

# Distributed Backlog-Driven Power Control in Wireless Networking

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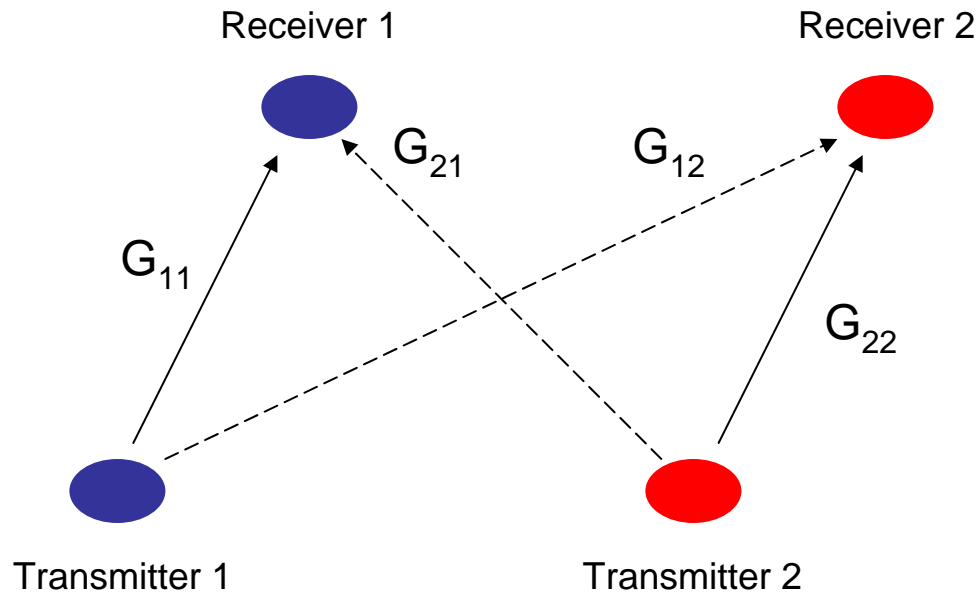


# Introduction

- Transmit power control in wireless networks
  - Mitigates multiple access interference
  - Conserves battery life in mobile terminals
- Distributed power control for ad hoc networks
  - Classical algorithm by Foschini & Miljanic'93
    - **Fully distributed**, but not backlog aware
  - PCRA by Bambos & Kandukuri'00
    - **Backlog aware**, but assumes unresponsive interference
- This talk ... *distributed, backlog aware power control, responsive to interference*
  - Focus on stochastic control aspects



# System Model



$$\gamma_1 = \frac{P_1 G_{11}}{P_2 G_{21} + \sigma^2}$$

$$\gamma_2 = \frac{P_2 G_{22}}{P_1 G_{12} + \sigma^2}$$

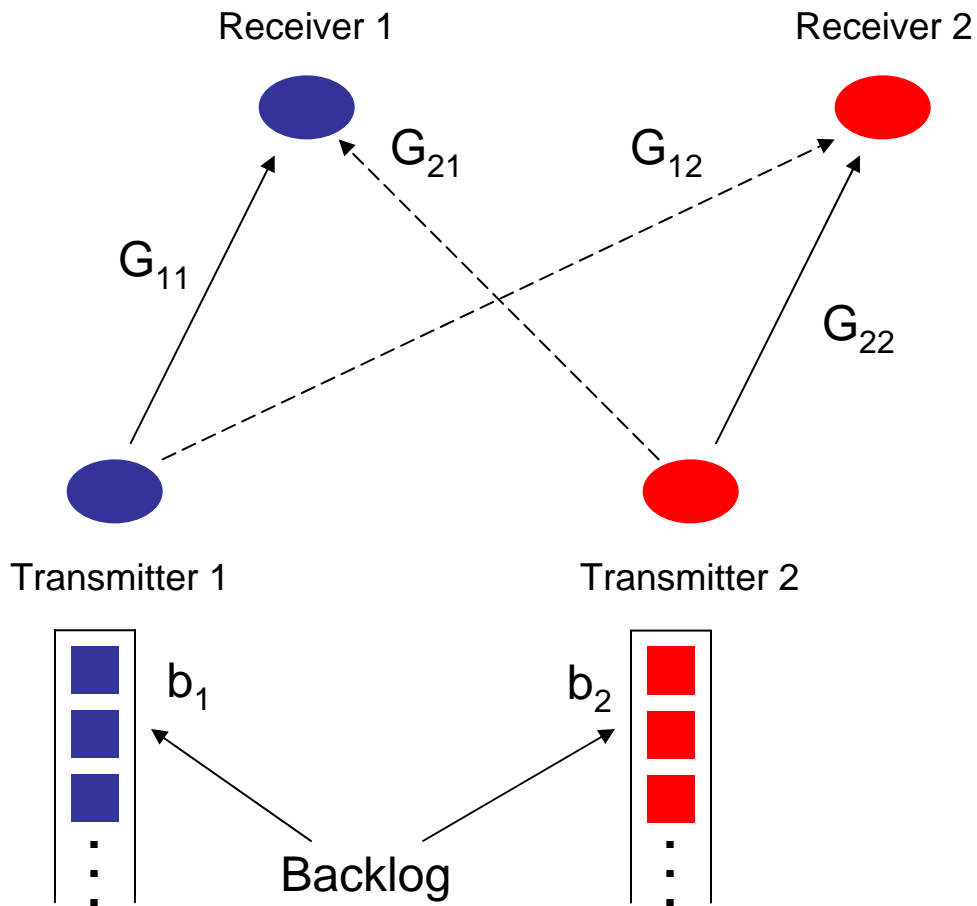
**SINR**

- Slotted time
- $L$  transmit power levels
- Probability of successful transmission – function of SINR
- Change power by at most one level in every time slot

*Practical considerations*



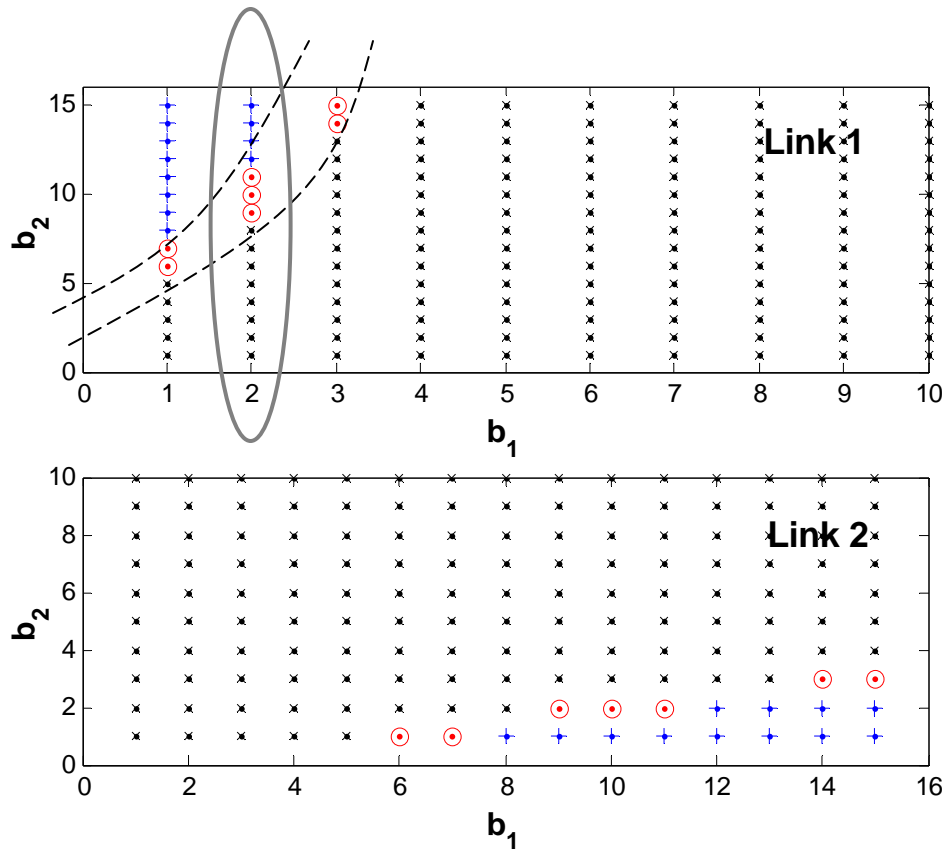
# Centralized Power Control



- Buffer draining problem
  - Can incorporate Markovian arrivals
- Backlog costs per time slot (convex)
- *Objective* – Minimize total backlog cost incurred in draining queues
- Power assignment based on
  - Backlog information
  - SINRs from previous time slot
- Stochastic shortest path problem
  - Dynamic programming



# Centralized Power Control ...



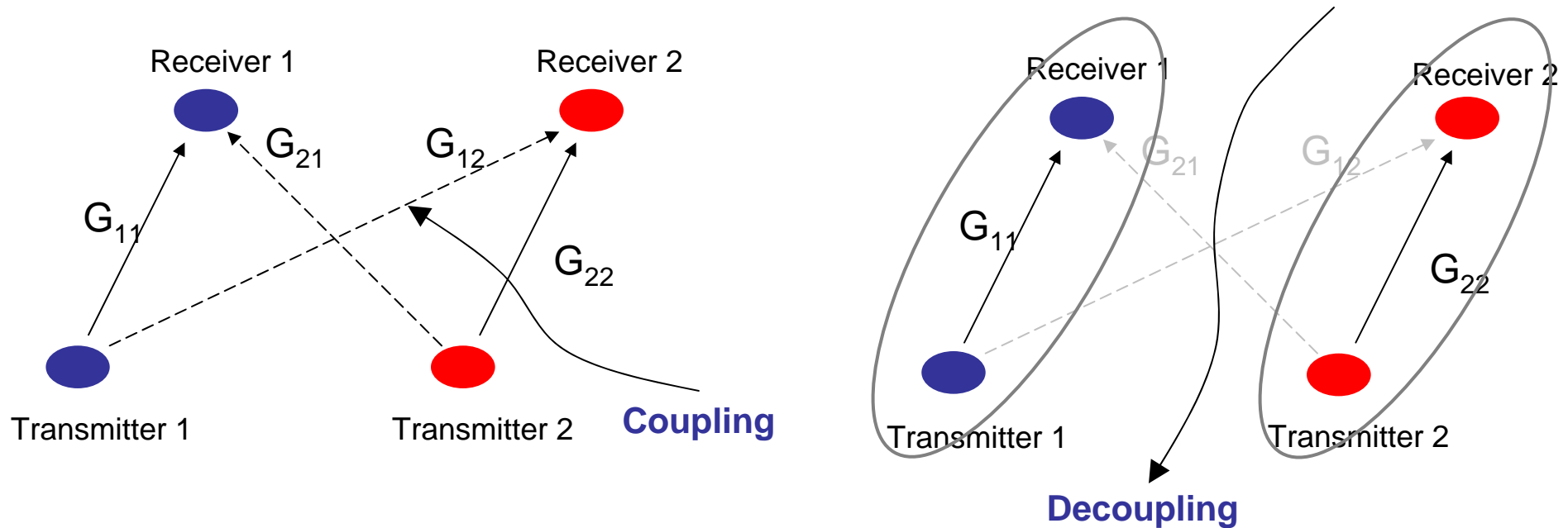
Snapshot of optimal policy (Oracle)

x increase o maintain + decrease

- *Provable* structural properties
- **Load balancing effect**
  - Opportunistic behavior
- What is missing?
  - Distributed decision making
  - Scalability
- Oracle is a benchmark for performance evaluation



# Distributed Power Control



- Coupling induced by broadcast nature of wireless medium
- Analysis / implementation does not scale with number of links

- *Decouple* – study every link in isolation
- Capture interaction through **power cost**
  - Penalty for “stressing” the shared wireless environment
  - Introduces *power vs. backlog tradeoff*



# Distributed Power Control ...

- Solve three different buffer draining problems for single link under the assumptions:
  - Interference will always decrease – **BACK** (back-off)
  - Interference will always increase – **AGGR** (aggressive)
  - Interference will stay fixed – **STAT** (static)
- **Objective** – Minimize total backlog cost plus power cost incurred in draining queue
- Dynamic programming formulation
- One look up table for each problem



# The BDD Power Control Algorithm

- Compute 3 look up tables BACK, AGGR, and STAT *offline* at each link
- Given current backlog and interference from previous time slot

- Choose action from table
 

{	BACK	w.p.	$\beta_1$	<i>Decision step</i>
	AGGR	w.p.	$\beta_2$	
	STAT	w.p.	$1 - \beta_1 - \beta_2$	

- Observe interference ( $i$ ) in current time slot

*Update step*

$i \downarrow$	$\beta_1 \uparrow$	$\beta_2 \downarrow$
$i \uparrow$	$\beta_1 \downarrow$	$\beta_2 \uparrow$
$i \leftrightarrow$	$\beta_1 \downarrow$	$\beta_2 \downarrow$

- $\beta_1$  = Fraction of time interfering links back off – interpret as probability





# The BDD Power Control Algorithm ...

- Generalizes to multiple links
- Only aggregate interference from other links matters
  - Conceptually, other links behave as one *mega link*
- Can adapt to changes in topology through  $\beta_1$  and  $\beta_2$ 
  - No need to re-compute look up tables as other links come and go
- Look up tables re-computed only when self link gain changes
  - Reasonable under slow mobility

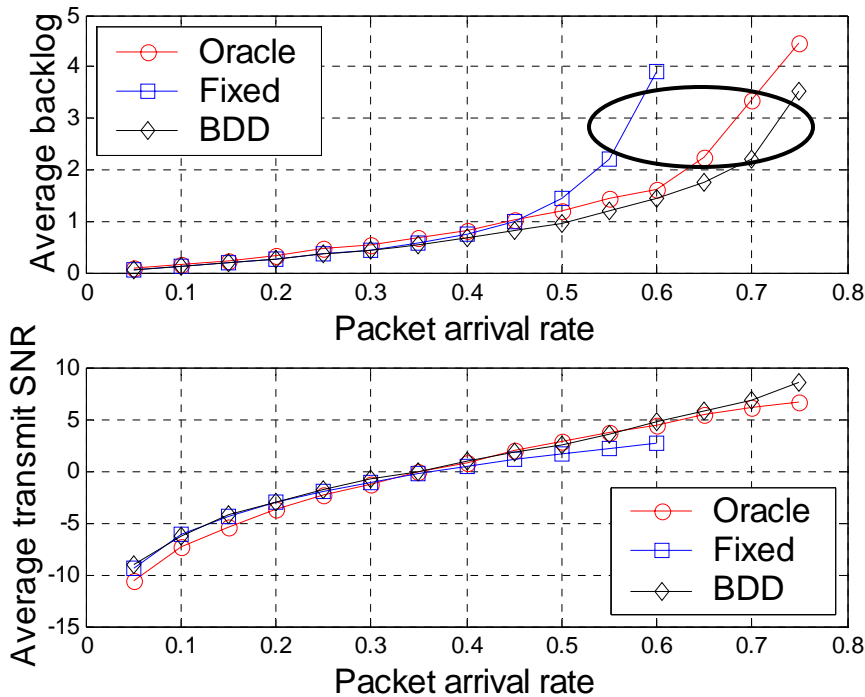


# Performance Evaluation

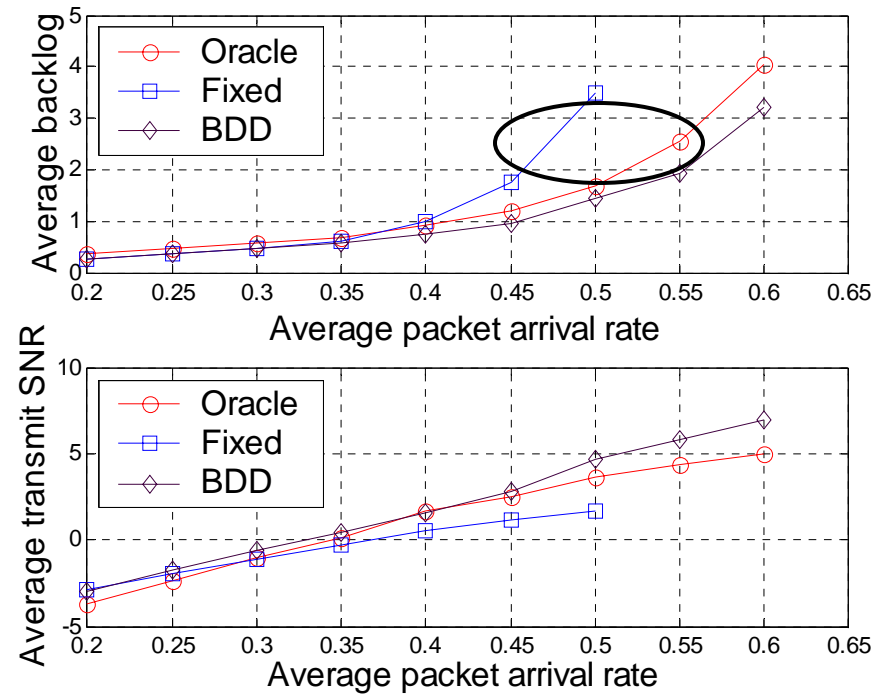
Parameter	Value
Simulation length	10000 time slots
Channel gains	$G_{11} = G_{22} = 1, G_{12} = G_{21} = \frac{1}{2}$
Success probability mapping	$s(\gamma) = 1 - \exp(-\gamma)$
Number of transmit power levels	$L = 8$
Backlog costs (Oracle and BDD)	$\phi(b) = b$
Power costs (BDD only)	$\zeta(l_1 - l_2) = l_1 - l_2$



# Performance Evaluation ...



**Bernoulli traffic**

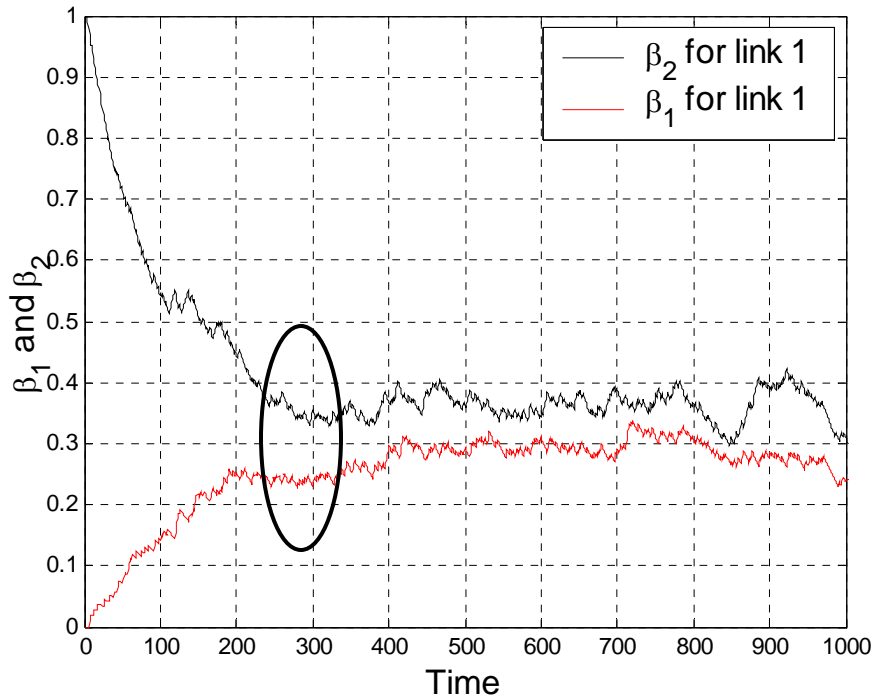


**Markov modulated  
Bernoulli traffic (bursty)**

- 20-30 % gain in throughput over power control with fixed SINR targets
- Similar results for other traffic types (e.g., Poisson)
- Performance of BDD and Oracle similar

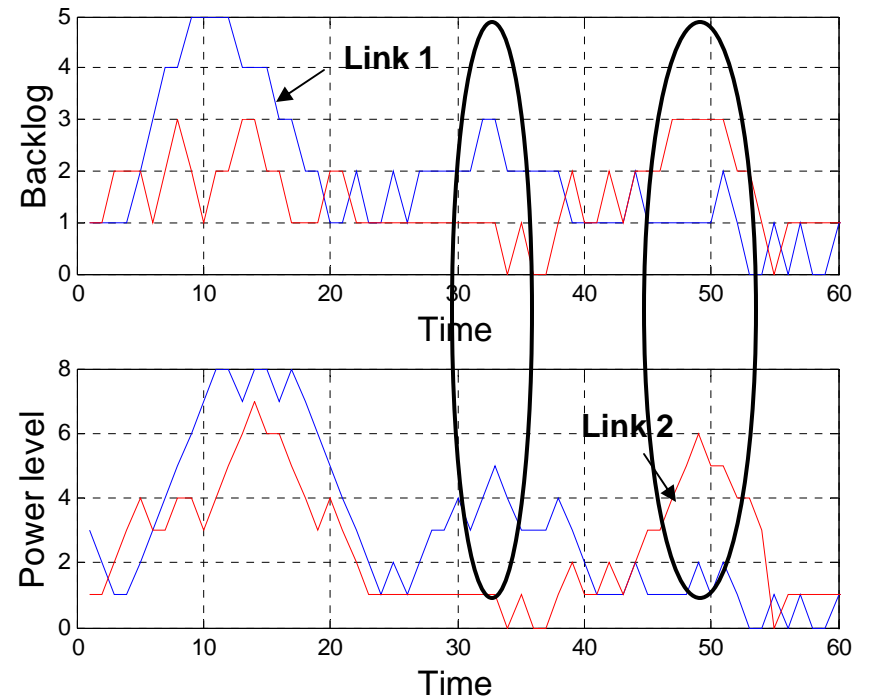


# Performance Evaluation ...



**Convergence**

**Bernoulli –  $p_1 = 0.8, p_2 = 0.4$**



**Power vs. Backlog tradeoff**

**Bernoulli –  $p_1 = 0.6, p_2 = 0.6$**



# Conclusions

- Centralized power control – Oracle
  - Load balancing effect
- Distributed power control – BDD
  - **Decouple links for analysis** – capture interaction through “power costs”
    - More generally applicable (e.g., buffer management for media streaming)
  - Mimics load balancing effect
  - Scalable
- *Ongoing work* – multilink simulations, theoretical aspects, protocol aspects



# Thank You !

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# Introduction ...

- A distributed PC algorithm – FM'93
  - Fixed SINR targets
  - Infinitely backlogged sources
  - “Fights” the interference
- Another distributed PC algorithm – BK'00
  - Probability of success – function of SINR
  - **Backlog aware**
  - Assumes unresponsive interference
  - “Befriends” the interference
- This talk ... *distributed, backlog aware power control, responsive to interference*
  - Focus on structural / control aspects

