



FACULTY OF ENGINEERING AND
ARCHITECTURE

# Anycast (re)routing of multi-period traffic in dimensioning resilient backbone networks for multi-site data centers

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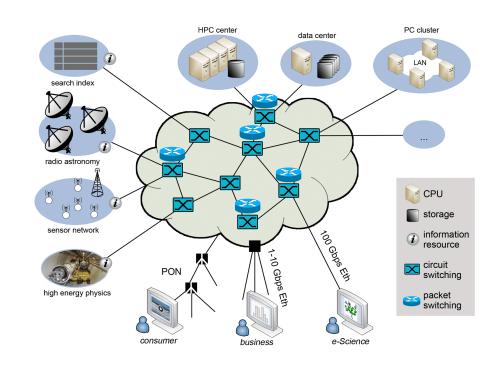




# **Optical clouds**

Optical networks crucial for increasingly demanding cloud services, e.g.,

- Computing:
  - High energy physics
  - Amazon EC2, Microsoft Azure
- Online storage:
  - Dropbox, Google Drive, etc.
- Collaboration tools:
  - MSOffice 365, Google Docs
- Video streaming:
  - Netflix, YouTube



C. Develder, et al., "Optical networks for grid and cloud computing applications", Proc. IEEE, Vol. 100, No. 5, May 2012, pp. 1149-1167.



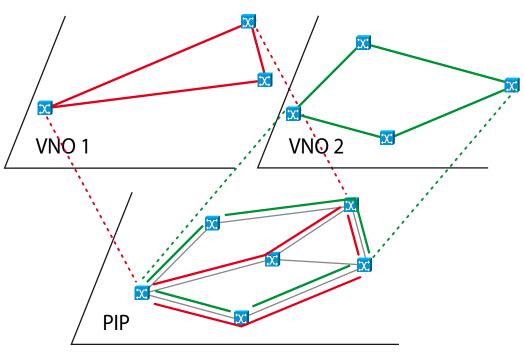


#### **Network virtualization**

Physical network is logically partitioned in isolated virtual networks

Virtual Network Operators
 (VNO) operate logically
 separate networks

Physical Infrastructure
 Providers (PIP) have full control over infrastructure (fibers, OXCs)



J.A. García-Espín, et al., "Logical Infrastructure Composition Layer: the GEYSERS holistic approach for infrastructure virtualisation", in Proc. TERENA Networking Conference (TNC 2012), Reykjavík, Iceland, 21-24 May 2012.





#### **Overview**

- 1. Introduction
- 2. Problem statement
- 3. Model & solution approach
- 4. Case study
- 5. Conclusions





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### Resiliently provisioning virtual cloud networks

#### How to choose the virtual to physical mapping, such that

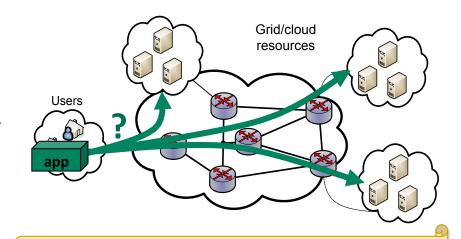
Services remain available in case of network failures



Bandwidth for providing services is minimal

#### Note:

- Anycast: requests coming from users can be served by any server
- Cloud services offered by VNO
- Cloud services run on top of PIP

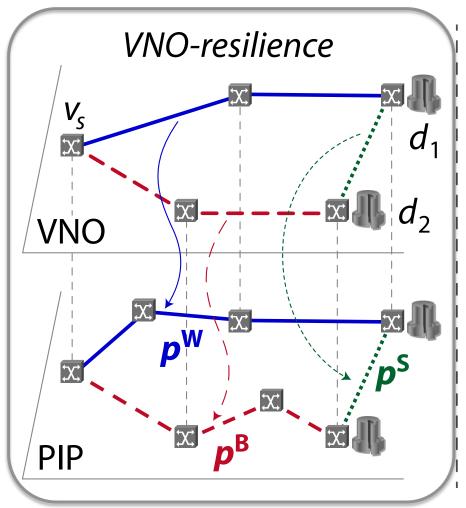


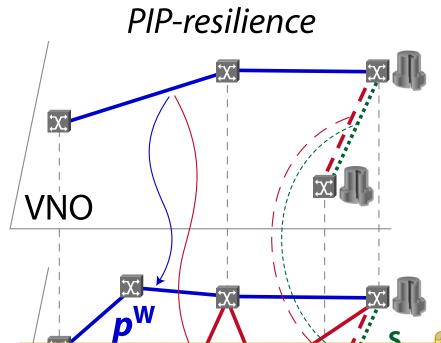
B. Jaumard, A. Shaikh and C. Develder, "Selecting the best locations for data centers in resilient optical grid/cloud dimensioning (Invited Paper)", in Proc. 14th Int. Conf. Transparent Optical Netw. (ICTON 2012), Coventry, UK, 2-5 Jul. 2012.





#### Two proposed protection schemes:





M. Bui, B. Jaumard, and C. Develder, "Anycast end-to-end resilience for cloud services over virtual optical networks" (Invited Paper), in Proc. 15th Int. Conf. Transparent Optical Netw. (ICTON 2013), Cartagena, Spain, 23-27 Jun. 2013.

This paper





#### Related work: Static traffic scenarios

- Traditional dimensioning (no virtualisation, no resilience):
  - Develder et al. 2009: Anycast, flexibility in choosing data center
- Resilient dimensioning problem:
  - Shaikh et al. 2011, Develder et al. 2013: scalable method, no synchronization between working and backup DCs
- Routing cloud requests and <u>mapping a VNet</u> to physical infrastructure separately:
  - Lee et al. 2009, Yu et al. 2010: Survivable VNet embedding, but assume VNet is given
  - Jiang et al. 2012, Alicherry et al. 2012: Optimal server selection and routing of anycast services in the physical layer for intra- and inter-DC networks but no resilient network design in the virtual layer
- VNet planning problem:
  - Barla et al. 2012, Barla et al. 2013: using mixed integer linear programming, but no synchronization between working and backup DCs
  - Bui et al. 2013 (ICTON): first model that incorporates **synchronisation path**, but *still static traffic!*
  - Bui et al. 2014 (ICTON): first model for <u>multi-period</u> scenario, but just considers 1 transition from a period T to T+1
  - Develder et al. 2015 (ICTON): first true multi-period model, cyclic sequence of periods





#### **Problem statement**

- Study time-varying traffic:
  - Traffic pattern changes from one period (t) to the next (t+1)
  - Optimize routes jointly for a <u>sequence of periods</u>
- Key research question: Benefit (in network resource usage) of changing routes for multiperiod traffic, i.e., that continues from t to t+1?
  - Does it help to only change backup paths?
  - ... or do we need to change working as well?
- Further analysis:
  - Impact of traffic: (i) varying fraction of traffic spanning multiple periods,
     (ii) varying number of regions with different traffic timing
  - Scalability: parallel solution scheme for column generation model





#### **Problem statement**

- Cloud network topology: G = (V, L), with V = nodes, L = links
- Given:
   Locations of the (candidate) data centers, V<sub>D</sub> ⊆ V
   Topology nodes are partitioned in time zones

  - Time is divided in multiple periods (time slots), and traffic

- Choice of primary and backup <u>DC locations</u> for each service,
   Primary, backup and synchronization <u>paths</u> in period t+1,
   in <u>each of the time slots</u> it lasts

Such that: Total network bandwidth cost is minimized

#### Where routing is:

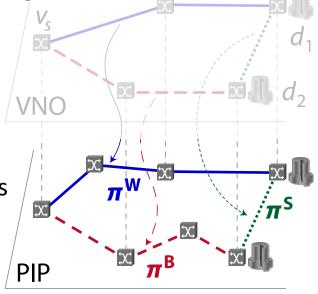
- Scenario I: unchanged,
- Scenario II: only changed for backup/synchronization paths
- Scenario III: freely changed (i.e., also allowed for working path)





# Solution: Column generation model

- Column generation idea:
  - Many different "configurations"
  - Start from a restricted subset of such "configurations"
  - Iteratively find additional configurations that reduce the cost:
    - (1) Restricted Master Problem (RMP) to use best existing configurations
    - (2) **Pricing Problem (PP)** to construct new configurations
- A configuration =
  - Working path from source to primary DC
  - Backup path from source to secondary DC
  - Sync path between the primary & backup DCs







# Column generation solution algorithm

Solve PP(v) for all sources v in parallel RMP Output / **Solve RMP** as LP: Selection of the best **PP Input:** Solve PP(v, t): configurations in each Generation of a new time slot Values of the dual promising configuration for variables source v at t **PP Output / RMP Input:** Move to other t New promising configuration  $c_v$  for New (at least some) source nodes v configuration w/ negative reduced Yes cost? No Solve RMP as LP is optimally All t successfully solved **ILP** tested? No Yes



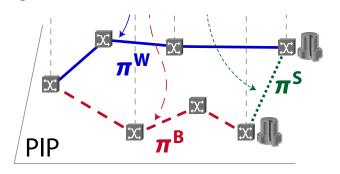


# **Restricted Master Problem (RMP)**

$$\begin{aligned} & \min \ \ \sum_{\ell \in L} \beta_{\ell}^{\text{W}} + \beta_{\ell}^{\text{B}} + \beta_{\ell}^{\text{S}} \cdot \|\ell\| \\ & + \text{PENAL}^{\text{DISRUPT\_BS}} \sum_{v \in V} \sum_{t \in T^{\star}} x_{v}^{\text{BS},t} \\ & + \text{PENAL}^{\text{DISRUPT\_W}} \sum_{v \in V} \sum_{t \in T^{\star}} x_{v}^{\text{W},t} \end{aligned}$$

#### **Constraints:**

- Assure all requests are granted
- Count configuration changes x<sup>BS,t</sup>, x<sup>W,t</sup>
- Compute W, B, S bandwidths



Case (ii): minimize # disruptions of B/S path

of multi-period traffic

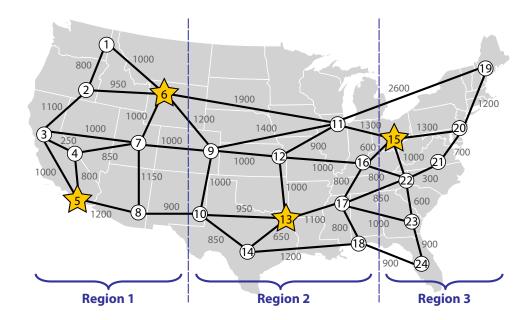
Case (iii): minimize # disruptions of W path of multi-period traffic





# **Case study**

- Topology:
  - 24 nodes, 43 links
  - Data centers in ☆:
     CA, WY, TX, OH



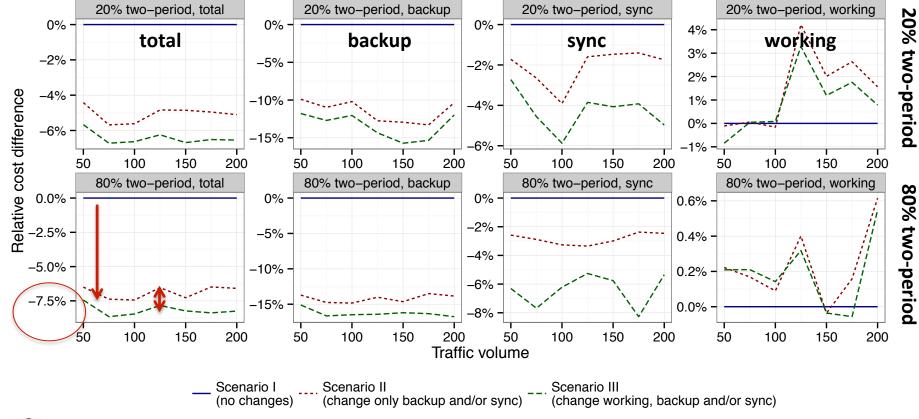
- Traffic: 3-region case
  - **Total traffic:** 33.3% region 1, 37.5% region 2, 29.2% region 3
  - Three periods: A: 14%, B: 38%, C: 48%
    - Region 1: A, B, C
    - Region 2: B, C, A
    - Region 3: C, A, B
  - Duration:
    - Pattern #1: 20% two-period, 80% single period traffic
    - Pattern #2: 80% two-period, 20% single period traffic





#### **Results: Net total bandwidth savings?**

- 1. Relative total cost savings up to nearly 8% (pattern #2, i.e., more multi-period traffic)
- 2. Capacity savings are realized mainly by **sharing of backup** (backup savings >15%)
- Saving by only changing backup/synchronization (Scenario II) almost as good as when also changing working (Scenario III)

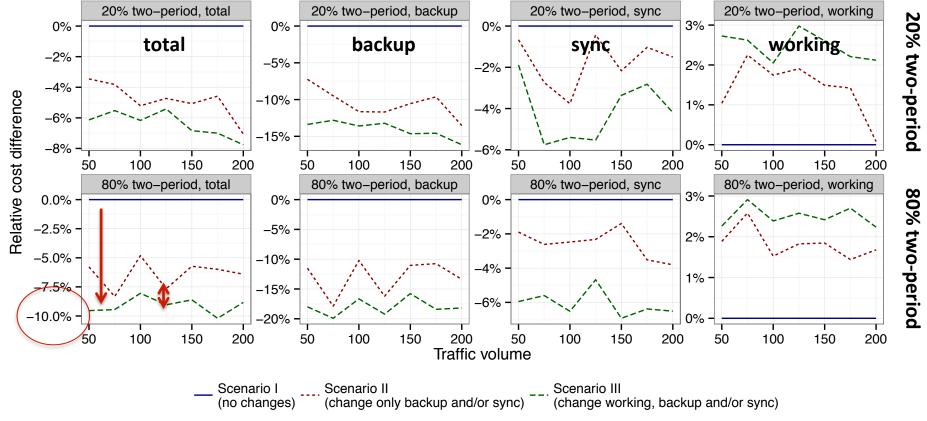






# Results: Net total bandwidth savings for 4 regions

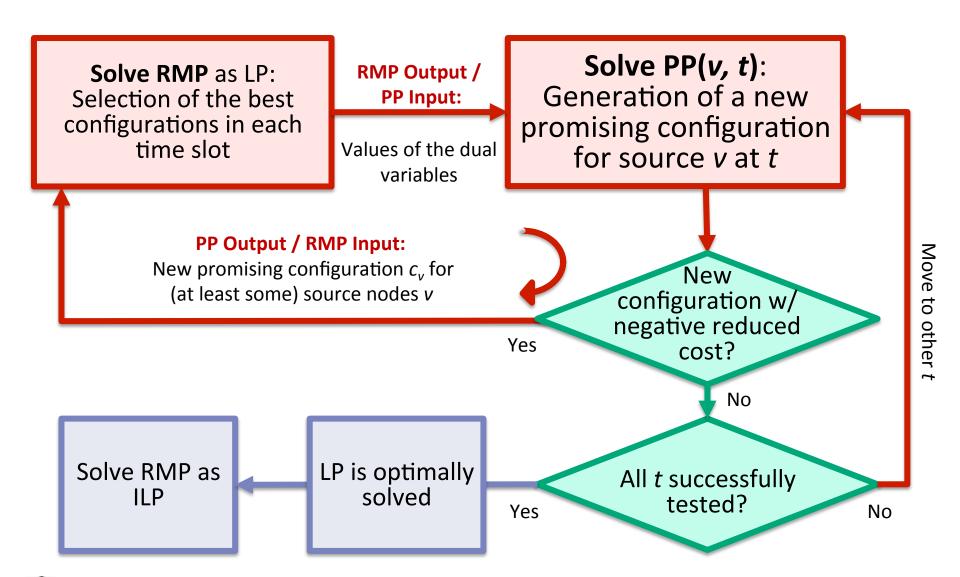
- 1. Relative total cost savings up to nearly **10%** (pattern #2, i.e., more multi-period traffic)
- 2. Capacity savings are realized mainly by **sharing of backup** (backup savings >15%)
- 3. Saving by only changing backup/synchronization (Scenario II) almost as good as when also changing working (Scenario III)







# Solution scheme: serial vs parallel







## Solution scheme: serial vs parallel

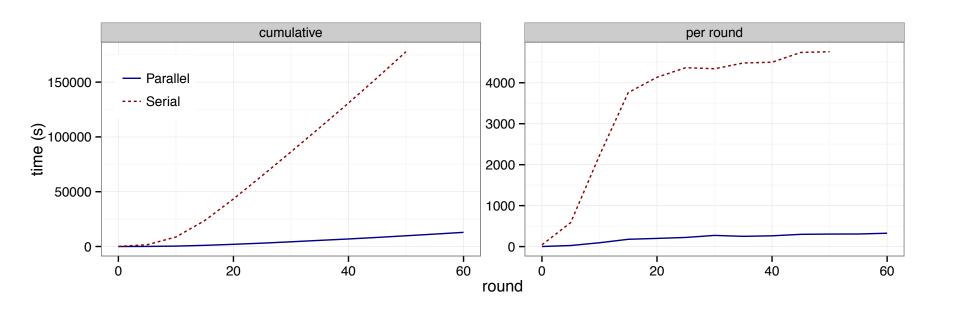
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# Scalability: Time savings by parallel PP solving

Only re-solve RMP after adding multiple configurations (i.e., for multiple source nodes)!







#### **Conclusions**

- Scalable column-generation method (w/ parallel solving of multiple PPs) for resilient VNet planning of time-varying traffic, <u>over all</u> <u>periods together</u>
- Our (relatively limited) case study shows that:
  - Changing routing from one period to the next saves several % of the total bandwidth cost (mostly backup cost savings)
  - ... but we need only to change about 50% of them
  - ... and only changing backup/synchronization seems to suffice
  - Savings seem to increase for (i) more multi-period traffic,
     (ii) more regions
- Future work: Optimize DC locations (e.g., 'scattered' vs 'paired', see ICTON 2013)





# Thank you ... any questions?



