

Combinatorial Optimization @ Work 2015

Optimization of Telecommunication Networks

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30 Sep 2015



Research Center MATHEON
Mathematics for Key Technologies



Berlin
Mathematical
School



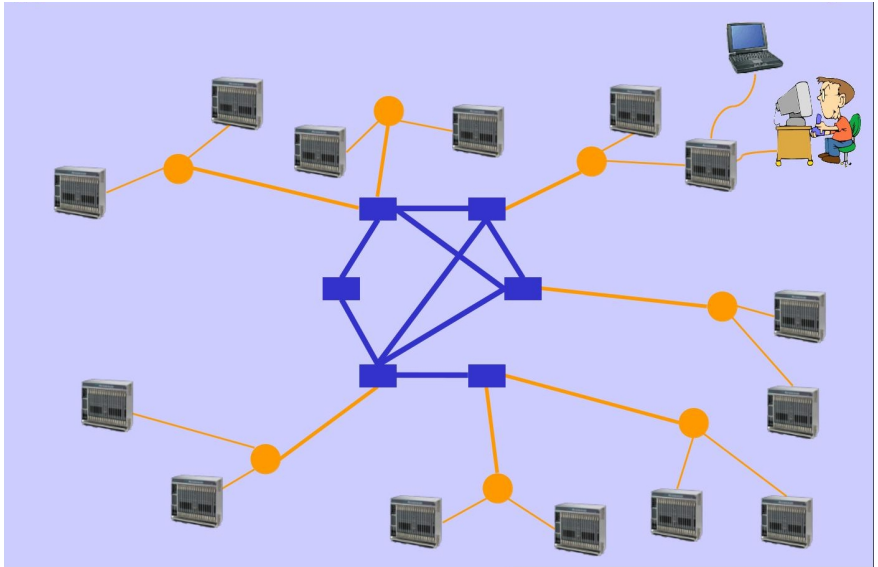
MODAL
Mathematical Optimization and Data Analysis Laboratories

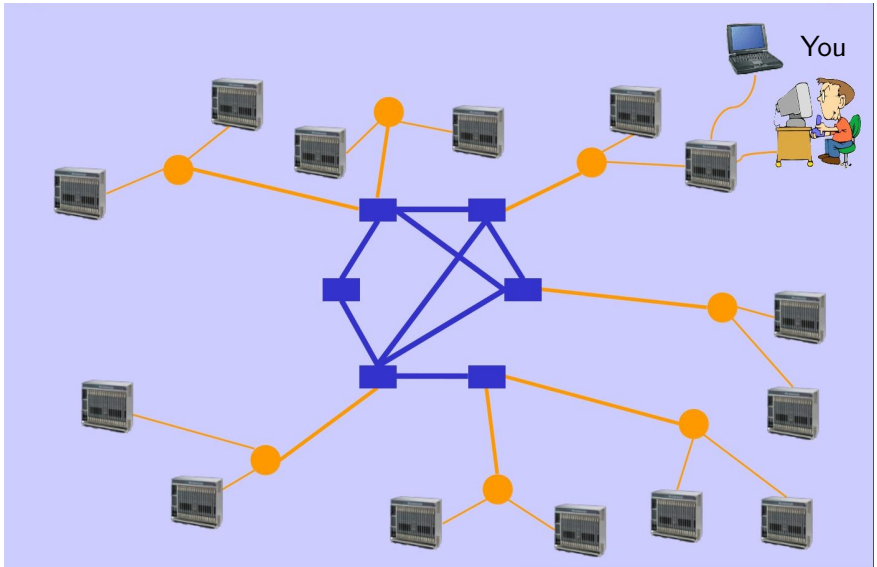
Introduction

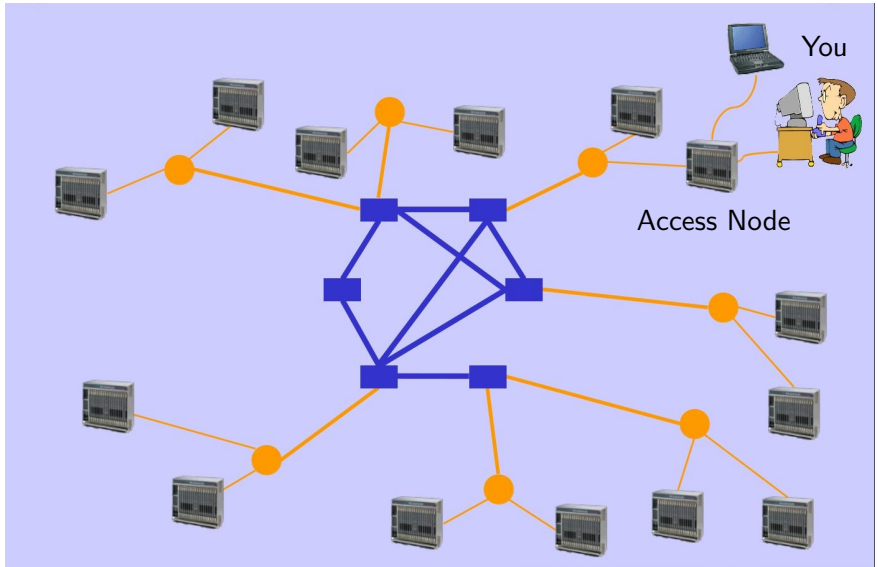
Network Layout Planning

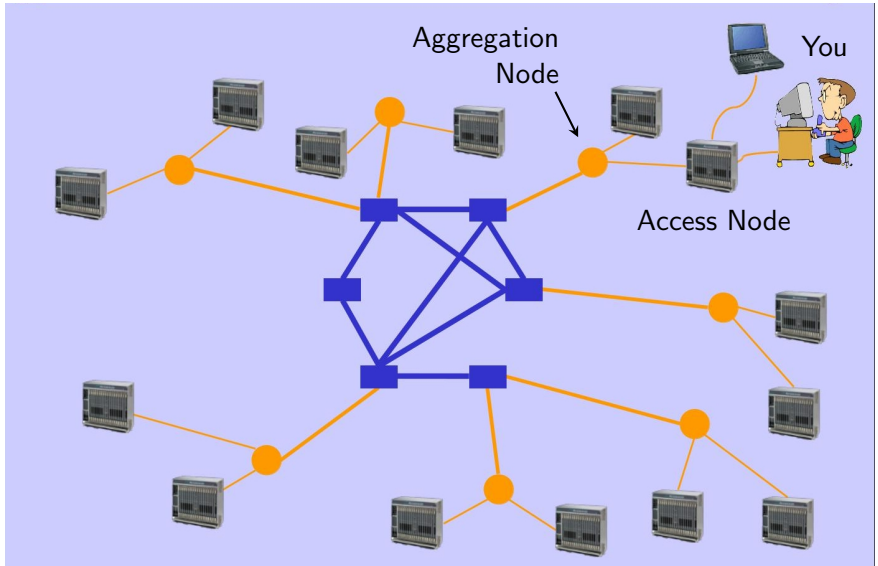
Network Dimensioning and Routing

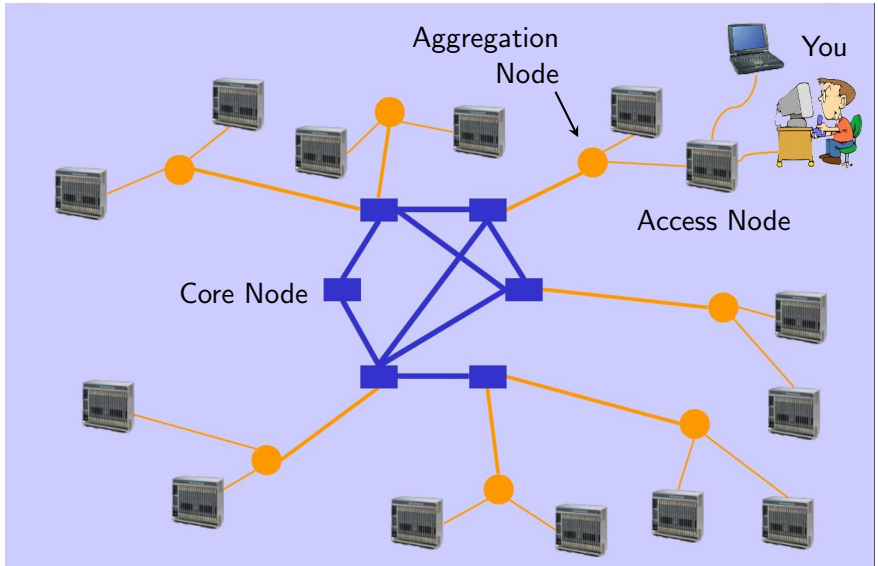
Further Topics

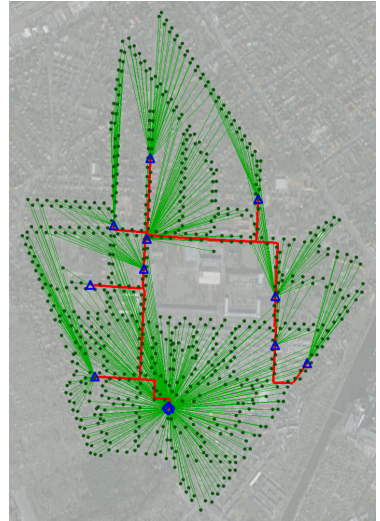
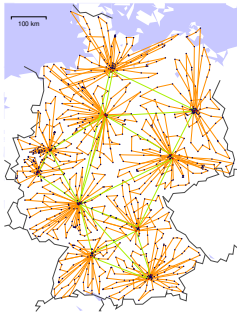
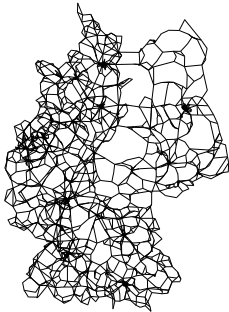












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 - ▶ How to connect customers to access nodes, access nodes to core nodes, and core nodes among themselves?
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- ▶ Further stuff
 - ▶ Wavelength assignment
 - ▶ Virtual networks
 - ▶ Dynamic traffic
 - ▶ Wireless networks

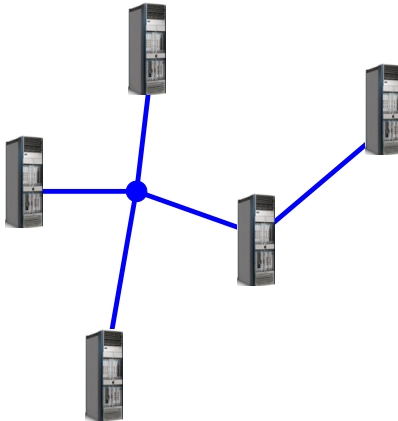
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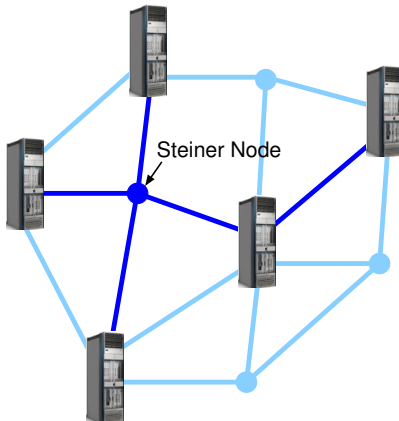
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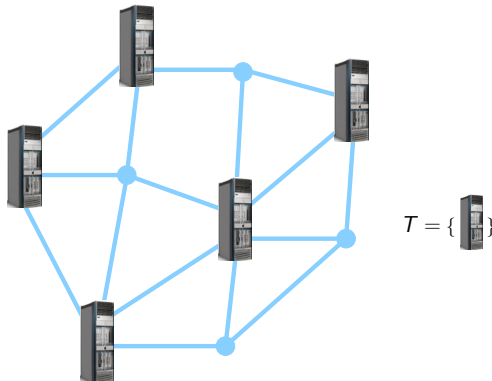


Definition

Given a graph $G = (V, E)$ with **terminals** $T \subseteq V$

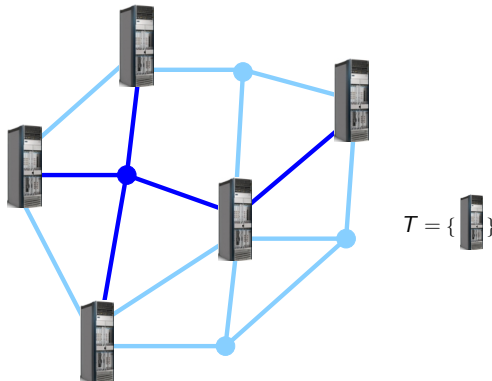
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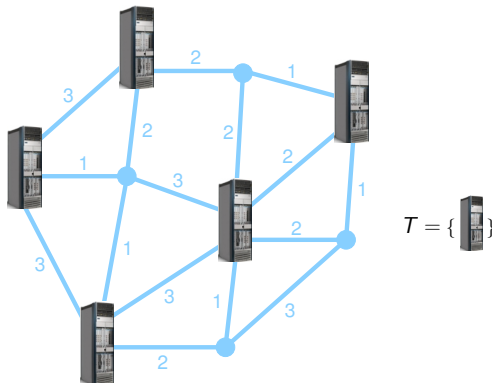


Definition (Minimum Steiner Tree Problem)

Given: $G = (V, E)$, terminals $T \subseteq V$, edge weights c_e for all $e \in E$

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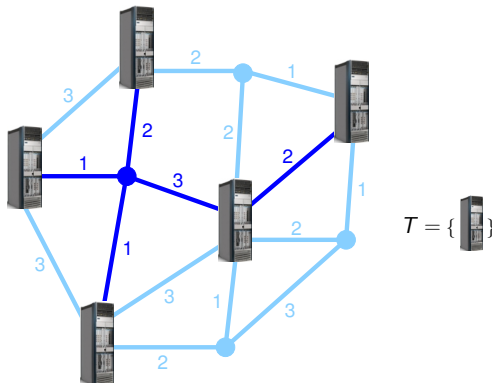
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Theorem (Garey & Johnson, 1979)

The Steiner Tree Problem is NP-complete.

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Simple special cases:

- ▶ $|T| = 2$: Shortest Path Problem
- ▶ $T = V$: Minimum Spanning Tree Problem

Undirected Cut Formulation (Aneja 1980)

$$\begin{array}{ll} \min & c^T x \\ \text{s.t.} & x(\delta(U)) \geq 1 \quad \forall U \subset V \text{ with } \emptyset \neq U \cap T \neq T \\ & x_e \in \{0, 1\} \quad \forall e \in E \end{array}$$

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Undirected vs. Directed Cut Formulation:

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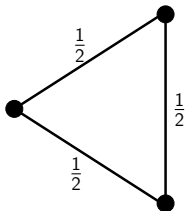
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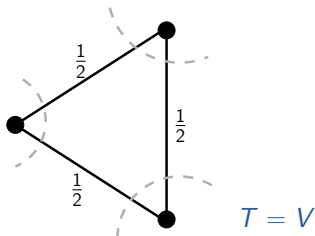
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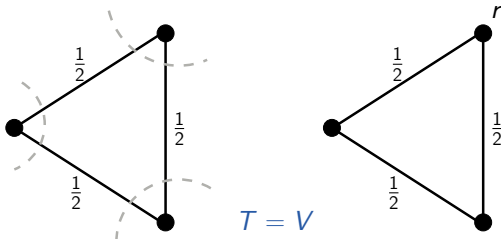
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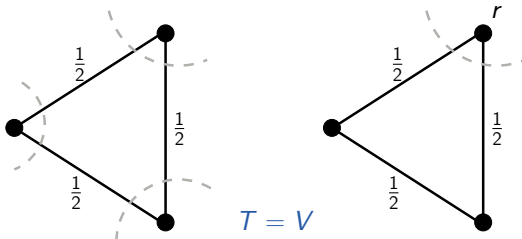
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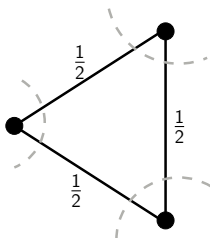
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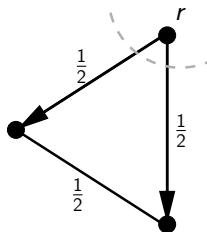
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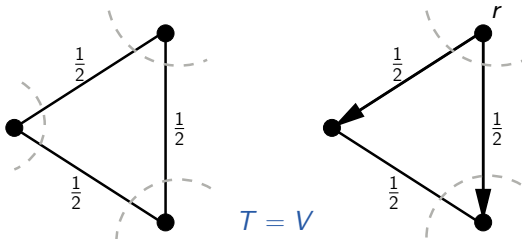
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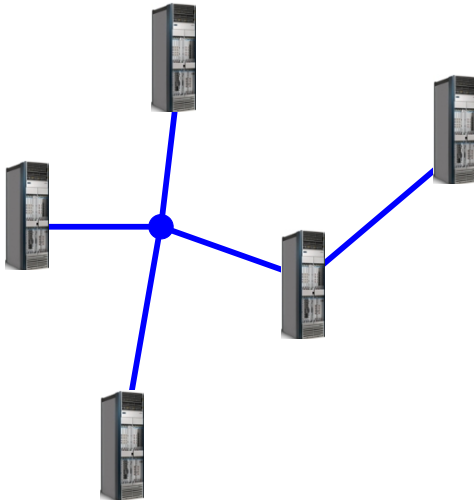
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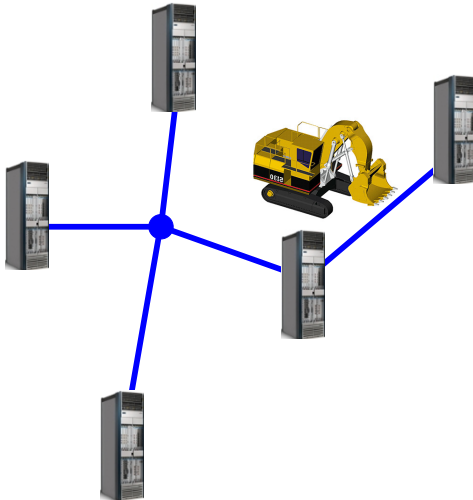
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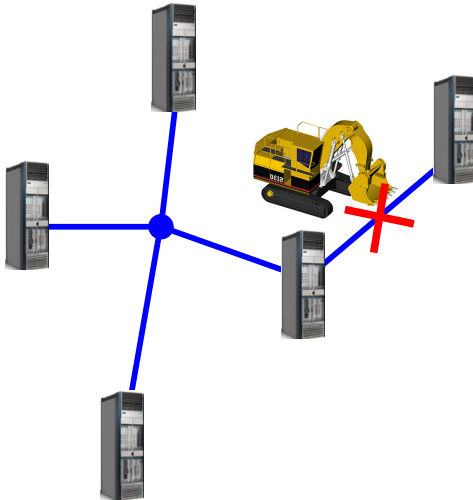
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- ▶ **(Multicommodity) flow formulation:**

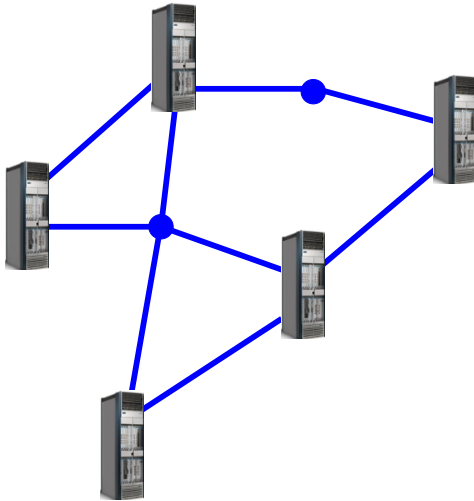
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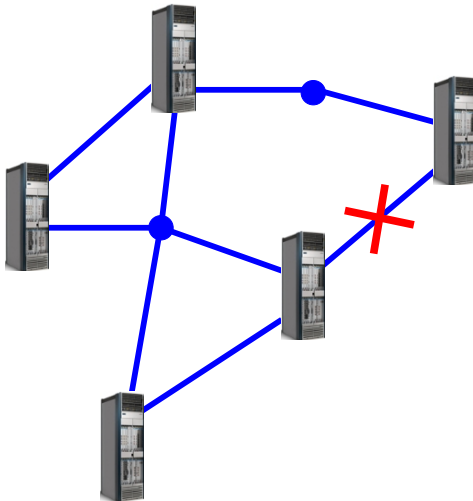
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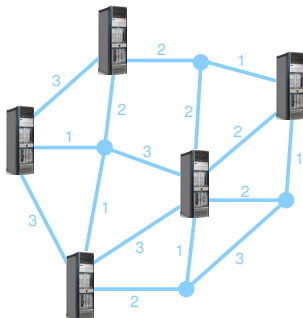






Definition (Edge-Survivable Network Design Problem)

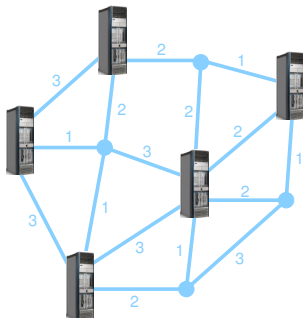
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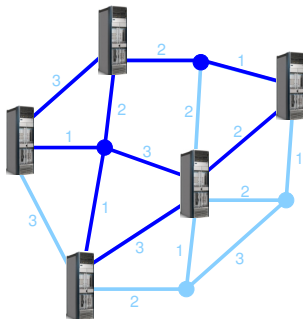
Find: Minimum cost subgraph containing all $v \in T$
that has at least **two** edge-disjoint s - t -paths for all $s, t \in T$



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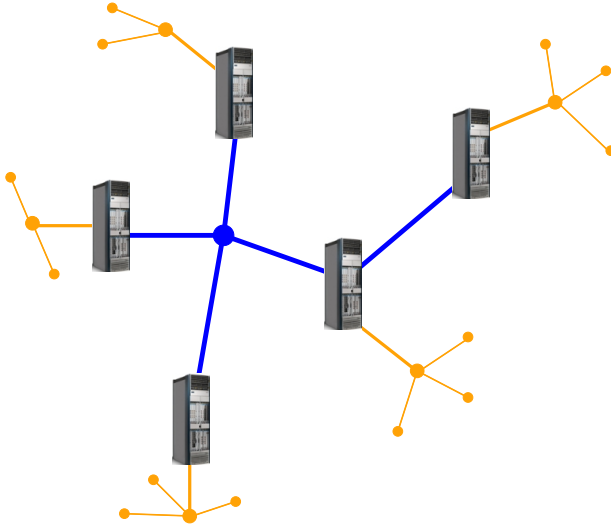
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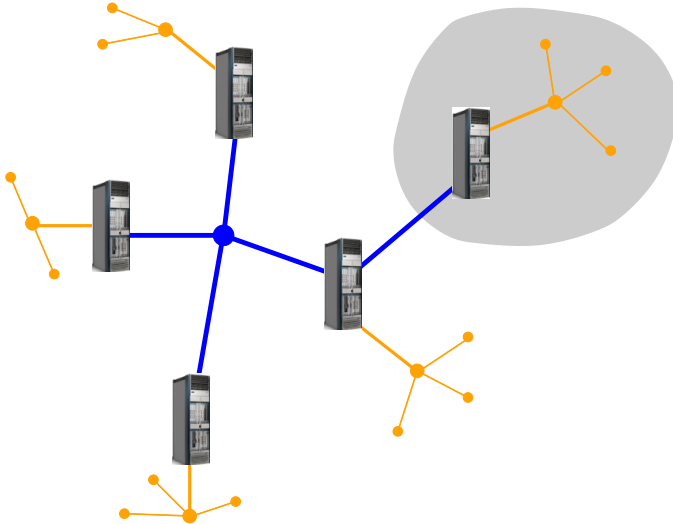
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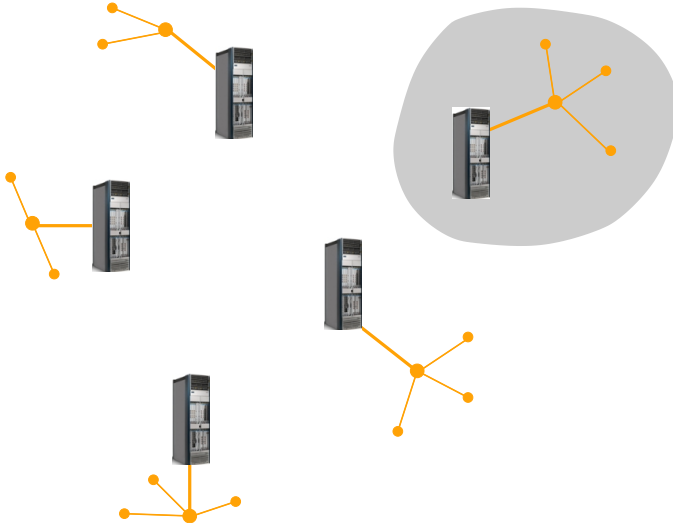
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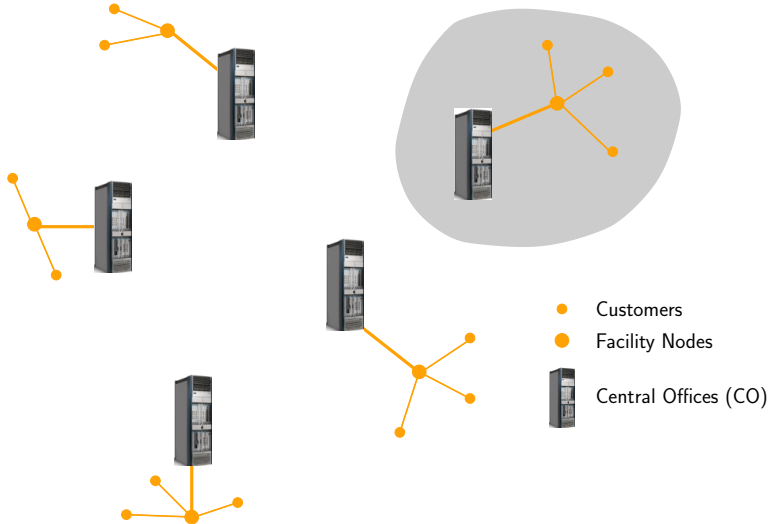
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$$\begin{aligned} \text{s.t.} \quad & \sum_{a \in \delta^+(v)} f_{st,a} - \sum_{a \in \delta^-(v)} f_{st,a} = \begin{cases} 2, & v = s \\ 0, & \text{else} \end{cases} & \forall s, t \in T, v \neq t \\ & f_{st,(i,j)} + f_{st,(j,i)} \leq x_e & \forall s, t \in T, e = \{i, j\} \in E \\ & f_{st,a} \in \{0, 1\} & \forall s, t \in T, a \in A \\ & x_e \in \{0, 1\} & \forall e \in E \end{aligned}$$



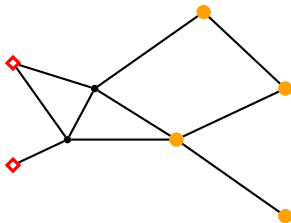






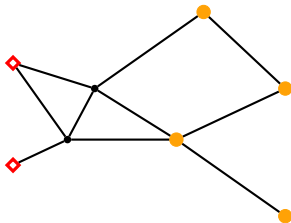
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Given: $G = (V, E)$, edge costs c_e for all $e \in E$;



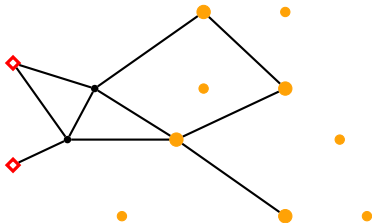
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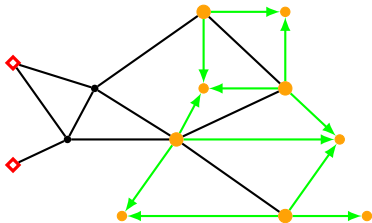
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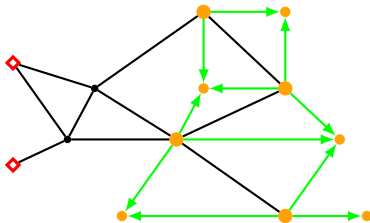
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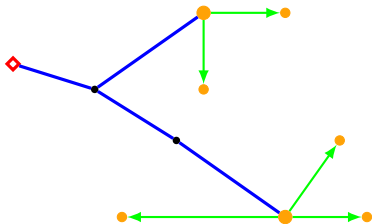
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► Connectivity using undirected cuts:

$$\begin{aligned} \min \quad & \sum_{v \in F} c_v y_v + \sum_{(v,j) \in A} c_{vj} x_{vj} + \sum_{e \in E} c_e x_e \\ \text{s.t.} \quad & x(\delta(U)) \geq y_v \quad \forall v \in F, v \in U \subset V \\ & x_{vj} \leq y_v \quad \forall v \in F, (v,j) \in A \\ & \sum_{(v,j) \in A} x_{vj} = 1 \quad \forall j \in C \\ & y_v \in \{0, 1\} \quad \forall v \in F \\ & x_{vj} \in \{0, 1\} \quad \forall (v,j) \in A \\ & x_e \in \{0, 1\} \quad \forall e \in E \end{aligned}$$

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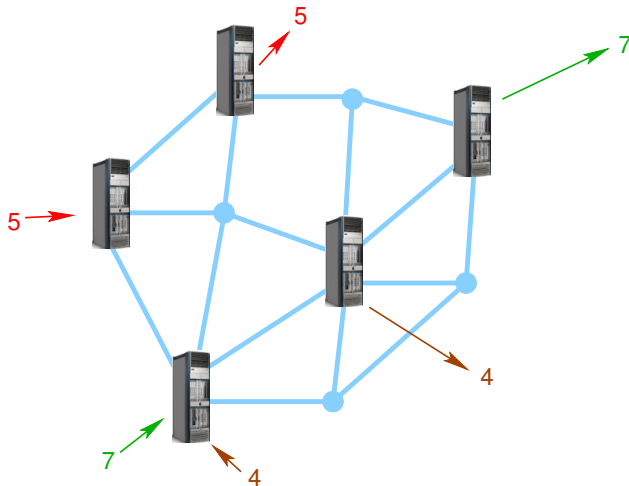
- Variants and improvements: directed cuts, customer cuts, flow, ...
- Extensions: different types of facilities, coverage requirements, customer demands, capacities, ...

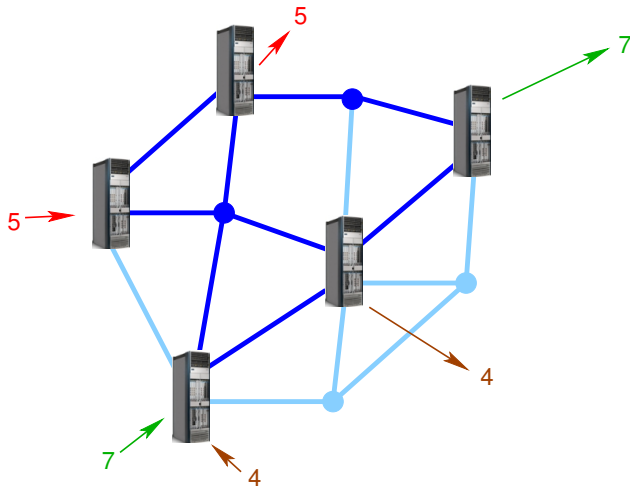
Introduction

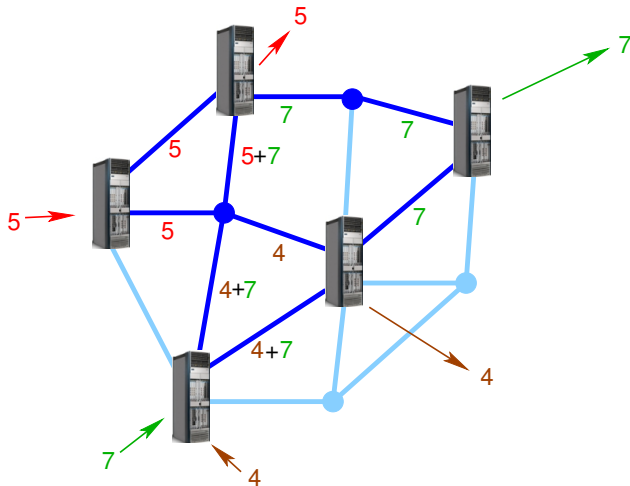
Network Layout Planning

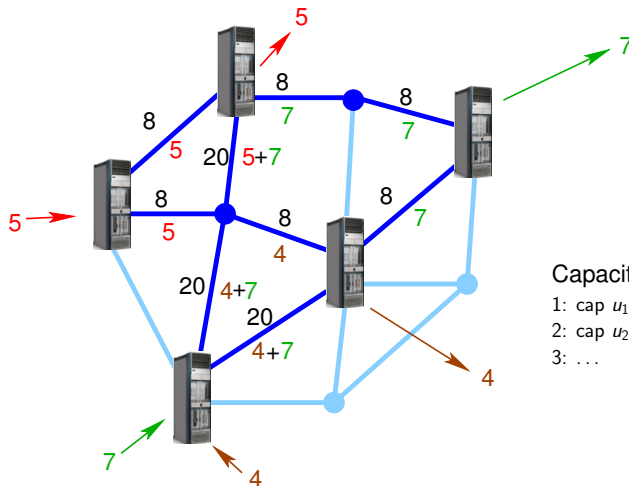
Network Dimensioning and Routing

Further Topics







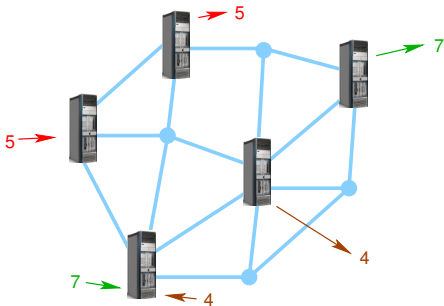


Capacity modules:

- 1: cap $u_1 = 8$, cost $c_1 = 1$
- 2: cap $u_2 = 20$, cost $c_2 = 2$
- 3: ...

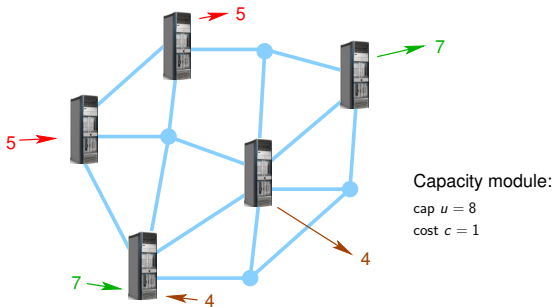
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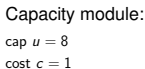


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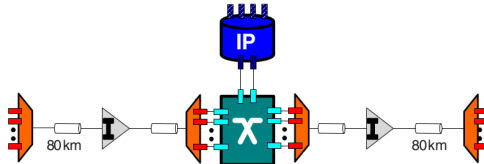
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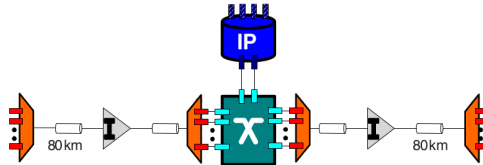
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- ▶ Multilayer networks

IP-over-WDM (*Internet Protocol/Wavelength Division Multiplexing)



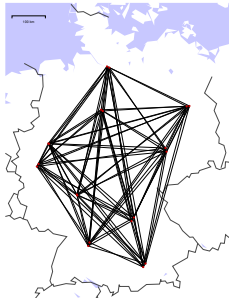
IP-over-WDM (*Internet Protocol/Wavelength Division Multiplexing)



IP layer

logical links
between IP
routers

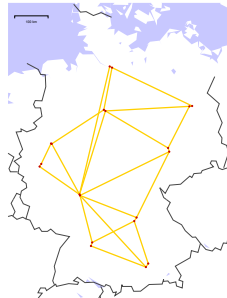
data encoded
and routed as IP
packets



WDM layer

fiber connections
between optical
devices

IP packets
transmitted as
optical signals



$$\min \sum_{i \in V} E_P y_i + E_S x_i + E_L z_i + E_F w_i + \sum_{e \in E} E_e z_e$$

$$\sum_{\{i,j\} \in L} f_{i,j}^s - f_{j,i}^s = \begin{cases} \sum_{t \in T(s)} d_{(s,t)}, & i = s \\ -d_{(s,i)}, & i \in T(s) \\ 0, & \text{otherwise} \end{cases} \quad \forall i \in V, s \in V$$

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routing &
dimensioning
IP layer

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Network Planning: Multilayer Networks

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counting
hardware

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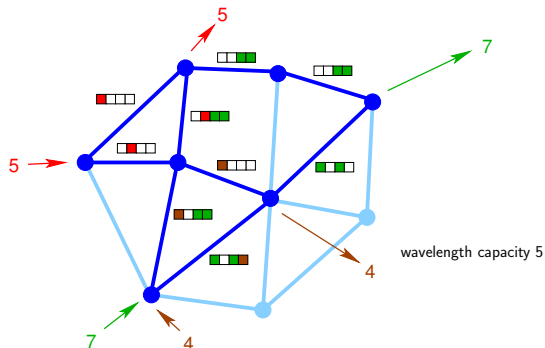
Introduction

Network Layout Planning

Network Dimensioning and Routing

Further Topics

Optical signals on a WDM system are multiplexed



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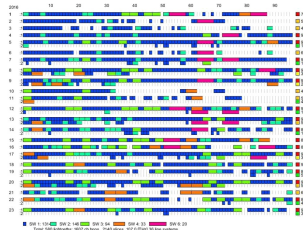
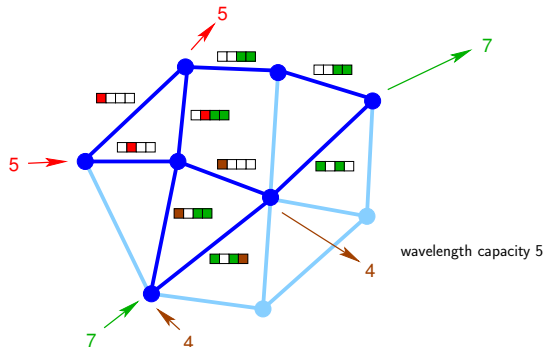


figure: ADVA

Optical signals on a WDM system are multiplexed

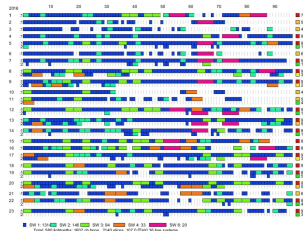
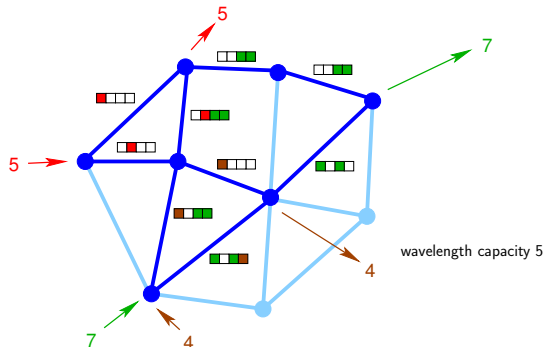
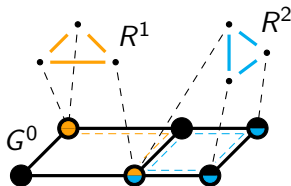


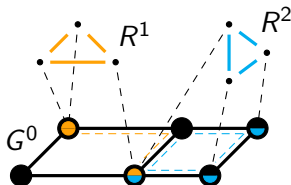
figure: ADVA

→ **Wavelength Assignment Problem:** For each optical link, find an assignment of optical connections using this link to 96 color slots!

Virtual network requests instead of demands:

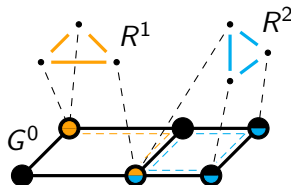


Virtual network requests instead of demands:



Virtual Network Embedding Problem: Given a substrate network G^0 and network requests R^1, \dots, R^n , find an optimal embedding of as many requests as possible into G^0 !

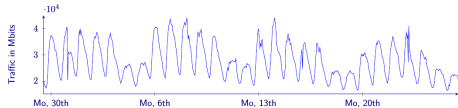
Virtual network requests instead of demands:



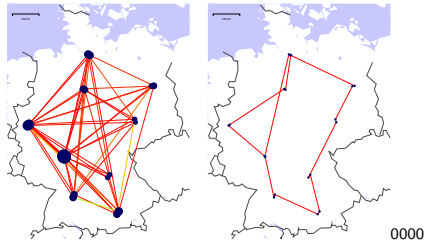
Virtual Network Embedding Problem: Given a substrate network G^0 and network requests R^1, \dots, R^n , find an optimal embedding of as many requests as possible into G^0 !

- ▶ Requests are dynamically changing over time
 - reoptimization necessary
 - online problem

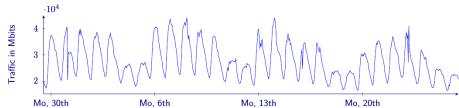
Network demands fluctuate:



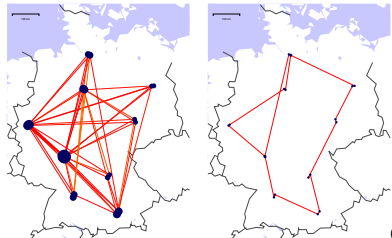
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

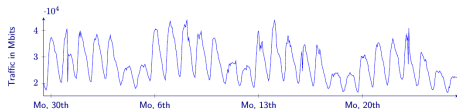


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

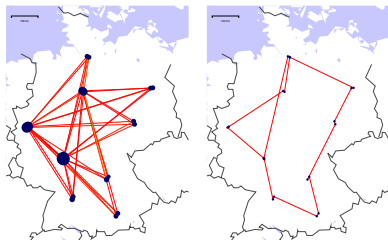


0030

Network demands fluctuate:

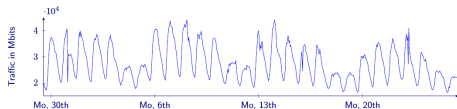


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

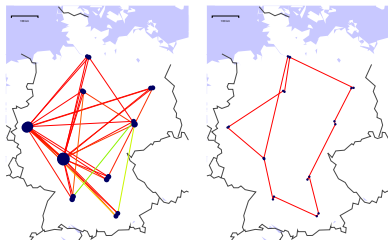


0100

Network demands fluctuate:

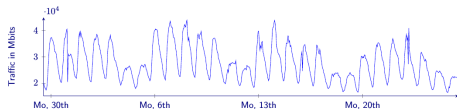


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

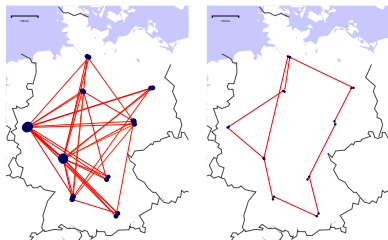


0130

Network demands fluctuate:



→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

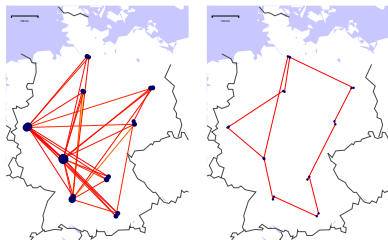


0200

Network demands fluctuate:

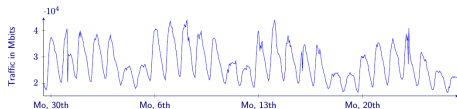


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

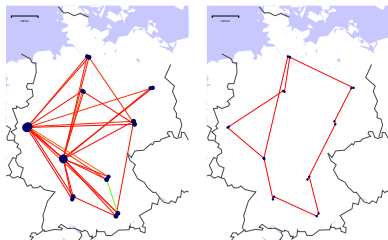


0230

Network demands fluctuate:

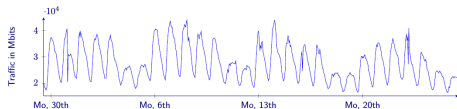


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

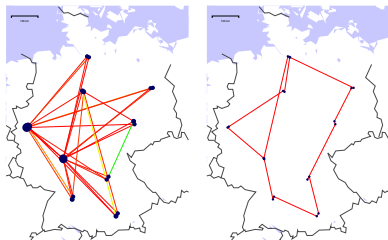


0300

Network demands fluctuate:

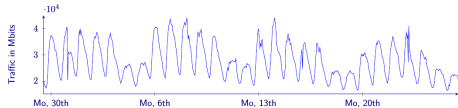


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

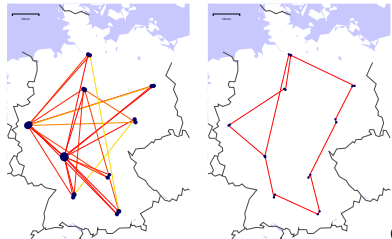


0330

Network demands fluctuate:

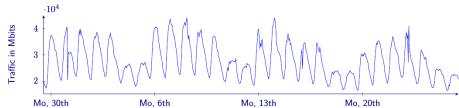


- ➔ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

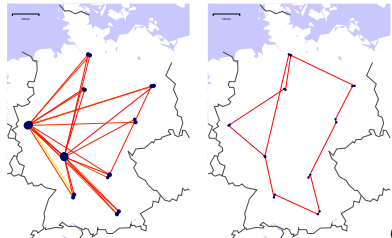


0400

Network demands fluctuate:

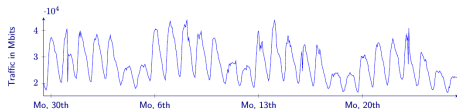


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

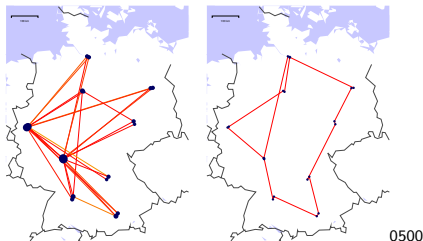


0430

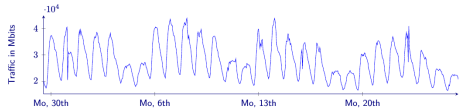
Network demands fluctuate:



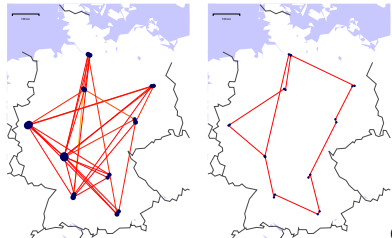
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

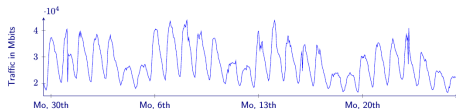


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

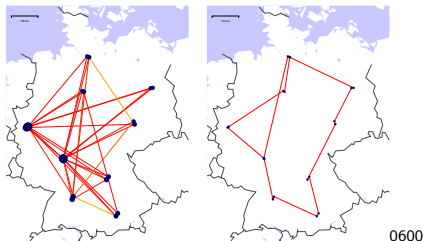


0530

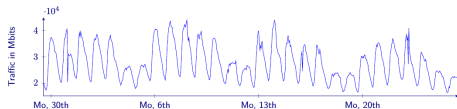
Network demands fluctuate:



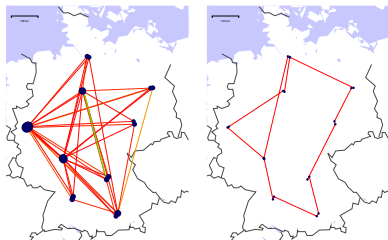
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:



→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

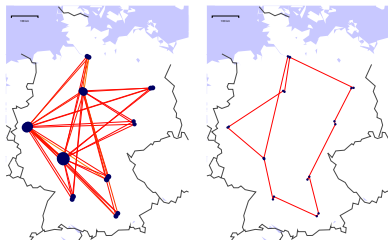


0630

Network demands fluctuate:

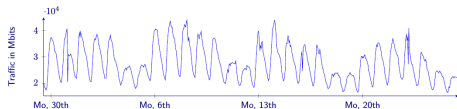


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

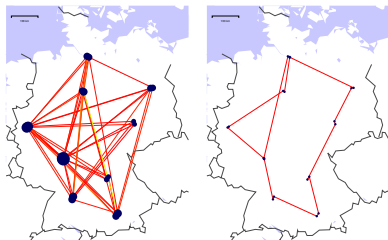


0700

Network demands fluctuate:

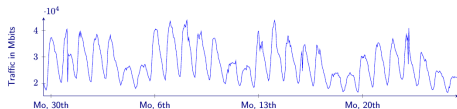


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

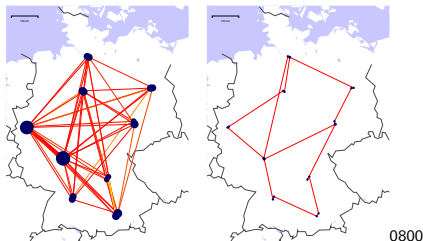


0730

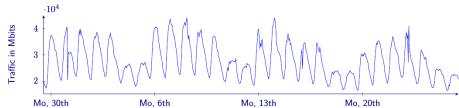
Network demands fluctuate:



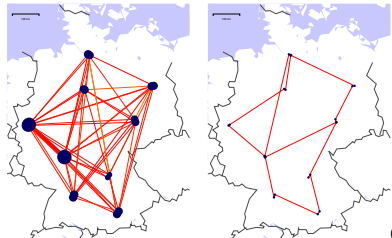
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

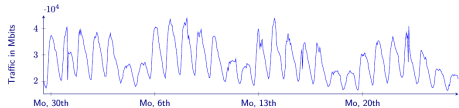


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

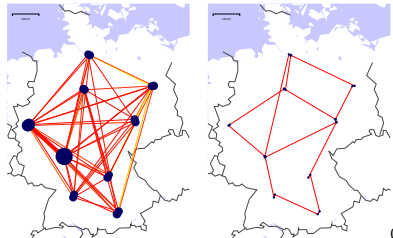


0830

Network demands fluctuate:

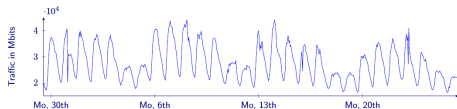


- ➔ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

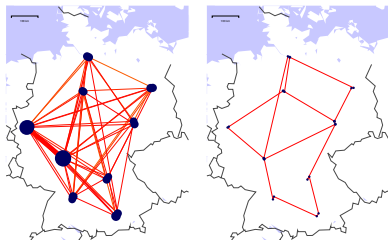


0900

Network demands fluctuate:

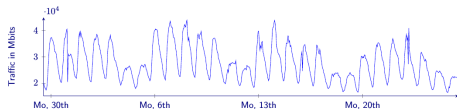


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

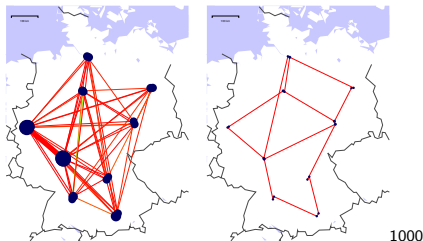


0930

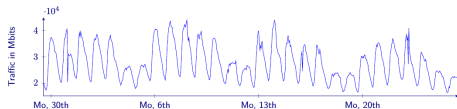
Network demands fluctuate:



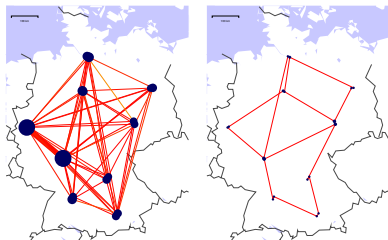
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

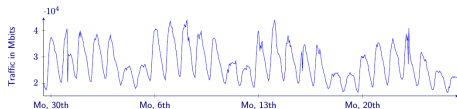


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

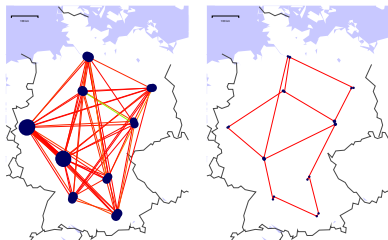


1030

Network demands fluctuate:

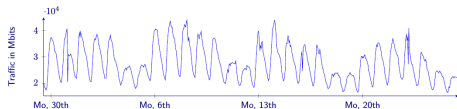


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

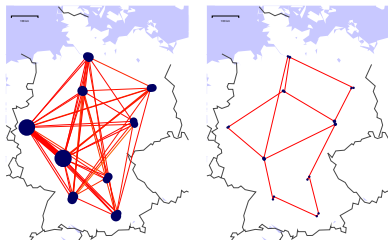


1100

Network demands fluctuate:

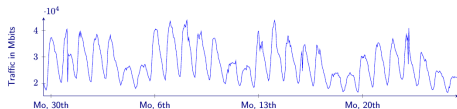


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

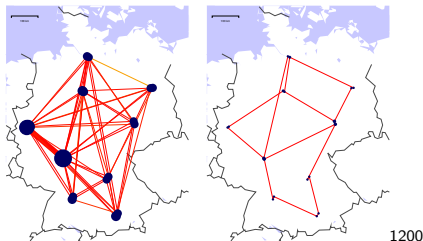


1130

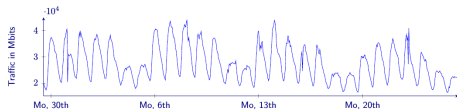
Network demands fluctuate:



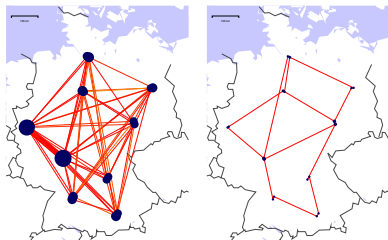
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

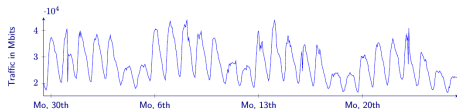


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

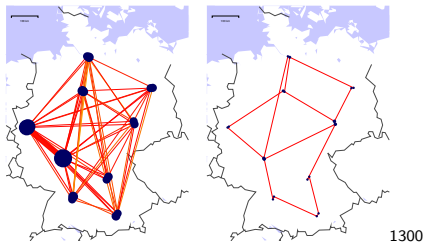


1230

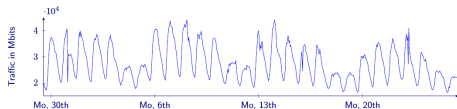
Network demands fluctuate:



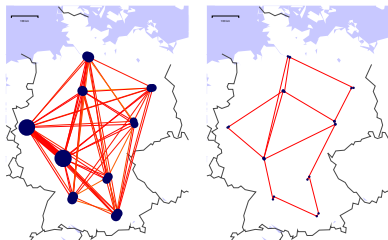
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

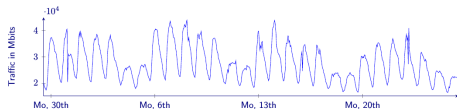


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

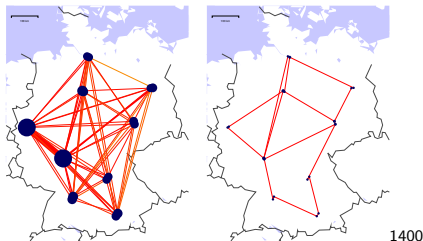


1330

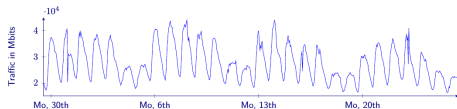
Network demands fluctuate:



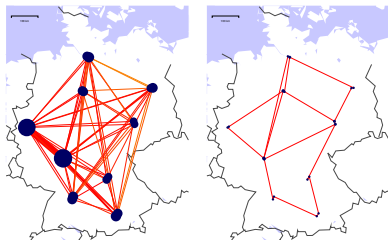
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

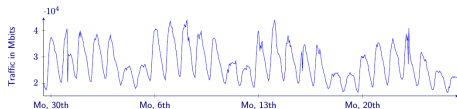


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

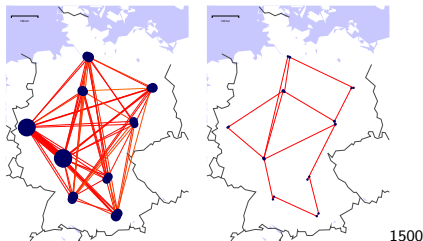


1430

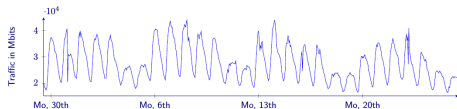
Network demands fluctuate:



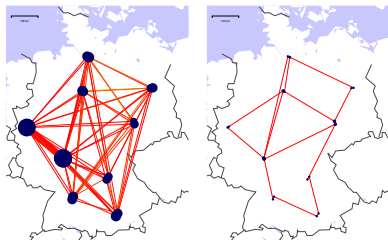
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

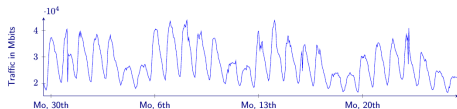


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

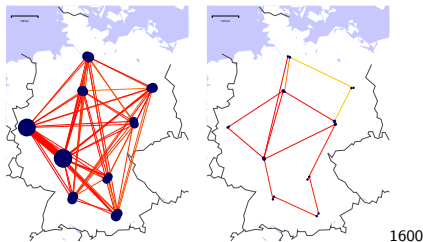


1530

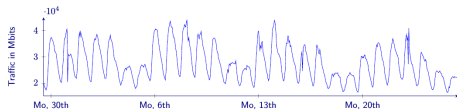
Network demands fluctuate:



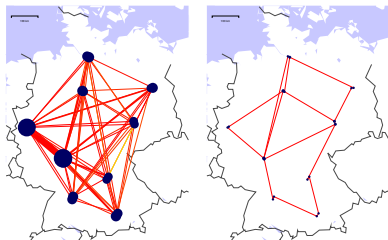
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

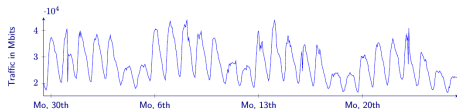


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

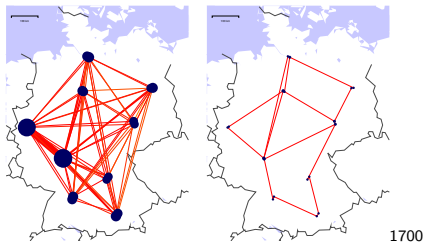


1630

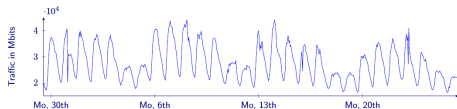
Network demands fluctuate:



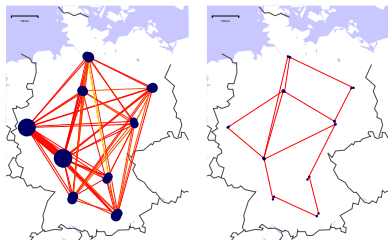
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

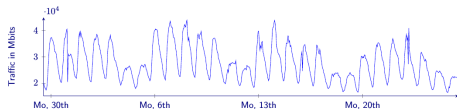


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

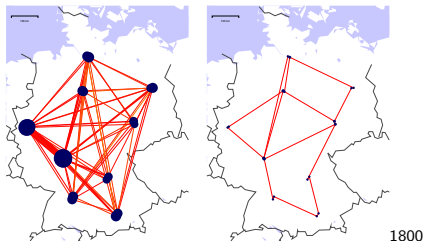


1730

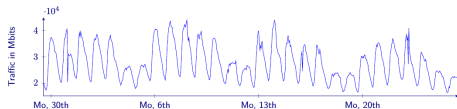
Network demands fluctuate:



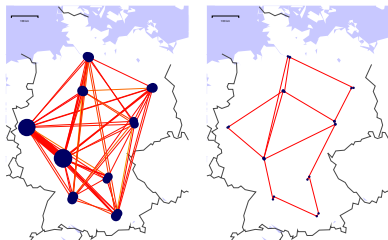
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

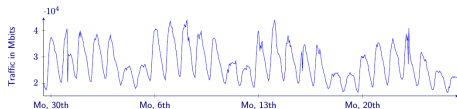


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

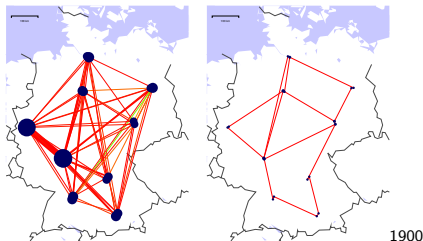


1830

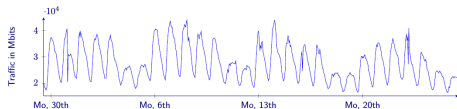
Network demands fluctuate:



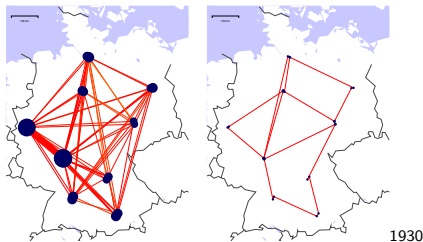
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:



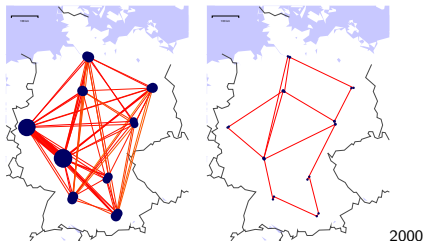
- Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



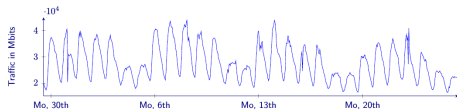
Network demands fluctuate:



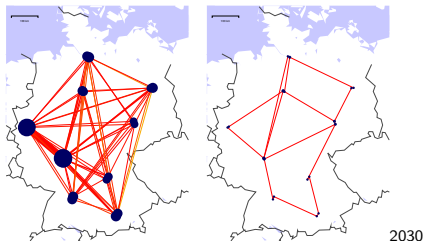
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:

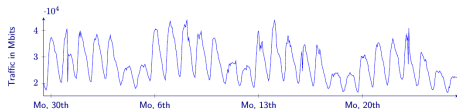


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

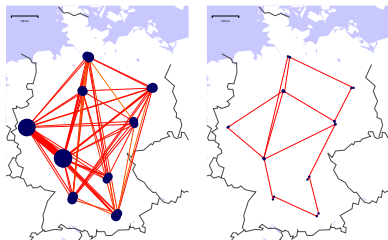


2030

Network demands fluctuate:

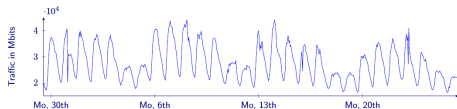


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

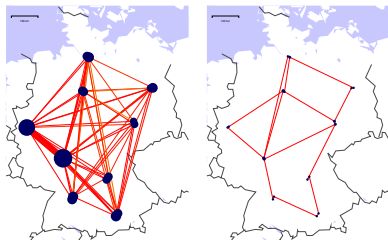


2100

Network demands fluctuate:

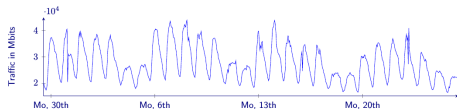


→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

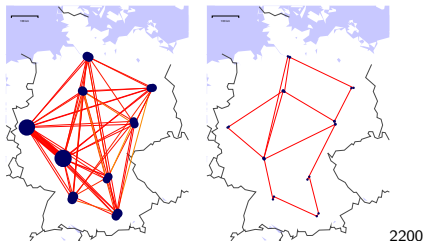


2130

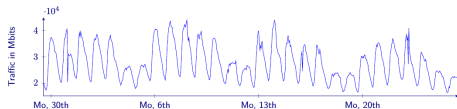
Network demands fluctuate:



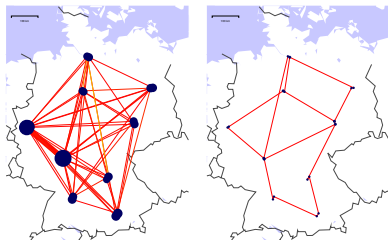
→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.



Network demands fluctuate:



→ Networks should adapt dynamically to work efficiently, reduce energy consumption etc.

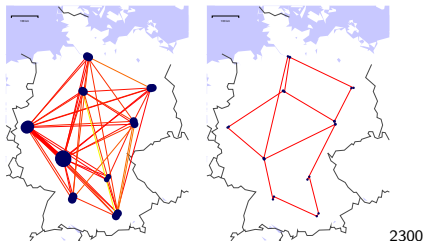


2230

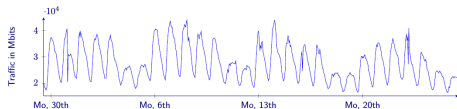
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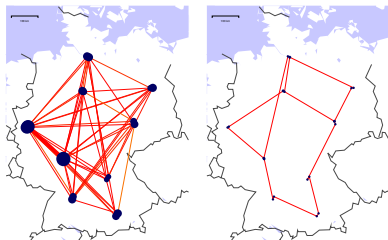
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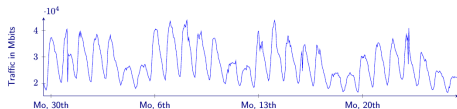


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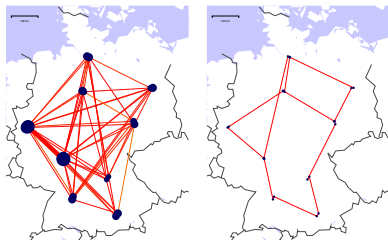


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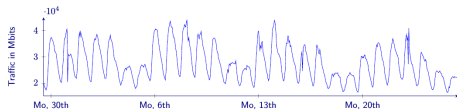
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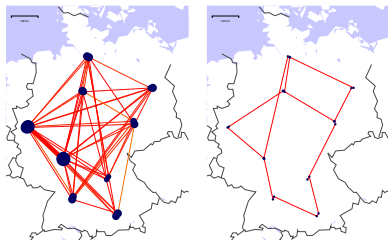
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Find optimal networks for each time interval!

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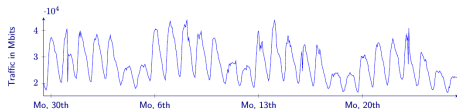
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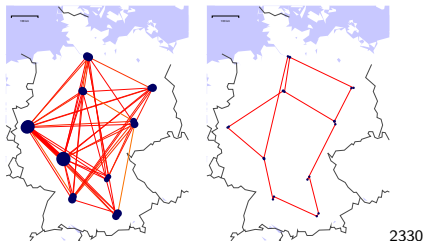
2330

- **Dynamic Network Design Problem:**
Find networks for each time interval that are **globally optimal**!

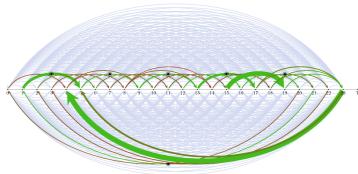
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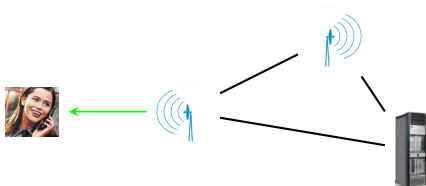
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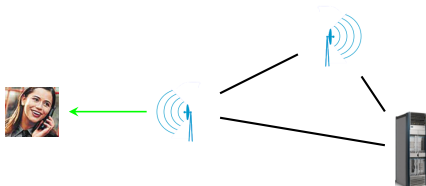
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Links can also be wireless:



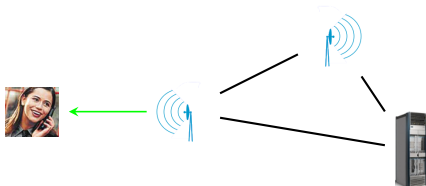
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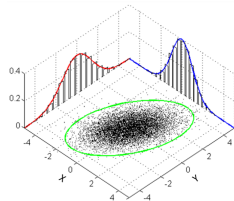
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→ SIR constraints:

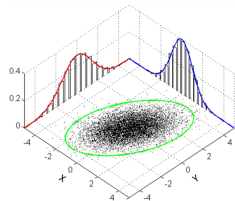
$$a_{jb}p_b - \delta \sum_{\beta \in B \setminus \{b\}} a_{j\beta}p_{\beta} + M(1 - z_j^k) \geq \delta N \quad \forall j \in C, b \in B$$

Input data might deviate from given (nominal) values



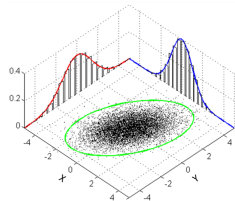
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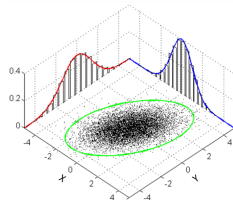
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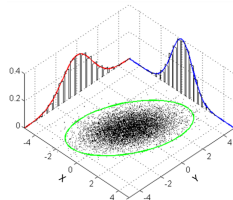
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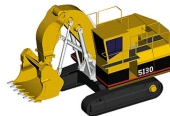
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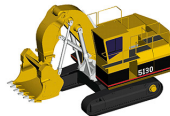


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 - ▶ robustification blows up the model, making it harder to solve
 - make sure the model size stays polynomial

Large networks are usually not built overnight...

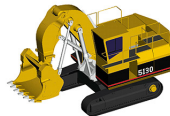


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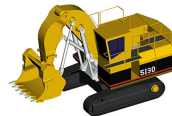
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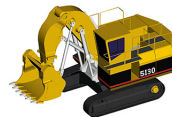
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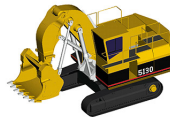
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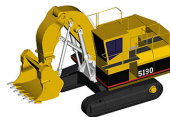
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- ➔ Multiperiod planning for a time horizon T (usually several years)
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 - ▶ Objective can include cost changes (due to inflation, technological development, etc.), operational costs, projected revenue

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$$\min \sum_{(i,j) \in A_c} c_{ij} x_{ij} + \sum_{l=1}^k \sum_{(i,j) \in A^l} c_{ij}^l x_{ij}^l + \sum_{l=1}^k \sum_{i \in F^l} c_i^l y_i^l$$

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$$\sum_{i \in F_j^l} x_{ij}^l = z_j^l \quad \forall j \in C, l = 1, \dots, k$$

$$x_{ij}^l \leq y_i^l \quad \forall j \in C, i \in F_j^l, l = 1, \dots, k$$

$$x(\delta^-(W)) \geq y_i^l \quad \forall W \subseteq V \setminus C, i \in F^l \cap W, l = 1, \dots, k$$

$$x_a, y_i^l, z_j^l \in \{0, 1\} \quad \forall a \in A_c, i \in F^l, j \in C, l = 1, \dots, k$$

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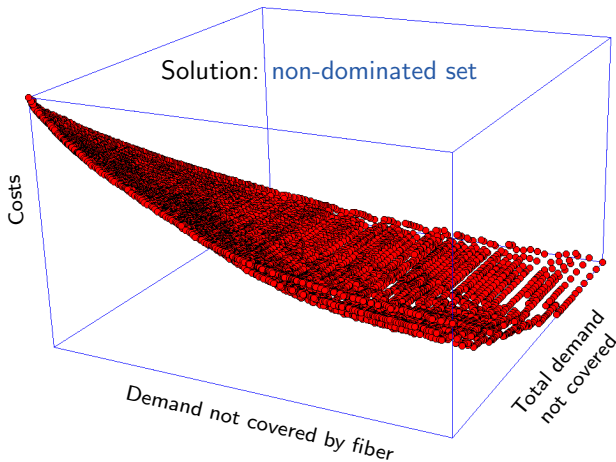
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- ▶ ZIMPL file for capacitated network design
- ▶ Some instances that can be read with the ZIMPL example
 - ➔ Create new ones to play with and try out models!

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HAVE FUN!

Get Together

Restaurant Cum Laude,
Platz der Märzrevolution, 10117 Berlin

in the building of Humboldt University
close to S+U Bhf Friedrichstraße

Meeting Point after this lecture in front of the ZIB lecture hall.