
On the Network **Throughput** Under **Delay** and **Burstiness** Constraints

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Motivation & Goal

- Capacity limits of wireless networks well-understood,
 - Courtesy Information Theory
- Rapid growth of delay sensitive applications, VOIP, IP video
- Capacity limits of wireless networks under QoS constraints (e.g. delay) not so well-understood
- **Goal**
- Quantify the traffic carrying capacity of communication networks with bursty sources under delay constraints
- We call it "**Delay Constrained throughput**"

Focus: Delay Constrained Throughput (λ_d)

- The maximum traffic* (λ) carried by the network for a given delay guarantee requirement (d^g) and burstiness constraint (σ)

$$\lambda_d = \max \left\{ \lambda \mid d_{\lambda, \sigma}^{\varepsilon} \leq d^g \right\}$$

where, $d_{\lambda, \sigma}^{\varepsilon}$ is delay bound with violation **Pr**obability (ε)

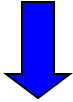
$$\Pr \left[d(t) > d_{\lambda, \sigma}^{\varepsilon} \right] \leq \varepsilon$$

Stochastic **S**ervice **G**uarantees (SSG)

Wireless channels only provide SSG

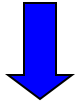
*In bits/sec

Modus Operandi...

- Given the
 - Input Traffic
 - Service Elements
 - Delay Guarantee (d^g)
- What is the throughput?
- **Solution Steps:** 
 - traffic and server model.
 - Delay bound ($d_{\lambda, \sigma}^\varepsilon$)
 - Using $d_{\lambda, \sigma}^\varepsilon \leq d^g$, we find Throughput

**Delay Constrained Throughput of
Correlated **MIMO** wireless channels in
spatial multiplexing mode using **MGF**
Stochastic Network Calculus**

Recap: Modus Operandi...

- Given the
 - Input Traffic
 - Service Elements
 - Delay Guarantee (d^g)
 - What is the throughput?
- 
- Solution Steps:
 - traffic and **server** model.
 - **Delay bound** ($d_{\lambda,\sigma}^\varepsilon$)
 - Using $d_{\lambda,\sigma}^\varepsilon \leq d^g$ and other constraints (if any) we find Throughput

MGF Based Network Calculus

 $d_{\lambda, \sigma}^{\varepsilon}$

$$d_{\lambda, \sigma}^{\varepsilon} = \inf_{\theta > 0} \left[\inf \left[\tau : \frac{1}{\theta} \left(\ln \sum_{s=\tau}^{\infty} M_A(\theta, s - \tau) \widehat{M}_S(\theta, s) - \ln \varepsilon \right) \leq 0 \right] \right]$$



MGF Based Network Calculus

 $d_{\lambda, \sigma}^{\varepsilon}$

- Markov Chain is used to model MIMO channel.
- States are based on degree of Freedom (DOF)

$$\widehat{M}_S(\theta, t) = \boldsymbol{\pi}(\mathbf{R}(-\theta)\mathbf{Q})^{t-1}\mathbf{R}(-\theta)\mathbf{1}$$

- Periodic traffic source with period τ produces σ units of workload at times $U \tau + n \tau$

$$M_A(\theta, t) = e^{\theta\sigma \lfloor \frac{t}{\tau} \rfloor} \left(1 + \left(\frac{t}{\tau} - \left\lfloor \frac{t}{\tau} \right\rfloor \right) (e^{\theta\sigma} - 1) \right)$$

$$d_{\lambda, \sigma}^{\varepsilon} = \inf_{\theta > 0} \left[\inf \left[\tau : \frac{1}{\theta} \left(\ln \sum_{s=\tau}^{\infty} M_A(\theta, s - \tau) \widehat{M}_S(\theta, s) - \ln \varepsilon \right) \leq 0 \right] \right]$$

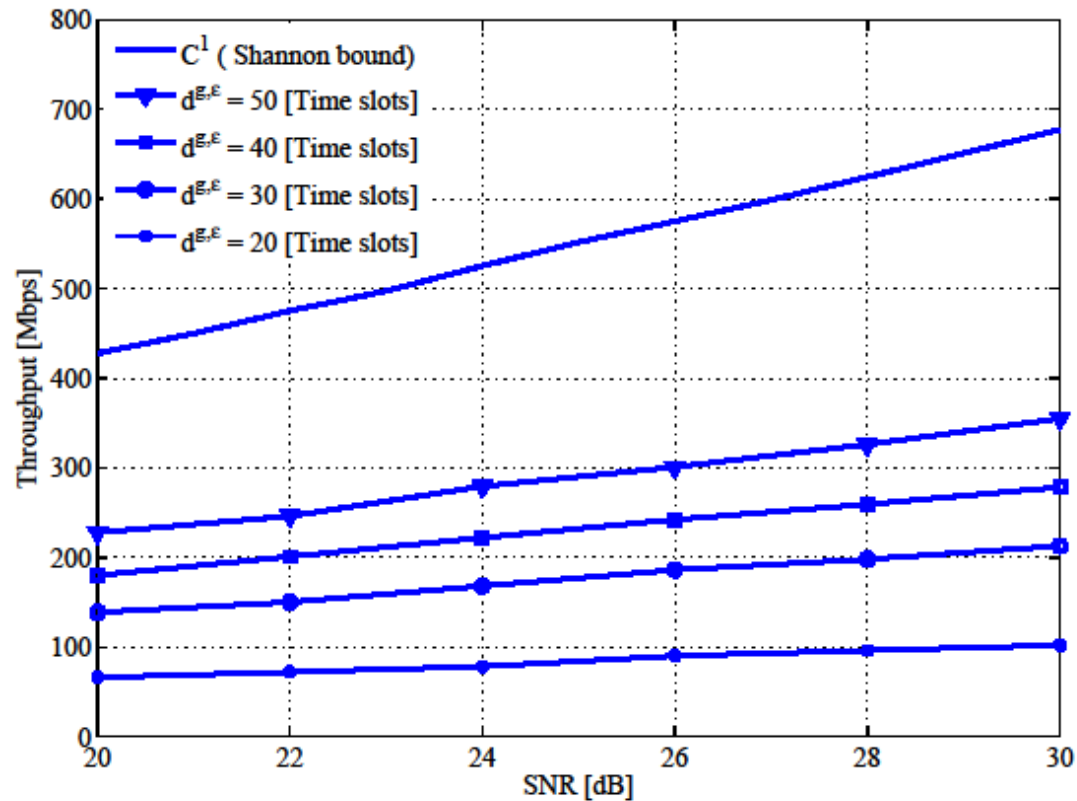
$$d_{\lambda, \sigma}^{\varepsilon} \leq d^g$$

Numerical Results

Shannon Bound

$$N = 2$$

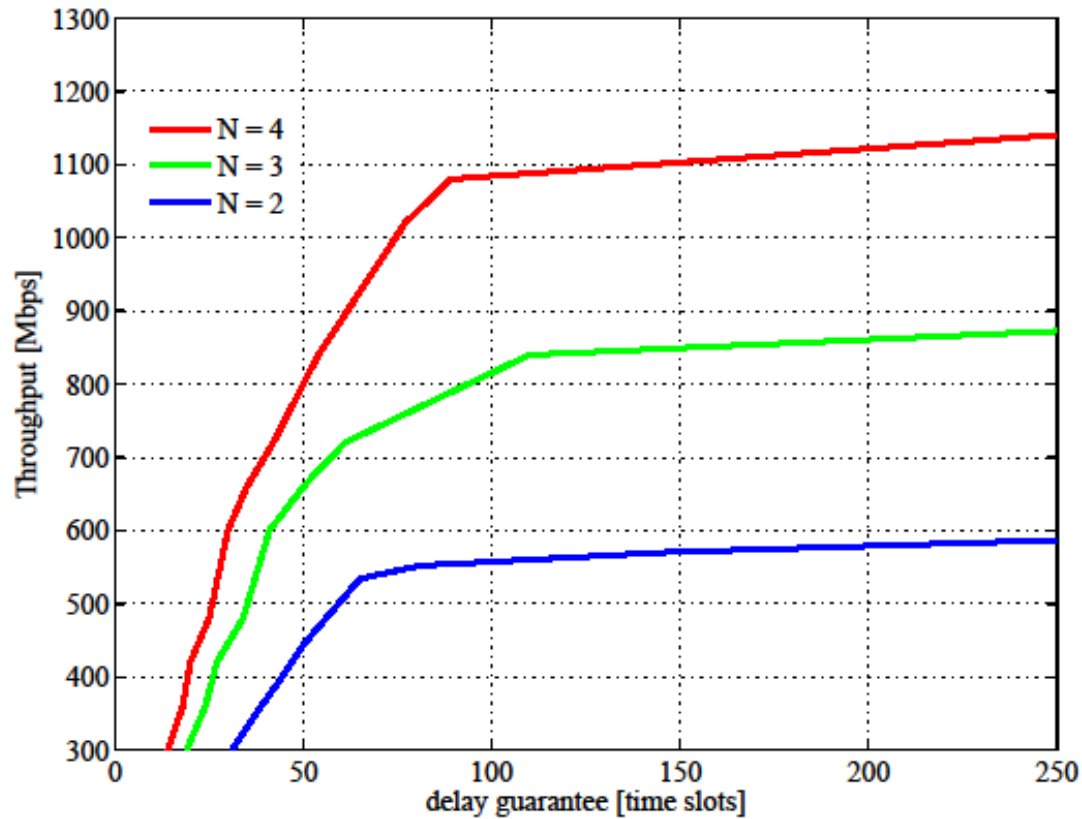
$$\epsilon = 10^{-6}$$



effect of # of antennas

$$\epsilon = 10^{-3}$$

SNR = 25 dB



Conclusion

Motivation

Focus

Modus Operandi

Application

Throughput of MIMO Channel

References

- On the modeling of delay and burstiness for calculating throughput.
 - K. Mahmood, Y. Jiang, Addisu T Eshete,
 - (IEEE SARNOFF, 2010)
- On the flow level delay of a spatial multiplexing MIMO wireless Channel
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- Delay Constrained throughput Analysis of a Correlated MIMO wireless Channel
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Sincerely Yours

Suggestions are most welcome