Zero-waste Designs for Terabit Network Systems

Liangcheng (LC) Yu





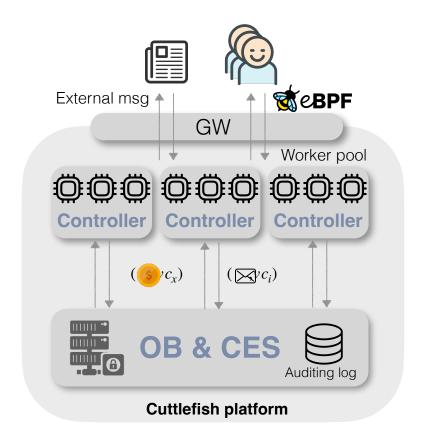
Cuttlefish: a fair, predictable cloud-hosted exchange platform

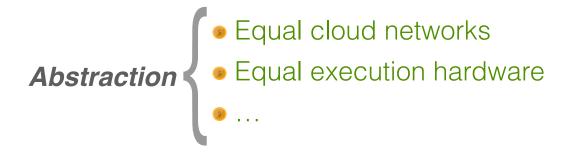
Liangcheng (LC) Yu, Prateesh Goyal, Ilias Marinos, and Vincent Liu *Advances in Financial Technologies (AFT) 2025*











- Abstracting out variances in cloud infrastructure
- An efficient implementation runnable on commercial cloud

Zero-waste Designs for Terabit Network Systems

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Ever-increasing user applications



















Applications

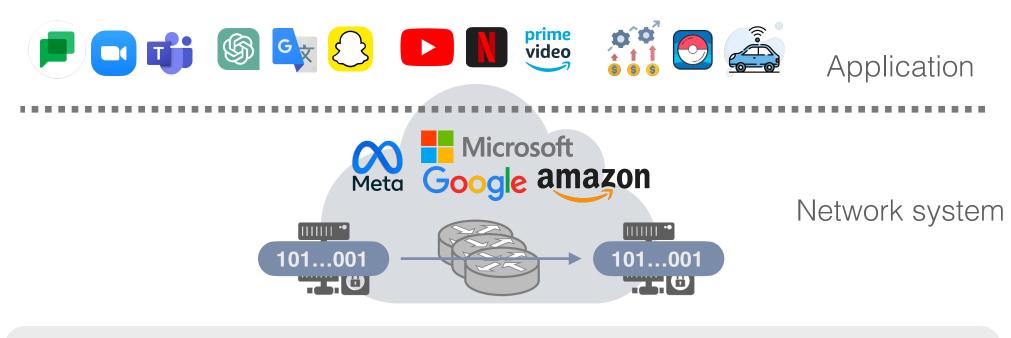


Application

Machine Learning

Video Streaming

Network systems, a packet forwarding engine



Networks serve to forward user data

Network systems, a packet forwarding engine





























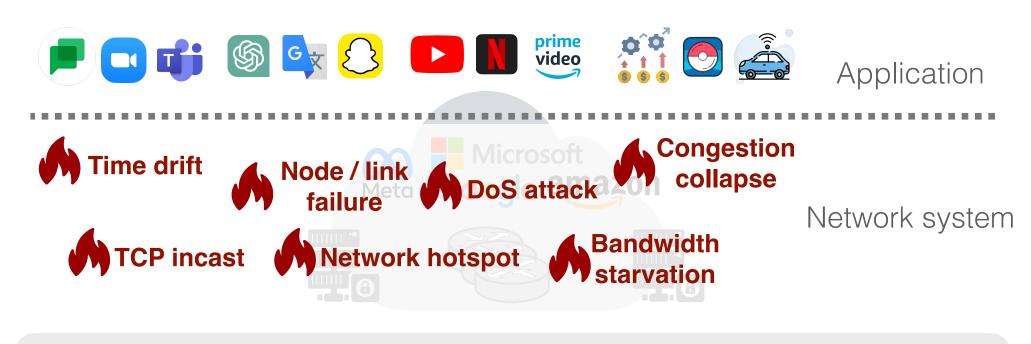




Network system

Networks serve to forward user data

Today, networks are far more complex!



Networks serve to forward user data

Today, networks are far more complex!

...must handle out-of-control events!



Networks serve to forward user data

Today, networks are far more complex!

...a vast array of control tasks

















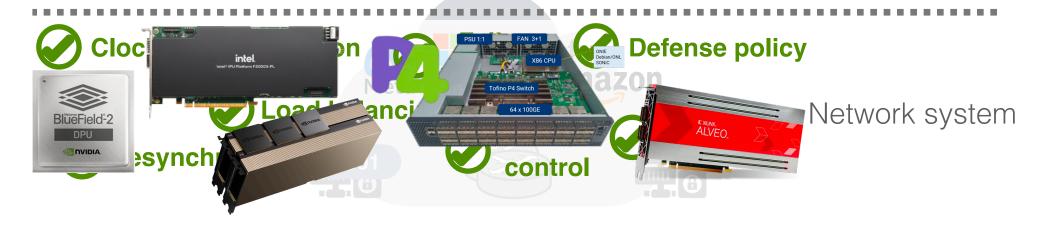








Application



Networks serve to forward user data

Today, networks are far more complex!

...a vast array of control tasks

...in-network computation w/ emerging HW accelerators

...and more!

























Today, network systems are **more than** just about **data forwarding!**

Networks serve to forward user data

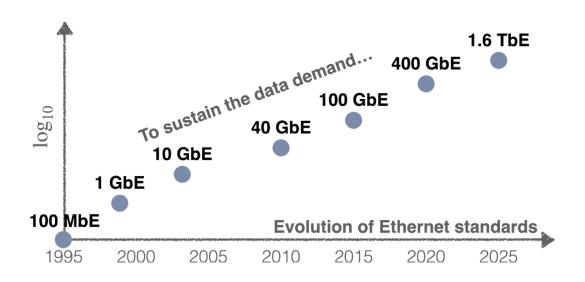
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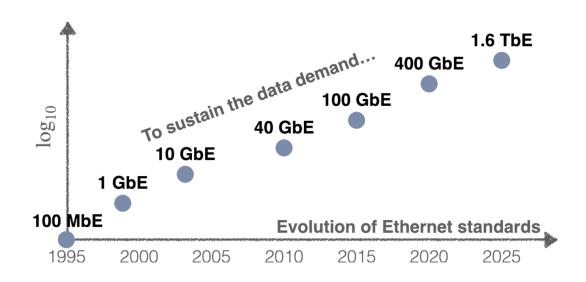
..and more!

Trend toward terabit speed...



The speed of networking is *outpacing* many others

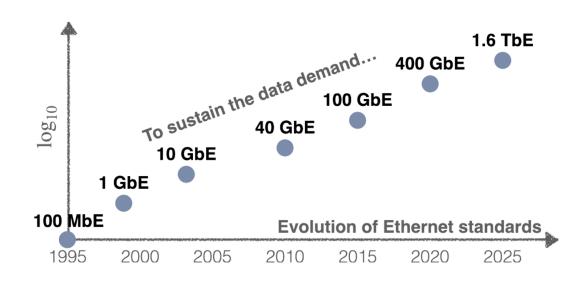
Trend toward terabit speed...



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Great for application data transfer

Trend toward terabit speed...



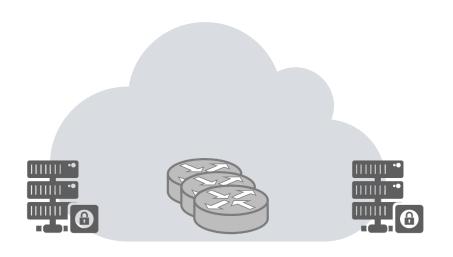
The speed of networking is *outpacing* many others

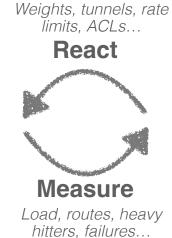
Great for application data transfer

... problematic for auxiliary tasks!



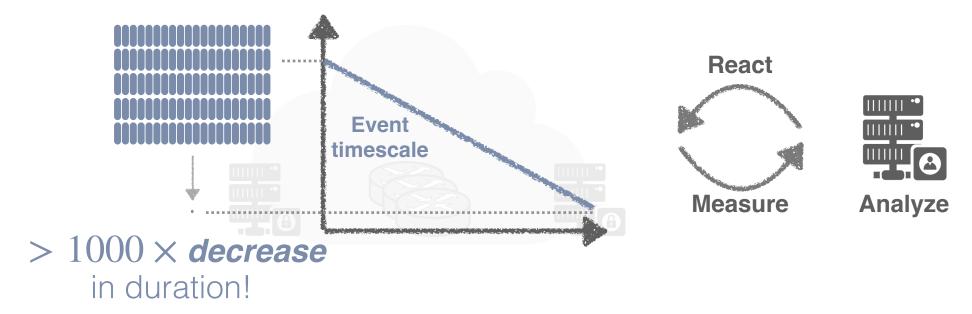
Network control function as an example

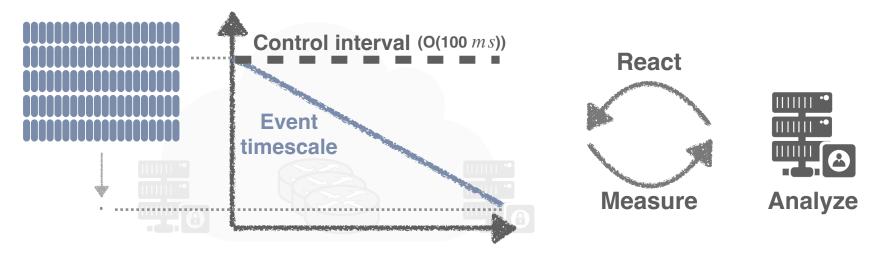




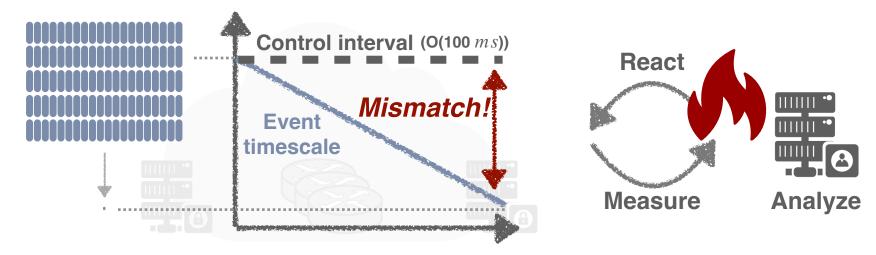


Network control function as an example



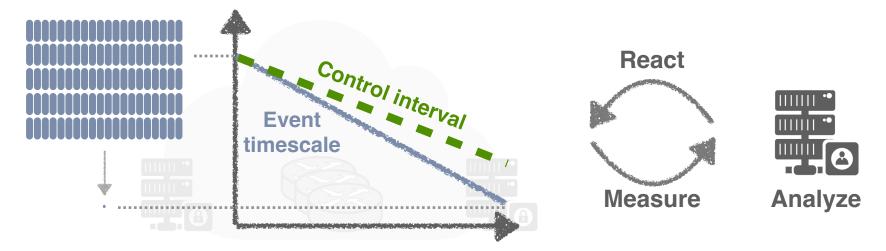


If the control interval remains coarse-grained...



If the control interval remains coarse-grained...

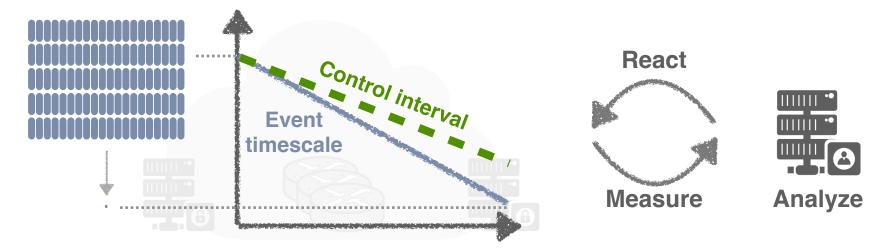




If the control interval remains coarse-grained...



If were to catch up with the link speeds...

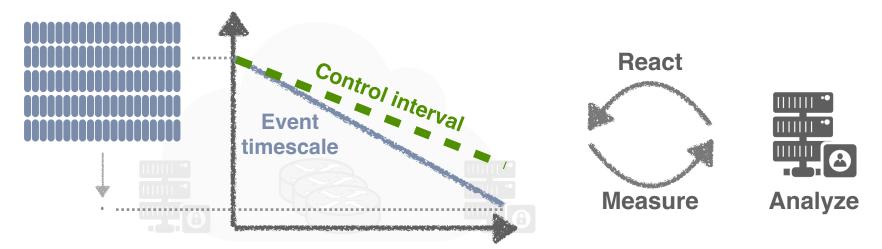


lf the control interval remains coarse-grained...

Hard to react to microscopic events

If were to catch up with the link speeds...

Allocate more cables, CPUs...?



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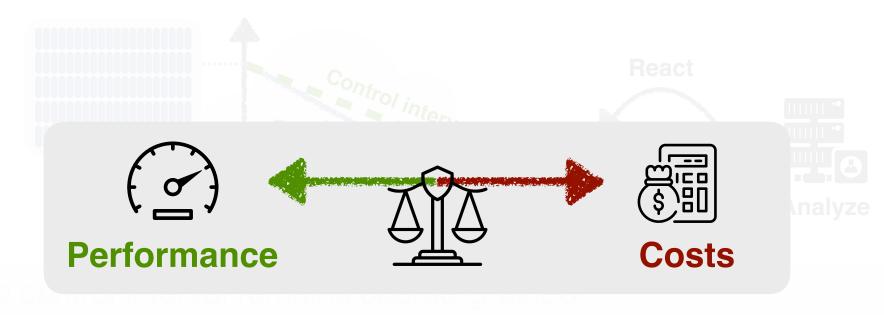












(>) Hard to react to microscopic events

If were to catch up with the link speeds...

Allocate more resources (cables, CPUs...)?

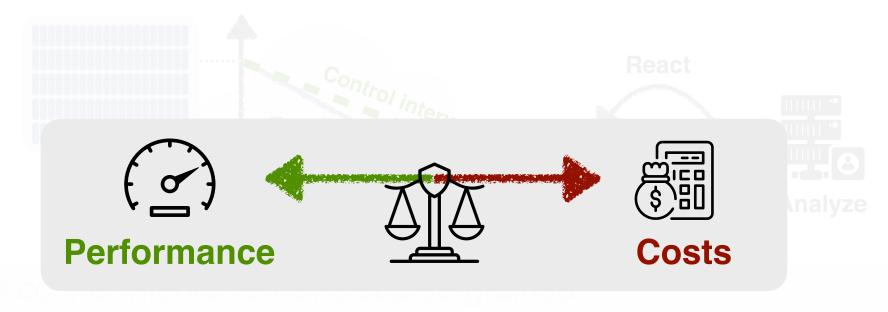


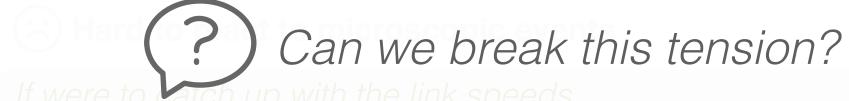












Allocate more resources (cables, CPUs...)?



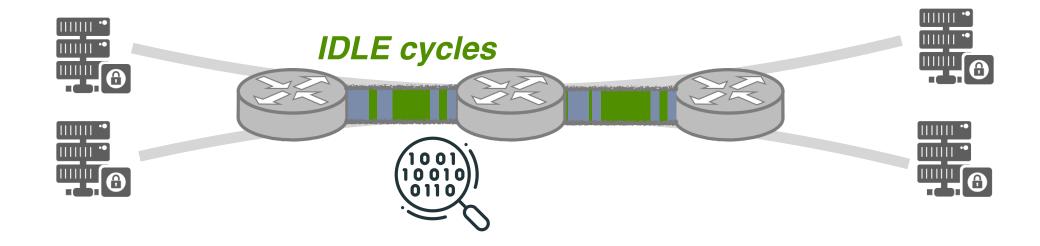




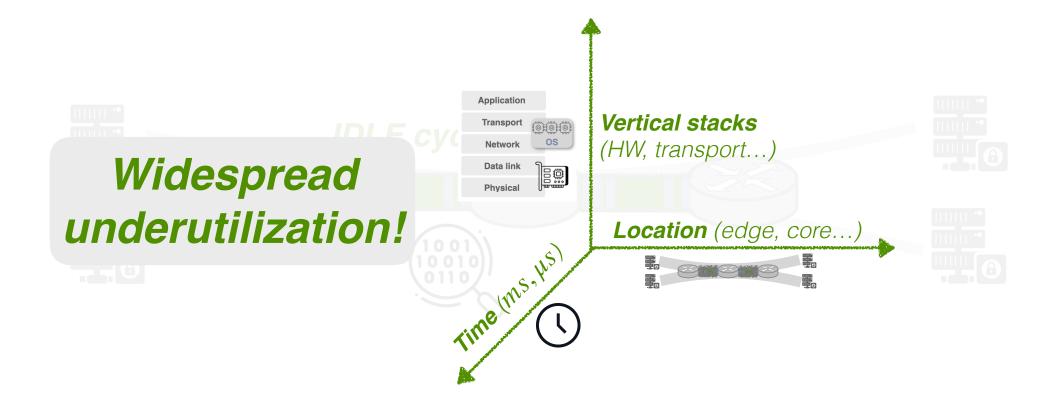




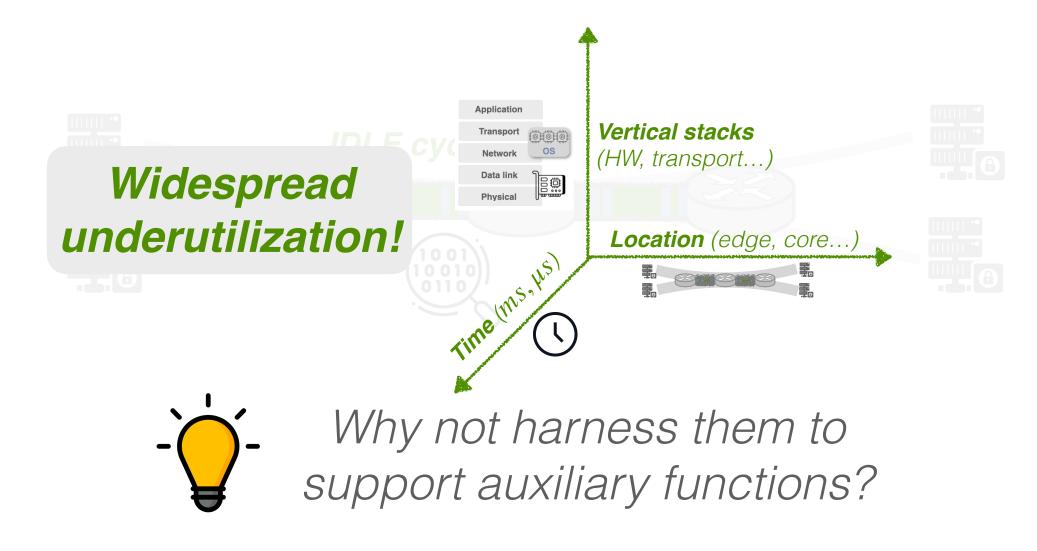
Observation: in-network waste



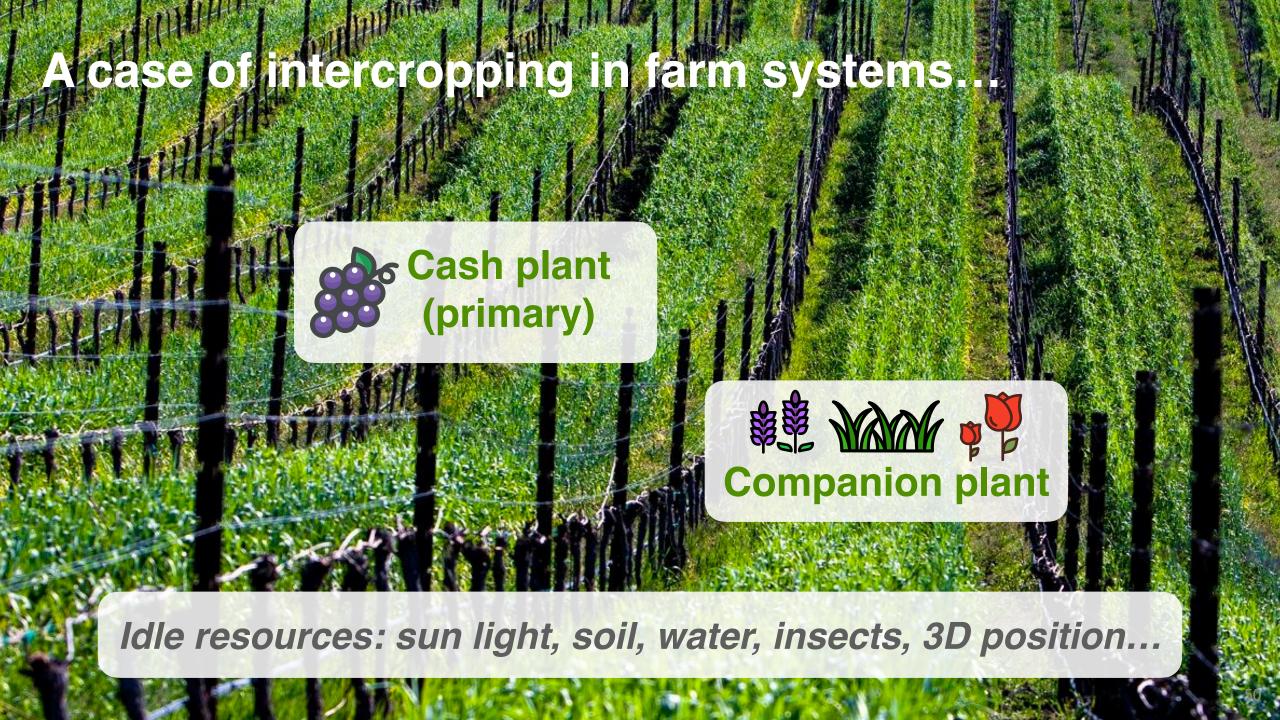
Observation: in-network waste



Observation: in-network waste







A zero-waste design approach

High-efficiency designs



Input: user workload

Goal: output a network to optimize performances with minimal resource usage

Zero-waste designs



Input: the workload *and the network*

Goal: maximize the utility of *that network*

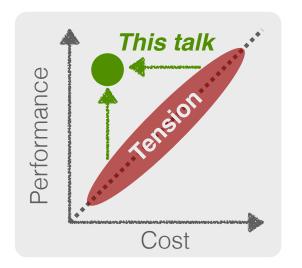
This talk: takeaway

In-network waste is **widespread**, and in **numerous forms**

Ethernet link IDLE cycles
Switch CPUs
Wasted power
Memory
Spare PCIe payload
Middleboxes



By exploiting domain-specific underutilization, it is *possible* to integrate performant functions with *near-zero costs*



Instantiations of zero-waste designs



Reuse





Beaver (OSDI 2024)
Reducing 'tax' of partial snapshots for distributed cloud services

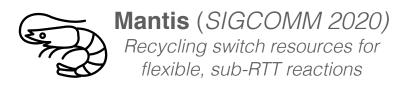
Reduce

Mantis (SIGCOMM 2020) Recycling switch resources for flexible, sub-RTT reactions

Recycle

Outline





Recycle





Beaver (OSDI 2024)
Reducing 'tax' of partial snapshots for distributed cloud services

Reduce

• A primary goal of computer networks: *delivery packets*

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 - *User application*: video streaming, web browsing, file transfer...

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- A primary goal of computer networks: delivery packets
 - *User application*: video streaming, web browsing, file transfer...
 - *Non-user application*: control messages, probes about network state, keep alive heartbeats...

Often, two classes of traffic multiplex the same network

When introducing an in-band control function...



To cost *extra bandwidth* for *efficacy*, or not?

When introducing an in-band control function...

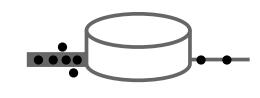


To cost *extra bandwidth* for *efficacy*, or not?



Time synchronization

Clock-sync rate ↔ **clock precision**



Congestion notification

Probe data/rate ↔ measurement accuracy



Failure detection

Heartbeat frequency ↔ **detection speed**



In-band telemetry

INT postcard volume ↔ post-mortem analysis

When introducing an in-band control function...

To cost extra bandwidth for efficacy, or not?

Can we coordinate at *high-fidelity* with a *near-zero* cost (to usable bandwidth, latency...)?

clock precision

measurement accuracy



Failure detection

Heartbeat frequency ↔ detection speed



In-band telemetry

INT postcard volume ↔ post-mortem analysis

When introducing an in-band control function...

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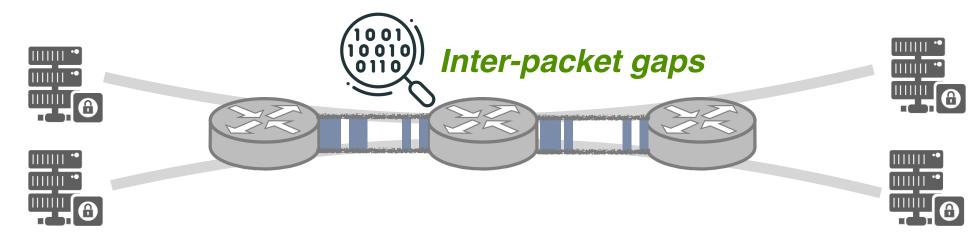
Can we coordinate at *high-fidelity* with a *near-zero* cost (to usable bandwidth, latency...)?

Clock piccision



- Exploit $\emph{every gap}$ (O(100 ns)) between user packets opportunistically
- Inject customizable IDLE packets carrying information across devices

Opportunity: $< \mu s$ gaps are prevalent



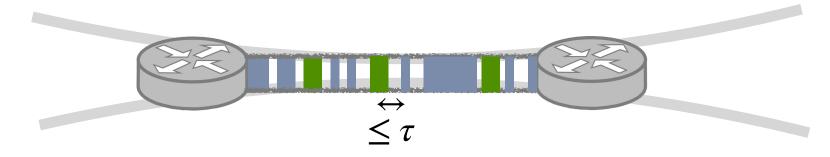
Root causes?

- Uncertainties in application load patterns (e.g., burstiness)
- Conservative resource provisioning for peak usages
- Bottlenecks at CPU processing vs network BW
- TCP effects
- Structural asymmetry
- ...

Abstraction: weaved stream



Union of user AND IDLE (injected) packets



[R1 Predictability] Interval between any two consecutive packets $\leq \tau$

$$\tau = B_{100Gbps} / MTU_{1500B} = 120ns$$

[R2 Little-to-zero overhead] Near-zero impact to user packets or power draw

Abstraction: weaved stream

Union of **user** and **IDLE** (injected) packets

Implement many in-network functions

(failure detection, clock sync, congestion notification...)

for free!

[R1

$$\tau = B_{100Gbps} / MTU_{1500B} = 120ns$$

[R2 Little-to-zero overhead] Not impact user packets or power draw

Abstraction: weaved stream

Union of user and IDLE (injected) packets

Crazy idea?

Extending IDLE characters to higher layers

- Data plane packet generator
- Replication engine
- Data plane programmability
- Flexible switch configuration (priorities, buffers...)

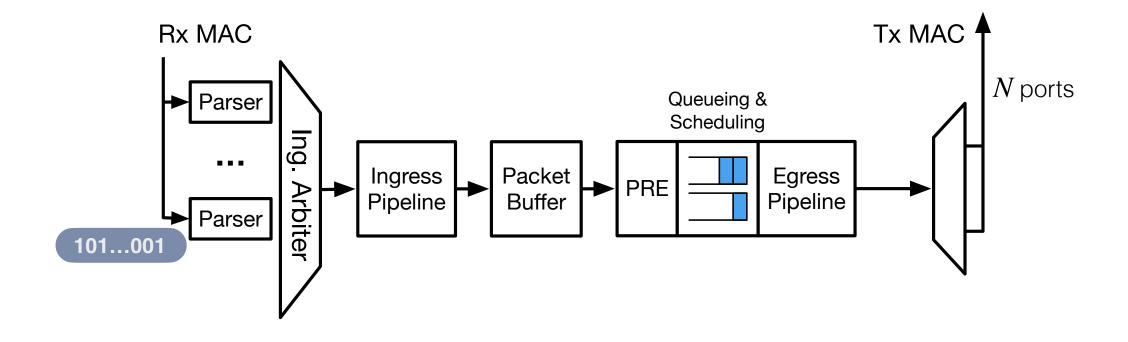
[R2 Little-to-zero overhead] Not impact user packets or power draw

[R1 Pre

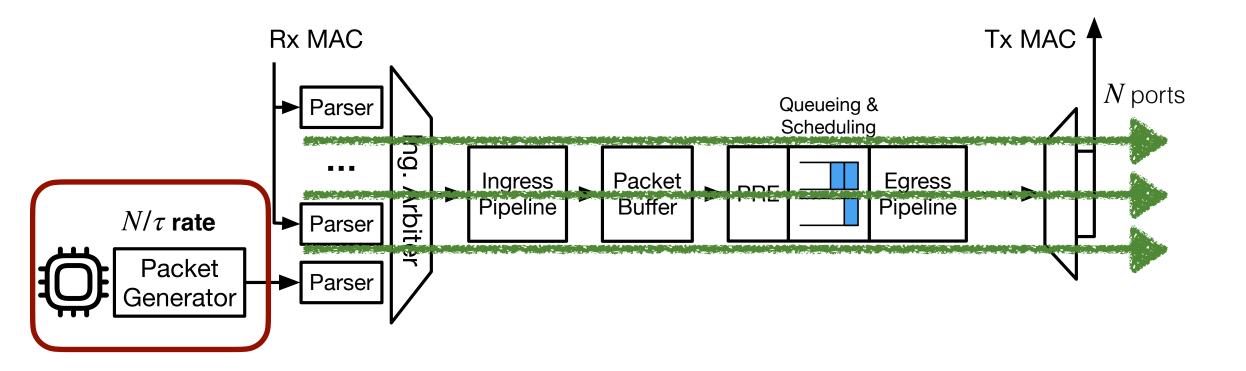
OrbWeaver: outline

- 1. RMT switch data plane architecture
- 2. Implementing weaved stream abstraction
- 3. OrbWeaver applications

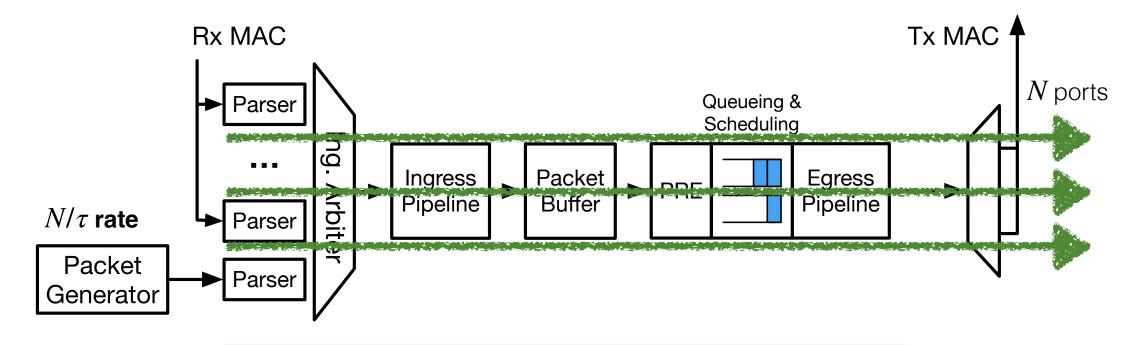
RMT switch architecture



Strawman: blind packet generation



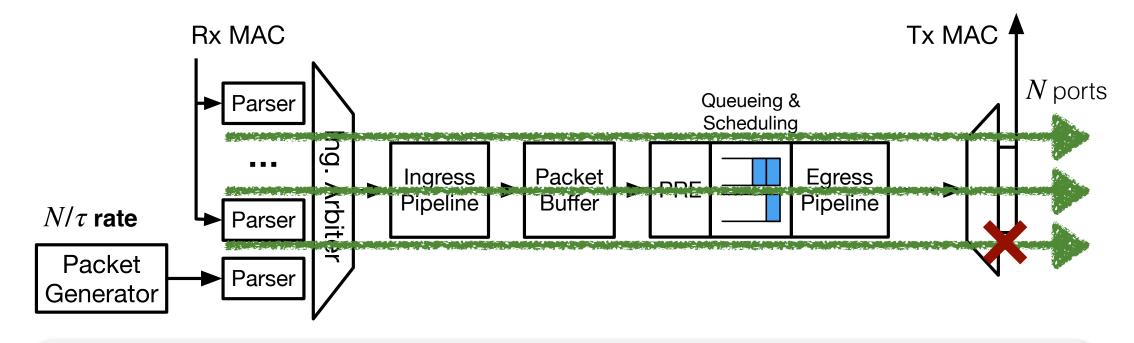
Strawman: blind packet generation



Predictability even there is no user traffic

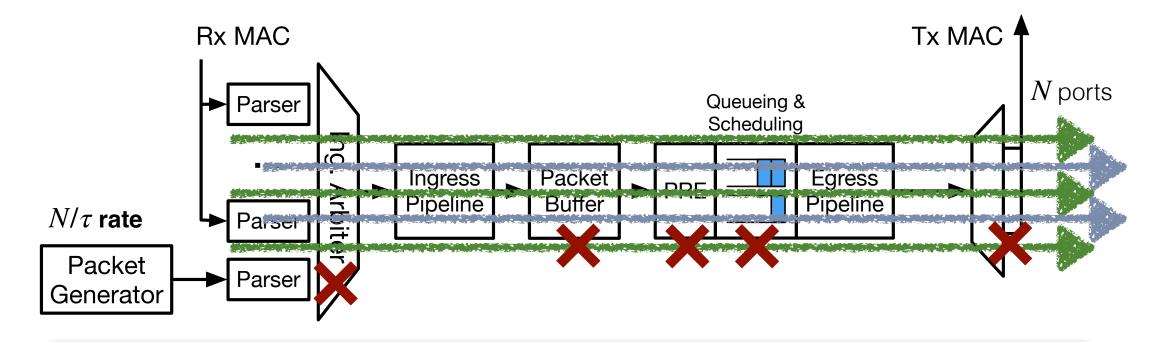


Problems with blind packet generation



#1 Scalability: overwhelm generator capacity to satisfy target rate for all ports

Problems with blind packet generation

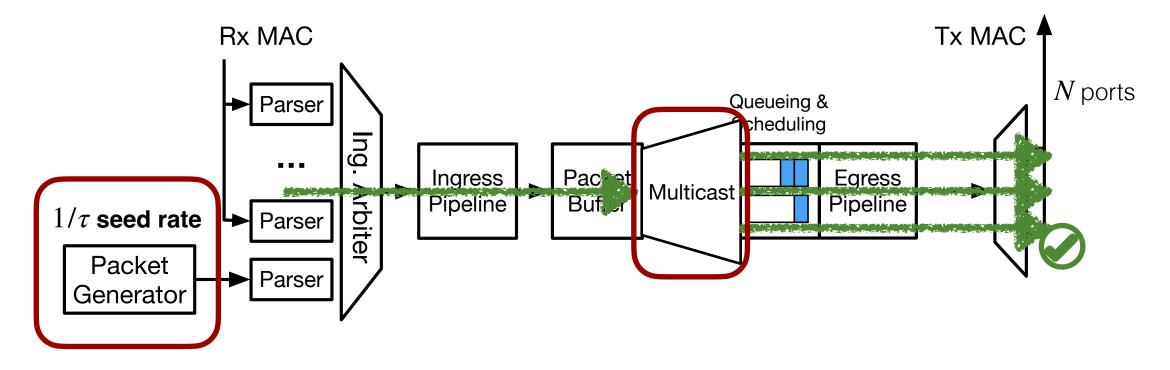


#1 Scalability: overwhelm generator capacity to satisfy target rate for all ports

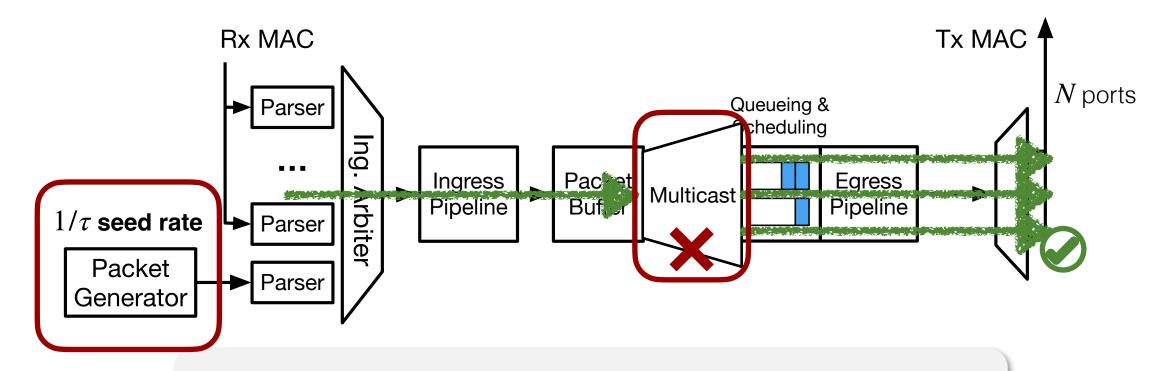
#2 Cross-traffic contention: affect throughput, latency, or loss of **user traffic!**

Problem #1: scalability

Solution: seed stream amplification



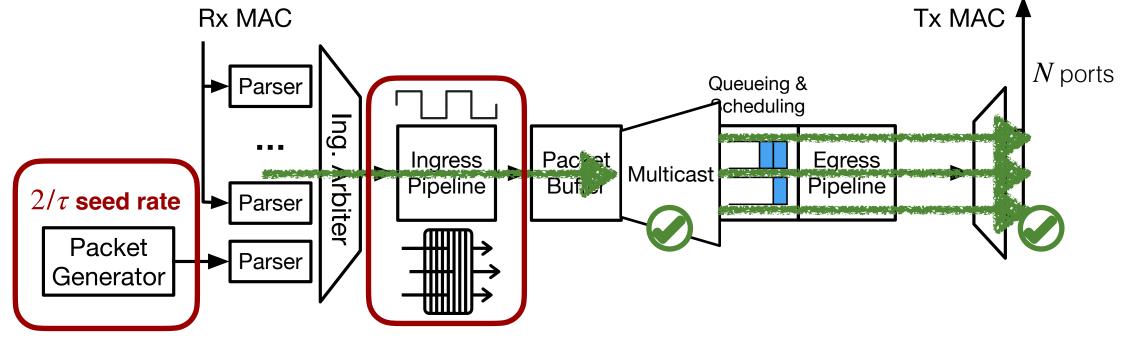
Problem #2: cross-traffic contention at PRE



Monopolize usage and waste PRE packet-level BW!

Problem #2: cross-traffic contention at PRE

Solution: amplify seed stream on-demand

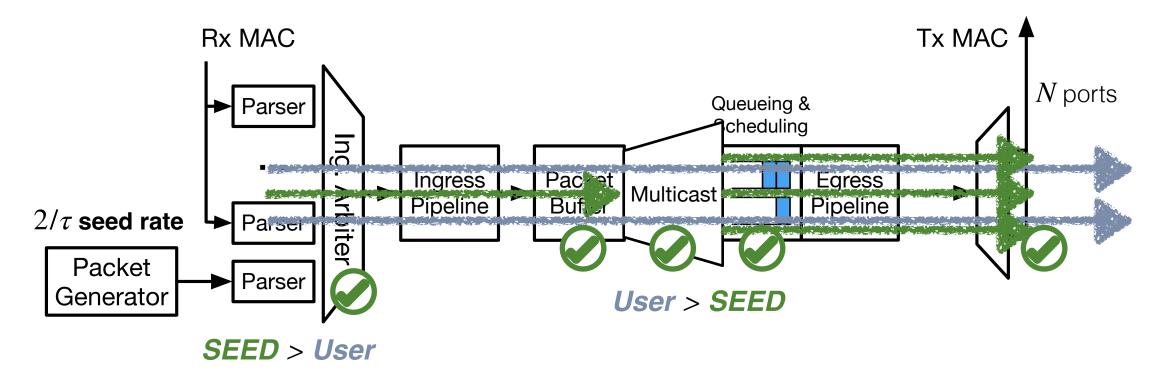


Selective filtering

- Per-egress port bitmap indicating packet presence in the last $\tau/2$ cycle
- If not, replicate an IDLE to the port

Problem: other contention points

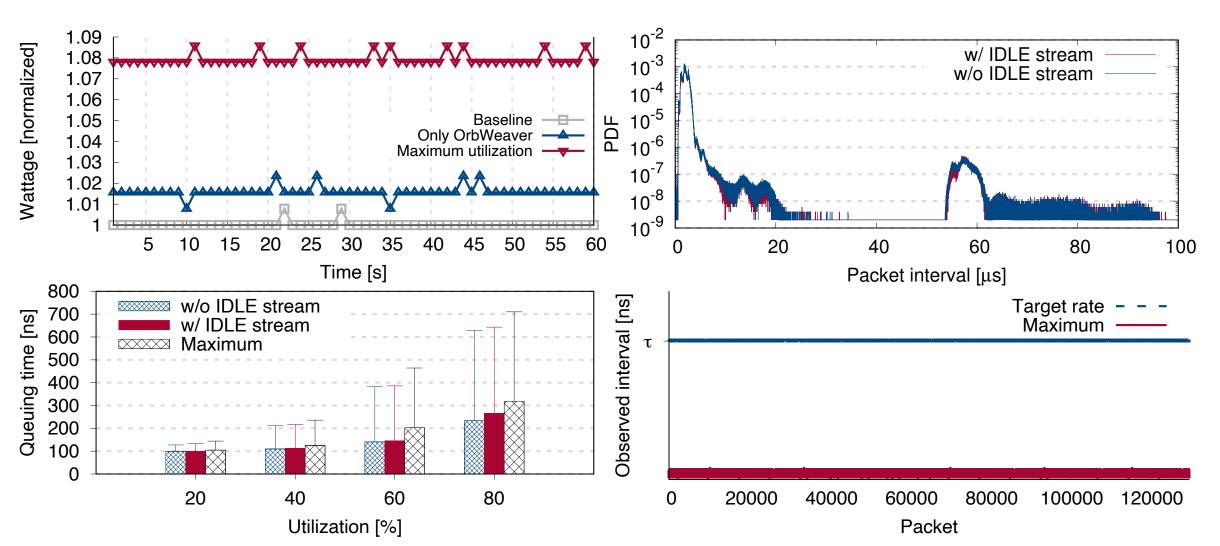
Solution: leverage rich configuration options for priorities and buffer management



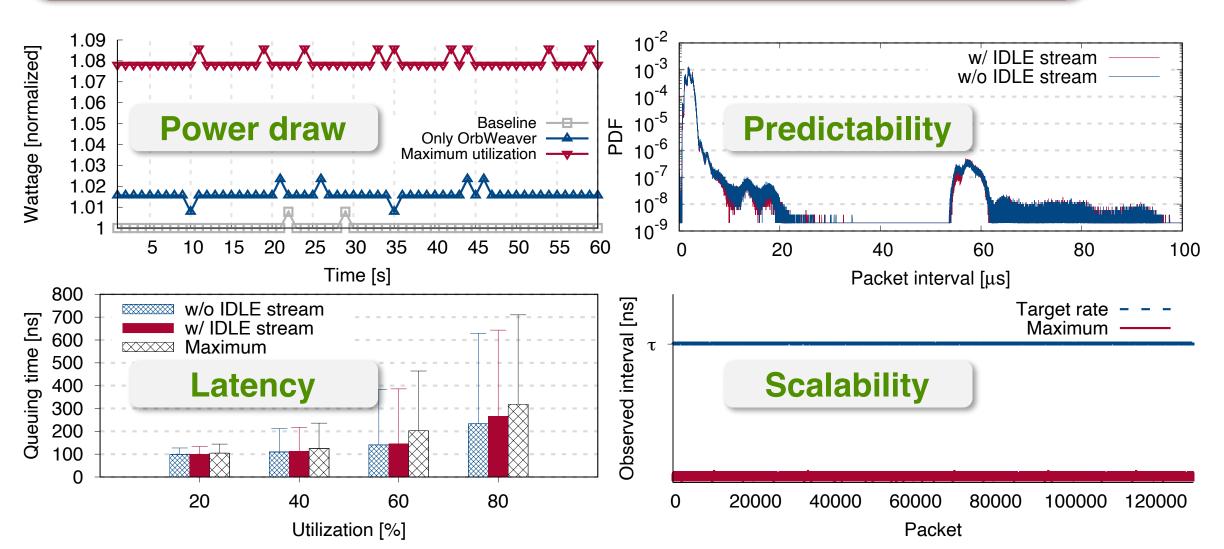
- Zero impact of weaved stream predictability
- Zero impact of user traffic throughput or buffer usage
- Negligible impact of latency of user packets

Implementation and evaluation

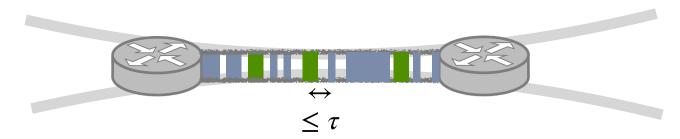
Hardware prototype on a pair of Wedge100BF-32X Tofino switches



Takeaway: Little-to-no impact of power draw, latency, or throughput while guaranteeing predictability of the weaved stream!



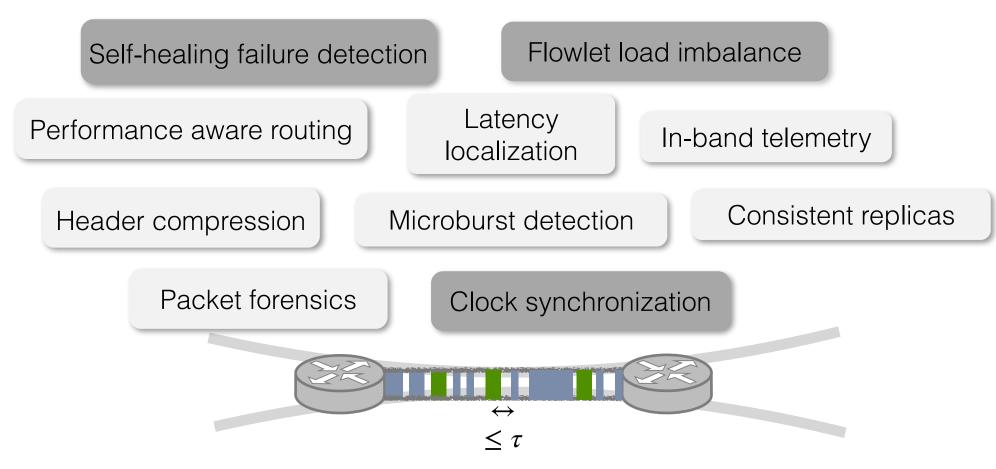
OrbWeaver use cases



[R1 Predictability] → Infer network state at fine-granularity!

[R2 Little-to-zero overhead] → Inject information using IDLE cycles!

OrbWeaver use cases



[R1 Predictability] → Infer network state at fine-granularity!

[R2 Little-to-zero overhead] → Inject information using IDLE cycles!

Example: failure detection

Node A Node B

'I am alive'

'I am alive'

? Suspect

Common approach:

Periodic, high priority heartbeats



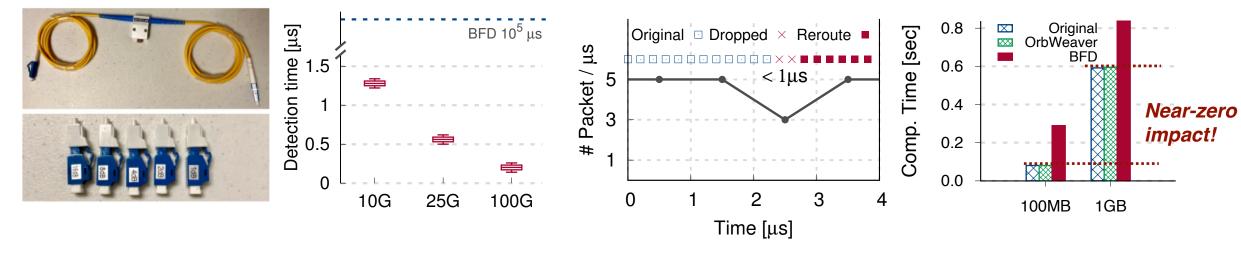
Empirically, use conservative detection thresholds

Failure detection with OrbWeaver



Before: Weak guarantee of the messaging channel

After: Guaranteed maximum inter-packet gap (120ns for 100 GbE)



Detection time of emulated failures using optical attenuators under varying link speeds

Instantaneous self-healing failure mitigation when combined with data-plane reroute

OrbWeaver pushes the detection speed to its *limits*

OrbWeaver: summary



- Weaved stream abstraction to harvest IDLE cycles
 - Sufficient for many in-band control functions
 - Don't need to choose between coordination fidelity and bandwidth overhead

OrbWeaver: summary



- Weaved stream abstraction to harvest IDLE cycles
 - Sufficient for many in-band control functions
 - Don't need to choose between coordination fidelity and bandwidth overhead
- Implementable on today's RMT switches
 - Push the utilization of IDLE cycles to its limits
 - Guarantee predictability with little-to-zero overhead

Outline



Reuse

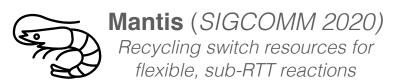




Beaver (OSDI 2024)

Reducing 'tax' of partial snapshots for distributed cloud services

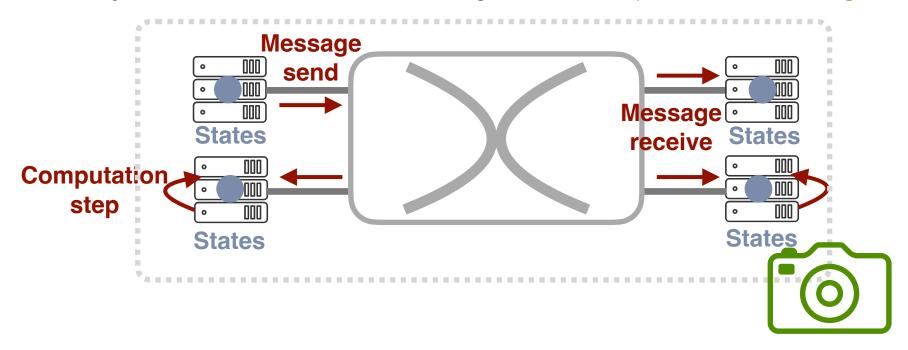
Reduce



Recycle

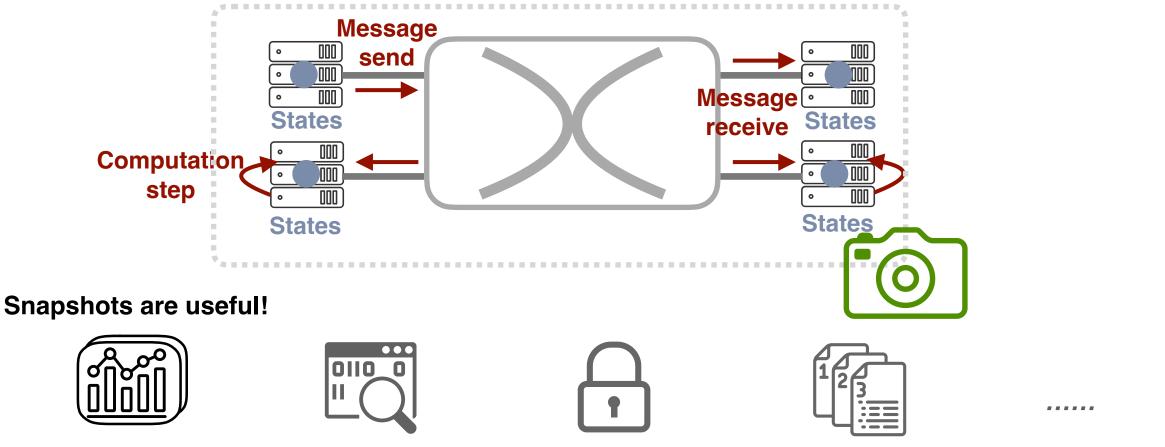
Let's talk about snapshots

Distributed snapshots: a class of distributed algorithms to capture consistent, global view of states



Let's talk about snapshots

Distributed snapshots: a class of distributed algorithms to capture consistent, global view of states



Network telemetry Distributed software Deadlock detection debugging

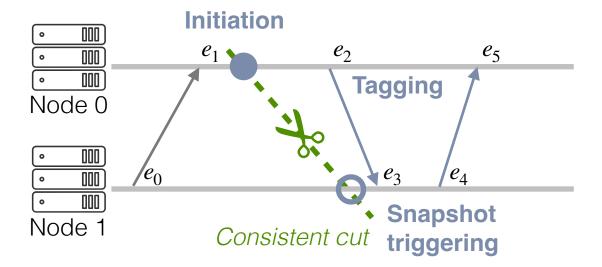
Checkpointing and failure recovery

Classic distributed snapshots

e.g., Chandy-Lamport (TOCS 1985)

Classic distributed snapshots

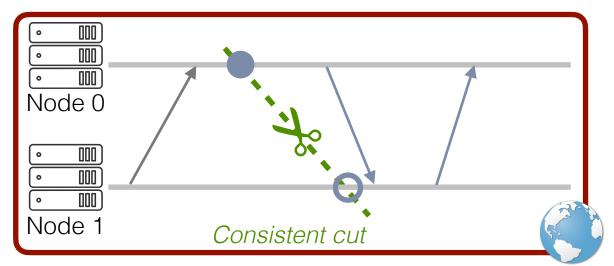
e.g., Chandy-Lamport (TOCS 1985)



Guarantee of causal consistency



Classic snapshots operate in an isolated universe



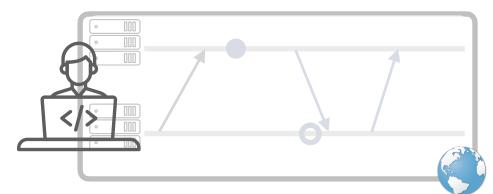
Utopian: isolated 'universe' of nodes

Fundamental assumption:

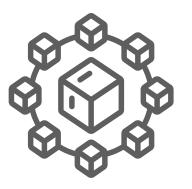
The set of participants are *closed* under causal propagation.



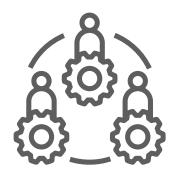
The assumption rarely matches reality!



Utopian: isolated 'universe' of nodes



Modular services



Instrumentation constraints



Costs and overheads



Hidden causality due to human

The assumption mismatches the reality!









Unrealistic to assume *zero* external interaction Impractical to instrument *all* processes

Utopian: isolated 'universe' of nodes

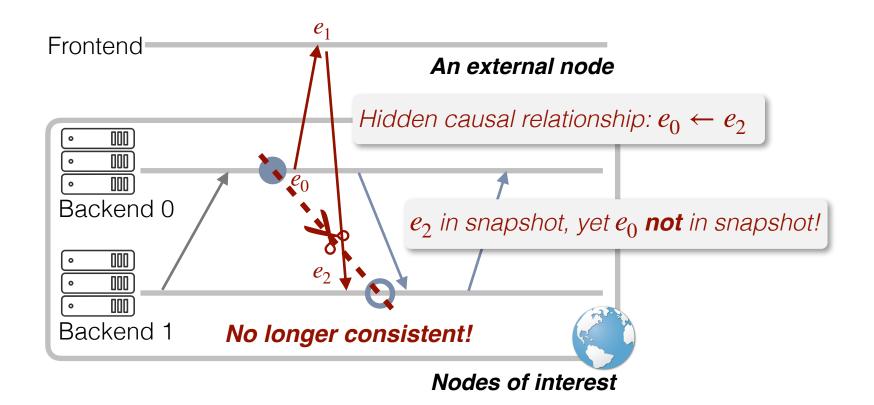




Costs and overheads

Hidden causality due to human

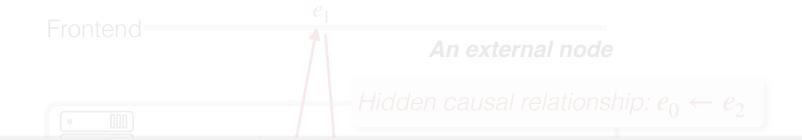
Consequences?





A single external node can break the guarantee!

Consequences?



Can we capture a *causally consistent* snapshot when a *subset* of the broader system participates?



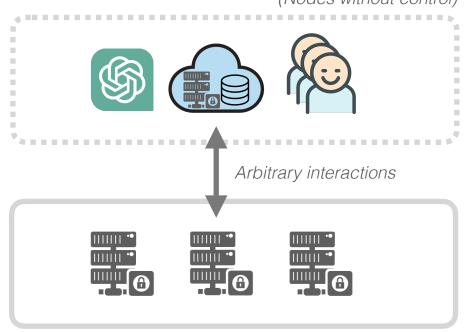


Beaver: practical partial snapshots



Out-group nodes

(Nodes without control)



In-group nodes

(Nodes with VIPs of interest)



The same causal consistency abstraction

Even when the target service interact with **external**, **black box services** (arbitrary number, scale, placement, or semantics) via **arbitrary pattern** (including multi-hop propagation of causal dependencies)

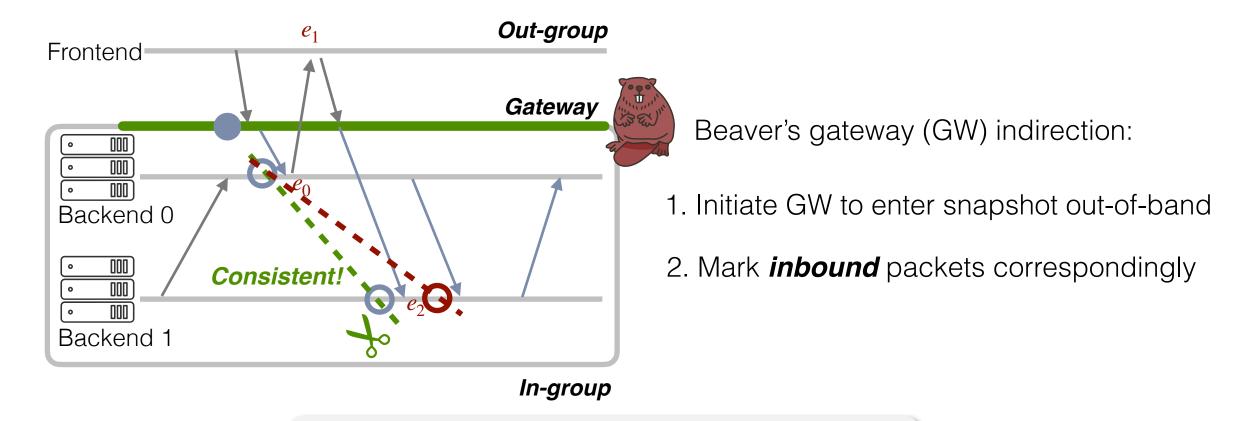


Zero impact over existing service traffic

That is, absence of blocking or any form of delaying operations during distributed coordination



Idea 1: Gateway (GW) indirection



Before: **inconsistent** cut at \mathbf{O} (after e_2)

With GW: **consistent** cut at \bigcirc (before e_2)

97

Formalizing idea 1: Monolithic Gateway Marking

Theorem 1. With MGM, a partial snapshot C_{part} for $P^{in} \subseteq P$ is causally consistent, that is, $\forall e \in C_{part}$, if $e' \cdot p \in P^{in} \land e' \rightarrow e$, then $e' \in C_{part}$.

Proof. Let $e.p = p_i^{in}$ and $e'.p = p_j^{in}$. There are 3 cases:

- 1. Both events occur in the same process, i.e., i = j.
- 2. $i \neq j$ and the causality relationship $e' \rightarrow e$ is imposed purely by in-group messages.
- 3. Otherwise, the causality relationship $e' \rightarrow e$ involves at least one $p \in P^{out}$.

In cases (1) and (2), the theorem is trivially true using identical logic to proofs of traditional distributed snapshot protocols. We prove (3) by contradiction.

Assume $(e \in C_{part}) \land (\exists e' \rightarrow e)$ but $(e' \notin C_{part})$. With (3), $e' \rightarrow e$ means that there must exist some e^{out} (at an out-group process) satisfying $e' \rightarrow e^{out} \rightarrow e$. Now, because $e' \notin C_{part}$, we know $e^{ss}_{p^{in}_j} \rightarrow e'$ or $e^{ss}_{p^{in}_j} = e'$, that is, p^{in}_j 's local snapshot happened before or during e'. Combined with the fact that the

happened before or during e'. Combined with the fact that the gateway is the original initiator of the snapshot protocol, we know that $e_g^{ss} \to e' \to e^{out} \to e$.

We can focus on a subset of the above causality chain: $e_g^{ss} \to e$. From the properties of the in-group snapshot protocol, $e_g^{ss} \to e$ implies that $e \notin C_{part}$.

This contradicts our original assumption that $e \in C_{part}$!

Formal proof in paper



Holds even if treating the out-group nodes as black boxes



Sufficient to *only* observe the inbound messages

Key ideas in Beaver

How to ensure consistency without coordinating external machines?

Idea 1: Indirection through Monolithic Gateway Marking (MGM)

How to enforce MGM practically in today's network?

Challenge 1 How to instantiate GW cost-effectively?

Challenge 2 How to handle asynchronous GWs?

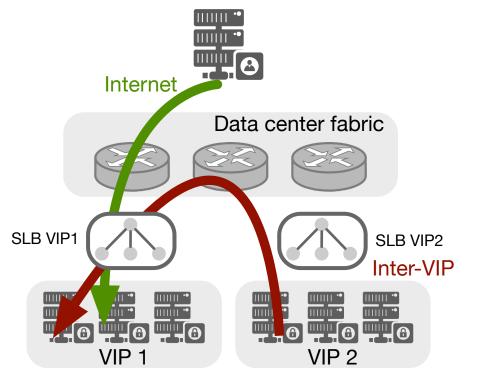
Challenge 1: instantiating GWs



Rerouting all inbound traffic through the GW is *costly*



Cloud data centers already place layer-4 load balancers (SLBs)





Key ideas in Beaver

How to ensure consistency without coordinating external machines?

Idea 1: Indirection through Monolithic Gateway Marking (MGM)

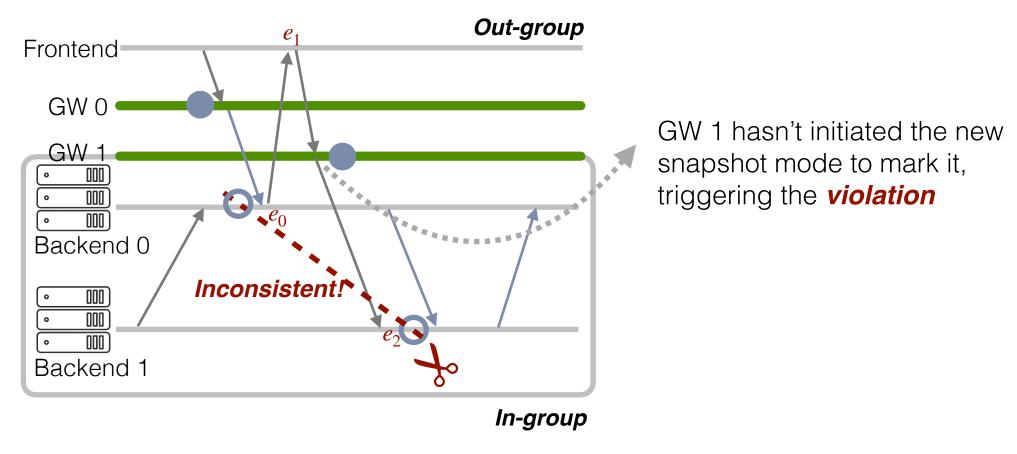
How to enforce MGM practically in today's network?

Challenge 1 How to instantiate GW?

Idea 2: Reuse existing SLBs with unique locations

Challenge 2 How to perform atomic snapshot initiation for asynchronous GWs?

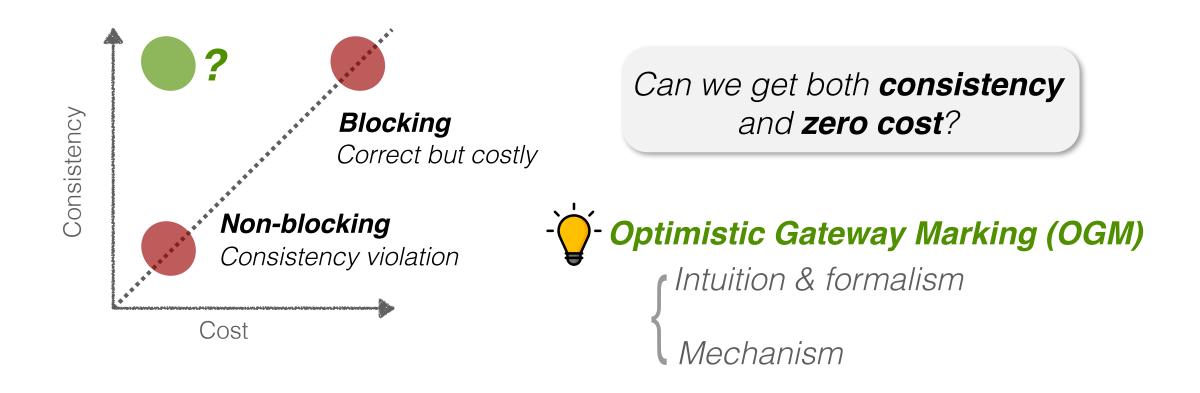
Implications of multiple SLBs



 e_2 in snapshot, yet e_0 that leads to it is not, inconsistent!

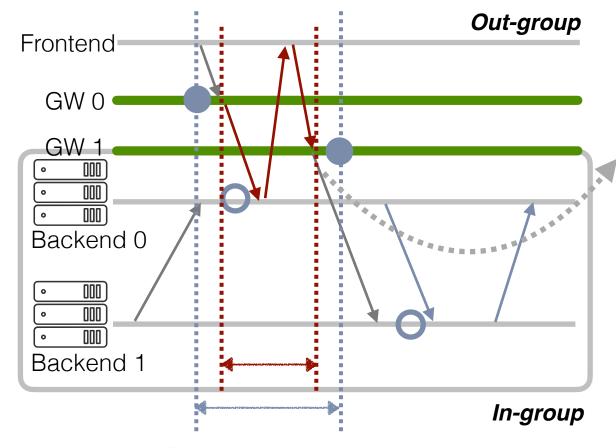
Handling multiple GWs: design space

How about blocking messages to 'atomically' trigger all SLBs?



Challenge 2: handling multiple SLBs

Reflection: Beyond worst cases, when and how often does the violation occur?



Time gap between SLB initiation points

Observation:

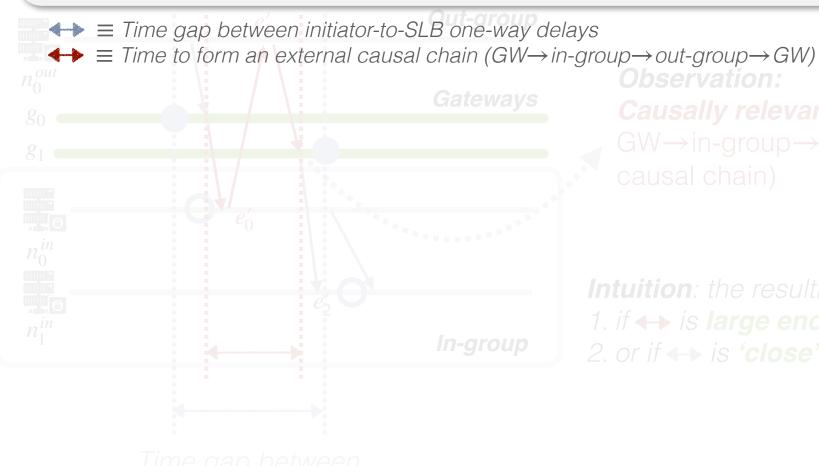
Causally relevant messages are rare! GW→in-group→out-group→GW (external causal chain)

Intuition: the resulting snapshot is consistent

1. if ←→ is large enough

2. or if → is 'close' enough

Theorem: if ↔ < ↔, the partial snapshot is consistent!



Theorem 2. In a system with multiple asynchronous gateways, let the wall-clock time of the first and last gateway snapshots be $e_{gmin}^{ss} = \min_{e_g^{ss}}(e_g^{ss}.t)$ and $e_{gmax}^{ss} = \max_{e_g^{ss}}(e_g^{ss}.t)$, respectively. Also let $\forall g \in G$, $\tau_{min} = min(d(g, g'; \{p, q\}))$, where $g, g' \in G, p \in P^{in}, and q \in P^{out}.$ If $e_{gmax}^{ss}.t - e_{gmin}^{ss}.t < \tau_{min}$ then the partial snapshot is causally consistent. *Proof.* We extend the proof of Theorem 1 to a distributed setting. Similar to Theorem 1, there are three cases, with (3) being the one that differs. We again prove it by contradiction.

Assume $(e \in C_{part}) \land (\exists e' \to e)$ but $(e' \notin C_{part})$. As before, there must be some chain $e' \to e^{out} \to e^g \to e$. Because $e' \notin$ C_{part} , we have $e_{p_{in}^{in}}^{ss} \rightarrow e'$ or $e_{p_{in}^{in}}^{ss} = e'$, that is, p_{j}^{in} must have been triggered directly or indirectly by an inbound message. Denote the arrival of this inbound message at its marking gateway as $e^{g'}$. By the definition of τ_{min} , we have $e^g \cdot t - e^{g'} \cdot t \ge 1$ $\tau_{min} > e_{gmax}^{ss}.t - e_{gmin}^{ss}.t$. Thus, at event e^g , the gateway must have already initiated the snapshot and will mark e^g . m before forwarding. This results in $e \notin C_{part}$, a contradiction!

Formal proof in paper

Theorem: if ↔ < ↔, the partial snapshot is consistent!

- **←** Time gap between initiator-to-SLB one-way delays
- \Rightarrow \equiv Time to form an external causal chain (GW \rightarrow in-group \rightarrow out-group \rightarrow GW)

Observation: condition holds in most cases anyway!

- ← can approximate zero
- SLBs share the same region
- Proper placement of controller

- → is relatively high
- ≥ 3 trips through the fabric
- Higher when the out-group is in another DC or Internet

Theorem 2. In a system with multiple asynchronous gateways, let the wall-clock time of the first and last gateway snapshots be $e_{\min}^{ss} = \min_{e_{ij}^{ss}} (e_{g}^{ss}.t)$ and $e_{\max}^{ss} = \max_{e_{ij}^{ss}} (e_{g}^{ss}.t)$, respectively. Also let $\forall g \in G$, $\tau_{\min} = \min(d(g,g';\{p,q\}))$, where $g,g' \in G$, $p \in P^{\text{in}}$, and $q \in P^{\text{out}}$. If $e_{\max}^{\text{ess}} - e_{\min}^{\text{ess}} \cdot t < \tau_{\min}$, then the partial snapshot is causally consistent.

Proof. We extend the proof of Theorem 1 to a distributed setting. Similar to Theorem 1, there are three cases, with (3) being the one that differs. We again prove it by contradiction.

Assume $(e \in C_{part}) \land (\exists e' \to e)$ but $(e' \notin C_{part})$. As before, there must be some chain $e' \to e^{out} \to e^g \to e$. Because $e' \notin C_{part}$, we have $e_{pji}^{ss} \to e'$ or $e_{pji}^{ss} = e'$, that is, p_j^{in} must have been triggered directly or indirectly by an inbound message. Denote the arrival of this inbound message at its marking gateway as e^g' . By the definition of τ_{min} , we have $e^g.t - e^g.t \le \tau_{min} \lor e_{gonax}^{ss}.t - e_{gonin}^{ss}.t$. Thus, at event e^g , the gateway must have already initiated the snapshot and will mark $e^g.m$ before forwarding. This results in $e \notin C_{part}$, a contradiction!

Formal proof in paper

Optimistic execution in common cases

Optimistic Gateway
Marking (OGM)

Verification/rejection of snapshots under worst cases

How does Beaver detect a snapshot violation?

Theorem: if ↔ < ↔, the partial snapshot is consistent

```
\Rightarrow \equiv Time gap between initiator-to-SLB one-way delays
\Longrightarrow Time to form an external causal chain (GW\rightarrowin-group\rightarrowout-group\rightarrowGW)
```



- Determine the lower bound of → statically
 Measure a safe upper bound for → online using a single clock



False positives is fine as one can always retry!

Key ideas in Beaver

How to ensure consistency without coordinating external machines?

Idea 1: Indirection through Monolithic Gateway Marking (MGM)

How to enforce MGM practically in today's network?

Challenge 1 How to instantiate GW cost-effectively?

Idea 2: Reuse existing SLBs with unique locations

Challenge 2 How to perform atomic snapshot initiation for asynchronous GWs?

Idea 3: Optimistic Gateway Marking (OGM)

- Optimistic execution in common cases
- Verification/rejection of snapshot under worst cases

Key ideas in Beaver

How to ensure consistency without coordinating external machines?

More details about Beaver's protocol...

- Synchronization-free snapshot verification
- Supporting parallel snapshots
- Handling failures
- Handling packet loss, delay, and reordering
- •

Chanenge z now to nanote asynchronous Gws:

Idea 3: Optimistic Gateway Marking (OGM)

- Optimistic execution in common cases
- Verification/rejection of snapshot under worst cases

Implementation and evaluation

SLB-associated workflow

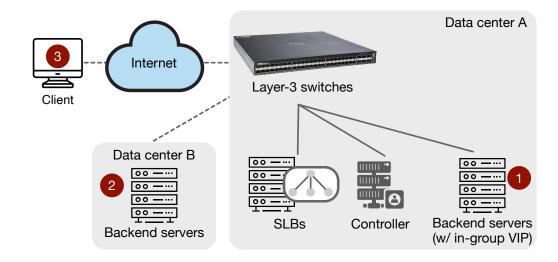
- Layer-3 ECMP forwarding per service VIPs: DELL EMC PowerSwitch S4048-ON
- 1860 LoC for core SLB functions in DPDK
- 1040 LoC for backend server functions in XDP and to

Beaver protocol integration (minimal logic)

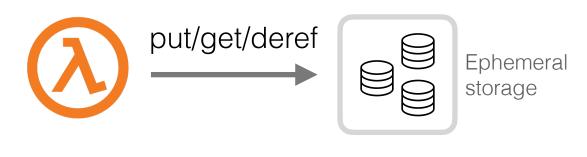
- 68 LoC for SLB DPDK data path logic
- 102 LoC for eBPF at in-group VMs

Topology

- Out-group locations: within the same DC, DC at a different region, or on the Internet
- Scale up to 16 SLB servers and 1024 backend applications



Example: garbage collection for ephemeral storage

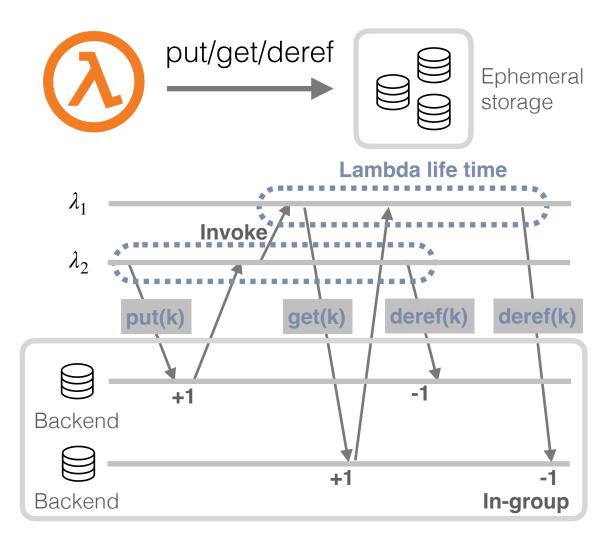


 λ_1

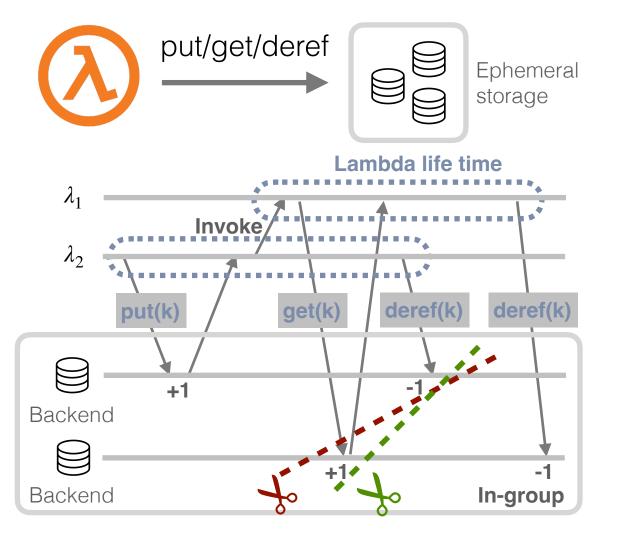
 λ_2



Example: garbage collection for ephemeral storage



Example: garbage collection for ephemeral storage



Strawman

Reference count = 0, unsafe recycle decision of k!



Reference count = 1, safe decision recognizing open reference to k

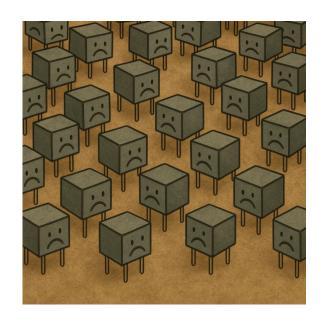
Beaver: summary

The first partial snapshot protocol that extends classic distributed snapshots in **practical cloud settings**

Guarantees causal consistency while incurring minimal changes and overheads

Key idea: Exploit data center characteristics (e.g., unique topologies)

... something I am excited about

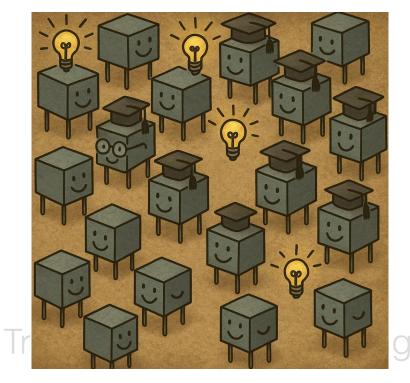


Transistor scaling is hitting walls



Rise of domain-specific accelerators

... something I am excited about



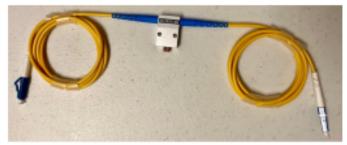
A complementary approach: build *smarter* systems

Uncover the hidden intelligence of modern hardware

walls

Rise of dontoday cific accelerators

Uncover the hidden intelligence of modern hardware





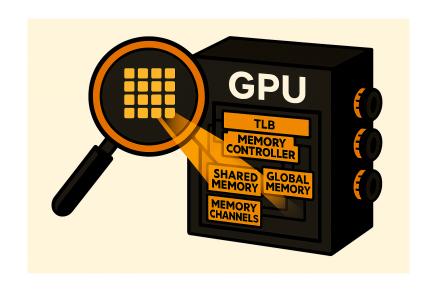


Networking ASICs (programmable switches and SmartNICs)





Memory in general compute servers (memory controller, DRAMs...)



GPU memory subsystem (GDDR, HBM...)

Q&A