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Ecole Jeunes Chercheurs sur l'Efficacité Énergétique des Réseaux et  
Systèmes Distribués (E3RSD)

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# **Towards Realistic Devices Shutdown Strategies in ISP and Data Center networks**

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SigNet team

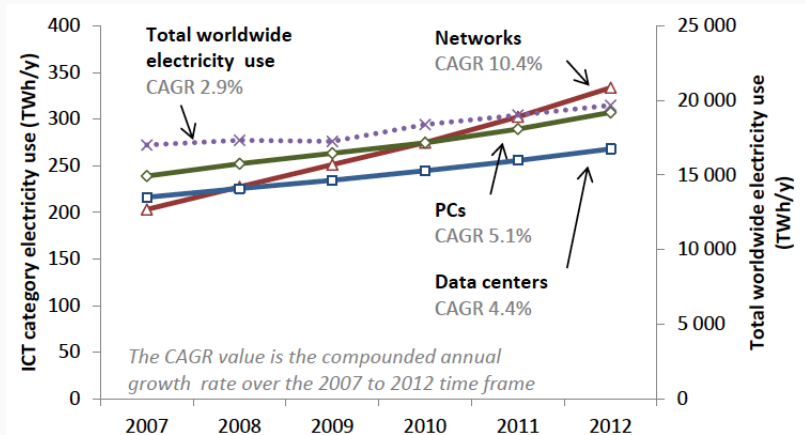
Université Côte d'Azur, CNRS, I3S, France



# Introduction & Context

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# The Worldwide ICT Energy Consumption



Estimated energy consumption of the ICT between years 2007 and 2012,  
from [Van Heddeghem *et al.* 2014]

# Energy optimization through shutdown solutions

- Networks are dimensioned to support peak loads → underutilization of resources
- Tackling the energy problem on both ISP and DC networks with shutdown strategies
  - ISP: Shutdown (sleep) routers → optimal usage of resources
  - DC: Shutdown idle VMs → massive consolidation
- Why not Energy Proportionality-based solutions?
  - Low Energy Proportionality Index (EPI)

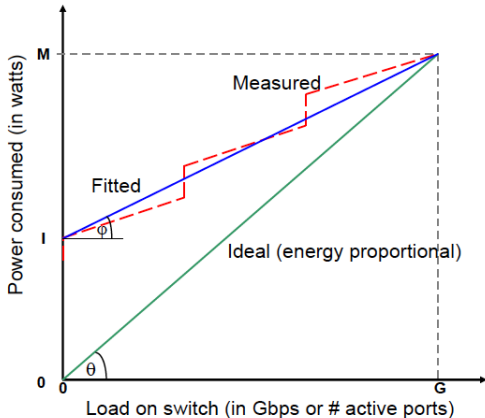
Going from idle to active might need considerable power!!

# Introduction & Context

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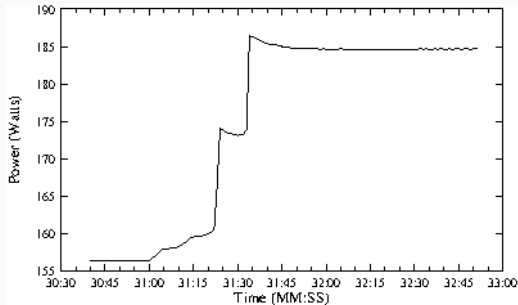
## Energy Proportitonality and Energy Proportionality Index

# Network Energy Proportionality, from [Mahadevan et al. 2009]



- $EPI = (M - I) / M$
- EPI of 25% for Edge switches and near 0% for core switches

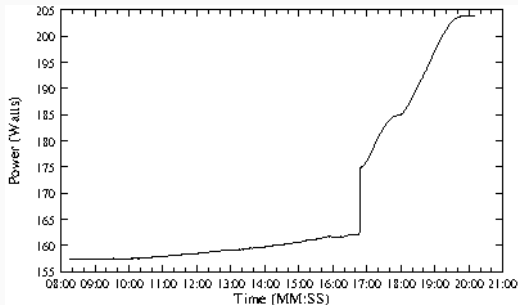
## Idle → Active - Our experiences (1)



Turning on one module every 10s, all ports at once.

- HP 5400zl switch
- 4 modules, 24 GigaEthernet ports per module
- $I_{pdis} = 158 \text{ Watts}$ ,  
 $M = 210 \text{ Watts}$ ,  
 $EPI \approx 25\%$

## Idle → Active - Our experiences (2)



Turning on one port every 5s.

- HP 5400zl switch
- 4 modules, 24 GigaEthernet ports per module
- $I_{pdis} = 158 \text{ Watts}$ ,  
 $M = 210 \text{ Watts}$ ,  
 $EPI \approx 25\%$



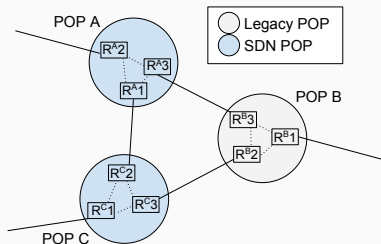
# Shutting Routers Down in ISP Networks

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- Energy Aware Routing [Rouzic *et al.* 2013; De Rango *et al.* 2012; Shang *et al.* 2010]
- Energy Aware Routing + Software Defined Networks [Giroire *et al.* 2014; “ElasticTree: Saving Energy in Data Center Networks.”]
- Hybrid Software Defined Networks [Vissicchio *et al.* 2014; Agarwal *et al.* 2013]

# Energy Models and Hybrid Network Models

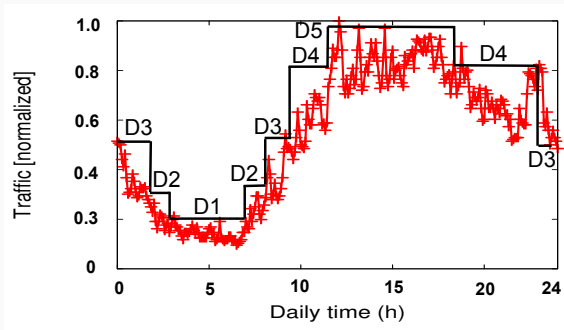
- Full SDN POPs and legacy POPs
- POP networks  $\rightarrow$  full mesh topology
- turning off routers in SDN POPs only



- Link power model between 2 hosts  $u$  and  $v$  [Idzikowski *et al.* 2016]
  - $P_{l(u,v)} = x_{u,v}U_{u,v} + F_{u,v}L_{u,v}$
- Forwarding node power model
  - $P_{n(u)} = B_u + A_u + \sum_{v \in N^+(u)} P_{l(u,v)}$

# Network Traffic Observations

- Traffic roughly stable over time
  - stable pattern per day, per week.
- A few configurations are enough to adapt the network resources to the spared amount traffic
  - No need for frequent network reconfigurations



# Shutting Routers Down in ISP Networks

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The Smooth ENergy Aware Routing  
(SENAtor) Solution

Goal: Maximize the number of links to be turned off

- Limited budget  $\implies$  not all POPs can be SDN-capable
- SDN POPs placement
  - chose the  $k$  first POPs with the highest degree
- Off link selection + tunnels for fast rerouting
  - inter POP links only  $\implies$  1 SDN device
  - For every link in a SDN POP
    - mark the link as disabled and reroute the traffic
    - if the traffic can be rerouted, set the link as *removable*
  - For  $i$  in 1 up to  $I_{u,v}^r$  *removable* links
    - declare the first  $i$  removable links to be turned off
    - create a tunnel between the concerned SND POP and the closest POP allowing to reach the traffic destination

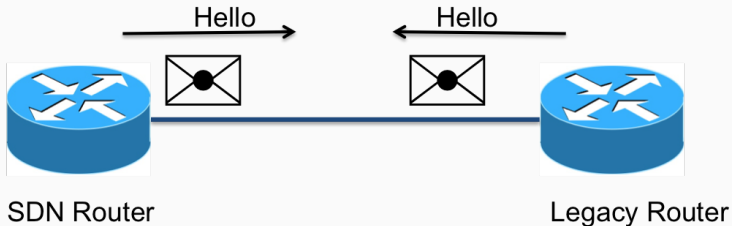
Goal: Turn off links, put routers in sleep mode and deal with unexpected network dynamics

- Link failure detection → sudden traffic decrease
  - Turn on all routers and links if  $E_i(t) \leq \beta * E_i^{ES}(t)$ ,  $\beta = 0.5$
- Traffic spike mitigation
  - Turn on all routers and links if  $E_i(t) \geq \alpha * E_i^{ES}(t)$ ,  $\alpha = 1.5$
- Safe link shutdown
  - Reroute traffic through tunnels (during legacy routing protocol convergence)
  - Trigger legacy routing convergence before actual turn off

# Triggering Legacy Routing Protocol Convergence

Goal: Smooth Router Shutdown

- Neighbor discovery through HELLO packet exchanges
- Link/Network failures detected after missing HELLO packets

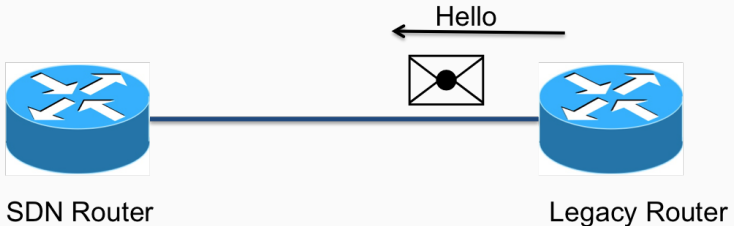




# Triggering Legacy Routing Protocol Convergence

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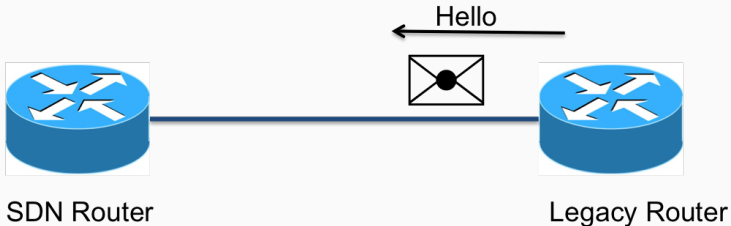
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  - SDN routers stop sending HELLO packets



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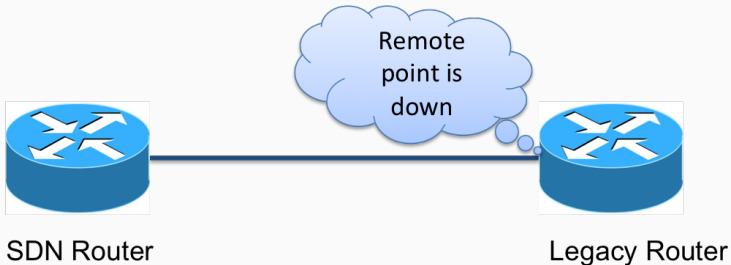
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# Triggering Legacy Routing Protocol Convergence

Goal: Smooth Router Shutdown

- Neighbor discovery through HELLO packet exchanges
- Link/Network failures detected after missing HELLO packets
  - SDN routers stop sending HELLO packets
  - Forward any incoming packet
  - Turn off a port and router when no more traffic is received



# Shutting Routers Down in ISP Networks

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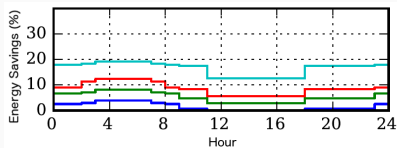
## Evaluation

- Tests on different network size from the SDNLib [Orlowski *et al.* 2007] database
  - *atlanta* - 15 nodes and 33 links
  - *germany50* - 50 nodes and 88 links
  - *zib54* - 54 nodes and 81 links
  - *ta2* - 65 nodes and 108 links
- Several parameters
  - Stretch ratio
  - Energy savings
  - and more

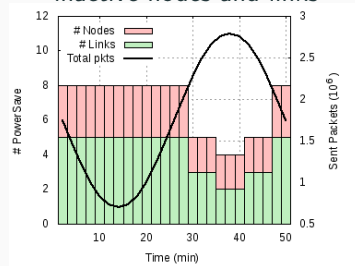
Experimental evaluation on *atlanta*

# Experimental Evaluation: Energy Savings

Realistic Traffic Pattern  $\Rightarrow$   
realistic energy savings

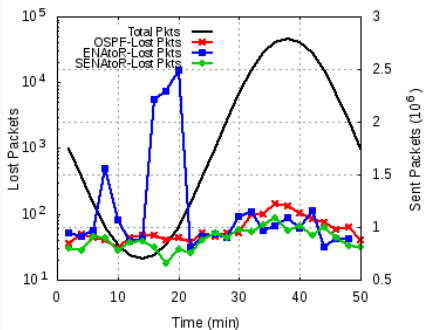


Sinusoidal Traffic Pattern  $\Rightarrow$   
Impact of traffic on the number of  
inactive nodes and links



# Experimental Evaluation: Packet Losses

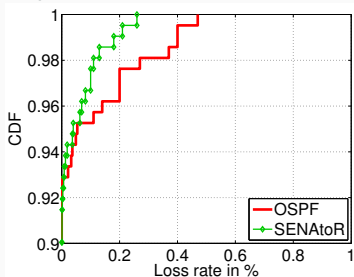
- OSPF - No device shutdown - baseline
- ENAtorR - Router shutdown - No smooth extinction
- SENAtorR - Smooth router extinction



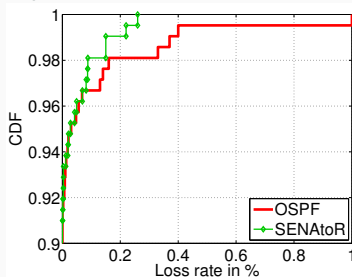
Takeaway: SENAtorR = OSPF without disabled devices!

# Experimental Evaluation: Traffic Spikes

Spike at a OSPF – SDN link



Spike at a OSPF – OSPF link



- SENAtorR successfully handle sudden traffic increases
  - Re-enabling links and routers
  - Fast load balancing

Takeaway: **SENAtorR outperforms OSPF** even in presence of disabled devices!



# Shutting Routers Down in ISP Networks

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## Conclusions

- Designing SENAtoR → Real network constraint
- SENAtoR can deliver complex green solutions to reality
  - Sleep mode for routers
  - Link disabling
- SENAtoR's green services does not degrade the Quality of Service offered by current networks

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  - Can do better

# SENAtoR for real networks

- Designing SENAtoR → Real network constraint
- SENAtoR can deliver complex green solutions to reality
  - Sleep mode for routers
  - Link disabling
- SENAtoR's green services does not degrade the Quality of Service offered by current networks
  - Can do better

Nicolas Huin, Myriana Rifai, Frédéric Giroire, Dino Lopez, Guillaume Urvoy-Keller and Joanna Moulrierac. *Bringing Energy Aware Routing closer to Reality with SDN Hybrid Networks*. To appear in IEEE Transactions on Green Communications and Networking. May 2018.

# **Massive Resources Consolidation in DCN**

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# Smart VM Placement

Virtual Machines placement to globally **optimize the resource utilization** and **decrease costs**:

- Server Consolidation
- Server Reconsolidation
  - Cold/Hot MV migration



Presence of **Idle VMs** has been reported in [Koomey *et al.* 2017]

- At least 30% of VMs are in an **idle state**
  - Long running services like mail or web servers [Zhang *et al.* 2016]
  - Testing VMs instantiated and rarely shut down

# The Problem

Idle VMs **lock** the physical resources assigned

- Instances need to serve **sudden requests**  $\implies$  VMs cannot be **powered off**
- Memory **overcommitment**  $\implies$  swapping  $\implies$  Performance degradation
- Memory is **wasted** and new tasks cannot be instantiated



# The Challenge

Idle machines can be identified as in [Franzini, 2012]

- Indicators: *Network transfer, disk R/W, CPU, page dirtying rate*

What after? How to release resources?

- **Suspended to RAM** the VM to release *CPU*, but **not** *RAM*
- **Suspended to Disk** the VM to release *CPU*, **and** *RAM*

**This is service disruptive and might hurt users' Quality of Experience!**

# Massive Resources Consolidation in DCN

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## Related Work

**Application proxies: DreamServer** [Knauth *et al.* 2014]

⇒ Each application protocol needs a custom proxy implemented

**Redesigning the platform: Picocenter** [Zhang *et al.* 2016]

⇒ Incompatible in scenarios where users want IaaS and VMs

**Remote memory: Oasis** [Zhi *et al.* 2016]

⇒ Specific hardware (low power mode) and patches for the hypervisor (partial VM migration)

**Snapshotting: CloudGC** [Zhang *et al.* 2017]

⇒ Snapshot creation of VMs will increase IO operations and from disk restoring might be too slow

# **Massive Resources Consolidation in DCN**

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**Our Solution: SEaMLESS**

# Our Solution: SEaMLESS

SEaMLESS key idea: transform a fully fledged idle VM in a resourceless lightweight VNF.

SEaMLESS pros

- Release resources locked by idle VM instances
- Full transparency and generic application support
- Fast response time upon user activity

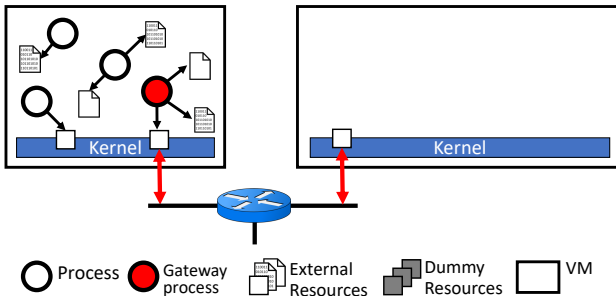
SEaMLESS comes as a

- *User-space solution* (Linux) compatible with existing technologies
- *No patch* for the VM kernel
- *No patch* for the hypervisor (based on KVM/QEMU)

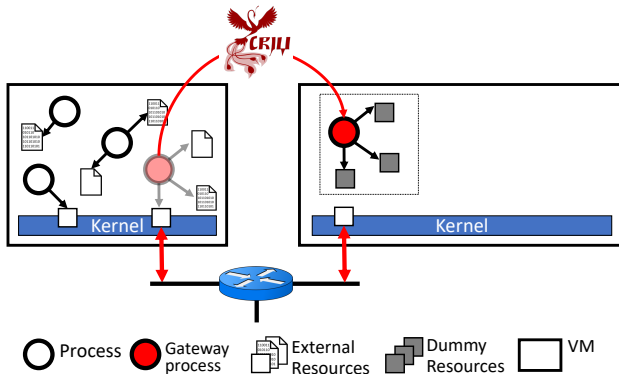
# Creating lightweight resourceless VNFs

## Gateway Process

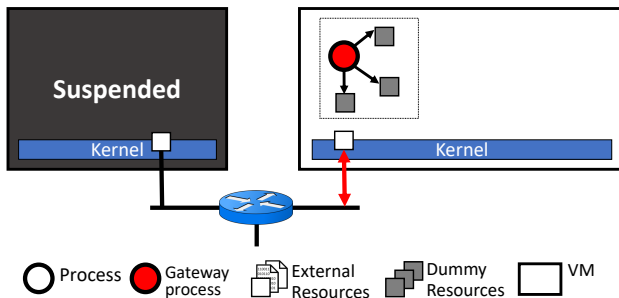
- Processes in a VM accepting end-user' requests
  - Web server, SSH server, FTP server, etc.
- Entry points for the VM



# Creating lightweight resourceless VNFs

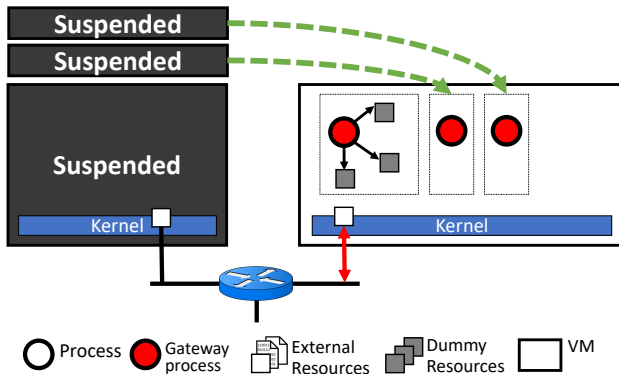


# Creating lightweight resourceless VNFs



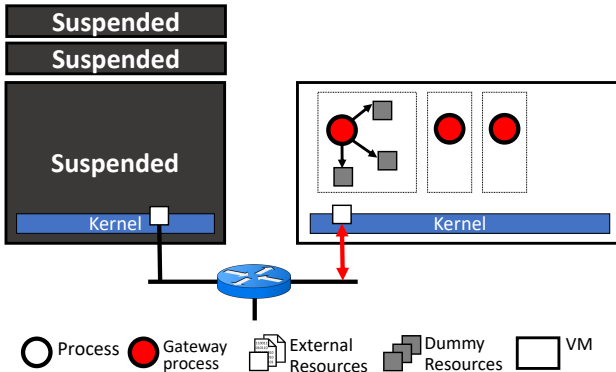


# Creating lightweight resourceless VNFs



# Creating lightweight resourceless VNFs

- Idle VMs transformed into resourceless VNFs (Sink VNFs)
- Hundreds of Sink VNFs consolidated on the Sink Server



# **Massive Resources Consolidation in DCN**

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**Permanent Service Availability**

# User Activity Detection

Not all the requests need to resume the VM

- **Trivial requests** can be replied by the VNF
  - Network-, Transport- and Application-Layer KeepAlive messages
  - Network Control packets
- **Non-trivial requests**, Gateway Process has to be inside the VM

How to detect **non-trivial** user requests?

- Gateway Processes interact with resources (read/write or open/close) via **System calls (Syscalls)**
- Monitor syscalls to detect users' activity

If `write()`, `read()`, `open()`, etc. on a resource outside the VNF  
⇒ **Resume the VM**

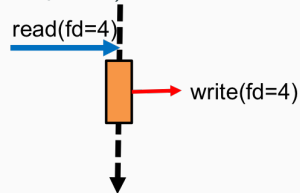
# User Activity Detection

## Classical Gateway Process at a Sink Container

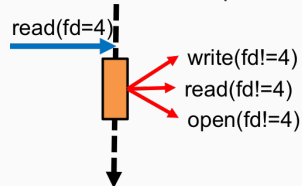
- Gateway Process with a network socket (syscalls on  $fd = 4$ )
- Other file descriptors pointing to empty/dummy resources



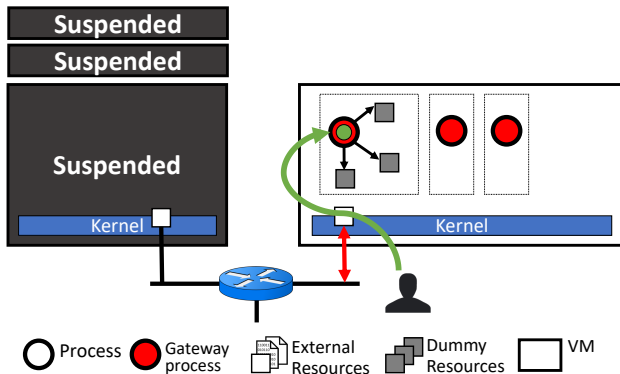
Trivial user request (e.g. KeepAlive)



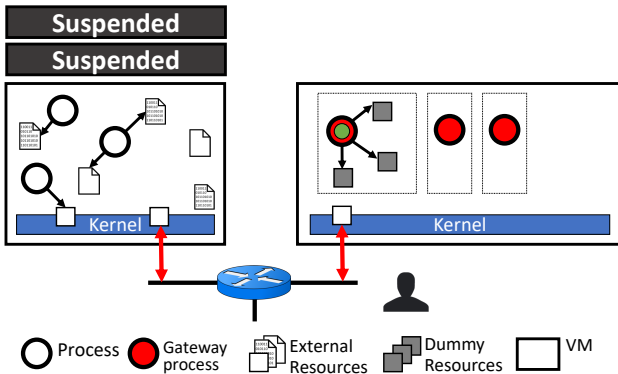
Non-Trivial User request



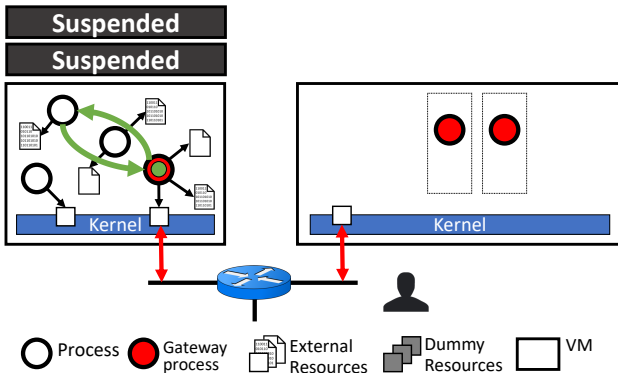
# Replying to Users' Requests



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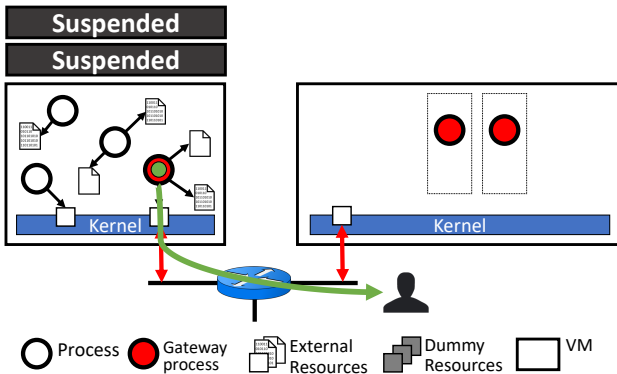


# Replying to Users' Requests





# Replying to Users' Requests



# **Massive Resources Consolidation in DCN**

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**Resource Releasing and Fast Service  
Restoration**

# Release the Resources

Different strategies to reclaim the resources allocated by a VM

## **Suspend to RAM**

- + Fast
- Only CPU released

## **Suspend to Disk**

- + RAM and CPU released
- Size dependent

# Release the Resources

Different strategies to reclaim the resources allocated by a VM

## Suspend to RAM

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## Suspend to Disk

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## Suspend to Swap

- + Immediate restart
- + Size independent
- + releases CPU
- + releases most of RAM

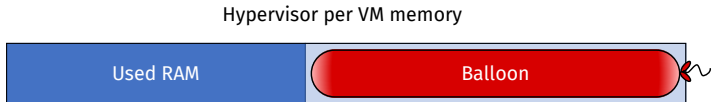
# Suspending to Swap

Hypervisor per VM memory



# Suspending to Swap

Balloning to retrieve free space



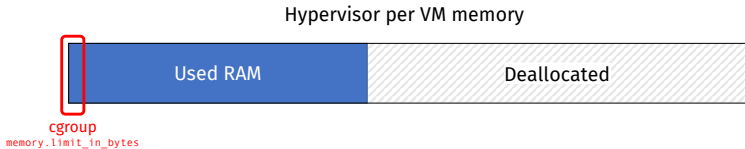
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Hypervisor per VM memory



# Suspending to Swap

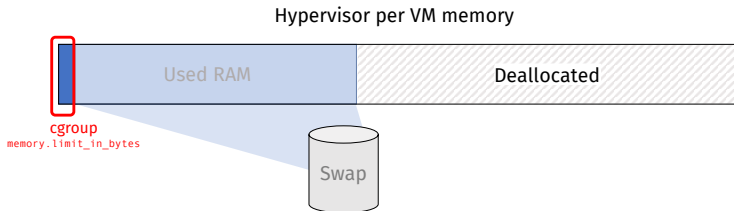
cgroups to constraint the hypervisor VM memory into a small size



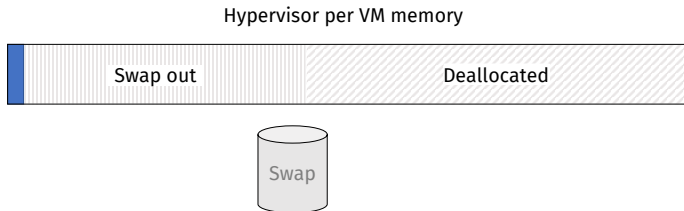


# Suspending to Swap

Swap out the memory to satisfy the cgroup constraint

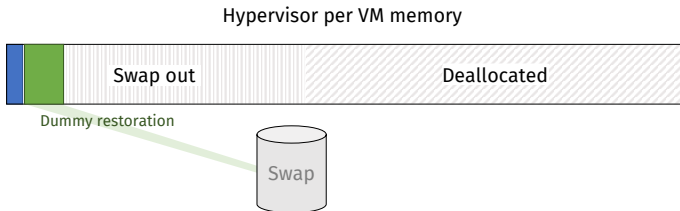


# Suspending to Swap



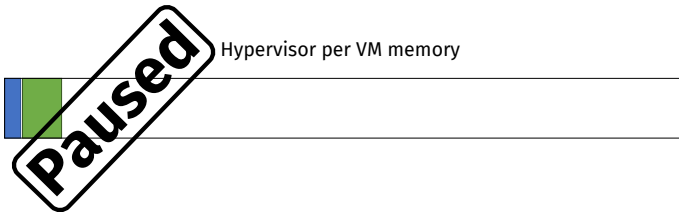
# Suspending to Swap

Dummy Restoration fetches pages likely to be used during a real restoration process  $\Rightarrow$  Fast VM reply



# Suspending to Swap

VM suspended to RAM



# Summary

1. *Idle VMs* are **turned** into *VNFs*
2. *Suspend to Swap* **releases** *CPU* and *memory* allocated
3. New users' *non-trivial requests* are **transparently intercepted**, the original VM is then **resumed** quickly

# **Massive Resources Consolidation in DCN**

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## **Performance Evaluation**

SEaMLESS prototype tested with regard to

- Perceived end-user Quality of Experience
- Resulting memory savings

All tests were conducted on Grid5000 [Balouek *et al.* 2013]

## Machine Specs

Dell PowerEdge R430

2 CPU Intel Xeon

32 GB RAM

10 GB Ethernet NICs

The VM's resuming delays the processing of the request

- **Migration delay**, time to restore the Gateway Process
- **Resume the VM**, time to restore the VM



# Impact over the QoE

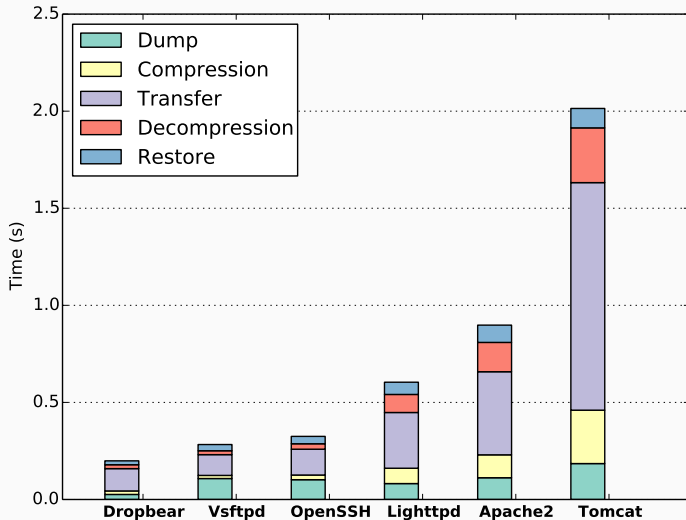
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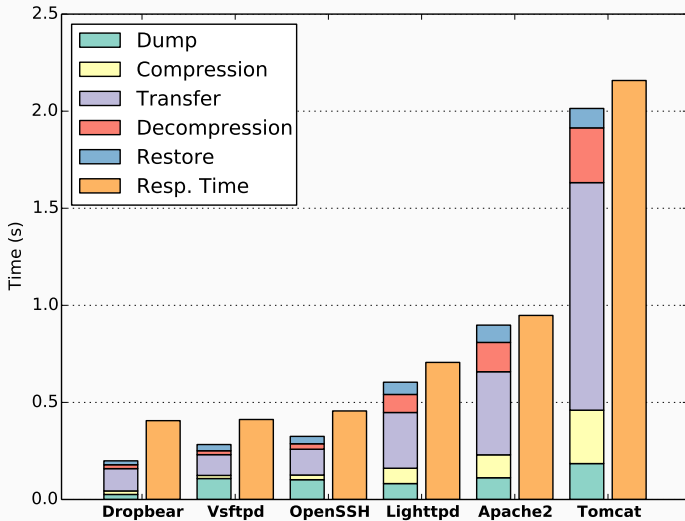
Restoring different Gateway Process depending on size and service

Application	Image Size (MB)	VNF Size (MB)
Dropbear	0.115	11.18
Vsftpd	0.107	7.81
OpenSSH	0.133	15.93
Lighttpd	0.287	46.43
Apache2	0.428	67.52
Tomcat	1.172	206.96

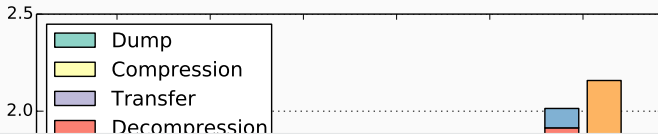
# Migration Delay



# Migration Delay

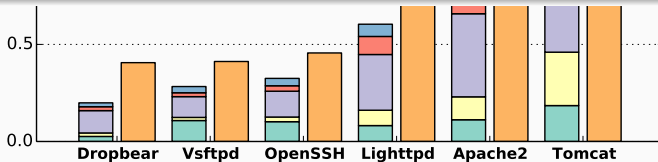


# Migration Delay



Acceptable response time for network applications [Chen *et al.* 2004]

- Less than 2 seconds for telenet apps.  
⇒ Dropbear and OpenSSH less than 0.5 seconds
- Less than 5 seconds for web browsing  
⇒ Lighttpd and Apache less than 1.0 seconds



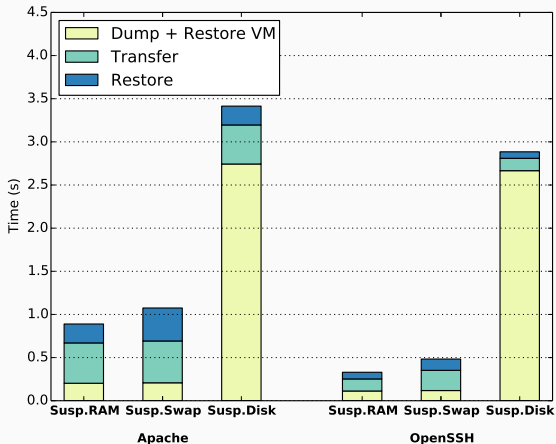
# Resuming the VM

Different strategies to reclaim the resources allocated by a VM

**Suspend to RAM**

**Suspend to Swap**

**Suspend to Disk**



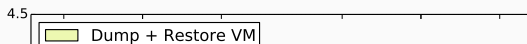
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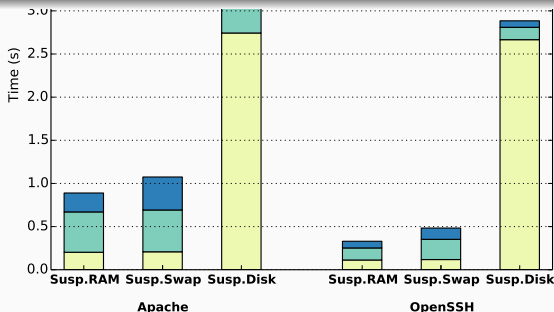
**Suspend to Swap**

**Suspend to Disk**



Suspend to Swap **response time**

⇒ **Similar to Suspend to RAM**



# Memory Savings

Tested **Suspend to Swap** with popular VM sizes from AWS

AWS Instances	Size (GB)	Reduced VM (GB)	Memory Saving (GB)
t1.micro	0.61	0.501	0.109
c1.medium	1.70	0.474	1.226
m1.small	1.70	0.474	1.226
c3.large	3.75	0.496	3.254
m1.medium	3.75	0.496	3.254
m3.medium	3.75	0.496	3.254
c1.xlarge	7.00	0.515	6.485
m1.large	7.50	0.511	6.989
m1.xlarge	15.00	0.527	14.473
m2.xlarge	17.10	0.560	16.540
m2.2xlarge	34.20	0.598	33.602

⇒ Reduced between **500** MB and **600** MB no matter the initial size

# Massive Resources Consolidation in DCN

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## Conclusions



Some limitations are inherited from the underlying technologies

- e.g., cannot handle Unix socket stream (CRIU)
- e.g., cannot intercept writes/reads to shared memory (ptrace)

Some workloads and applications are not suitable

- *Monolithic* processes with big memory footprint

- **Release resources** locked by idle VM instances  
⇒ Suspend to Swap deallocates CPU and the majority of RAM
- **Full transparency** and generic application support  
⇒ Sink VNF intercepts new requests and restarts VM
- **Fast response** time upon new activities  
⇒ Response time between 0.5 and 2 seconds

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A. Segalini, D. Lopez Pacheco, Q. Jacquemart, M. Rifai, G. Urvoy-Keller and M. Dione. *Towards Massive Consolidation in Data Centers with SEaMLESS*. In Proceedings of CCGrid 2018, 18th IEEE/ACM International Symposium on Cluster, Cloud and Grid Computin. Washington, DC, USA. May 2018.

## Final Thoughts

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Energy Optimization, but

- Need to provide high QoS
  - Keep SLA in mind
- Integrate real constraints... little by little
- SDN is your friend
  - be reasonable

**Questions?**

# References i



[Agarwal et al. 2013]

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