



Window Flow Controller and Subadditivity

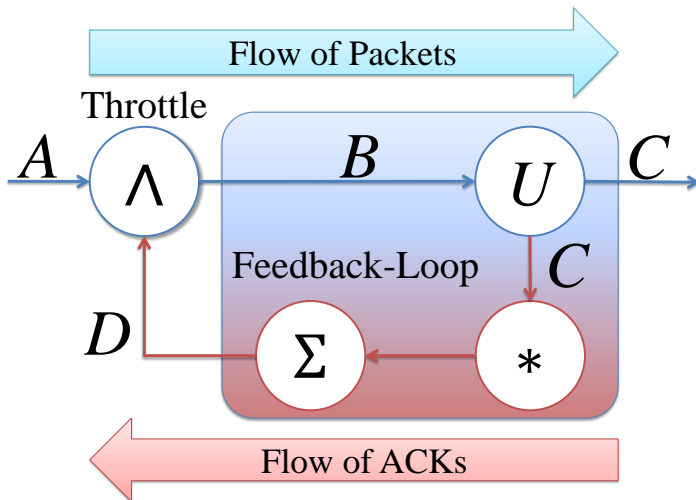
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TU Kaiserslautern

WoNeCa 2016

Introduction

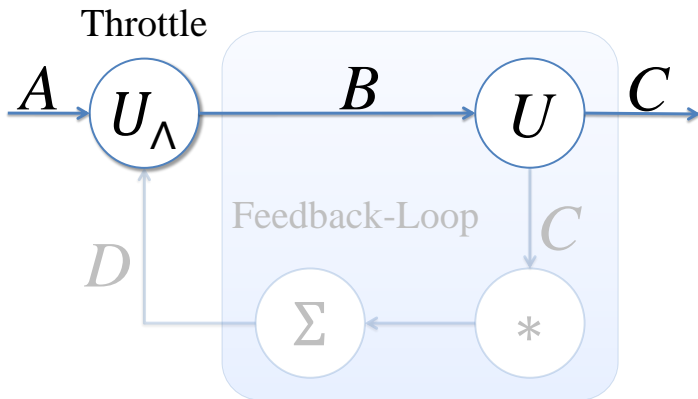
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- 3 First Successes
- 4 SNC at Work
- 5 Conclusion

What is Window Flow Control?



- Most important example: window-based transport protocols

End-to-end Description



$$U_{\Lambda} = \bar{U}_{fb} := \bigwedge_{n=0}^{\infty} U_{fb}^{(n)}(t)$$

Subadditivity

Definition

U is *subadditive* if

$$U(s) + U(t) \geq U(t + s)$$

$$\left(U(s, r) + U(r, t) \geq U(s, t) \right)$$

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- Convolution **does not** preserve subadditivity.
- The calculation of leftover service curves **does not** preserve subadditivity.
- Rule of thumb: “Interesting things are not subadditive.”

MGF Calculus

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MGF-Bounds

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- In the calculation of performance bounds the MGF

$$\mathbb{E} \left(e^{\theta A \otimes (\bar{U}_{fb} \otimes U)}(s, t) \right) \leq \sum_{n=0}^{\infty} \mathbb{E} \left(e^{\theta A \otimes (U_{fb}^{(n)} \otimes U)}(s, t) \right)$$

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- However: $\sum_{n=0}^{\infty} \mathbb{E} \left(e^{\theta A \otimes (U_{fb}^{(n)} \otimes U)}(s, t) \right) = \infty$.

First Successes

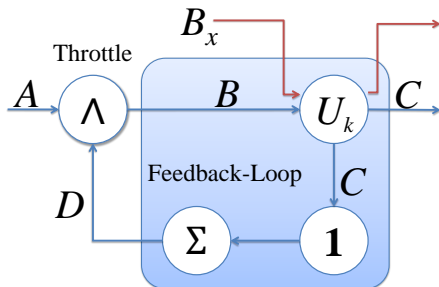
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Method 0: Bivariate Calculus

- Subadditivity leads to a closed form of the subadditive closure:
$$\bar{U}_{fb} = U_{fb} \wedge \mathbf{1}.$$
- First idea: Consider subadditive feedback loops.
- In bivariate formulations leftover service descriptions preserve subadditivity (no arrival curves involved).

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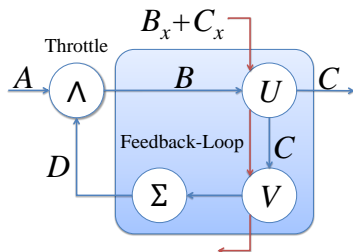
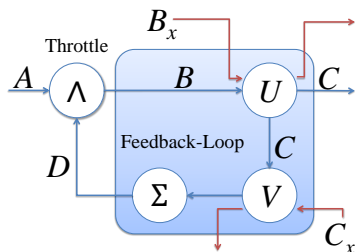
$$U_k(s, t) = k(t - s)$$

Method 1: Change Topologies

- Part of “Window Flow Control in Stochastic Network Calculus” (TR, 2015)
- By changing the topology subadditivity can be enforced.
- Can be costly.

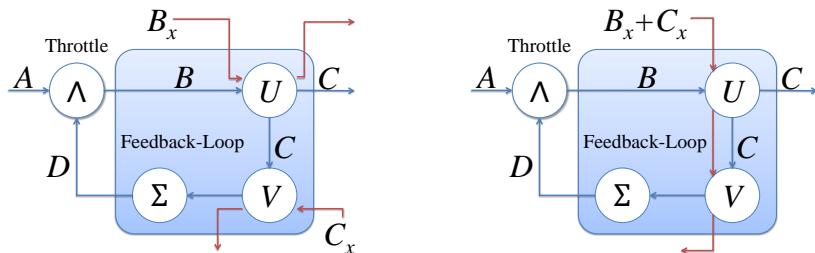
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- Nevertheless: first non-trivial performance bounds on WFC-Systems!
- Works better if:
 - service elements have **similar** rates
 - each service element can work the entire aggregate of crossflows

Method 2: “Assume” Subadditivity

- “Window Flow Control in Stochastic Network Calculus – The General Case” (Valuetools 2015)
- A condition for subadditivity:

$$(E) : U \otimes V(s, t) - (U \otimes V)^{(2)}(s, t) \leq \Sigma \text{ for all } s \leq t$$

$\Rightarrow U_{fb}$ is subadditive.

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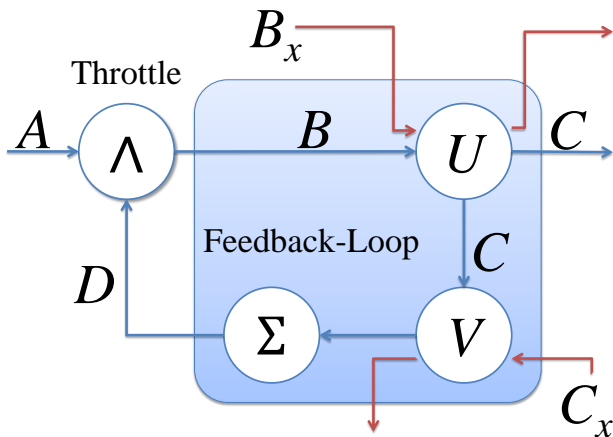
- Works better for
 - **differing** service elements
- The catch: $\mathbb{P}(\neg E)$ diverges in t !

SNC at Work

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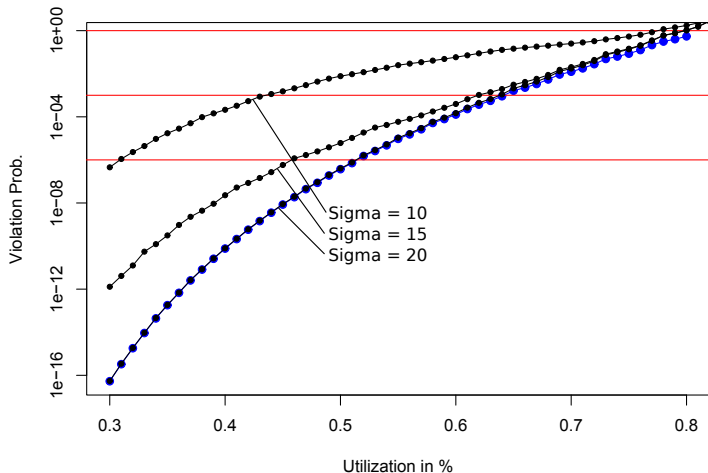
General Case

- From “Window Flow Control in Stochastic Network Calculus – The General Case” (Valuetools 2015)
- Throttled vs. Unthrottled:



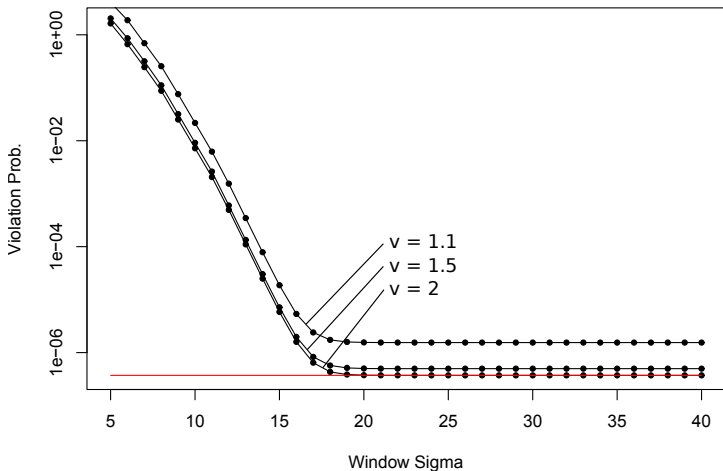
General Case (throttled vs. unthrottled)

- From “Window Flow Control in Stochastic Network Calculus – The General Case” (Valuetools 2015)
- I.i.d. $\exp(\lambda)$ increments for all flows involved.



Convergence to Unthrottled Systems?

- From “Window Flow Control in Stochastic Network Calculus – The General Case” (Valuetools 2015)
- Bounds for improving window sizes Σ :



DNC vs. Topology Changes vs. $\mathbb{P}(\neg E)$

- From “Stochastic Worst Case Analysis of Window Flow Controlled Systems” (under review)
- Given the same scenario we can analyze it deterministically or by the two stochastic methods.
- Admission problem:

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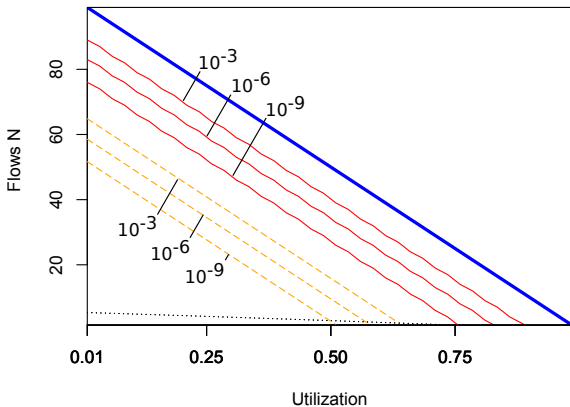
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 - U is utilized by a certain amount of cross-flows already.

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 - U is utilized by a certain amount of cross-flows already.
 - How many flows can we admit to the system without breaking a given (probabilistic) backlog bound at the throttle element?

DNC vs. Topology Changes vs. $\mathbb{P}(\neg E)$

- From “Stochastic Worst Case Analysis of Window Flow Controlled Systems” (under review)
- Reachable utilizations: DNC (up to 52%), by topology change (up to 65%), and by bounding $\mathbb{P}(\neg E)$ (up to 90%, $t = 1000$)



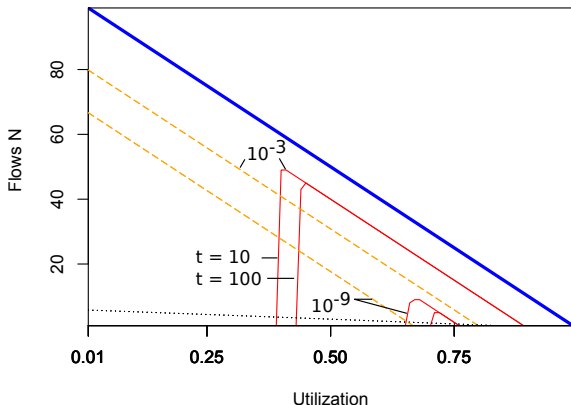
Asymmetric situation: V runs faster than U .

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- Now V and U have the same rate. V handles 10 crossflows.

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- For a low number of crossflows at U the service elements are very similar! \rightarrow bounding $\mathbb{P}(\neg E)$ becomes harder.

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- Recent work in *bivariate* formulations gives first results, though.
- Current approaches either:
 - consider specific feedback loops only (fixed delay elements)
 - underestimate available service rates (topological changes)
 - depend on the evaluation time t (bounding $\mathbb{P}(\neg E)$)
- Methods complement one another to some extent.

Thank you for your attention!

For details:

- “Window Flow Control in Stochastic Network Calculus” (Beck and Schmitt. TR, 2015)
- “Window Flow Control in Stochastic Network Calculus – The General Case” (Beck and Schmitt, Valuetools 2015)
- “Stochastic Worst Case Analysis of Window Flow Controlled Systems” (Beck. Under review)