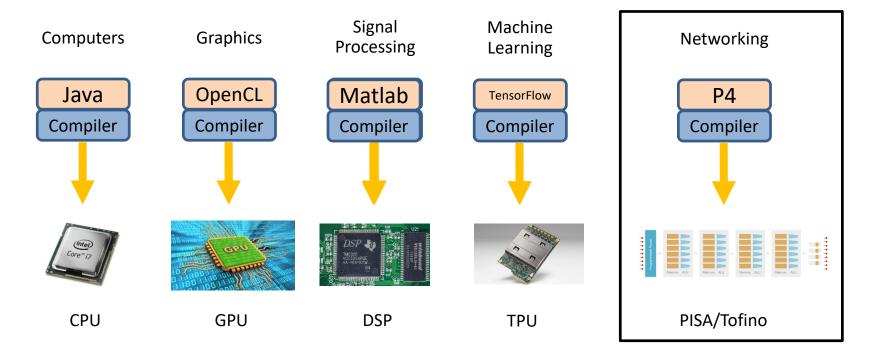
Example: VxLAN

... and: the automation trend is not limited to SDN.



Now Networking is Catching Up

Similar to other IT trends: can now *write high-level program* and compile it to *domain specific processor*.



Roadmap

- A Static Problem: Policy Compliance
 Under Failures
 - AalWiNes: Fast Automated What-if Analysis for Networks (INFOCOM 2018, ACM CoNEXT 2018, ACM CONEXT 2019, TACAS 2021)

- A Dynamic Problem: Scheduling Consistent Network Updates
 - Latte and quantitative extensions (PODC 2015, ICALP 2018, PERFORMANCE 2021)

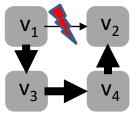


Background: Rerouting Under Failures

Two approaches to react to link failures

- In the control plane: just re-invoke (shortest path) routing protocol
 - Always re-establishes connectivity but slow
- In the data plane: pre-defined local failover rules
 - Orders of magnitude *faster*

Our focus!

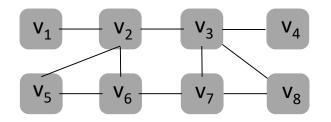


Restoration in control plane takes time -> packet drops!



How (MPLS) Networks Work

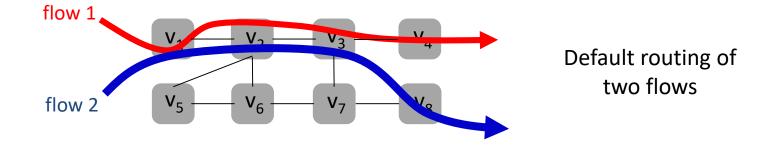
• Forwarding based on top label of label stack



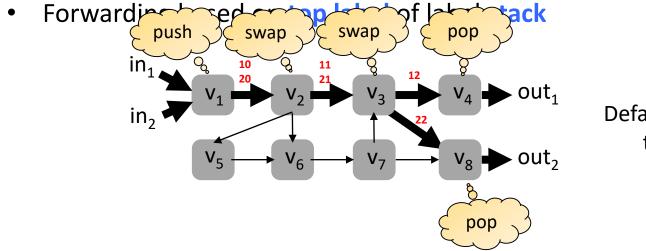
Default routing of two flows

How (MPLS) Networks Work

• Forwarding based on top label of label stack



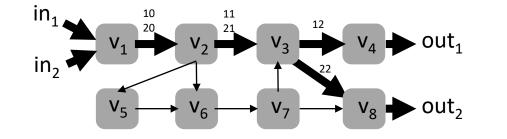
How (MPLS) Networks Work



Default routing of two flows

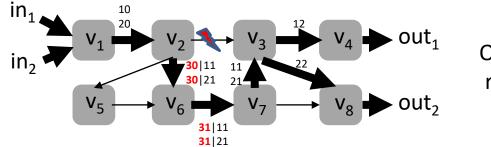
Fast Reroute Around 1 Failure

• Forwarding based on top label of label stack (in packet header)



Default routing of two flows

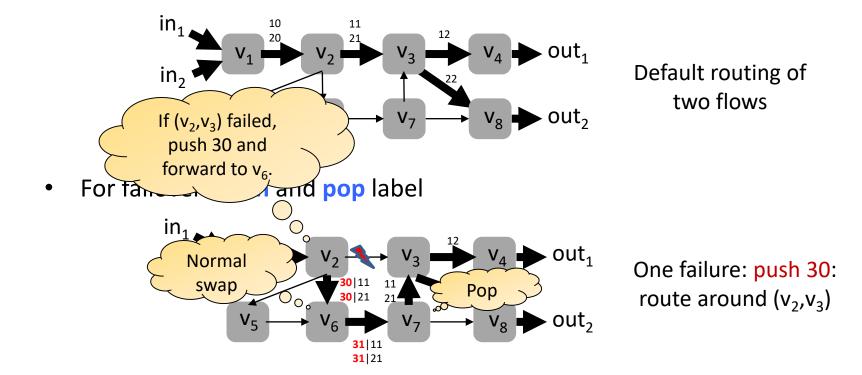
• For failover: push and pop label



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

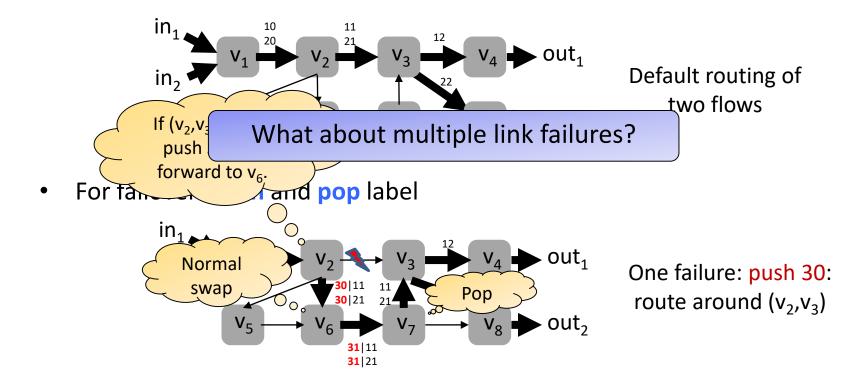
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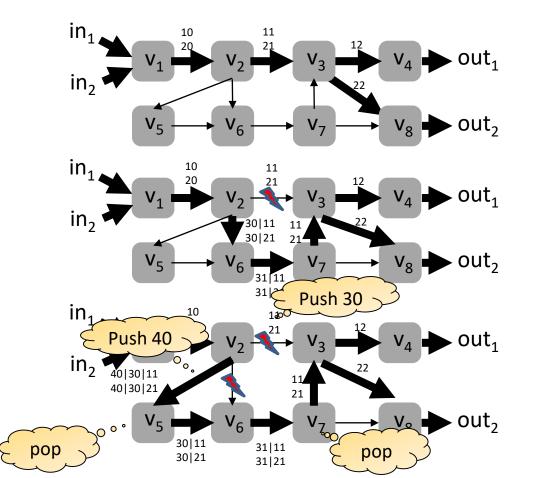


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2 Failures: Push *Recursively*

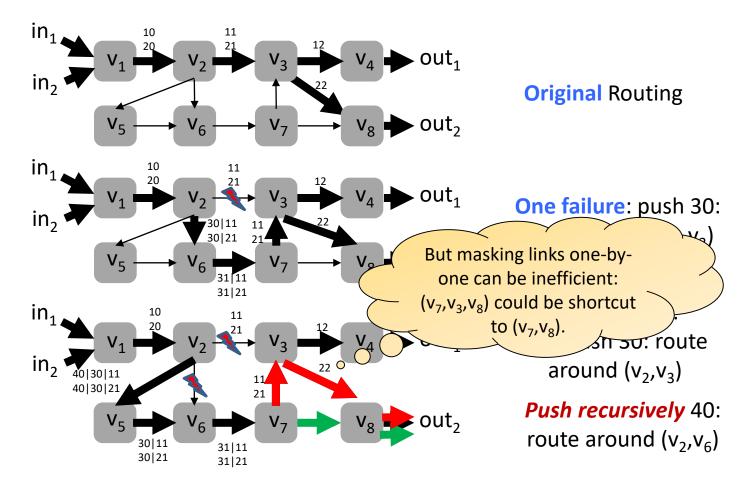


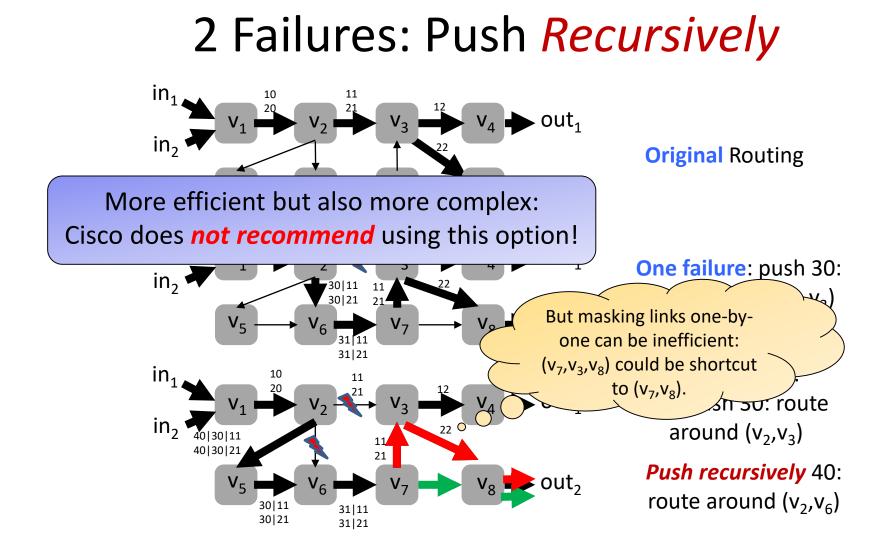
Original Routing

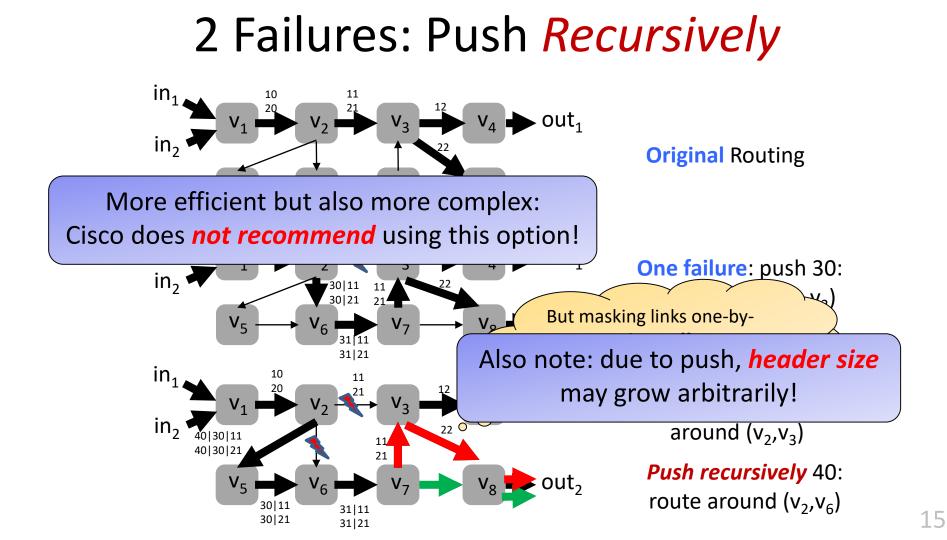
One failure: push 30: route around (v_2, v_3)

Two failures: first push 30: route around (v₂,v₃) *Push recursively* 40: route around (v₂,v₆)

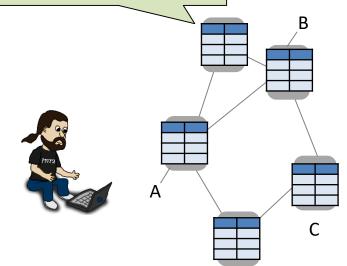
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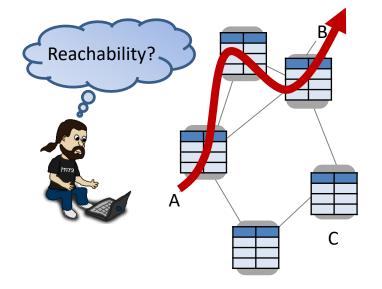






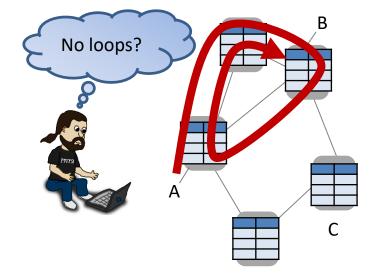
Routers and switches store list of forwarding rules, and conditional failover rules.





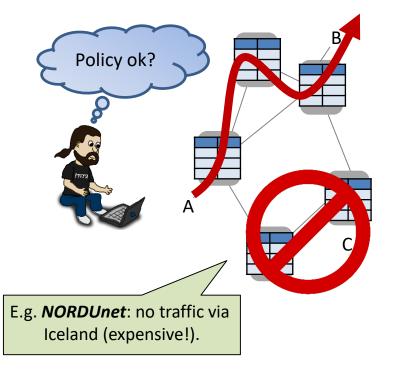
Sysadmin responsible for:

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



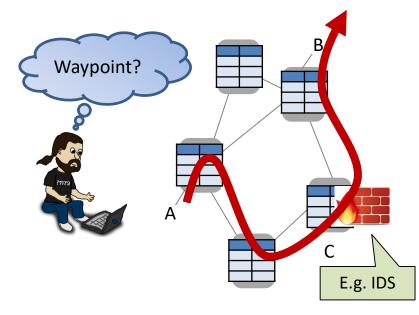
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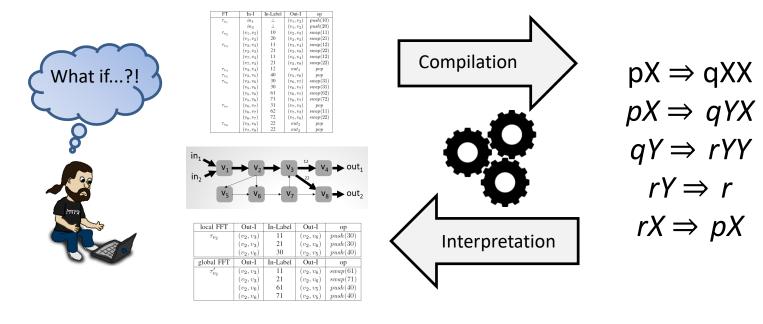
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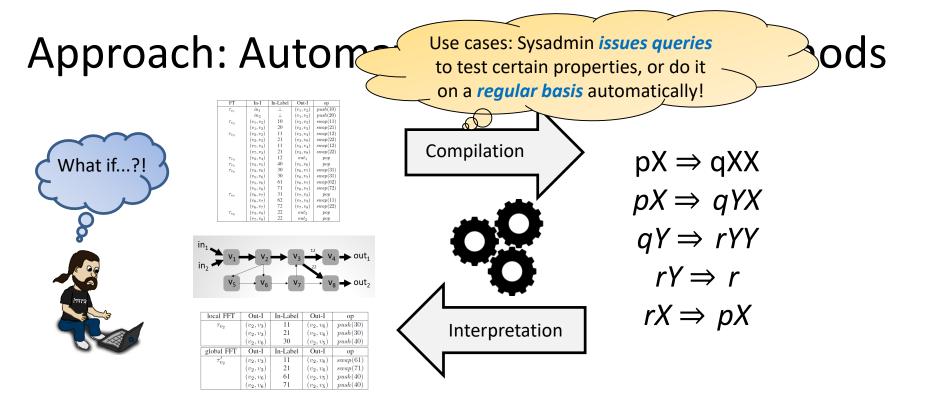
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Generalization: service chaining!

Approach: Automation and Formal Methods

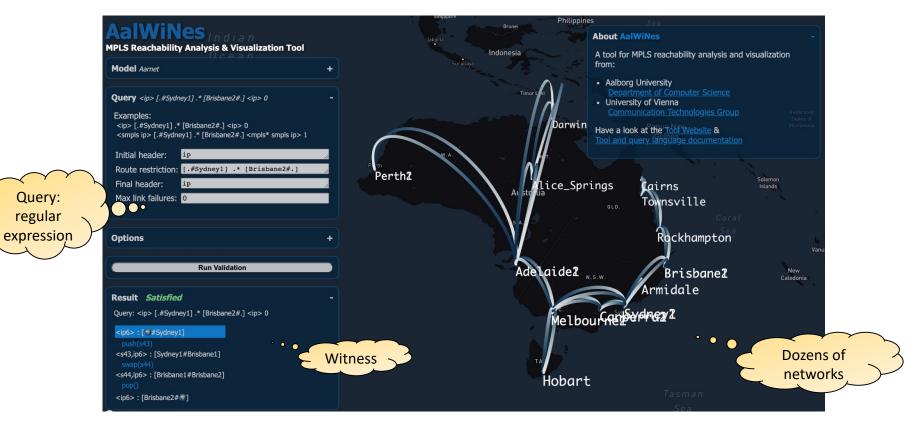


Router configurations (Cisco, Juniper, etc.) Pushdown Automaton and Prefix Rewriting Systems



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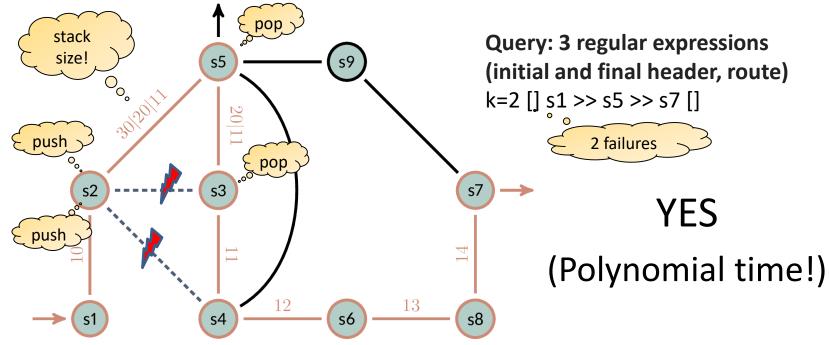
AalWiNes



Online demo: <u>https://demo.aalwines.cs.aau.dk/</u> Source code: <u>https://github.com/DEIS-Tools/AalWiNes</u>

Example

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



Why AalWiNes is Fast (Polytime): Automata Theory

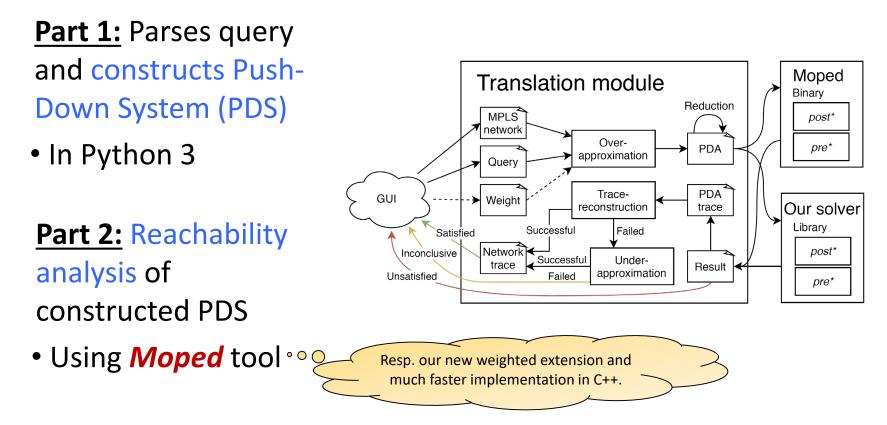
- For fast verification, we can use the result by Büchi: the set of all reachable configurations of a pushdown automaton a is regular set
- We hence simply use Nondeterministic Finite Automata (NFAs) when reasoning about the pushdown automata



Julius Richard Büchi 1924-1984 Swiss logician

• The resulting **regular operations** are all **polynomial time**

AalWiNes



Network Model

• Network: a 7-tuple $N = (V, E, I_v^{in}, I_v^{out}, \lambda_v, L, \delta_v^F)$ Nodes

Network Model

• 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 $(v, \lambda_v(out)) \in E$

Network Model

• Network: a 7-tuple

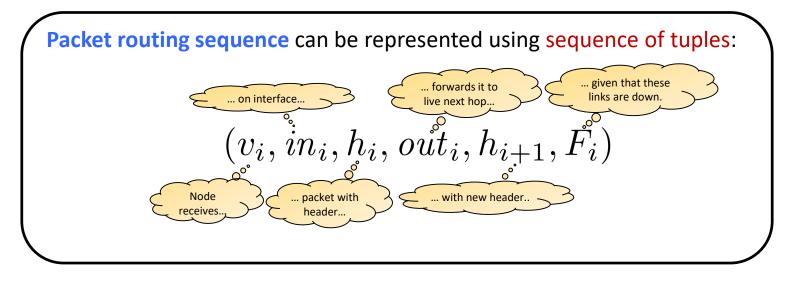
$$N = (V, E, I_v^{in}, I_v^{out}, \lambda_v, L, \delta_v^F)$$

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

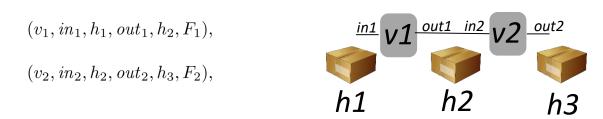
$$\delta_v^F: I_v^{in} \times L^* \to 2^{(I^{out} \times L^*)}$$

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

Routing

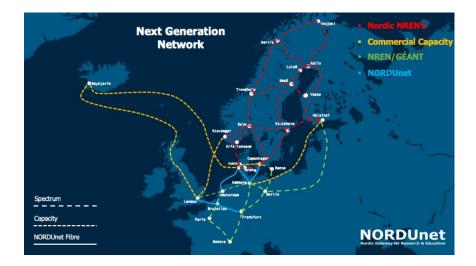


• Example: routing (in)finite sequence of tuples



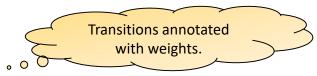
Case Study: NORDUnet

- Regional service provider
- 24 MPLS routers geographically distributed across several countries
- Running Juniper operating system
- More than 30,000 labels
- Ca. 1 million forwarding rules in our model
- For most queries of operators: answer *within seconds*



Generalizes to Quantitative Properties

- AalWiNes can also be used to test quantitative properties
- If query is satisfied, find trace that minimizes:
 - Hops
 - Latency (based on a latency value per link)
 - Tunnels



- Approach: weighted pushdown automata
 - Fast *poly-time algorithms* exist also for weighted pushdown automata (area of dataflow analysis)
 - Indeed, experiments show: acceptable overhead of weighted (quantitative) analysis

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More Adaptable Networks

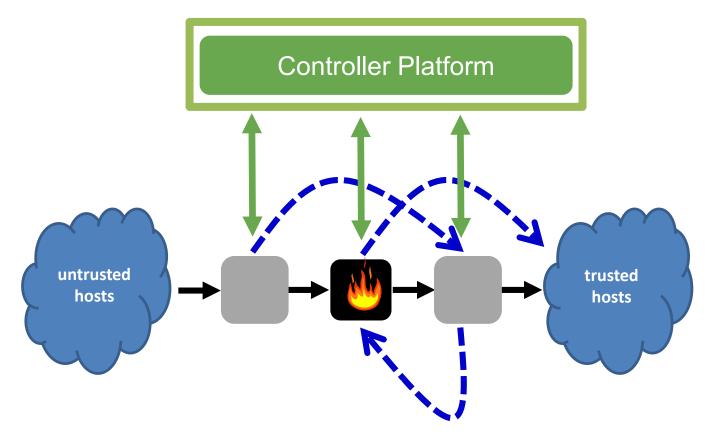
- Software-defined networking also enables networks to be more adaptable
- Attractive for:

...

- Fine-grained *traffic engineering* (e.g., at Google)
- Accounting for changes in the demand (*spatio-temporal structure*)
- Security policy changes
- Service relocation
- Maintenance work
- Link/node failures

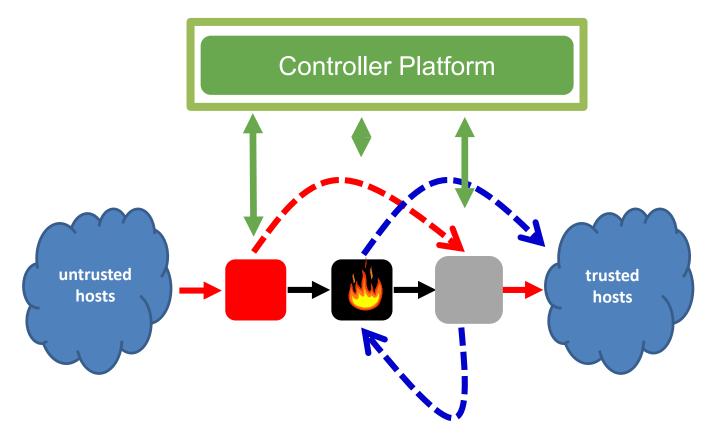
COMMUNICATIONS HOME CURRENT ISSUE NEWS BLOGS OPINION RESEARCH Home / Magazine Archive / March 2016 (Vol. 59, No. 3) / A Purpose-Built Global Network: Google's Move to SDN PRACTICE A Purpose-Built Global Network: Google's Move to SDN Communications of the ACM, March 2016, Vol. 59 No. 3, Pages 46-54 10.1145/2814326 SIGN IN for Full Access Comments User Name SHARE: 🖂 🥵 외 🔟 🕒 🚮 🛨 VIEW AS: 100 12 Password Create an ACM Web Account Everything about Google is at scale, of coursea market cap of SIGN legendary proportions, an unrivaled talent pool, enough intellectual property to keep armies of attorneys in Guccis for life, and, oh yeah, a private WAN bigger than you can possibly imagine that also happens to be growing substantially faster than ARTICLE CONTENTS: the Internet as a whole Article

Introduces a New Challenge: Consistent Update



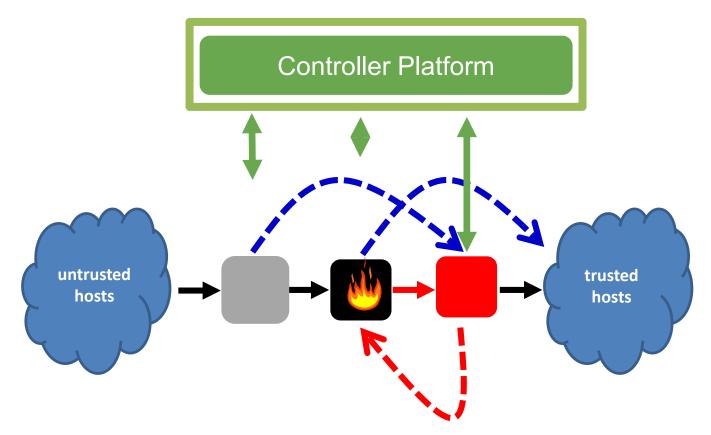
Invariant: Traffic from untrusted hosts to trusted hosts via firewall!

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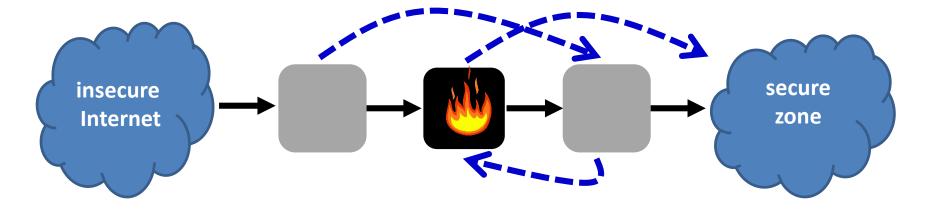
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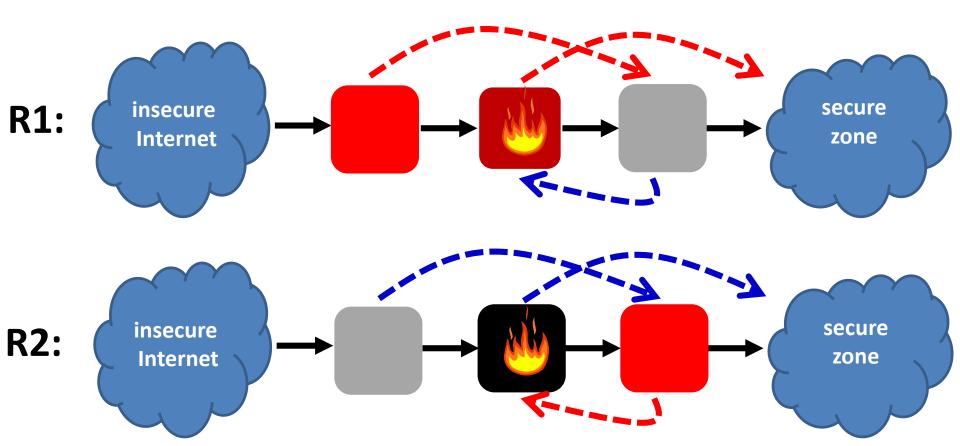


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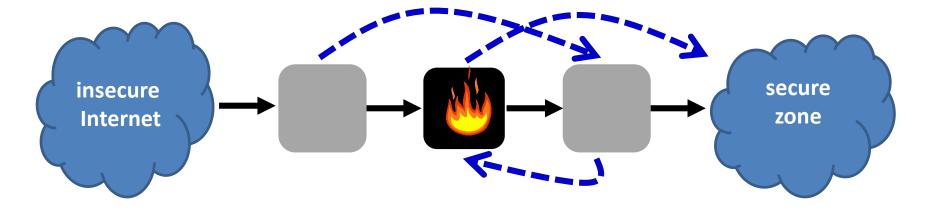
Question: How To Update Loop-Free?



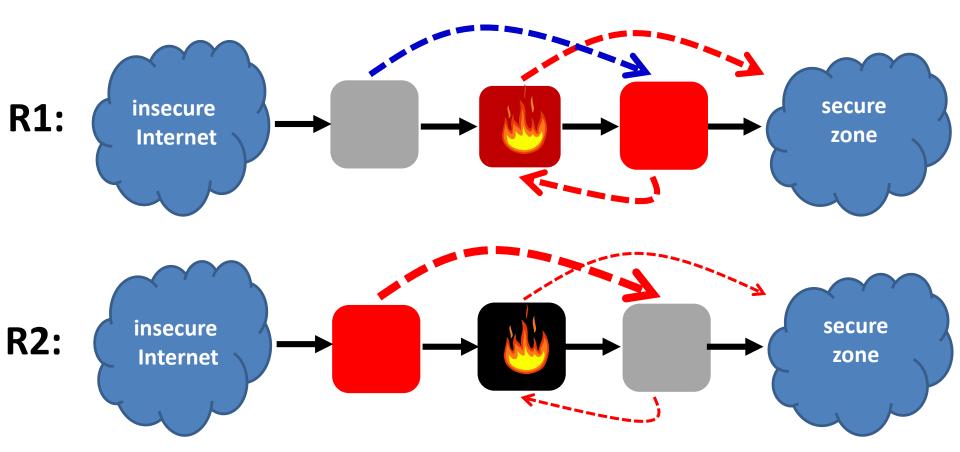
In 2 Rounds!



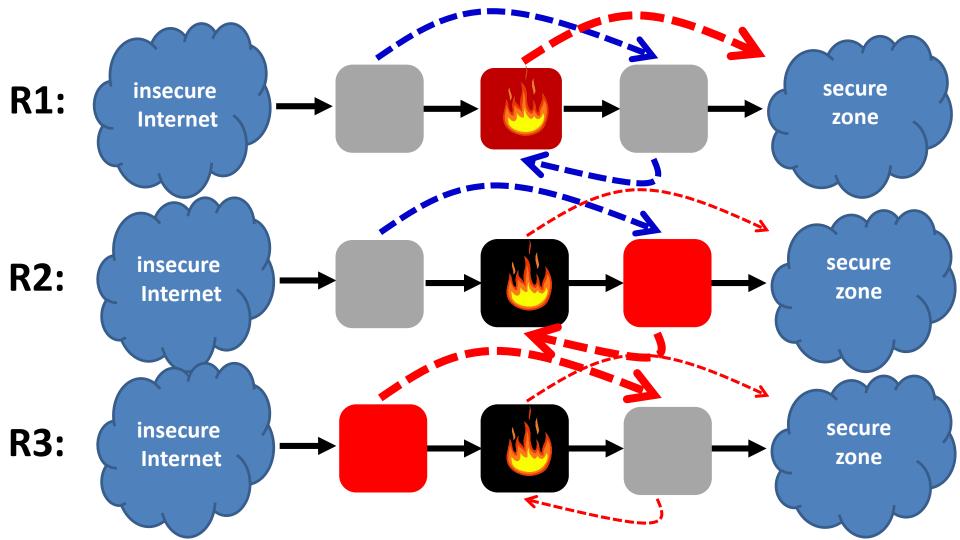
Background: How To Enforce Waypoint?

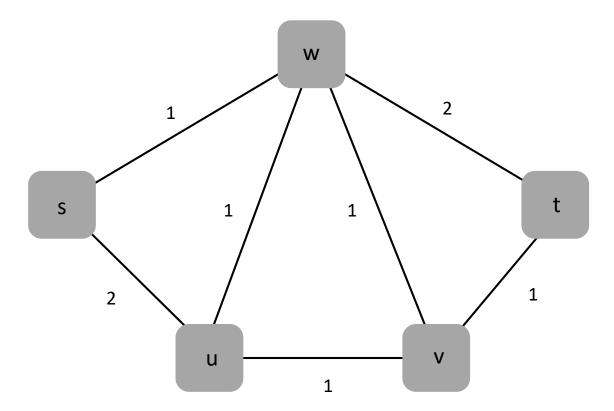


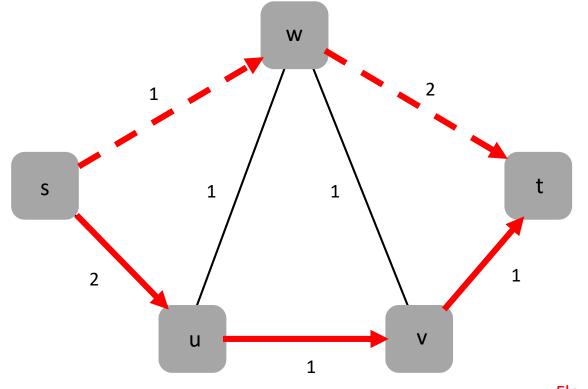
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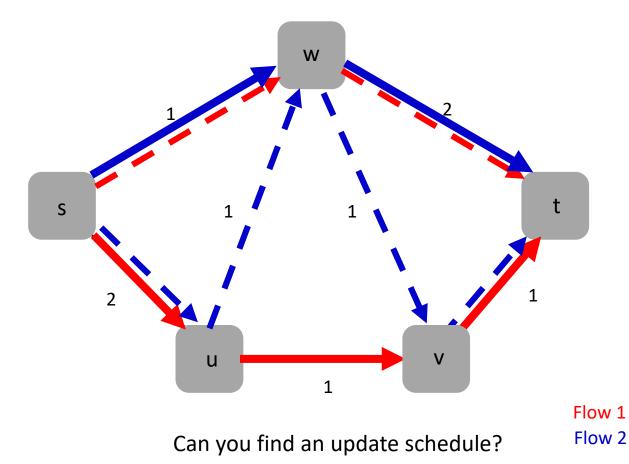
Loop-Free and Waypoint? 3 Rounds!

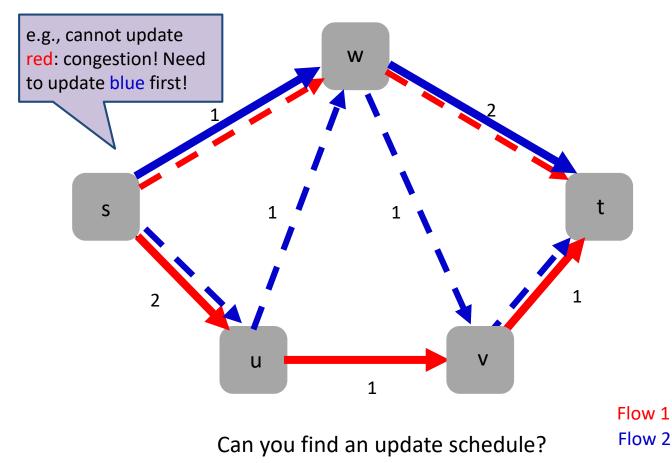


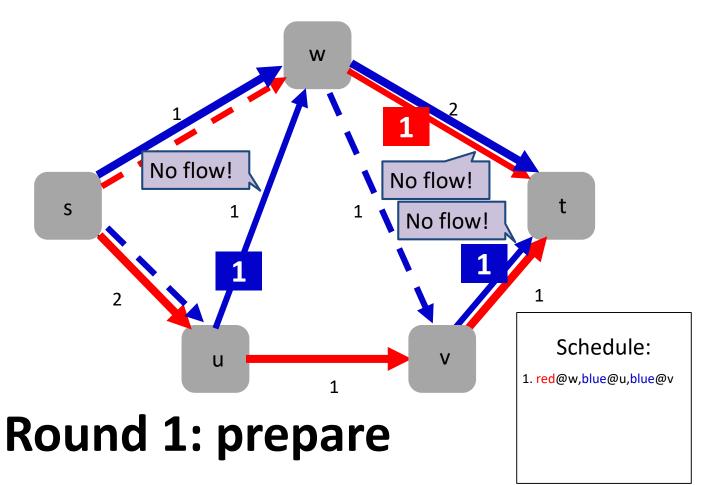


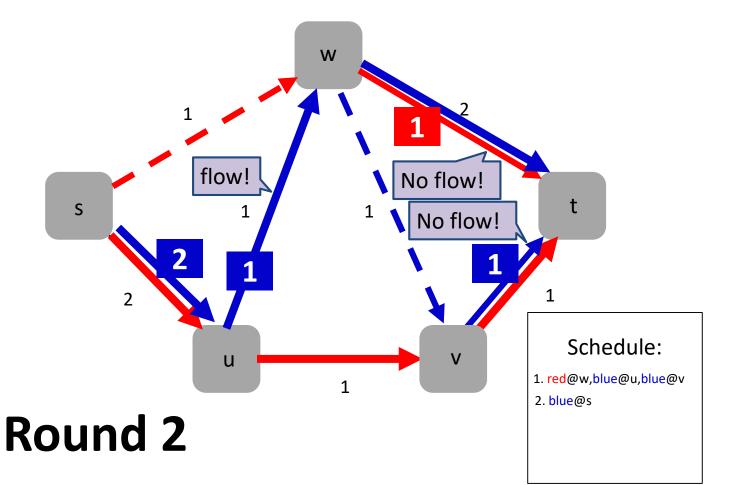


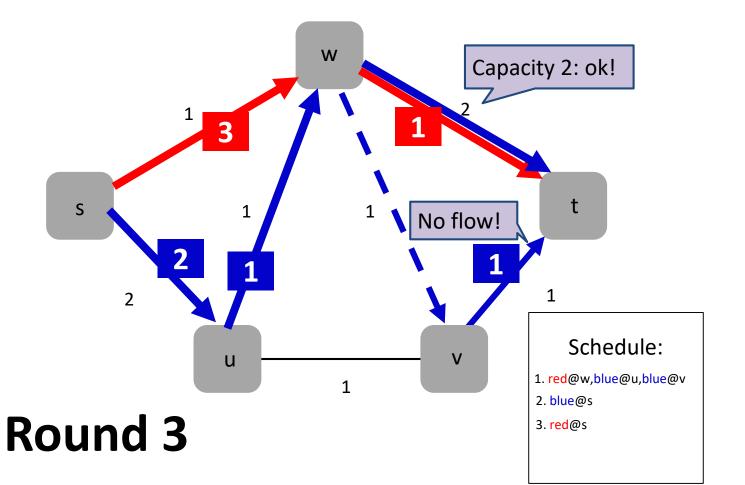


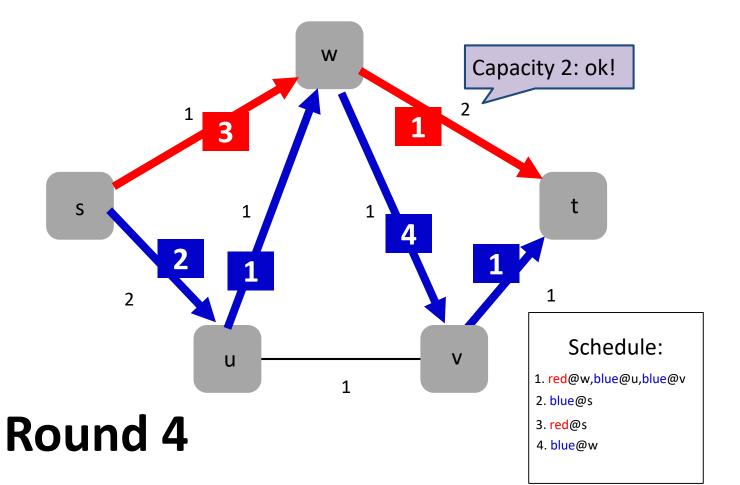


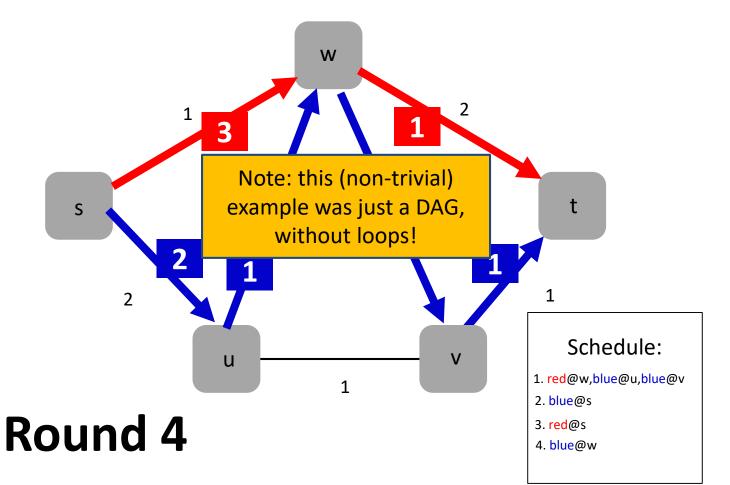






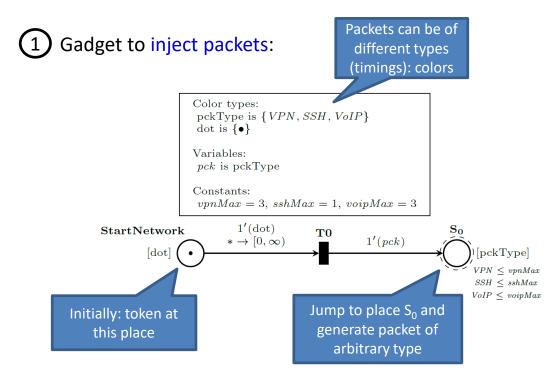


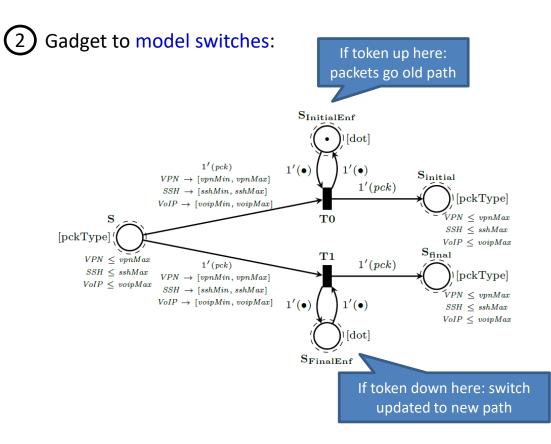


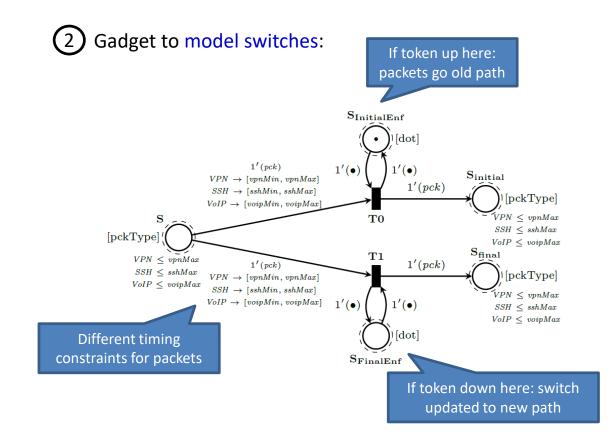


Latte: Shortest Consistent Update Schedules

- A first approach: fast updates by accounting for temporal properties
 - E.g., different packet types have different processing times
 - Requires a fixed *update order* (e.g., produced by NetSynth)
 - Limited to loop-freedom and waypoint enforcement, and scheduling latency (no congestion)
- Based on petri nets: powerful modeling language for distributed systems
 - Configurations: tokens located at places
- Our extension: Timed-Arc Colored Petri Nets (TACPN)
 - Tokens also contain: *color* information (e.g., different packet *types*) and time information (e.g., modeling *age*)
 - Places and input arcs have time constraints for each color

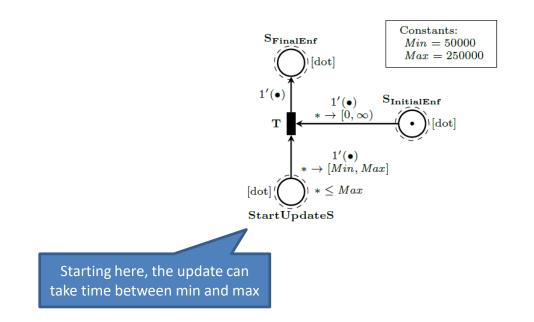




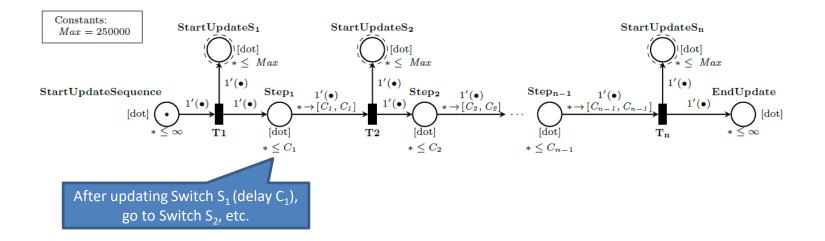


3 Gadget to model switch update:

How to change between initial and final switch configuration

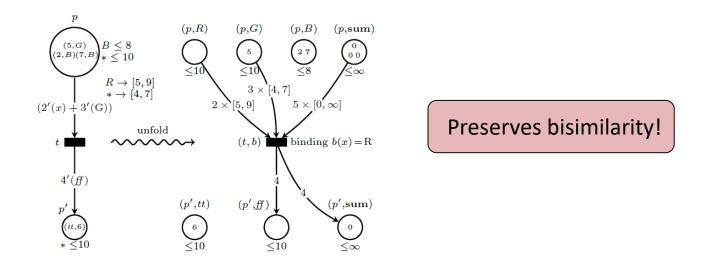


4 Connecting the pieces: initialization of update sequence for all *n* switches



Analysis

The constructed nets can be analyzed efficiently via their *unfolding* into existing *timed-arc Petri nets*.



Improved Latency of Update Schedules

Network	Route length	Verification time[s]	Default update time [s]	Optimized update time [s]	Improvement [%]
TLex	4	0.74	3.58	0.25	92.30%
HiberniaIreland	5	1.02	6.05	0.28	95.50%
Harnet	6	1.42	9.08	0.28	96.97%
UniC	7	1.49	12.65	0.28	97.83%
Oxford	8	2.02	16.78	0.28	98.36%
Xeex	10	5.86	26.68	0.28	98.97%
Sunet	11	10.23	32.45	0.28	99.15%
SwitchL3	12	18.88	38.78	0.28	99.29%
Psinet	14	89.67	53.01	0.28	99.48%
Uunet	15	211.86	61.05	0.28	99.55%
Renater2010	16	480.52	69.58	0.28	99.60%
Missouri	25	timeout	171.05	67.10	60.77%
Syringa	35	timeout	336.05	295.35	12.11%
VtlWavenet2011	35	timeout	336.06	295.35	12.11%

- Network topologies from the Topology Zoo
- Experiments run on a 64-bit Ubuntu 18.04 laptop

Improved Latency of Update Schedules

Compared to conservative delays as produced by NetSynth: over 90% improvement.

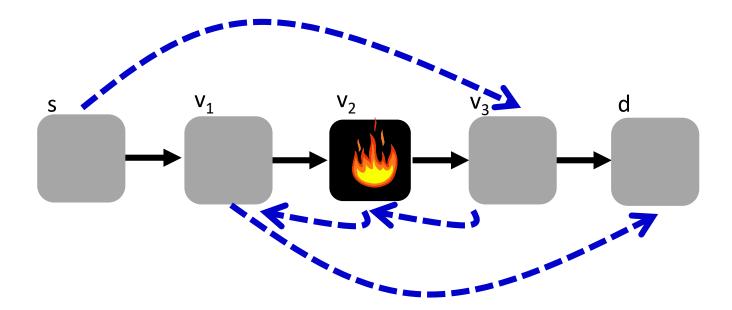
	Verification time[s]	Default update time [s]	Optimized update time [s]	Improvement [%]
Route length		· · · ·	<u> </u>	92.30%
5			0.28	95.50%
6	1.42		0.28	96.97%
7	1.49	12.65	0.28	97.83%
8	2.02	16.78	0.28	98.36%
10	5.86	26.68	0.28	98.97%
11	10.23	32.45	0.28	99.15%
1.5	18.88	38.78	0.28	99.29%
6, optimal up	date 89.67	53.01	0.28	99.48%
computed.	211.86	61.05	0.28	99.55%
	480.52	69.58	0.28	99.60%
25	timeout	171.05	67.10	60.77%
35	timeout	336.05	295.35	12.11%
35	timeout	226.06	295.35	12.11%
		Too many updates c	an be performed	
	7 8 10 11 6, optimal up computed. 25 35	5 1.02 6 1.42 7 1.49 8 2.02 10 5.86 11 10.23 18.88 89.67 211.86 480.52 25 timeout 35 timeout	$\begin{array}{cccccccccccccccccccccccccccccccccccc$	5 1.02 6.05 0.28 6 1.42 9.08 0.28 7 1.49 12.65 0.28 8 2.02 16.78 0.28 10 5.86 26.68 0.28 11 10.23 32.45 0.28 11 10.23 32.45 0.28 6, optimal update 89.67 53.01 0.28 211.86 61.05 0.28 0.28 25 timeout 171.05 67.10 35 timeout 336.05 295.35

concurrently: could be tackled with

static analysis (future work).

- Network topologies from the Top
- Experiments run on a 64-bit Ubuntu 18.04 laptop

Support Beyond "Simple Solutions"



- No loop-free solution with waypoint: cannot update any edge
- But could first update s to v_2 , then v_1, v_2, v_3 , and finally s again to v_3

Conclusion

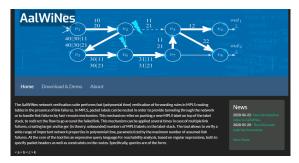
- Finally: networks are moving from manual to more automated operations
- Supported by emerging programmable networks and their solid theoretical foundations and languages
- Automata-theoretical approaches can be used to perform fast what-if analysis of the policy compliance (e.g., P-Rex, *AalWiNes*, etc.)
- More adaptive network operations further require tools for consistent network update scheduling (e.g., *Latte, QSynth*)

Efficient solutions to automatically verify and improve (synthesize) network configurations perhaps **#1 open research challenge** in networking.

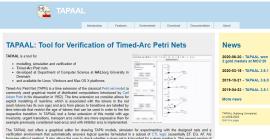
 E.g., control plane verification and hybrid, complex network functions (IDS), quantitative aspects, performance aspects and scalability...

Further Reading

The AalWines project https://aalwines.cs.aau.dk/



TAPAAL.net



The TGHAL but of dire a graphical data for devining TMP models, simulator for apprivatelying with the adjusted of the second sec

Netverify.fun

RESEARCH, NETWORK, VERIFICATION

Toward Polynomial-Time Verification of Networks with Infinite State Spaces: An Automata-Theoretic Approach





Jul 20. 2020 · 6 mins read Jiri Srba (View ul 20, 2020 · 6 mins read



ith the increasing scale of communication networks, failures (e.g. link failures) are becoming the norm rather than the exception. Given the critical role such networks play for our digital society it is important to

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Questions?