

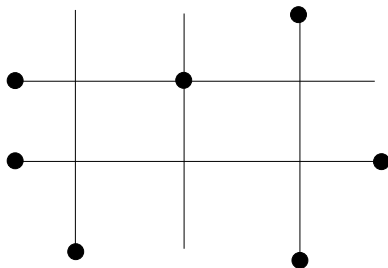
Sending Messages on Communication Networks on Time

Ronald Koch, Britta Peis, Martin Skutella, Andreas Wiese

TU Berlin

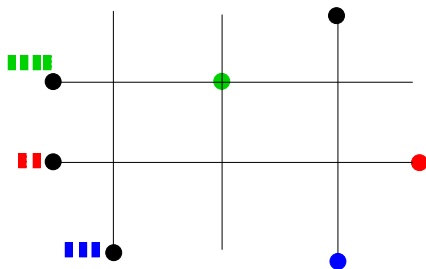
The Message Routing Problem

- ▶ In a distributed system, processes residing at different nodes of the network communicate by passing messages.



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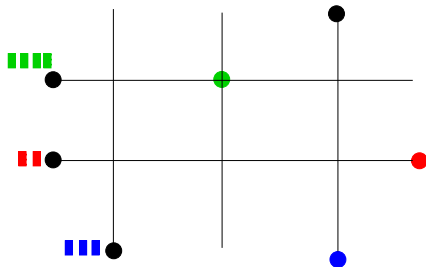
- ▶ In a distributed system, processes residing at different nodes of the network communicate by passing messages.



- ▶ It is an important question, whether a given set of messages $\{M_i\}_{i \in I}$ can be routed through the network on time.

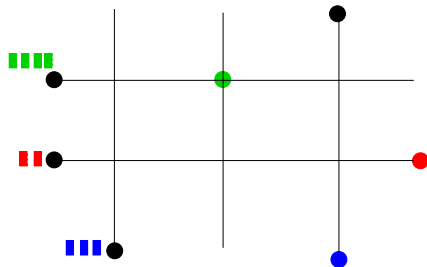
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- ▶ Message $M_i = (s_i, t_i, l_i)$ consists of l_i unit-size packets that need to be send from s_i to t_i within time horizon T .



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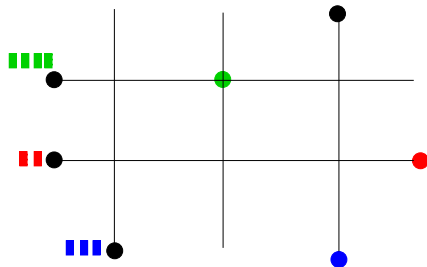
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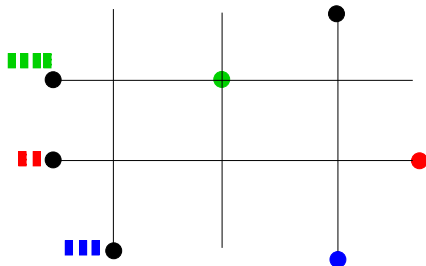
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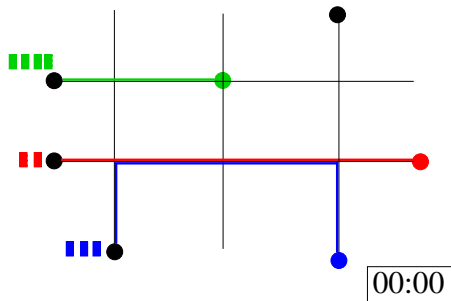
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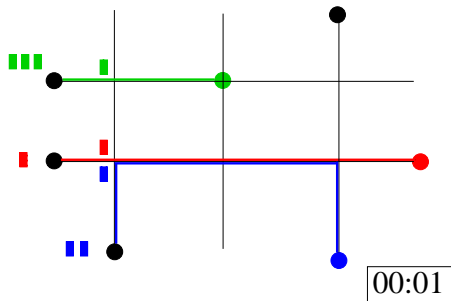
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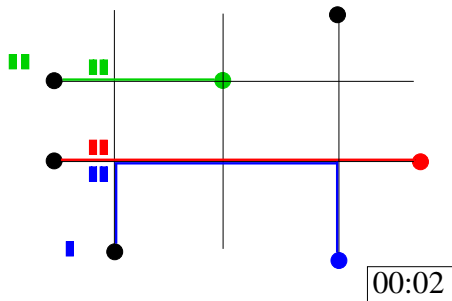
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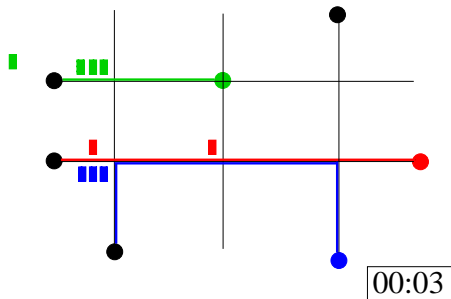
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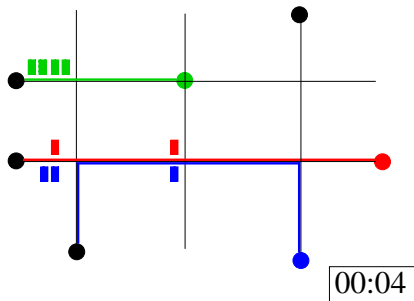
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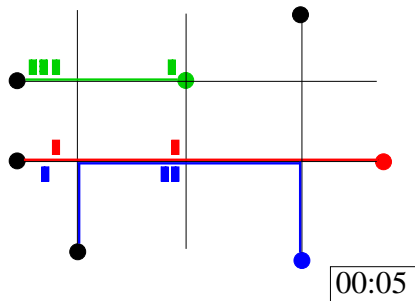
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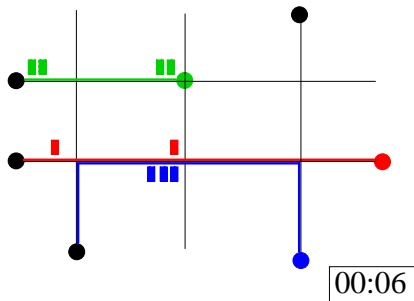
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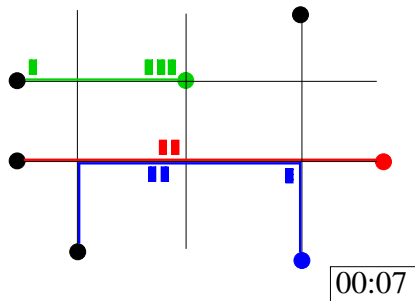
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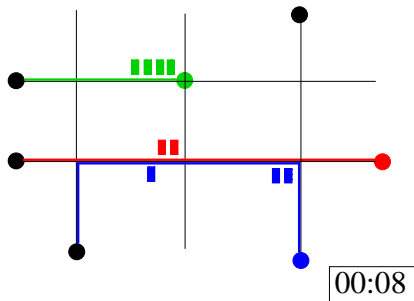
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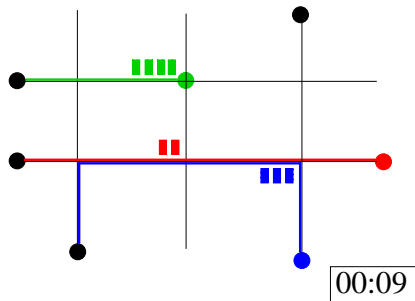
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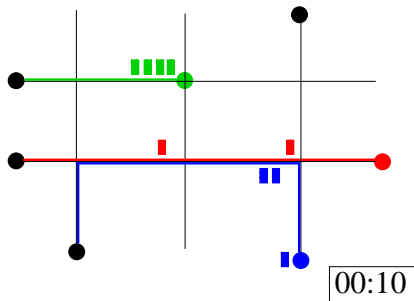
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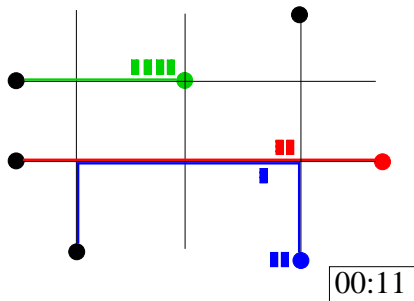
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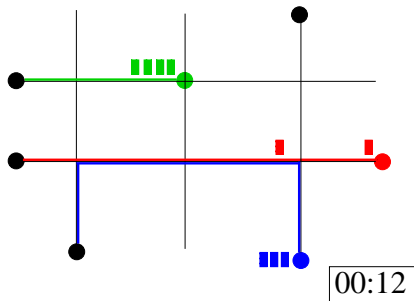
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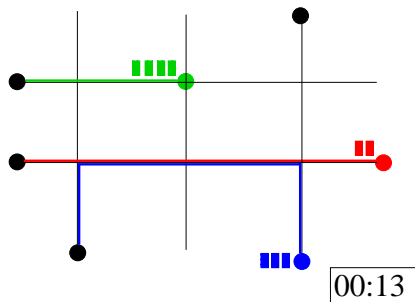
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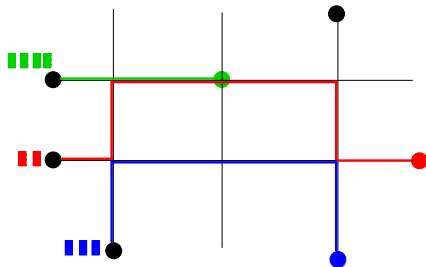
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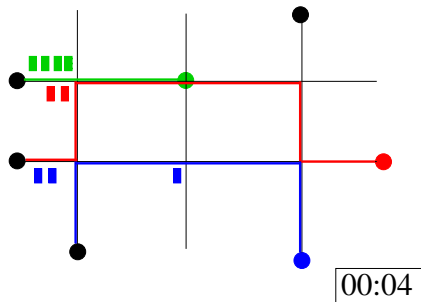
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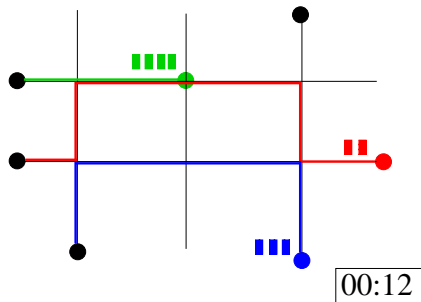
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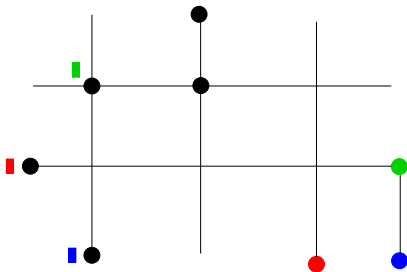
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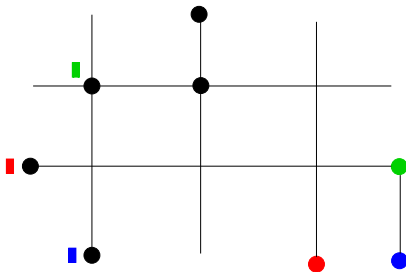
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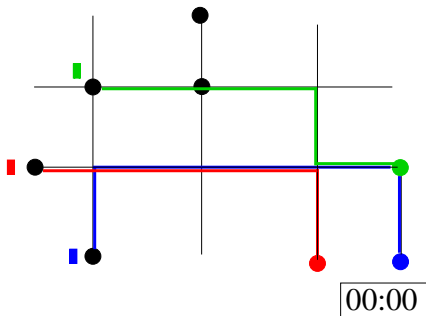
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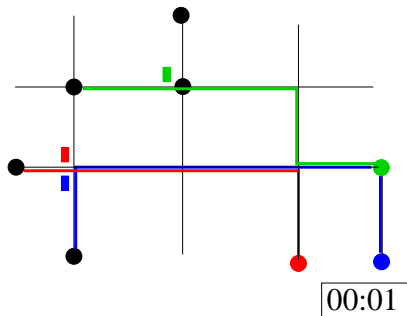
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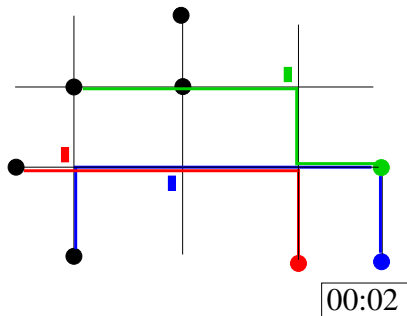
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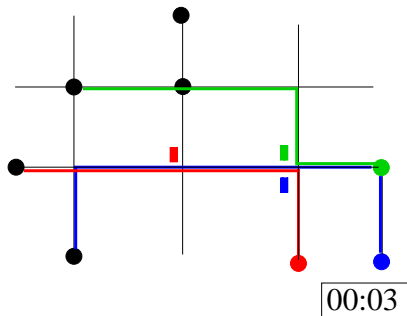
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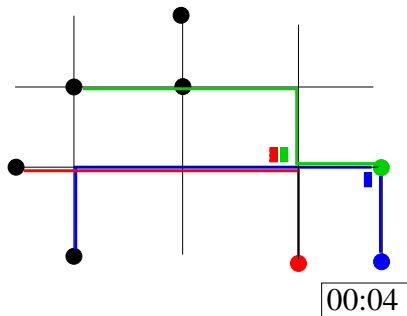
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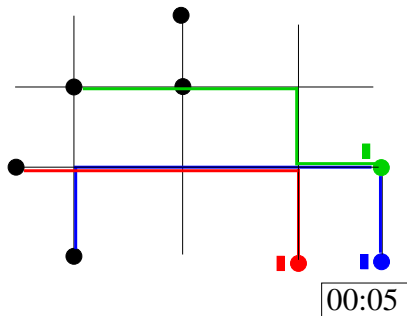
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Single-Sink-Single-Source Packet and Message Routing

Observation

1-sink-1-source packet routing *can be solved efficiently.*

Proof.

Calculate a maximum s-t-flow over time with time horizon T . □

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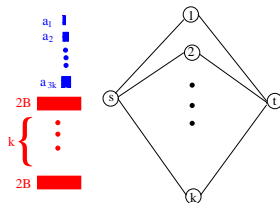
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1-sink-1-source message routing is NP-complete.

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Reduction from 3-PARTITION.



The message- and packet routing problem

Message routing and job shop scheduling

Path-finding algorithm

Message- and packet routing on special graph classes

Periodic message routing

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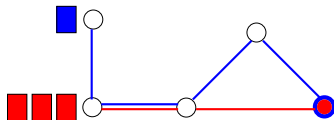
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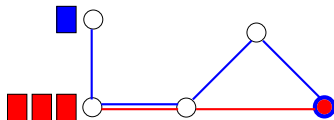
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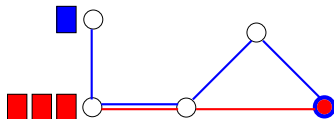
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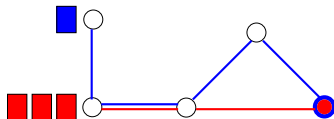
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- ▶ Assigning priorities \rightarrow acyclic job shop scheduling problem!

Job Shop Scheduling

- ▶ Jobs J_1, \dots, J_n , machines M_1, \dots, M_m , each job consists of a sequence of operations $J_i = ((M_{i_1}, p_{i_1}), \dots, (M_{i_k}, p_{i_k}))$ to be performed in order.

Goal: Find feasible schedule with minimal makespan.

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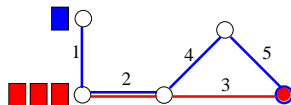
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$$J_R = ((M_2, 3), (M_3, 3))$$

$$J_B = ((M_1, 1), (M_2, 1), (M_4, 1), (M_5, 1)).$$



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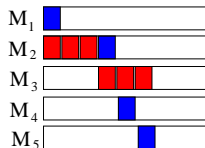
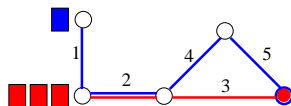
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- ▶ First constant factor approximation for packet routing [Srinivasan, Teo 01]
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- ▶ It improves the result of Srinivasan and Teo for packet routing by a factor of 2.

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$$\begin{aligned} \min_{x \geq 0} \quad & C \\ \forall i \in I : \quad & \sum_{P \in \mathcal{P}_i} x_P \geq 1 \\ \forall e \in E : \quad & \sum_{i \in I} \sum_{P \in \mathcal{P}_i: e \in P} l_i x_P \leq C \end{aligned}$$

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$$\mathcal{P}_i := \{s_i, t_i\text{-paths of length} \leq \frac{D}{l_i}\} \quad \forall i \in I.$$

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$$\begin{aligned} \min_{x \geq 0} \quad & C \\ \forall i \in I : \quad & \sum_{P \in \mathcal{P}_i} x_P \geq 1 \\ \forall e \in E : \quad & \sum_{i \in I} \sum_{P \in \mathcal{P}_i: e \in P} l_i x_P \leq C \end{aligned}$$

Theorem

Our algorithm finds a $\{0, 1\}$ -solution \hat{x} such that

$$\hat{C} < C^* + D,$$

where C^ is the congestion of an optimal fractional solution.*

An optimal fractional solution

Observation

An **optimal fractional solution** x^* of

$$\begin{aligned} \min_{x \geq 0} \quad & C \\ \forall i \in I : \quad & \sum_{P \in \mathcal{P}_i} x_P \geq 1 \\ \forall e \in E : \quad & \sum_{i \in I} \sum_{P \in \mathcal{P}_i : e \in P} l_i x_P \leq C \end{aligned}$$

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can be found efficiently.

Proof.

The pricing problem is the **constant-length-bounded shortest path** problem (\rightarrow modified Dijkstra). □

Rounding algorithm

Algorithm

$F \leftarrow$ messages with fixed paths (initially empty).

Iteratively:

1. Compute a basic optimal solution x^* of

$$\begin{aligned} \min_{x \geq 0} \quad & C \\ \forall i \in I : \quad & \sum_{P \in \mathcal{P}_i} x_P \geq 1 \\ \forall e \in E : \quad & \sum_{i \in I} \sum_{P \in \mathcal{P}_i: e \in P} l_i x_P \leq C - \sum_{i \in F: e \in P_i} l_i \end{aligned}$$

2. Fix variables with $x_P^* = 1$; (move corresponding i from I to F);
3. Remove variables with $x_P^* = 0$;
4. Remove constraint e with

$$\sum_{i \in I} \sum_{P \in \mathcal{P}_i: e \in P} l_i < C^* - \sum_{i \in F: e \in P_i} l_i + D.$$

The algorithm is well-defined

Theorem

If $0 < x_p^* < 1$ for all paths P , there exists a constraint e with

$$\sum_{i \in I} \sum_{P \in \mathcal{P}_i; e \in P} l_i < C^* - \sum_{i \in F; e \in P_i} l_i + D.$$

Proof.

Since x^* is b.f.s., there exist linearly independent tight constraints \mathcal{T}_1 and \mathcal{T}_2 of type (1) and (2) with $n = |\text{supp}(x^*)| = |\mathcal{T}_1| + |\mathcal{T}_2|$. If

$$\forall e \in \mathcal{T}_2 : \sum_{i \in I} \sum_{P \in \mathcal{P}_i; e \in P} l_i (1 - x_p^*) \geq D, \quad \text{then}$$

$$\begin{aligned} nD &\leq \sum_{i \in \mathcal{T}_1} D \sum_{P \in \mathcal{P}_i} x_p^* + \sum_{e \in \mathcal{T}_2} \sum_{i \in I} \sum_{P \in \mathcal{P}_i; e \in P} l_i (1 - x_p^*) \\ &\leq \sum_{i \in I} \sum_{P \in \mathcal{P}_i} (D x_p^* + \sum_{e \in \mathcal{T}_2; e \in P} l_i (1 - x_p^*)) \\ &\leq \sum_{i \in I} \sum_{P \in \mathcal{P}_i} (D x_p^* + D - D x_p^*) = Dn. \end{aligned}$$

Contradiction to linear independency!

Corollary

The algorithm determines paths with small congestion and dilation.

The message- and packet routing problem

Message routing and job shop scheduling

Path-finding algorithm

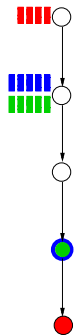
Message- and packet routing on special graph classes

Periodic message routing

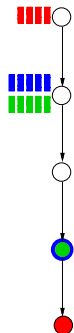
Message Routing on a Directed Path



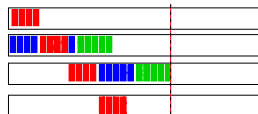
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Message Routing on a Directed Path



Farthest-Destination-First:



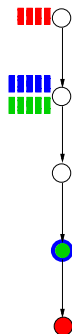
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Optimal Schedule:

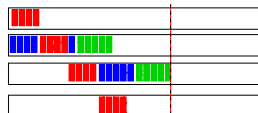


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Message Routing on a Directed Path



Farthest-Destination-First:



22

Optimal Schedule:

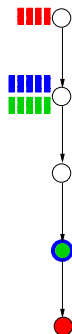


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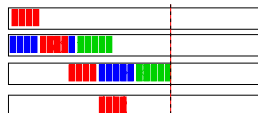
- ▶ Theorem (Leung, Tam, Wong, Young 96)

Message routing on a directed path is NP-complete (reduction from 3-PARTITION).

Message Routing on a Directed Path



Farthest-Destination-First:



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Optimal Schedule:



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- ▶ Theorem (Leung, Tam, Wong, Young 96)

Message routing on a directed path is NP-complete (reduction from 3-PARTITION).

- ▶ Theorem

Farthest-Destination-First is optimal if $s_i <_P s_j \implies t_i \leq_P t_j$.

Further results on special graph classes

Message routing problem:

- ▶ NP-hard to approximate with a factor $< \frac{7}{6}$ on a **tree** even if message lengths of 1 and 2, only.
- ▶ NP-hard on a **grid** even in the single-sink, single-source case.

Packet routing problem:

- ▶ FDF optimal on directed **paths**, **in-trees** and **out-trees**.
- ▶ FDF arbitrarily bad on **trees**.
- ▶ 2-approximation on **trees**.
- ▶ $C + D - 1$ -approximation on **directed trees**.
- ▶ NP-hard to approximate with a factor $< \frac{10}{9}$ on **trees**.
- ▶ NP-hard to approximate with a factor $< \frac{7}{6}$ on **planar graphs**.
- ▶ NP-hard to approximate with a factor $< \frac{6}{5}$ on **general graphs**.
- ▶ 2-approximation on a **grid** with pairwise different origins and destinations.

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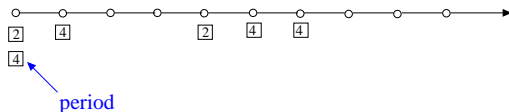
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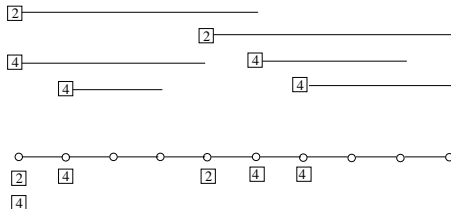
Periodic message routing

- ▶ Each message (here: packet) is released periodically.



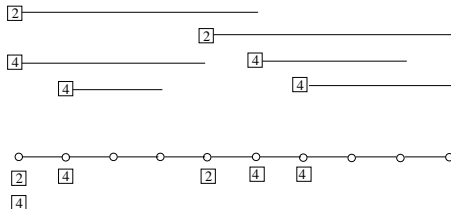
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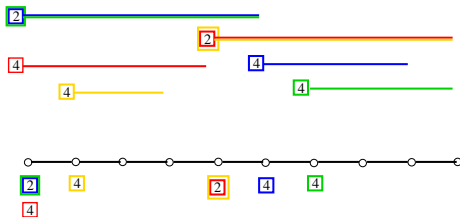
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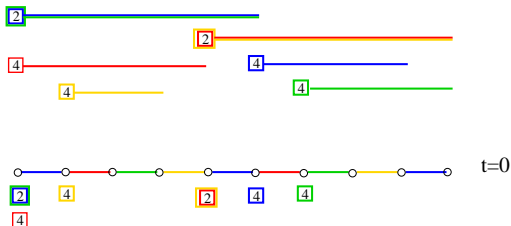
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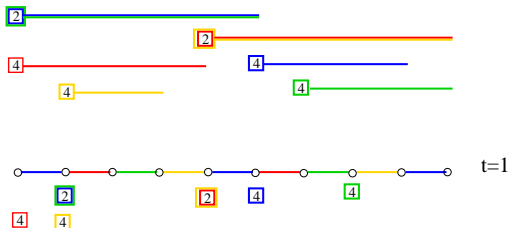
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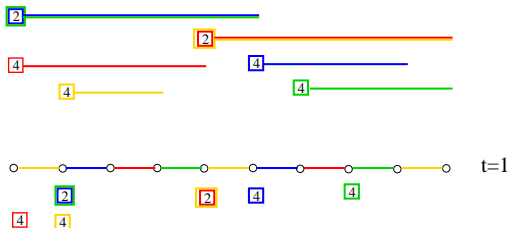
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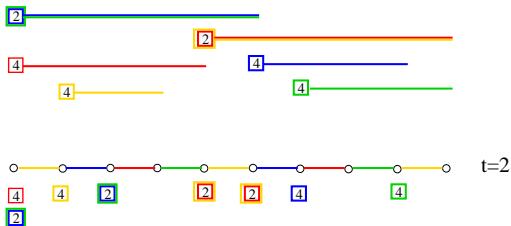
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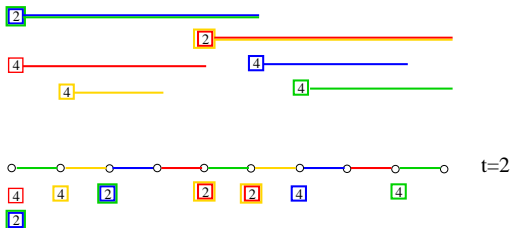
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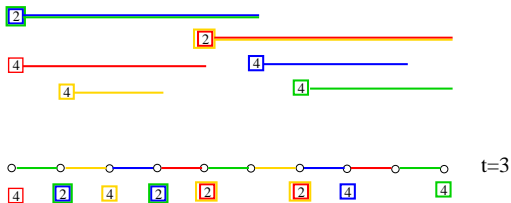
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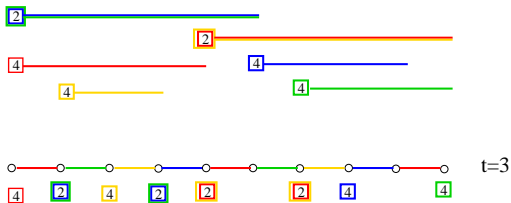
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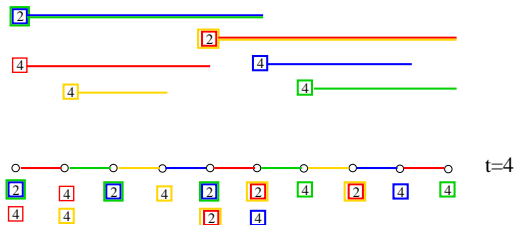
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Color algorithm

► Send packets according to the **color algorithm**:

1. Order the paths by increasing periods;
2. Color a path P with period p with a color class

$$[c_P] \in \{[0 \bmod p], [1 \bmod p], \dots, [(p-1) \bmod p]\}$$

such that $[c_P] \cap [c_{P'}] = \emptyset$ if P and P' overlap.

3. Color the edges e_k of $\{e_0, e_1, \dots, e_n\}$ with time-dependent color

$$(k + t) \bmod p_{max} \quad \text{for } t = 0, \dots;$$

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- **Theorem:** Feasible schedule if all periods are powers of 2.
- Thus, for general periods feasible if utilities

$$u(e) := \sum_{i:e \in P_i} \frac{1}{p_i} \leq \frac{1}{2} \quad \forall e \in E.$$

Solve all the open questions!