

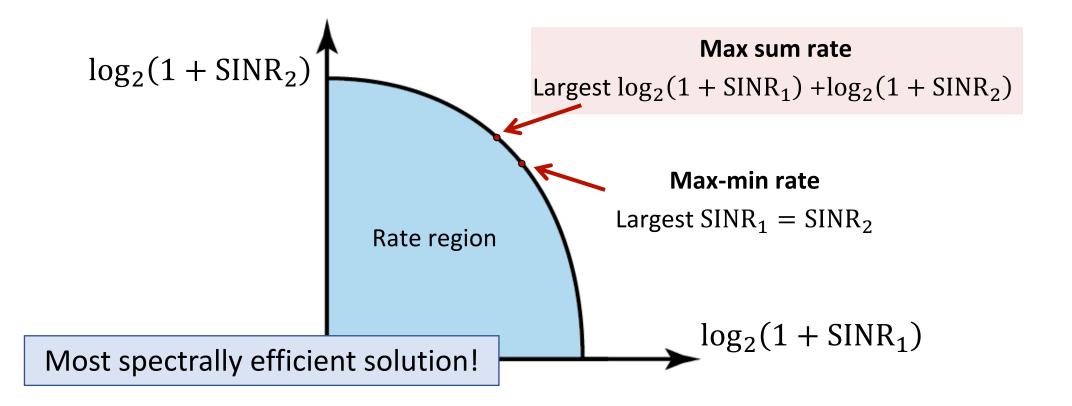
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#### Outline

- Power control
- Spectral efficiency (sum rate) maximization
  - Uplink, downlink
  - Simulation example
- Energy efficiency maximization
  - Definition
  - Impact of beamforming and multipleixng

#### Power control

- Effective SINRs depend on  $\eta_1, ..., \eta_K$ 
  - Can be selected to achieve different operating points



#### Downlink sum rate maximization

- Optimization problem:
  - Find  $\eta_1, ..., \eta_K$  that maximizes

MR	ZF
$a_k = M \rho_{dl} \gamma_k$	$a_k = (M - K)\rho_{dl}\gamma_k$
$b_k = \rho_{dl} \beta_k$	$b_k = \rho_{dl}(\beta_k - \gamma_k)$

$$\sum_{k=1}^{K} \log_2 \left( 1 + \frac{a_k \eta_k}{1 + b_k \sum_{k'=1}^{K} \eta_{k'}} \right)$$

subject to  $\sum_{k=1}^{K} \eta_k \le 1$ ,  $\eta_k \ge 0$ , k = 1, ..., K

- Property 1: Sum rate is larger with  $(c\eta_1, ..., c\eta_K)$  than with  $(\eta_1, ..., \eta_K)$ , for  $c \ge 1$ .
  - Consequence: Use maximum power,  $\sum_{k=1}^{K} \eta_k = 1$

Maximize: 
$$\sum_{k=1}^{K} \log_2 \left(1 + \frac{a_k}{1 + b_k} \eta_k\right)$$
 using "waterfilling"

# Sum rate maximizing waterfilling power allocation

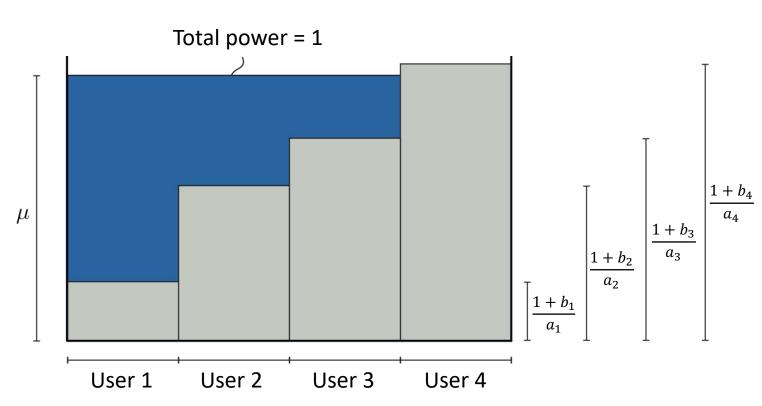
• After some optimization:

$$\eta_k = \max\left(\mu - \frac{1 + b_k}{a_k}, 0\right)$$

where  $\mu$  is selected such that  $\eta_1 + \cdots + \eta_K = 1$ 

#### **Properties:**

- Larger  $a_k/(1+b_k)$ : More power
- Some users might get zero power



Users ordered based on channel quality

## Uplink sum rate maximization

- Optimization problem:
  - Find  $\eta_1, \dots, \eta_K$  that maximizes

MR	ZF
$a_k = M \rho_{ul} \gamma_k$	$a_k = (M - K)\rho_{ul}\gamma_k$
$b_{k'} = \rho_{ul} \beta_{k'}$	$b_{k'} = \rho_{ul}(\beta_{k'} - \gamma_{k'})$

$$\sum_{k=1}^{K} \log_2 \left( 1 + \frac{a_k \eta_k}{1 + \sum_{k'=1}^{K} b_{k'} \eta_{k'}} \right)$$

subject to  $0 \le \eta_k \le 1, k = 1, ..., K$ 

- Property 1: Denominator  $(1 + \sum_{k'=1}^{K} b_{k'} \eta_{k'})$  is the same for every user
  - Change of variable:

$$s = \frac{1}{1 + \sum_{k'=1}^{K} b_{k'} \eta_{k'}}, \qquad x_k = \eta_k b_k s$$

Maximize
$$\sum_{k=1}^{K} \log_2 \left( 1 + \frac{a_k}{b_k} x_k \right)$$

### Revised problem formulation

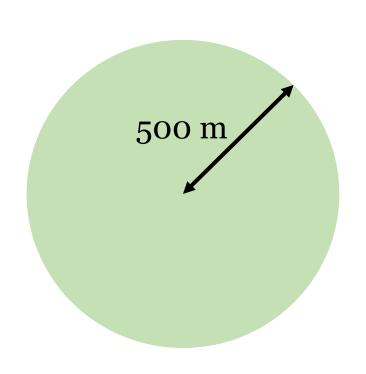
maximize 
$$x_1, \dots, x_K, s \qquad \sum_{k=1}^K \log_2 \left( 1 + \frac{a_k}{b_k} x_k \right)$$
 subject to  $0 \le x_k \le sb_k$ ,  $k = 1, \dots, K$  
$$\sum_{k=1}^K x_k = 1 - s$$

#### **Convex optimization problem**

Maximize a concave function Linear constraints Solve with any convex optimization solver (e.g., CVX)

## Simulation example: Urban deployment

- Single-cell setup
  - Circular cell with radius 500 m
  - Base station: M = 100 antennas
  - K = 10 uniformly users
- Important properties
  - Independent Rayleigh fading
  - No inter-cell interference
  - Carrier frequency: 2 GHz
  - Bandwidth 20 MHz

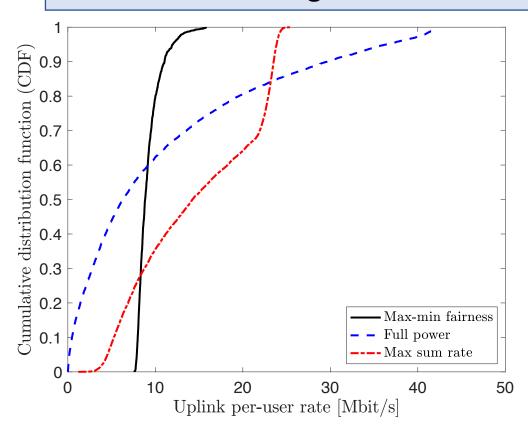


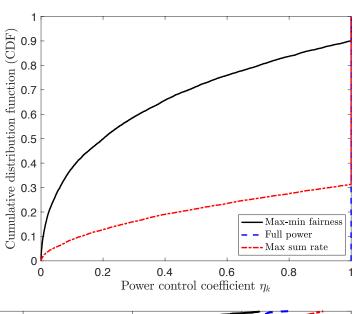
Same parameters as in last lecture

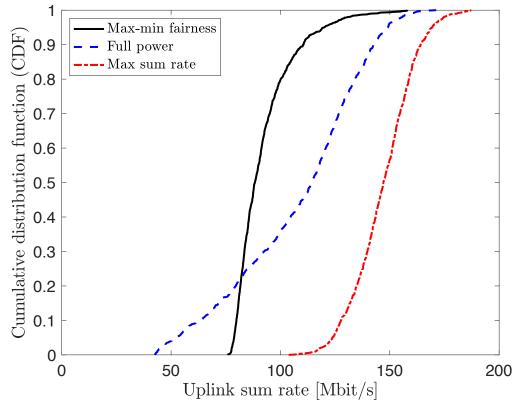
### Uplink with power control

#### Sum rate maximization

Increase rates by sacrificing fairness Focused on long-term fairness

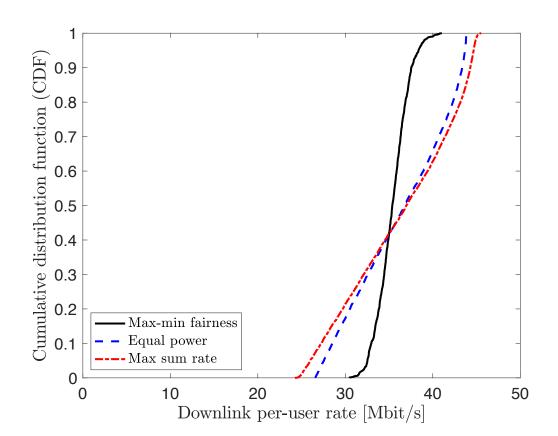


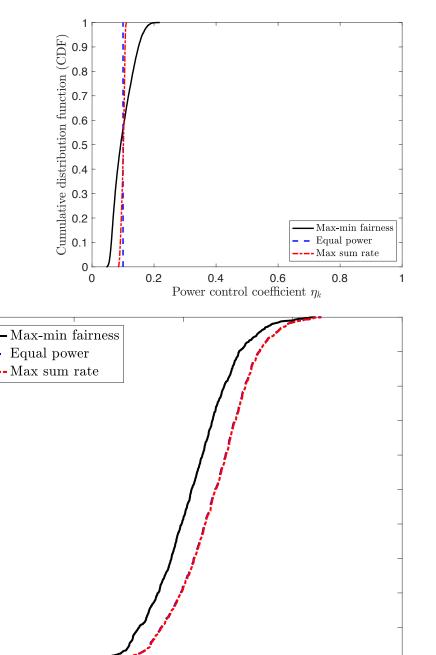




#### Downlink with power control

**Sum rate maximization**Similar to equal power allocation





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Downlink sum rate [Mbit/s]

400

450

300

250

### Power Control for Maximum Energy Efficiency

• Benefit-cost analysis:



• Benefit-cost ratio:

Energy efficiency [bit/Joule] = 
$$\frac{\text{Data rate [bit/s]}}{\text{Energy consumption [Joule/s]}}$$

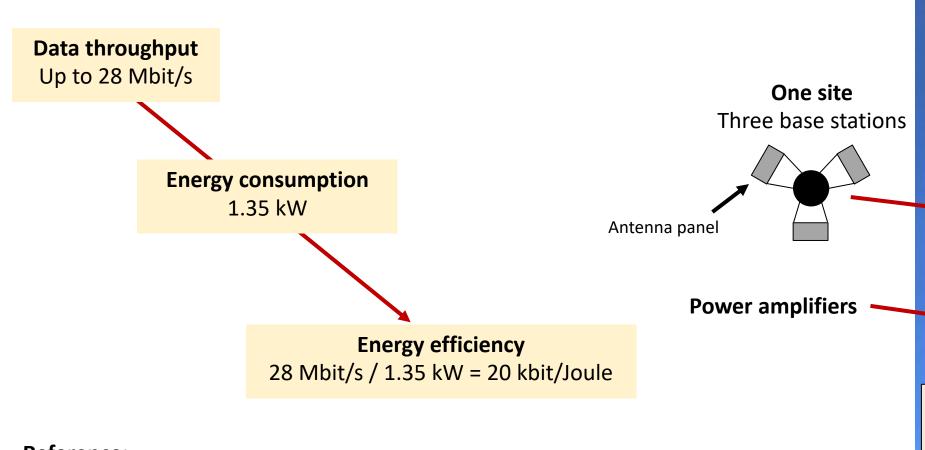
#### **Environmental concerns**

Energy production is mainly non-renewable

#### **Economical concerns**

Energy price: Joule/€
Other costs can also be included

## Example: Energy efficiency of 4G base station



#### **Reference:**

Auer et al., "How much energy is needed to run a wireless network?," IEEE Wireless Communication, 2011



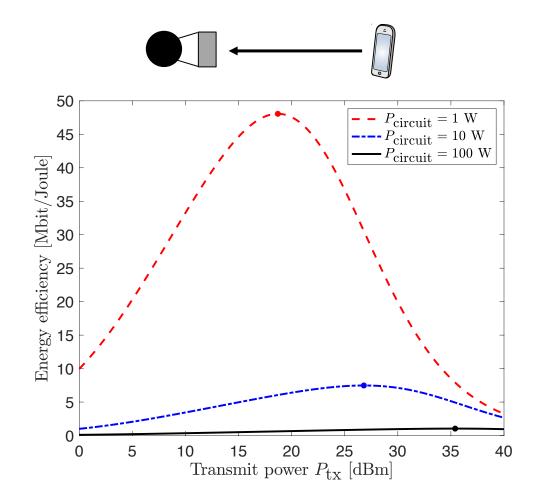
Power amplifiers

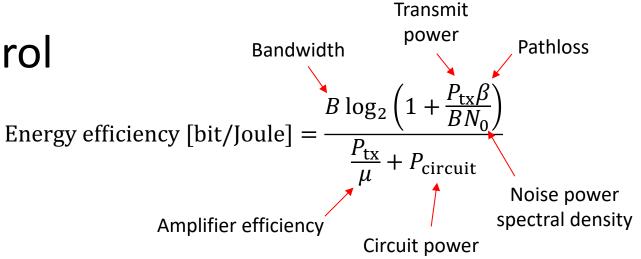
Radio transceivers

Baseband processors

## **Energy Efficient Power Control**

• Consider point-to-point system:





#### **Unimodal functions**

Control transmit power to find optimum

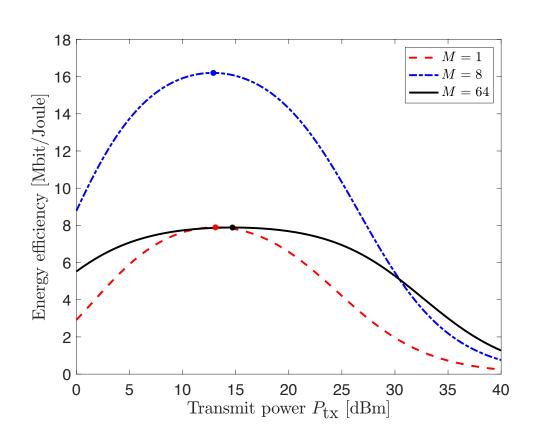
#### **Circuit power**

Must be accurately modeled

$$B = 10 \text{ MHz}, \qquad \mu = 0.25, \qquad \frac{BN_0}{\beta} = 0 \text{ dBm}$$

# **Energy Efficiency and Beamforming**

• Consider SIMO system:



Energy efficiency [bit/Joule] =  $\frac{B \log_2 \left(1 + \frac{M \rho_{ul} \gamma}{1 + \rho_{ul} \beta}\right)}{\frac{P_{tx}}{\mu} + P_{circuit} + M P_{antenna}}$   $\rho_{ul} = \frac{P_{tx}}{B N_0}$ Circuit power per antenna

SINR with MR

Beamforming can help reduce power Received power proportional to  $MP_{tx}$ 

$$B=10$$
 MHz,  $\mu=0.25$ ,  $\frac{BN_0}{\beta}=0$  dBm  $P_{\rm circuit}=10$  W,  $P_{\rm antenna}=0.1$  W

35

# **Energy Efficiency and Multiplexing**

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• Consider Massive MIMO system:

Energy efficiency [bit/Joule] =

 $= \frac{KB \log_2 \left(1 + \frac{M\rho_{ul}\gamma}{1 + \rho_{ul}K\beta}\right)}{\frac{KP_{tx}}{\mu} + P_{circuit} + (M + K)P_{antenna}}$ 

Uplink SINR with MR and K users

Total transmit power

Circuit power per antenna/users

$$\rho_{ul} = \frac{P_{tx}}{BN_0}$$

Energy efficiency  $\frac{15}{10}$  From  $\frac{1$ 

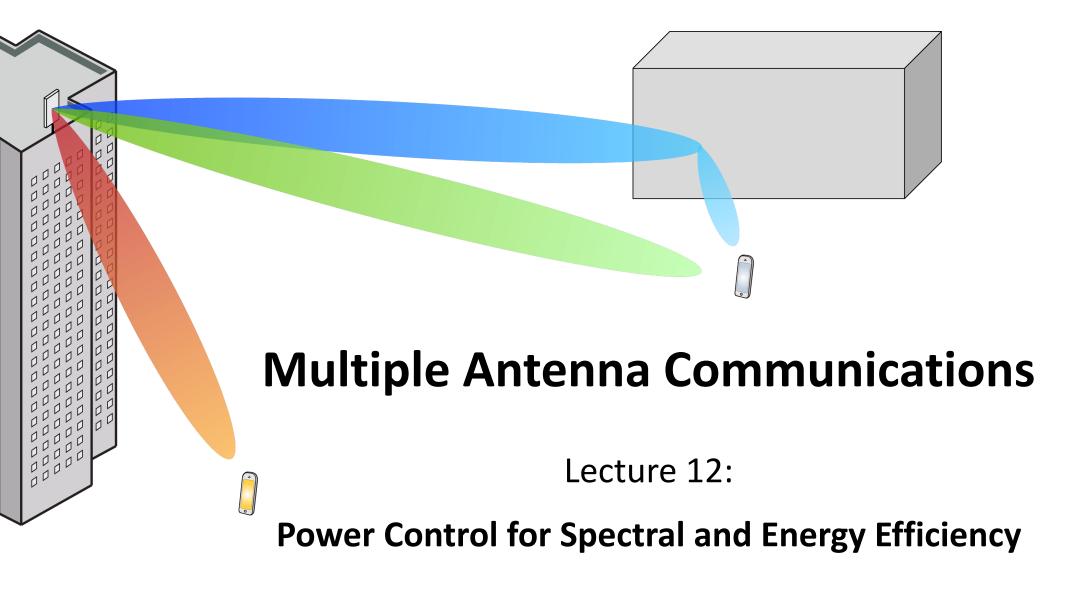
Transmit power per user  $P_{tx}$  [dBm]

Multiplexing increases efficiency Share power cost between users

$$B=10$$
 MHz,  $\mu=0.25$ ,  $\frac{BN_0}{\beta}=0$  dBm  $P_{\rm circuit}=10$  W,  $P_{\rm antenna}=0.1$  W,  $M=64$ 

### Summary

- Power control used to increase efficiency
  - Spectral or energy efficiency
- Sum rate power control
  - Downlink: Waterfilling
  - Uplink: Convex optimization
- Energy efficiency
  - Rate divided by energy consumption
  - Accurate circuit power models needed
  - Beamforming and multiplexing useful



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