

Optimal Scheduling in Distributed MACs under Delay Constraints

Sibi Raj B. Pillai

Department of Electrical Engineering
Indian Institute of Technology Bombay



Outline

- System Model with Random Arrivals
- Power Consumption in TDMA
- Optimal Power Allocation Functions
- Generalizations
- Conclusion



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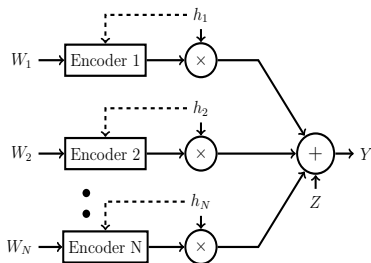


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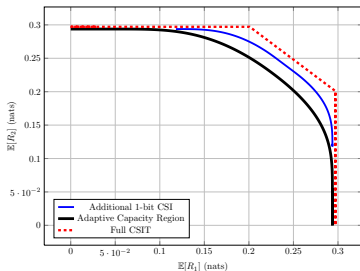


Distributed Multiple Access



- ▶ 'Motivated by practical wireless' [ElGamal11].
- ▶ **Adaptive Capacity \mathcal{C}_A** : \Rightarrow No outage rates under blockwise encoding/decoding.
- ▶ Unknown for many models [GamalCioffi07]

- ▶ Solve \mathcal{C}_A for arbitrary fading distributions.
- ▶ An explicit rate-allocation algo is the key.
- ▶ Can be generalized to other CSI models.
- ▶ SS, BKD, *SRBP*, "Distributed Rate Adaptation and Power Control in Fading MACs", Submitted to IEEE Trans Information Theory, 2014 (also in ITW11, ISIT13, ITW14).



Distributed Access with Arrivals

ALOHA

- ▶ G_i : attempt probability of transmitter i .
- ▶ Incoming load:

$$\sum_{i=1}^L G_i = G$$

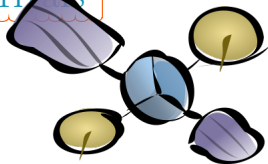
- ▶ Throughput :

$$\sum_{i=1}^L G_i (1 - G_i)^{L-1} \rightarrow G e^{-G}$$

- ▶ Maximum = $\frac{1}{e}$.



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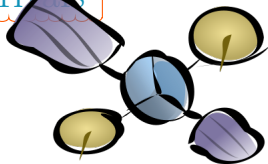
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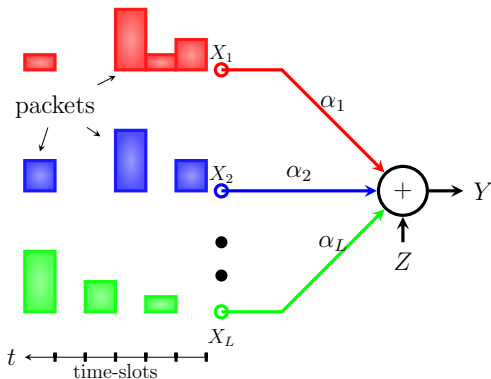
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Distributed Multiple Access



El Gamal et al, " Energy efficient scheduling of packet transmissions over wireless networks", INFOCOM 2002.

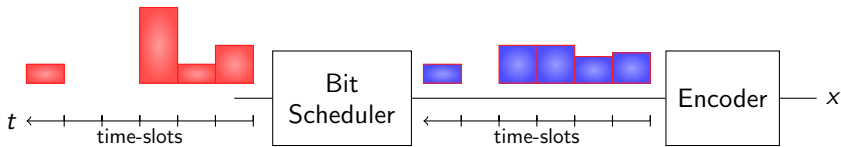
1) Is it possible?

2) What is the cost?

Flush packets within the delay + *high success-rate* using distributed info.



Single User Scheduling



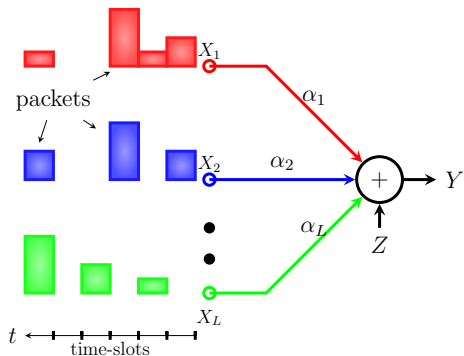
- ▶ Bit Scheduler ensures the delay constraint, example max-delay.
- ▶ Encoder is also a power scheduler, i.e. for B bits per channel use

$$P(B) = \frac{2^{2B} - 1}{\alpha^2}.$$

- ▶ In other words, a $(n, 2^{nB})$ channel code with average power $P(B)$ is employed in that block (*Zero Outage Scheduler*).



Time Division Multiple Access



- ▶ Assume $\alpha_i = \alpha, \forall i$.
- ▶ User i requires rate $B_i \in \mathcal{B}$,

$$\frac{1}{L} \cdot \frac{1}{2} \log(1 + L\alpha^2 P_i) = B_i$$

- ▶ The required power is

$$P_i(B_i) = \frac{2^{2LB_i} - 1}{\alpha^2}$$



Uncoordinated Access

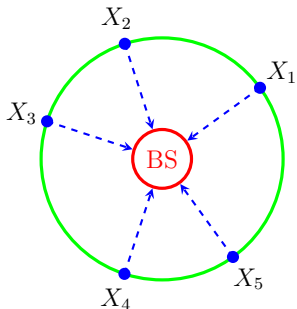


Figure : Symmetric MAC

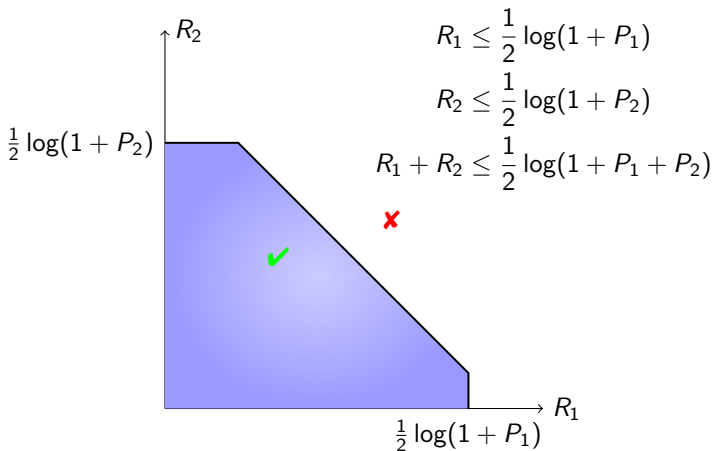
- ▶ User i employs a rate B_i codebook of blocklength n and average power

$$P_i(B_i) = \frac{2^{2LB_i} - 1}{\alpha^2}$$

- ▶ Transmissions interfere with each other.
- ▶ Can we still decode everyone?



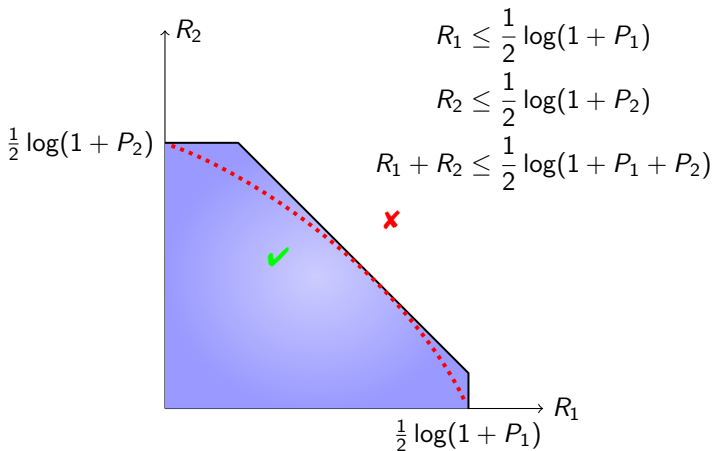
Two User Capacity Region $C_{MAC}(P_1, P_2)$



The region also includes TDMA rates, i.e. our power choice works!



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Lemma

With identical link gains and arrival statistics

$$P_{sum}^{min} = \frac{1}{\alpha^2} \mathbb{E}[2^{2LB} - 1].$$

Proof.

$$\begin{aligned} \mathbb{E} \sum_{i=1}^L P_i(B_i) &= \mathbb{E} \sum_{i=1}^L P_i(B) \\ &= \frac{1}{\alpha^2} \mathbb{E} \left(2^{\log(1+\alpha^2 \sum_{i=1}^L P_i(B))} - 1 \right) \\ &\geq \frac{1}{\alpha^2} \mathbb{E} (2^{2LB} - 1). \end{aligned}$$

□



Power Optimization

- ▶ Minimize average power by choosing $(P_i(B_i), 1 \leq i \leq N)$:

$$\min \mathbb{E} \sum_{i=1}^N w_i P_i(B_i)$$

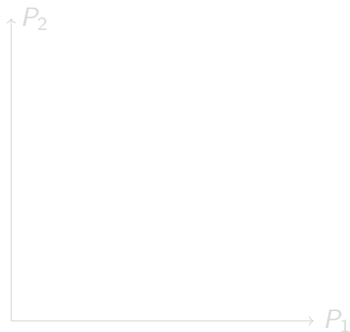
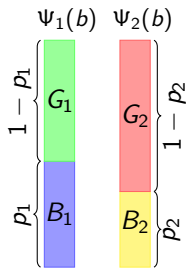
such that $\forall (b_1, \dots, b_N)$

$$\sum_{i \in S} b_i \leq \frac{1}{2} \log \left(1 + \sum_{i \in S} \alpha_i^2 P_i(b_i) \right), \quad \forall S \subseteq \{1, \dots, N\}.$$

- ▶ $\bar{w} = w_1, \dots, w_N$ is any positive weight vector.



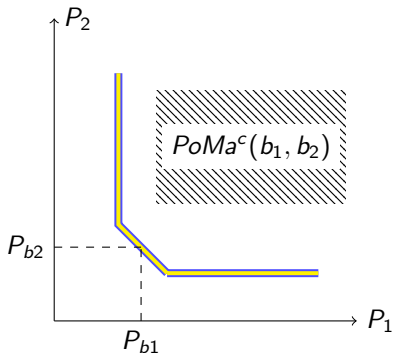
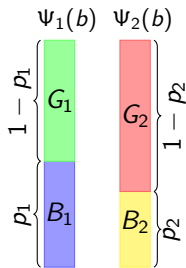
Non-identical Arrivals



▶ S. Sreekumar, SRBP, BKD, Energy efficient random access under strict delay constraints, ISIT 2014



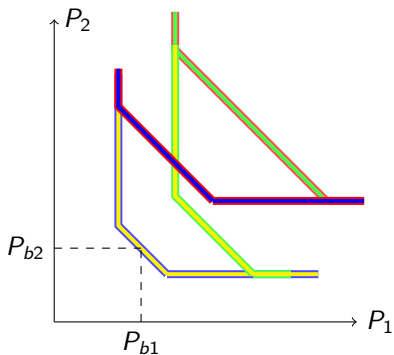
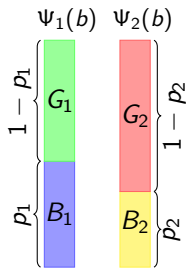
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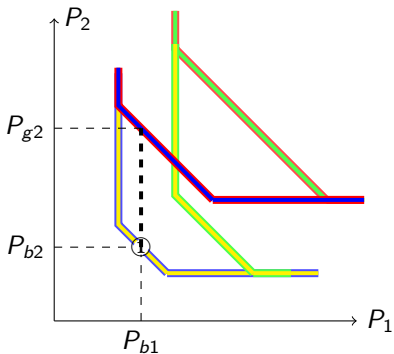
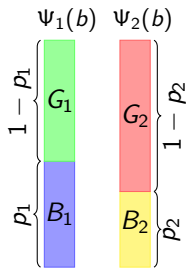
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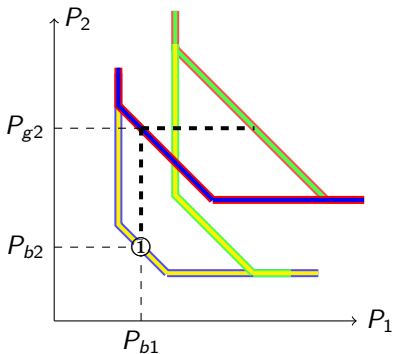
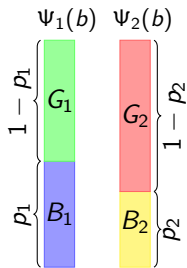
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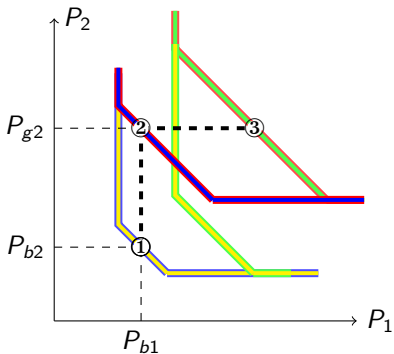
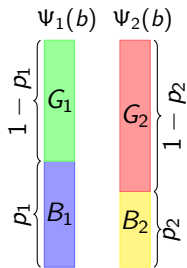
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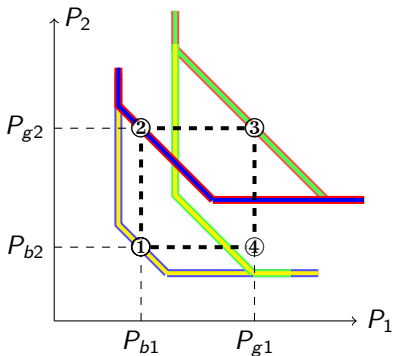
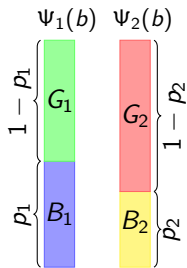
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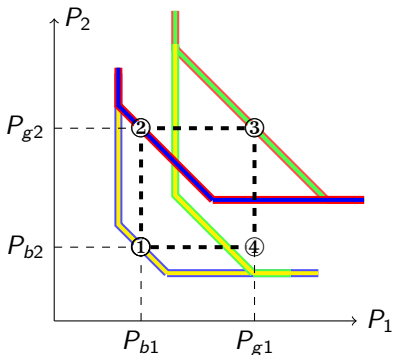
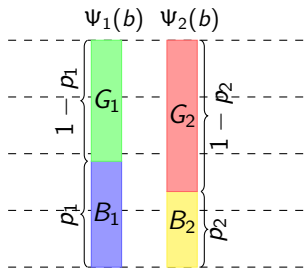
Non-identical Arrivals



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Non-identical Arrivals



- Allocation not only **successful**, but also **Power Optimal** for

$$\min \sum_{i=1}^L \mathbb{E} P_i(B_i) : (P_i(B_i), P_j(B_j)) \in \text{PoMa}^c(B_i, B_j) \forall i, j.$$

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Non-identical Arrivals

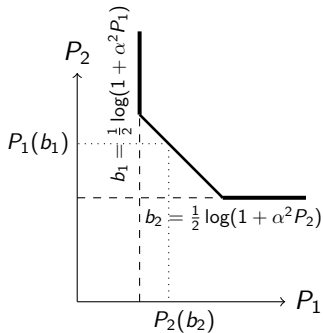
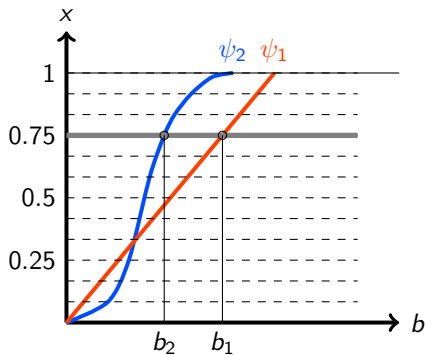


Figure : Optimal Sum-power Allocation



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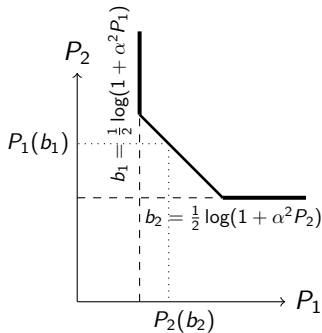
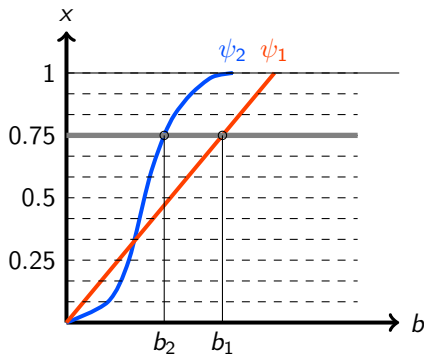
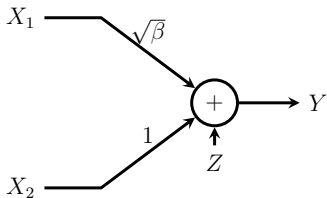


Figure : Optimal Sum-power Allocation

$$P_{sum}^{min} = \int_0^1 \frac{2^{2(b_1(x)+b_2(x))} - 1}{\alpha^2} dx, \text{ where } b_i(x) = \sup\{b \mid \Psi_i(b) \leq x\}.$$



Asymmetric Links



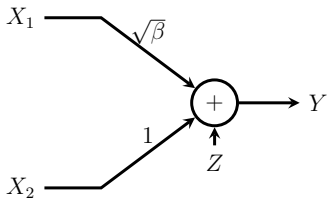
- ▶ To support a packet-rate pair of (b_1, b_2) ,

$$\beta P_1(b_1) + P_2(b_2) \geq 2^{2(b_1+b_2)} - 1$$

- ▶ **Difficulty:** This does not parse into a suitable constraint on $P_1 + P_2$.



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CDF Transformations

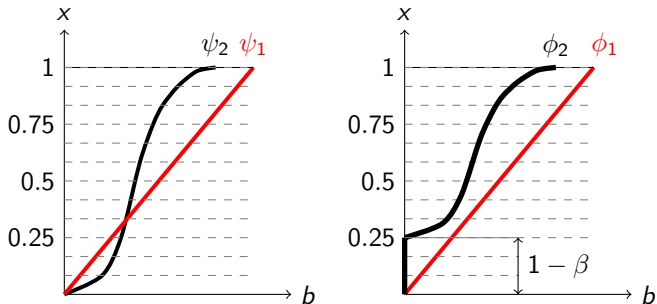


Figure : Optimal Power-allocation for $\beta = 0.75$



CDF Transformations

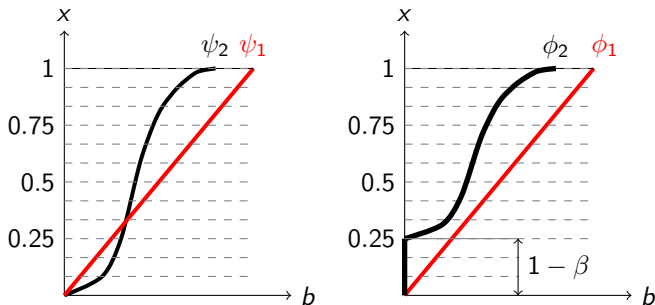


Figure : Optimal Power-allocation for $\beta = 0.75$

Theorem

The minimum sum-power for our MAC model is

$$P_{sum}^{min} = \int_0^{1-\beta} \frac{2^{2b_1(x)} - 1}{\beta} dx + \int_0^{\beta} \frac{2^{2(b_1(v+1-\beta)+b_2(\frac{v}{\beta}))} - 1}{\beta} dv$$



Power-Savings

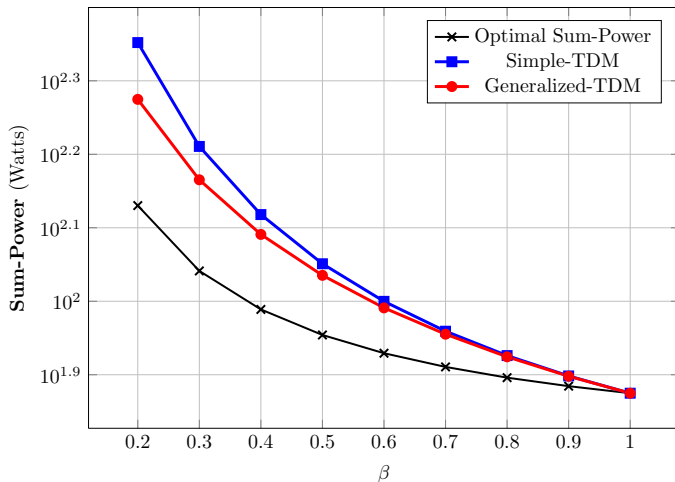
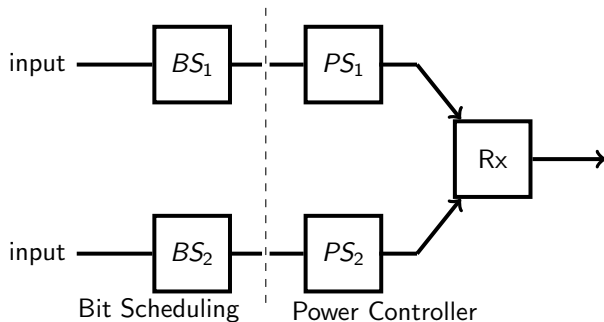


Figure : Power savings for rates in $\{1, 2\}$ with $p(1) = 0.75, \alpha_1 = \beta, \alpha_2 = 1$



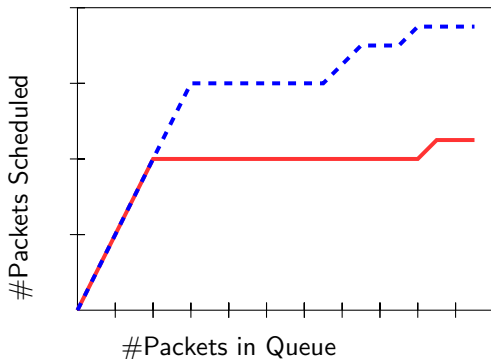
Bit Scheduling



- ▶ Source IID + bit scheduler memoryless \Rightarrow o/p stationary.
- ▶ Now use the optimal unit-delay power scheduler.



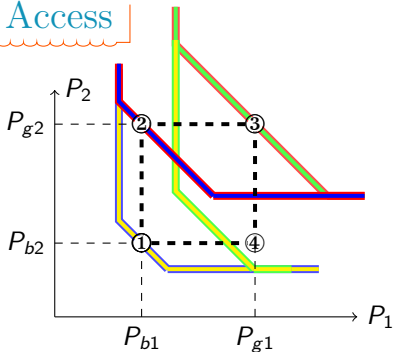
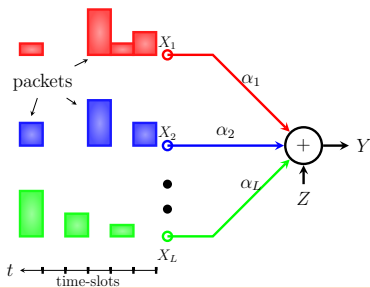
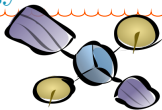
Zero Outage Bit Schedulers



- ▶ Deterministic scheduling policies form a basis. [Rajan, Sabharwal, Aazhang, "Delay bounded packet scheduling of bursty traffic over wireless channels", Trans IT 2004].



Energy Efficient Random Access



- ▶ Solutions that minimize the average power to transport data [ISIT14].
- ▶ “The ultimate goal is to find decentralized schedulers that approach the performance” :- [RAA2001]



Conclusion

- ▶ Optimal power allocations under strict delay constraints were proposed for a MAC with random arrivals.
- ▶ The approach can also solve the weighted power minimization problem.
- ▶ An iterative algorithm quickly finds the optimal scheduler (observation).
- ▶ A dual result can solve the so called *adaptive capacity region* of distributed CSI MACs Chapter 23 of El Gamal and Kim, Network Information Theory, Cambridge 2011.
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