## Throughput optimization (next) ...

- Max-flow optimization
  - Zongpeng's slides: 2-8
- Network coding
  - Butterfly example
  - Zongpeng's slides: 14-16

## <u>Linnear Programming: "Hello world" ...</u>

```
maximize 2x + y

s.t.:

x \leq 2

y \leq 2

x + y \leq 3

x, y \geq 0
```

## <u>Linnear Programming: "Hello world" ...</u>

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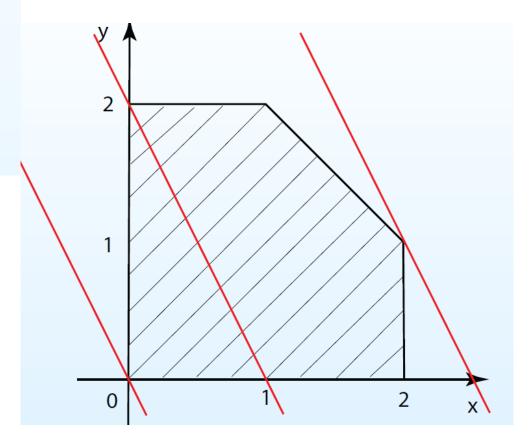
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x \leq 2

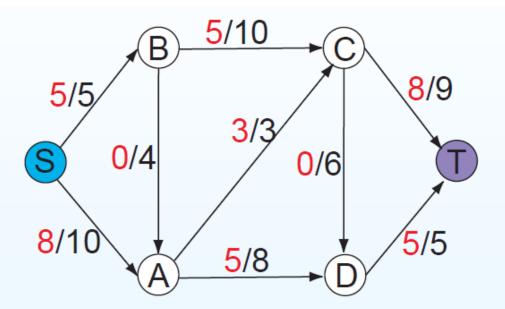
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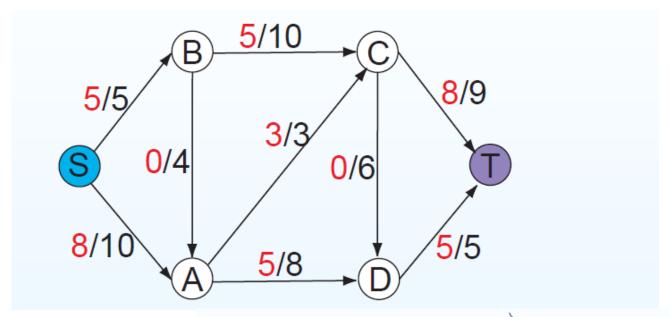


#### LP-model: Max flow



- Maximum rate we can push flows from S to T in a given capacitied flow network.
- flow-rate/link-capacity

#### LP-model: Max flow



Maximize

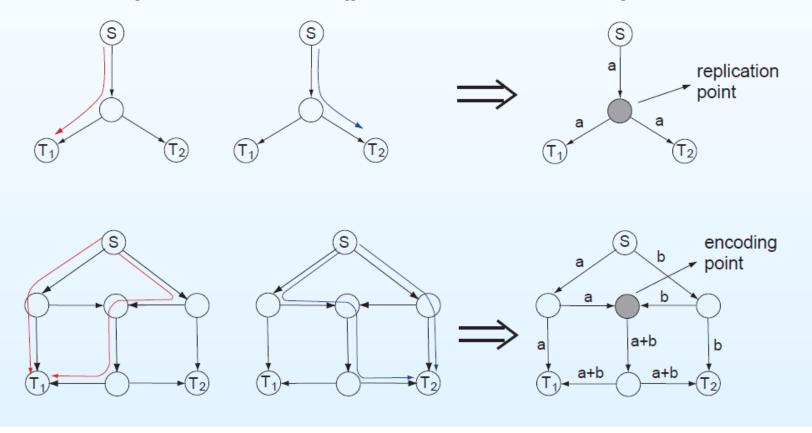
$$\chi = f(\overrightarrow{TS})$$

Subject to:

$$\begin{cases} f(\overrightarrow{uv}) \leq C(uv) & \forall \overrightarrow{uv} \neq \overrightarrow{TS} \\ \sum_{v \in N(u)} f(\overrightarrow{uv}) = \sum_{v \in N(u)} f(\overrightarrow{vu}) & \forall u \end{cases}$$
$$f(\overrightarrow{uv}) \geq 0 \qquad \forall \overrightarrow{uv}$$

### Max-rate multicast with network coding

Given network coding, a multicast rate x is feasible in a directed network iff it is feasible as an independent unicast to every receiver. [Ahlswede et al. IT 2000][Koetter and Médard TON 2003]



## Max-rate multicast with network coding

Maximize  $\chi$  Subject to:

$$\begin{cases} \chi \leq f_{i}(\overrightarrow{T_{i}S}) & \forall i & (1) \\ f_{i}(\overrightarrow{uv}) \leq c(\overrightarrow{uv}) & \forall i, \forall \overrightarrow{uv} \neq \overrightarrow{T_{i}S} & (2) \\ \sum_{v \in N(u)} f_{i}(\overrightarrow{uv}) = \sum_{v \in N(u)} f_{i}(\overrightarrow{vu}) & \forall i, \forall u & (3) \\ c(\overrightarrow{uv}) + c(\overrightarrow{vu}) \leq C(uv) & \forall uv \neq T_{i}S & (4) \end{cases}$$

$$c(\overrightarrow{uv}), f_{i}(\overrightarrow{uv}), \chi \geq 0 \qquad \forall i, \forall \overrightarrow{uv}$$

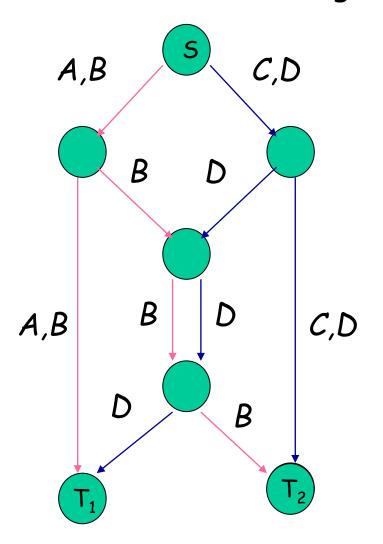
### Max-rate multicast WITHOUT network coding

Minimize  $\sum_t f(t)$  Subject to:  $\sum_{t:e \in t} f(t) \leq c(e) \qquad \forall e$   $f(t) \geq 0 \qquad \forall t$ 

- Don't be misguided by the seeming simplicity of the LP.
- It has exponentially many variables.
- We know a network instance with 16 nodes only, having  $\sim 50$  million different trees.
- But, what else can we do? It's an NP-hard problem.

# Let's start with throughput ...

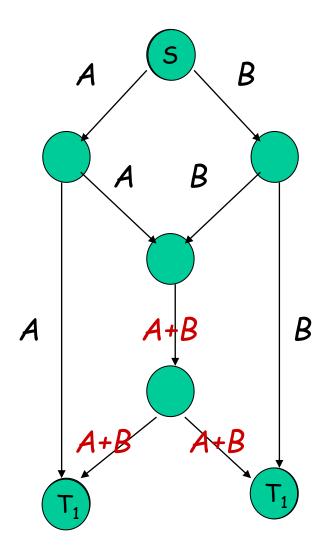
Without network coding ...

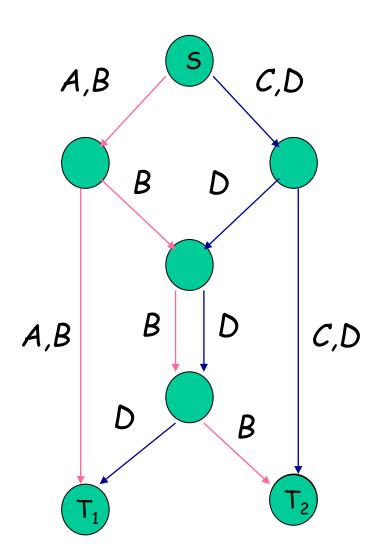


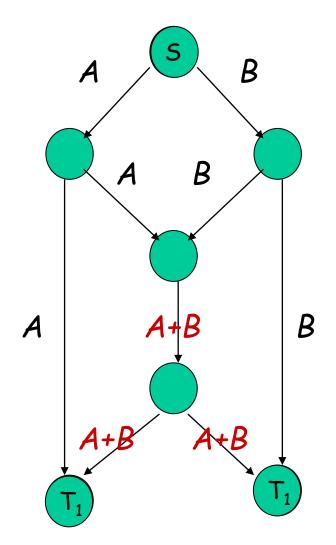
□ T1 and T2 both
 get ¾ streams
 (75% of senders
 capacity)

 Optimization problem equal to "packing of Steiner trees" (NP-hard problem) With network coding ...

- □ T1 and T2 both get2/2 streams (100% of senders capacity)
- □ Improvement by 33%

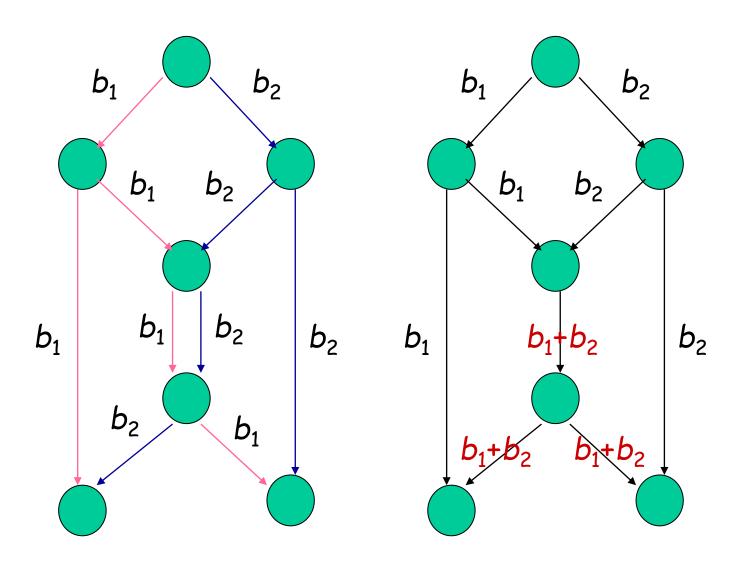






Savings can also be in terms of "bandwidth"

• • •



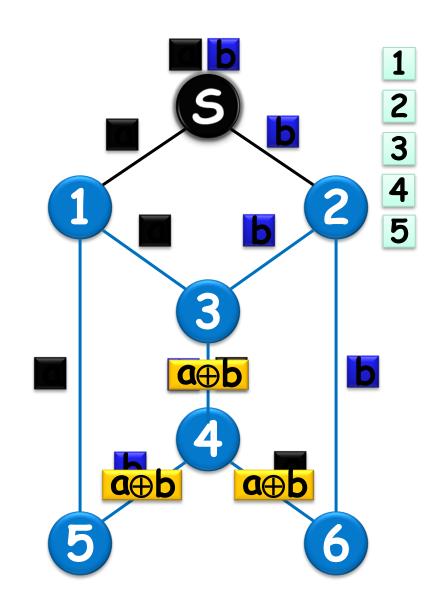
□ ...or "time" ...

## Network Coding

- □ A technique to improve:
  - 1. network throughput
  - 2. efficiency
  - 3. scalability

. . .

Information is <u>coded</u> at potentially every node



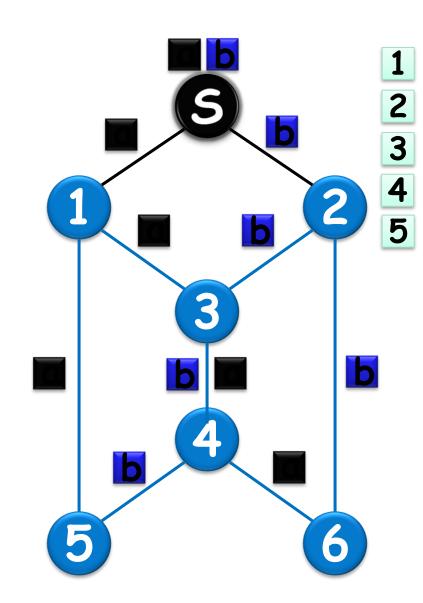
# Without animation ...

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