

# EL736 Communications Networks II: Design and Algorithms

Class3: Network Design Modelling

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## Outline

- Examples
- Basic Problems
- Routing Restriction

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## Example: Intra-Domain Traffic Engineering

- ❑ IP Routing:
  - Intra-domain: OSPF/IS-IS
  - Inter-domain: BGP
- ❑ Intra-domain TE Objective
  - Good end-to-end performance for users
  - Efficient use of the network resources
  - Reliable system even in the presence of failures

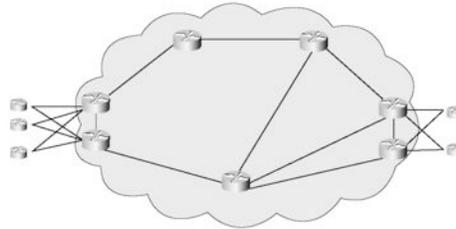


FIGURE 31 Intra-Domain IP Network

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## TE Optimization: The Problem

- ❑ Intradomain traffic engineering
  - Predict influence of weight changes on traffic flow
  - Minimize objective function (say, of link utilization)
- ❑ Inputs
  - Networks topology: capacitated, directed graph
  - Routing configuration: routing weight for each link
  - Traffic matrix: offered load each pair of nodes
- ❑ Outputs
  - Shortest path(s) for each node pair
  - Volume of traffic on each link in the graph
  - Value of the objective function

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## TE Optimization: model

### Intra-Domain Traffic Engineering (3.1.1)

- indices

$d = 1, 2, \dots, D$  demands  
 $p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$   
 $e = 1, 2, \dots, E$  links

- constants

$c_e$  capacity of link  $e$   
 $\delta_{edp} = 1$ , if link  $e$  belongs to path  $p$  realizing demand  $d$ ; 0, otherwise  
 $h_d$  volume of demand  $d$

- variables

$w_e$  metric of link  $e$ ,  $\mathbf{w} = (w_1, w_2, \dots, w_E)$  (primary)  
 $x_{dp}(\mathbf{w})$  flow allocated to path  $p$  of demand  $d$  determined by the link system  $\mathbf{w}$   
 $y_e(\mathbf{w})$  load of link  $e$  determined by the link system  $\mathbf{w}$   
 $r$  maximum link utilization variable,  $r = \max_{e=1, \dots, E} \{y_e(\mathbf{w})/c_e\}$

- The problem of minimizing the maximum link utilization can be formulated as

$$\begin{aligned}
 & \text{minimize}_{\mathbf{w}, r} && F = r \\
 & \text{subject to} && \sum_p x_{dp}(\mathbf{w}) = h_d && d = 1, 2, \dots, D \\
 & && \sum_d \sum_p \delta_{edp} x_{dp}(\mathbf{w}) \leq c_e r && e = 1, 2, \dots, E \\
 & && r \text{ continuous} \\
 & && w_e \text{ non-negative integers.}
 \end{aligned}$$

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## Example: MPLS Networks

- Traditional IP routing
  - packets are forwarded based on their destination IP addresses
  - forwarding on core routers can be bottleneck
- MPLS: multi-protocol label switching
  - recent technique for TE in core IP networks
  - introducing a connection oriented mechanism in the connectionless IP networks
  - packets from a traffic class forwarded along a preset virtual path: Label Switched Path (LSP)

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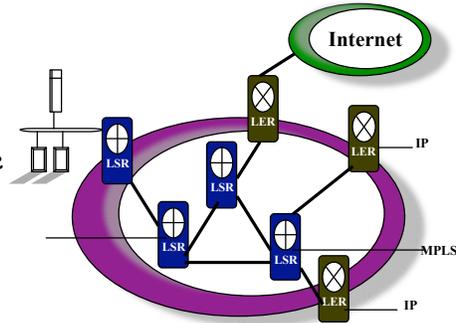
## MPLS Basics

### ❑ Label Edge Router (LER)

- analyze the IP header to decide which LSP to use
- add a corresponding local Label Switched Path Identifier, in the form of a label
- forward the packet to the next hop

### ❑ Label Switched Router (LSR)

- just forward the packet along the LSP
- simplify the forwarding function greatly
- increase performance and scalability dramatically



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## MPLS Basics contd..

- ❑ New advanced functionality for QoS, differentiated services can be introduced in the edge routers
- ❑ Backbone can focus on capacity and performance
- ❑ Routing information obtained using a common intra domain routing protocol such as OSPF

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## MPLS Design Problem

- *how to carry different traffic classes in an MPLS network through the creation of tunnels in such a way that the number of tunnels on each MPLS router/link is minimized and load balanced?*

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## MPLS Design Formulation

- **indices**
  - $d = 1, 2, \dots, D$  demands
  - $p = 1, 2, \dots, P_d$  number of possible tunnels for demand  $d$
  - $e = 1, 2, \dots, E$  links
- **constants**
  - $c_e$  capacity of link  $e$
  - $\delta_{edp} = 1$ , if link  $e$  belongs to tunnel  $p$  realizing demand  $d$ ; 0, otherwise
  - $h_d$  volume of demand  $d$
- **variables**
  - $x_{dp}$  fraction of the demand volume  $d$  carried over tunnel  $p$
  - $\varepsilon$  lower bound on fraction of flow on a tunnel (path)
  - $u_{dp} = 1$ , to denote selection of a tunnel if the lower bound is satisfied; 0, otherwise
  - $r$  maximum number of tunnels over all links.
- The problem of minimizing the number of tunnels on each MPLS router/link and load balancing in an MPLS network can be formulated as
 

<b>minimize</b>	$F = r$	
<b>subject to</b>	$\sum_p x_{dp} = 1$	$d = 1, 2, \dots, D$
	$\sum_d h_d \sum_p \delta_{edp} x_{dp} \leq c_e$	$e = 1, 2, \dots, E$
	$\varepsilon u_{dp} \leq h_d x_{dp}$	$d = 1, 2, \dots, D \quad p = 1, 2, \dots, P_d$
	$x_{dp} \leq u_{dp}$	$d = 1, 2, \dots, D \quad p = 1, 2, \dots, P_d$
	$\sum_d \sum_p \delta_{edp} u_{dp} \leq r$	$e = 1, 2, \dots, E$
	$x_{dp}$ continuous and non-negative	
	$u_{dp}$ binary, $r$ integer.	

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## Example: WDM Networks

- ❑ Wavelength Division Multiplexing (WDM)
  - 100+ wavelengths (colors) in one optical fiber
  - each wavelength  $\sim$  10Gbps
- ❑ Optical Cross-Connects (OXC)
  - switch light from one input fiber to one output fiber
  - with/ w.o. wavelength conversion

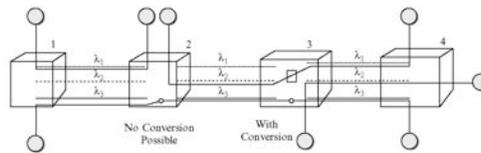


FIGURE 3.9 WDM Network

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## WDM Restoration Design Problem

- ❑ possible link failure: fiber cuts
- ❑ without wavelength conversion: provide enough light paths for all demands under any possible failure scenario
- ❑ fiber cost-effective: **just enough!**

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## WDM Restoration Design: formulation

<ul style="list-style-type: none"> <li>• <b>indices</b></li> </ul>	
$c = 1, 2, \dots, C$	colors
$e = 1, 2, \dots, E$	links
$v = 1, 2, \dots, V$	nodes
$s = 0, 1, \dots, S$	failure situations
<ul style="list-style-type: none"> <li>• <b>constants</b></li> </ul>	
$h_{ds}$ ( $d = 1, 2, \dots, D$ )	volume of demand $d$ to be realized in situation $s$ ,
$\xi_e$ ( $e = 1, 2, \dots, E$ )	cost of one LCU (i.e., optical fibre) on link $e$
$\alpha_{es}$	= 0 if link $e$ is failed in situation $s$ ; 1, otherwise
$\delta_{edp}$	= 1 if link $e$ belongs to path $p$ realizing demand $d$ ; 0, otherwise
$\theta_{dps}$	= 0 if path $p$ of demand $d$ is failed in situation $s$ ; 1, otherwise
<ul style="list-style-type: none"> <li>• <b>variables</b></li> </ul>	
$x_{dpc}$	flow (number of light-paths) realizing demand $d$ in color $c$ on path $p$
$z_{ce}$	number of times the color $c$ is used on link $e$
$y_e$	capacity of link $e$ expressed in the number of fibers
<ul style="list-style-type: none"> <li>• The optimization problem for the OXCs without wavelength conversion can be formulated as</li> </ul>	
<b>minimize</b> $F = \sum_e \xi_e y_e$	
<b>subject to</b>	$\sum_p \theta_{dps} \sum_c x_{dpc} \geq h_{ds}, \quad d = 1, 2, \dots, D \quad s = 0, 1, 2, \dots, S$ $\sum_d \sum_p \delta_{edp} x_{dpc} = z_{ce}, \quad c = 1, \dots, C, \quad e = 1, 2, \dots, E$ $y_e \geq z_{ce}, \quad c = 1, \dots, C, \quad e = 1, 2, \dots, E.$
	$x_{dpc}, z_{ce}, y_{es}$ non-negative integers

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## NDP Modeling

- Design for Normal (nominal) operating state
  - average demand volumes, no variation
  - resource fully available, no failure.
- Two time scales
  - **uncapacitated design**: for a given demand, how much resource needed and how to distribute, medium/long term planning;
  - **capacitated design**: given demand, resource, how to allocate flows to paths to optimize a network goal, short/medium term design

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## Simple Design Problem

### Simple Design Problem

- **indices**

$d = 1, 2, \dots, D$  demands  
 $p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$   
 $e = 1, 2, \dots, E$  links

- **constants**

$\delta_{edp} = 1$ , if link  $e$  belongs to path  $p$  realizing demand  $d$ ; 0, otherwise  
 $h_d$  volume of demand  $d$   
 $\xi_e$  unit (marginal) cost of link  $e$

- **variables**

$x_{dp}$  flow allocated to path  $p$  of demand  $d$  (continuous non-negative)  
 $y_e$  capacity of link  $e$  (continuous non-negative)

- **objective**

minimize  $F = \sum_e \xi_e y_e$  (bandwidth cost)

- **constraints**

$\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$  (demand constraints)  
 $\sum_d \sum_p \delta_{edp} x_{dp} \leq y_e, \quad e = 1, 2, \dots, E$  (capacity constraints).

Shortest path allocation rule: allocate all volume to cheapest path

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## Node-Link Formulation I

- **constants**

$a_{ev} = 1$  if link  $e$  originates at node  $v$ , 0 otherwise  
 $b_{ev} = 1$  if link  $e$  terminates in node  $v$ , 0 otherwise  
 $s_d$  source node of demand  $d$   
 $t_d$  sink node of demand  $d$   
 $h_d$  volume of demand  $d$   
 $\xi_e$  unit cost of link  $e$

- **variables**

$x_{ed}$  flow realizing demand  $d$  allocated to link  $e$  (continuous non-negative)  
 $y_e$  capacity of link  $e$  (continuous non-negative)

- **objective**

minimize  $F = \sum_e \xi_e y_e$

- **constraints**

$$\sum_e a_{ev} x_{ed} - \sum_e b_{ev} x_{ed} = \begin{cases} h_d, & \text{if } v = s_d \\ 0, & \text{if } v \neq s_d, t_d, \\ -h_d, & \text{if } v = t_d \end{cases} \quad v = 1, 2, \dots, V; d = 1, 2, \dots, D$$

$$\sum_d x_{ed} \leq y_e, \quad e = 1, 2, \dots, E.$$

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## Node-Link Formulation II

- **constants**
  - $a_{ev}$  = 1 if link  $e$  originates at node  $v$ , 0 otherwise
  - $b_{ev}$  = 1 if link  $e$  terminates in node  $v$ , 0 otherwise
  - $h_{vv'}$  volume of demand  $d$  originating at node  $v$  and terminating at node  $v'$
  - $H_v = \sum_{v' \neq v} h_{vv'}$  - total demand volume originating in node  $v$
  - $\xi_e$  unit cost of link  $e$
- **variables**
  - $x_{ev}$  flow realizing *all* demands originating at node  $v$  on link  $e$
  - $y_e$  capacity of link  $e$
- **objective**
  - minimize  $F = \sum_e \xi_e y_e$
- **constraints**
  - $\sum_e a_{ev} x_{ev} = H_v, \quad v = 1, 2, \dots, V$
  - $\sum_e b_{ev'} x_{ev} - \sum_e a_{ev'} x_{ev} = h_{vv'}, \quad v, v' = 1, 2, \dots, V, v \neq v'$
  - $\sum_v x_{ev} \leq y_e, \quad e = 1, 2, \dots, E.$

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## Model Comparison

### □ Complexity

	Number of Variables	Number of Constraints
Link-path formulation	$P \times V'(V' - 1) + \frac{1}{2} k \times V = O(V^2)$	$P \times V'(V' - 1) + \frac{1}{2} k \times V = O(V^2)$
Node-link formulation	$\frac{1}{2} k \times V \times V'(V' - 1) = O(V^2)$	$V \times V'(V' - 1) + \frac{1}{2} k \times V = O(V^2)$
Modified node-link formulation	$\frac{1}{2} k \times V \times (V' + 1) = O(V^2)$	$V'(V' + 1) + \frac{1}{2} k \times V = O(V^2)$

### □ Flexibility

- path formulation (PF): pre-compute path,
- link formulation (LF): implicitly all possible paths
- path eliminating
  - PF: exclude in path pre-processing, set path flow to zero
  - LF: manipulate link flow to control path flow

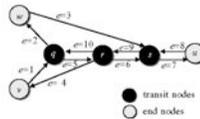


FIGURE 4.1 Network with Separate End and Transit Nodes

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## Capacitated Problem

- given link capacities, whether demands are realizable?

### Pure Allocation Problem

- **indices**

$d = 1, 2, \dots, D$  demands

$p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$

$e = 1, 2, \dots, E$  links

- **constants**

$\delta_{edp}$  = 1 if link  $e$  belongs to path  $p$  realizing demand  $d$ ; = 0 otherwise

$h_d$  volume of demand  $d$

$c_e$  capacity of link  $e$

- **variables**

$x_{dp}$  flow allocated to path  $p$  of demand  $d$  (continuous non-negative)

- **constraints**

$$\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$$

$$\sum_d \sum_p \delta_{edp} x_{dp} \leq c_e, \quad e = 1, 2, \dots, E.$$

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## Modified Link-Path Formulation

- how much additional bandwidth needed on each link to accommodate current demand?

### PAP – Modified Link-Path Formulation

- **indices**

$d = 1, 2, \dots, D$  demands

$p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$

$e = 1, 2, \dots, E$  links

- **constants**

$\delta_{edp}$  = 1 if link  $e$  belongs to path  $p$  realizing demand  $d$ ; = 0 otherwise

$h_d$  volume of demand  $d$

$c_e$  capacity of link  $e$

- **variables**

$x_{dp}$  flow allocated to path  $p$  of demand  $d$

$z$  auxiliary continuous variable (of unrestricted sign)

- **objective**

minimize  $z$

- **constraints**

$$\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$$

$$\sum_d \sum_p \delta_{edp} x_{dp} \leq z + c_e,$$

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## How many paths needed?

- Proposition: If there is a feasible allocation, then there exists a allocation with at most  $D+E$  non-zero flows
  - $D$  flows if all links are unsaturated
- Assign the entire demand volume of each demand to one of its shortest paths, (#hops), if the resulting solution all links are saturated (at least on overloaded), then there is no feasible allocation. (homework).

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## Mixed Problem

- with upper bounds on link capacities

**Bounded Link Capacities**

- **indices**
  - $d = 1, 2, \dots, D$  demands
  - $p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$
  - $e = 1, 2, \dots, E$  links
- **constants**
  - $\delta_{edp}$  = 1 if link  $e$  belongs to path  $p$  realizing demand  $d$ ; 0, otherwise
  - $h_d$  volume of demand  $d$
  - $c_e$  upper bound on the capacity of link
  - $\xi_e$  unit cost of link  $e$
- **variables**
  - $x_{dp}$  flow allocated to path  $p$  of demand (continuous non-negative)  $d$
  - $y_e$  capacity of link  $e$  (continuous non-negative)
- **objective**
  - minimize  $F = \sum_e \xi_e y_e$
- **constraints**
  - $\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$
  - $\sum_d \sum_p \delta_{edp} x_{dp} \leq y_e, \quad e = 1, 2, \dots, E$
  - $y_e \leq c_e, \quad e = 1, 2, \dots, E.$

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## Introducing Routing Restriction

- ❑ enforce the resulting routes w./w.o. certain properties
  - path diversity v.s. limited split
  - equal splitting v.s. arbitrary splitting
  - modular flows v.s. unmodular flows
- ❑ extend the basic formulation by introducing additional routing constraints.

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## Path Diversity

- ❑ “never put all eggs in one basket”

**Generalized Diversity**

- **indices**
  - $d = 1, 2, \dots, D$  demands
  - $p = 1, 2, \dots, P_d$  candidate paths for flows realizing demand  $d$
  - $e = 1, 2, \dots, E$  links
- **constants**
  - $\delta_{edp}$  = 1 if link  $e$  belongs to path  $p$  realizing demand  $d$ ; 0, otherwise
  - $h_d$  volume of demand  $d$
  - $n_d$  diversity factor for demand  $d$
  - $c_e$  capacity of link  $e$
- **variables**
  - $x_{dp}$  flow allocated to path  $p$  of demand  $d$
- **constraints**
  - $\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$
  - $\sum_d \sum_p \delta_{edp} x_{dp} \leq c_e, \quad e = 1, 2, \dots, E$
  - $\sum_p \delta_{edp} x_{dp} \leq h_d/n_d, \quad e = 1, 2, \dots, E \quad d = 1, 2, \dots, D.$

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## Lower Bounds on Non-Zero Flows

- ❑ the flow volume on a path greater than B if any.
- ❑ implicitly limit number of paths

Lower-Bounded Flows	
• <b>indices</b>	
$d = 1, 2, \dots, D$	demands
$p = 1, 2, \dots, P_d$	candidate paths for flows realizing demand $d$
$e = 1, 2, \dots, E$	links
• <b>constants</b>	
$\delta_{edp}$	= 1 if link $e$ belongs to path $p$ realizing demand $d$ ; 0, otherwise
$h_d$	volume of demand $d$
$b_d$	lower bound on non-zero flows of demand $d$
$c_e$	capacity of link $e$
• <b>variables</b>	
$x_{dp}$	continuous flow variable allocated to path $p$ of demand $d$
$u_{dp}$	binary variable corresponding to $x_{dp}$
• <b>constraints</b>	
	$\sum_p x_{dp} = h_d, \quad d = 1, 2, \dots, D$
	$x_{dp} \leq h_d u_{dp}, \quad d = 1, 2, \dots, D \quad p = 1, 2, \dots, P_d$
	$b_d u_{dp} \leq x_{dp}, \quad d = 1, 2, \dots, D \quad p = 1, 2, \dots, P_d$
	$\sum_d \sum_p \delta_{edp} x_{dp} \leq c_e, \quad e = 1, 2, \dots, E.$

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## Limited Demand Split

- ❑ only split among k paths

Single-Path Allocation	
• <b>indices</b>	
$d = 1, 2, \dots, D$	demands
$p = 1, 2, \dots, P_d$	candidate paths for flows realizing demand $d$
$e = 1, 2, \dots, E$	links
• <b>constants</b>	
$\delta_{edp}$	= 1 if link $e$ belongs to path $p$ realizing demand $d$ ; 0, otherwise
$h_d$	volume of demand $d$
$c_e$	capacity of link $e$
• <b>variables</b>	
$x_{dp}$	flow allocated to path $p$ of demand $d$
$u_{dp}$	binary variable associated with flow $x_{dp}$
• <b>constraints</b>	
	$x_{dp} = h_d u_{dp}, \quad d = 1, 2, \dots, D \quad p = 1, \dots, P_d$
	$\sum_p u_{dp} = 1, \quad d = 1, 2, \dots, D$
	$\sum_d \sum_p \delta_{edp} x_{dp} \leq c_e, \quad e = 1, 2, \dots, E.$

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## Node-Link Formulation

### □ Single Path

- constants

$a_{ev}$  = 1 if node  $v$  is the originating node of link  $e$ ; 0, otherwise

$b_{ev}$  = 1 if node  $v$  is the terminating node of link  $e$ ; 0, otherwise

$s_d$  source node of demand  $d$

$t_d$  sink node of demand  $d$

$h_d$  volume of demand  $d$

$c_e$  capacity of link  $e$

- variables

$u_{de}$  binary variable corresponding to flow of demand  $d$  allocated to link  $e$

- constraints

$$\sum_d h_d u_{de} \leq c_e, \quad e = 1, 2, \dots, E$$

$$\sum_e a_{ev} u_{de} - \sum_e b_{ev} u_{de} = \begin{cases} 1, & \text{if } v = s_d \\ 0, & \text{if } v \neq s_d, t_d, \quad v = 1, 2, \dots, V; d = 1, 2, \dots, D \\ -1, & \text{if } v = t_d. \end{cases}$$

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## Node-Link Formulation

### □ equally split among $k$ link-disjoint paths

#### Equal Split Among $k$ Link-Disjoint Paths

- indices

$d = 1, 2, \dots, D$  demands

$e = 1, 2, \dots, E$  links

$v = 1, 2, \dots, V$  nodes

- constants

$a_{ev}$  = 1 if node  $v$  is the originating node of link  $e$ ; 0, otherwise

$b_{ev}$  = 1 if node  $v$  is the terminating node of link  $e$ ; 0, otherwise

$s_d$  source node of demand  $d$

$t_d$  sink node of demand  $d$

$h_d$  volume of demand  $d$

$c_e$  capacity of link  $e$

$k_d$  predetermined number of paths for demand  $d$

- variables

$u_{de}$  binary variable corresponding to flow of demand  $d$  allocated to link  $e$

- constraints

$$\sum_d u_{de} h_d / k_d \leq c_e, \quad e = 1, 2, \dots, E$$

$$\sum_e a_{ev} u_{de} - \sum_e b_{ev} u_{de} = \begin{cases} k_d, & \text{if } v = s_d \\ 0, & \text{if } v \neq s_d, t_d, \quad v = 1, 2, \dots, V; d = 1, 2, \dots, D \\ -k_d, & \text{if } v = t_d. \end{cases}$$

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## Integral Flows

- allocate demand volumes in demand modules

Modular Flow Allocation	
• indices	
$d = 1, 2, \dots, D$	demands
$p = 1, 2, \dots, P_d$	candidate paths for flows realizing demand $d$
$e = 1, 2, \dots, E$	links
• constants	
$\delta_{edp}$	= 1 if link $e$ belongs to path $p$ realizing demand $d$ ; 0 otherwise
$L_d$	demand module for demand $d$
$H_d$	volume of demand $d$ expressed as the number of demand modules
$h_d$	demand volume ( $h_d = L_d H_d$ )
$c_e$	capacity of link $e$
• variables	
$u_{dp}$	non-negative integral variable associated with the flow on path $p$ of demand $d$
• constraints	
$\sum_p u_{dp} = H_d, \quad d = 1, 2, \dots, D$	
$\sum_d L_d \sum_p \delta_{edp} u_{dp} \leq c_e, \quad e = 1, 2, \dots, E.$	

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## Next Lecture

- Non-linear Link Dimensioning, Cost and Delay Functions
- Budget Constraint
- General Optimization Method for NDP

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