# On Resilience of Multicommodity Flow Networks

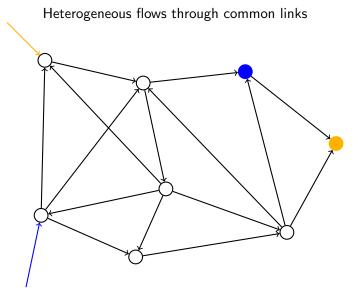
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# Multicommodity Flow Problem



In this talk: Introduce dynamics to study stability and resilience.

# Multicommodity Flows







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## Outline

Local network

**Global Network** 

Conclusions and Future Work

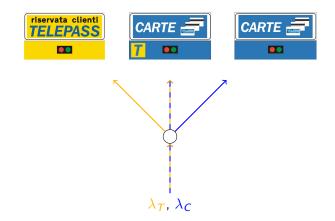
## Example - Toll Station



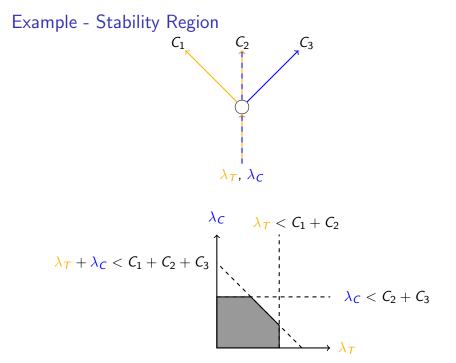


Images: http://www.inabruzzo.com, http://www.autostrade.it

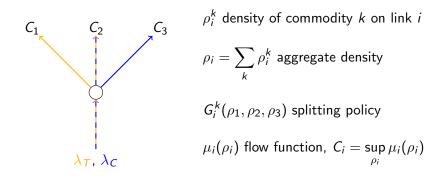
# Example - Toll Station



Static inflow of customers with telepass,  $\lambda_{T}$ , and credit card,  $\lambda_{C}$ .



# Local Network - Dynamics

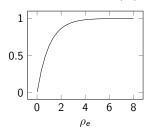


$$\dot{
ho}_i^k = \lambda_k G_i^k(
ho_1(t), 
ho_2(t), 
ho_3(t)) - rac{
ho_i^k(t)}{
ho_i(t)} \mu_i(
ho_i(t))$$

## Local Network - Assumptions

Flow functions

Strictly increasing and bounded from above.



Flow function,  $\mu_e(\rho_e)$ 

Splitting policies

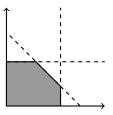
a) 
$$\frac{\partial}{\partial \rho_j} G_i^k(\rho) \ge 0$$
,  $\forall i, j \text{ s.t. } i \neq j$ .  
b) if  $\rho_i \to +\infty$  on a subset of links, then  $G_i^k(\rho) \to 0$ .

## Local Network - Stability

#### Theorem

For a local network, satisfying the assumptions on the previous slide, it holds that:

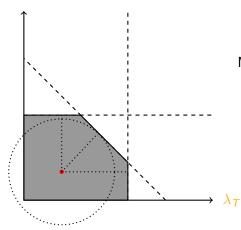
- a) if the inflows are inside the stability region, it exists unique limit densities,  $\rho_e^{k*}$ , such that  $\lim_{t \to +\infty} \rho_e^k(t) = \rho_e^{k*}$  for every link.
- b) if the inflows are outside the stability region,  $\rho_e(t) \rightarrow \infty$  on at least one link.



Proof idea: The system is monotone in the aggregate

## Resilience

The largest increase of inflow/decrease of capacity the network can handle  $\lambda_{C}$ 



Margin of resilience =

$$\min\{C_1 + C_2 + C_3 - \lambda_C - \lambda_T, \\ C_1 + C_2 - \lambda_T, \\ C_2 + C_3 - \lambda_C\}$$

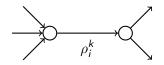
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### **Global Network - Dynamics**

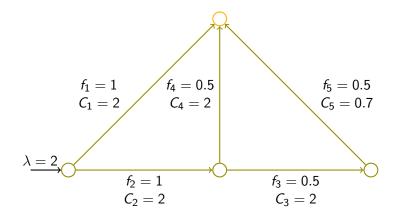


$$\begin{split} \dot{\rho}_i^k &= \sum_j f_{ji}^k - \sum_j f_{ij}^k \\ f_{ij}^k &= \begin{cases} \frac{\rho_i^k}{\rho_i} \mu_i(\rho_i) G_j^k(\rho) & \text{if } (i,j) \in \mathcal{E} \\ 0 & \text{o.w} \end{cases} \end{split}$$

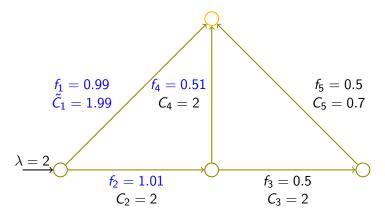
#### Proposition

For acyclic networks, where the splitting policies and flow functions are satisfying the previously stated assumptions, if there exists a finite equilibrium, it is globally asymptotically stable.

#### **Resilience - Single Commodity**

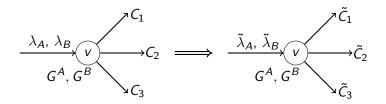


#### Resilience - Single Commodity



Margin of resilience = Minimum node residual capacity = 0.2 [Como et.al. (2013), *Robust Distributed Routing in Dynamical Networks - Part I & II*]

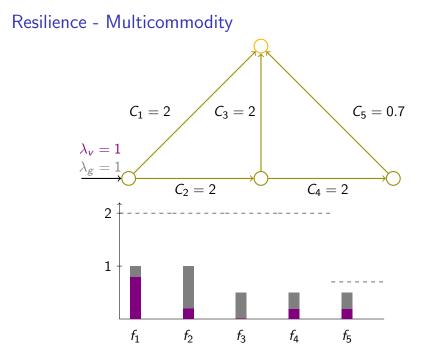
## Resilience - Diffusivity

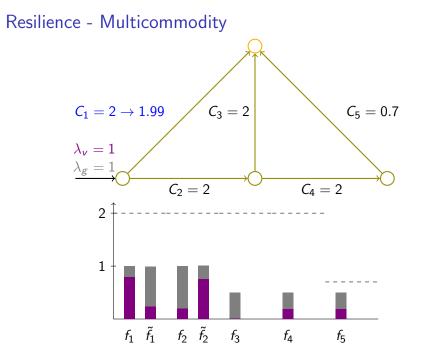


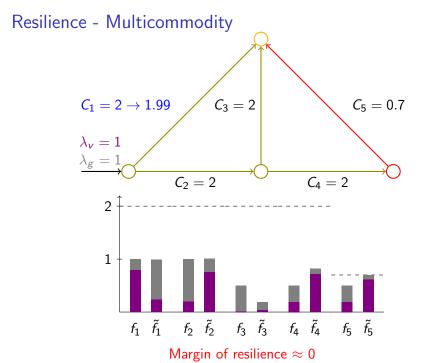
#### Proposition

For every subset of links  $\mathcal{I}$  it holds that

$$\sum_{i\in\mathcal{I}}\left(\tilde{f}_i^*(\tilde{\lambda})-f_i^*\right)\leq \sum_{k\in\mathcal{K}}\left[\tilde{\lambda}_k-\lambda_k\right]_++\sum_e(C_e-\tilde{C}_e).$$







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# Conclusions and Future Work

#### Conclusions

- Extension of single commodity to multicommodity
- Heterogeneity in the routing can make the network more fragile

#### Future Work

- Resilience under less heterogeneous routing policies
- Robust (distributed) controllers, scheduling

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