

Guaranteeing Stability and Delay in Dynamic Networks based on Infinite Games

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Third Cassting Meeting, Brussels, May 21–22, 2014

Outline

1 Routing in Dynamic Networks

2 Stability

3 Delay Bounds

4 Implementation

5 Conclusion

Problem Setting

- Communication network in which each node has a capacity for forwarding packets
- Primary users can occupy (block) some capacity of the nodes within their reach
- Secondary network defined by a list of source/destination pairs

Question: Under which conditions can we guarantee stable traffic in the secondary network?

$$\mathcal{N} = (G, c, \mathcal{D}, \mathcal{B})$$

- **Connectivity graph** $G = (V, E)$. Edges model communication links between the sites.
- **Capacity function** $c : V \rightarrow \mathbb{N}$, that is, node v has $c(v)$ independent channels for sending packets.
- $\mathcal{D} = [(s_1, d_1), \dots, (s_m, d_m)]$ **demand list** of source/destination pairs.
- \mathcal{B} is a set of **blocking functions** $B : V \rightarrow \{0, \dots, c\}$ modelling the activity of the primary network.

Routing Game

Game between **Routing Agent** and **Blocking Agent** played in rounds (discrete time steps) as follows:

- one packet is generated at each source s_i
- Blocking Agent chooses a blocking function $B \in \mathcal{B}$
- Routing Agent can forward at each node v up to $c - B(v)$ many packets along the edges
- packets that were generated at s_i and that arrive at d_i are removed from the network

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Properties of interest:

- Stability – Does the number of packets in the network remain below some bound?
- Packet delay – Does there exist a delay bound for packets?

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Stability Game

Routing game with stability condition for Routing Agent:

Routing Agent wins if there is a bound B such that the number of packets in the network never exceeds B .

Question: Does Routing Agent have a winning strategy?

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Static networks: We start by analyzing the one-player game in which Blocking Agent does not have any choice: there is only one fixed blocking function B

Multi Commodity Flows

Consider a network $\mathcal{N} = (G, c, \mathcal{D}, \mathcal{B})$ with $\mathcal{B} = \{B\}$.

A **multicommodity flow (MCF)** f for \mathcal{N} is a tuple $f = (f_1, \dots, f_m)$ of functions $f_j : E \rightarrow \mathbb{Q}_{\geq 0}$ with:

- for all $u \in V \setminus \{s_j, d_j\}$:
$$\underbrace{\sum_{(v,u) \in E} f_j(v,u)}_{f_j\text{-input at } u} = \underbrace{\sum_{(u,w) \in E} f_j(u,w)}_{f_j\text{-output at } u}$$

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- for all $u \in V$:
$$\underbrace{\sum_{j=1}^m \left(\sum_{(u,v) \in E} f_j(u,v) \right)}_{\text{overall output at } u} \leq \underbrace{c(u) - B(u)}_{\text{capacity at } u}$$

Stability Theorem

Theorem. In the (one player) stability game for $\mathcal{N} = (G, \mathcal{D}, \mathcal{B})$ with $\mathcal{B} = \{B\}$, Routing Agent has a winning strategy if and only if there exists an MCF $f = (f_1, \dots, f_m)$ for \mathcal{N} .

MCF to Routing Strategy

Assume there is an MCF $f = (f_1, \dots, f_m)$ for \mathcal{N} .

- Let p be period that is big enough (bigger than the least common multiple of the denominators of the values for f)
- The strategy works in rounds of p time steps
- At each node u , forward (up to) $p \cdot f_j(u, v)$ many packets along (u, v) in each round
- The flow properties ensure that this is a stable routing strategy

Stable Routing Strategy to MCF

Assume that Routing Agent has a stable routing strategy.

- Safety condition (keep the number of packets bounded)
- Exists stable routing strategy whose decisions only depend on the current network configuration
- If the number of packets is bounded, then the number of network configurations is bounded
- Behaviour is periodic, with some period p

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- If the number of packets is bounded, then the number of network configurations is bounded
- Behaviour is periodic, with some period p
- For each j , define $f_j(u, v)$ to be $\frac{n}{p}$, where n is the number of (s_j, d_j) -packets traversing (u, v) in one cycle of the period.
- This defines an MCF because
 - in one cycle of the period the number of packets entering and leaving a node must be the same
 - the capacity of the nodes is respected by the routing strategy

Extension to Dynamic Networks

Theorem. In the game for $\mathcal{G} = (G, \mathcal{D}, \mathcal{B})$ routing agent has a winning strategy if and only if there exists an MCF $f^B = (f_1^B, \dots, f_m^B)$ for $(G, \mathcal{D}, \{B\})$ for each $B \in \mathcal{B}$.

Idea:

- For each B choose a stable routing strategy σ_B .
- Whenever B is active, play according to σ_B , and only forward packets that were generated when B was active.

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Stability vs. Delay

A stable routing strategy does not guarantee that each packet is delivered:

- Some nodes might be used for some blocking functions but are isolated for other blocking functions.
- Even if no node can be isolated by a blocking function, we did not succeed in defining a routing strategy that guarantees bounded delay.
- We need an MCF with slightly higher throughput to obtain a bounded delay strategy.

Delay Bounds

Theorem. Let $\varepsilon > 0$, and let $\mathcal{N} = (G, \mathcal{D}, \mathcal{B})$ be a network with $c(u) - B(u) \geq 1$ for all $u \in V$ and $B \in \mathcal{B}$.

If for each $B \in \mathcal{B}$ there is an MCF $f^B = (f_1^B, \dots, f_m^B)$ for $(G, \mathcal{D}, \{B\})$ with throughput at least $1 + \varepsilon$, then routing agent has a strategy such that all packets are delivered within a bounded number of steps.

Idea:

- In the strategy for stability, under blocking function B , only packets are forwarded that were generated under B . The other packets are put on hold.
- The strategy for bounded delay uses the additional ε for forwarding such packets.

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Blocking Functions

- In a realistic scenario, the blocking functions are given by constraints (are not listed explicitly)
- We consider the following type of constraints
 - O_{\max} : maximal total number of blocked channels
 - c_{\min} : the minimal number of available channels at each node
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Size of $\mathcal{B}(O_{\max}, c_{\min})$:

- network with 50 nodes
- capacity $c = 3$ at each node
- $c_{\min} = 1$

O_{\max}	$ \mathcal{B}(O_{\max}, 1) $
1	51
2	1.326
3	23.376
4	313.701
5	3.412.461
6	31.298.361
7	248.635.761
8	1.744.483.611
9	10.970.926.711
10	62.561.143.641

Backtracking Algorithm

Start with blocking function B_0 that does not block anything.

- Given the current blocking function B , compute MCF f with throughput $1 + T$ with T maximal.
- If $T < 0$, then there is no MCF for B .

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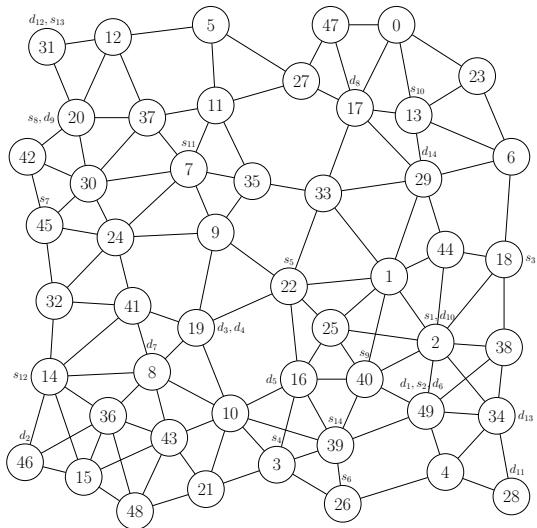
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- If T is bigger than the number of channels that can still be blocked, then no extension of B can “break” f . (Each additional channel blocked at a node can reduce the throughput of f by at most 1.)
- Otherwise, normalize f to throughput 1 and increase the number of blocked channels at some node u to break f .
- Continue with this extended blocking function.

Example Network for Evaluation

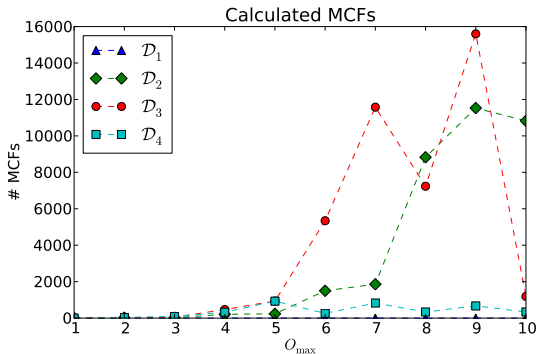


$$\begin{aligned} \mathcal{D}_2 &= \mathcal{D}_1 \cup \{(40, 20), (13, 2)\} \\ \mathcal{D}_3 &= \mathcal{D}_2 \cup \{(7, 28), (14, 31)\} \\ \mathcal{D}_4 &= \mathcal{D}_3 \cup \{(31, 34), (39, 29)\} \end{aligned}$$

$$\mathcal{D}_1 = \{(2, 49), (49, 46), (18, 19), (3, 19), (22, 16), (26, 49), (45, 8), (20, 17)\}$$

Results

	O_{\max}									
	1	2	3	4	5	6	7	8	9	10
\mathcal{D}_1	●	●	●	●	●	●	●	●	●	●
\mathcal{D}_2	●	●	●	●	●	●	●	●	●	○
\mathcal{D}_3	●	●	●	●	●	●	○	○	○	○
\mathcal{D}_4	●	●	●	○	○	○	○	○	○	○



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Summary:

- Characterization of stable networks using MCFs
- Sufficient condition for delay bound
- Implementation working for large sets of blocking functions
- Constructed routing strategy is global and thus not useful in practice. But we can use our results to provide a sufficient condition such that backpressure routing is stable.

Ideas for future work:

- Analysis for finer network and routing models
- Dynamic changes of source/destination pairs
- Further investigation of delay bounds