

TSKS14

Multiple Antenna Communications

Lecture 1, 2020

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Three main benefits of multiple antenna communications

1. Beamforming gain
2. Spatial diversity
3. Spatial multiplexing

The course will cover all of them:

- First historical perspective
- Then the theory behind them

Constructive and destructive interference

- One signal:

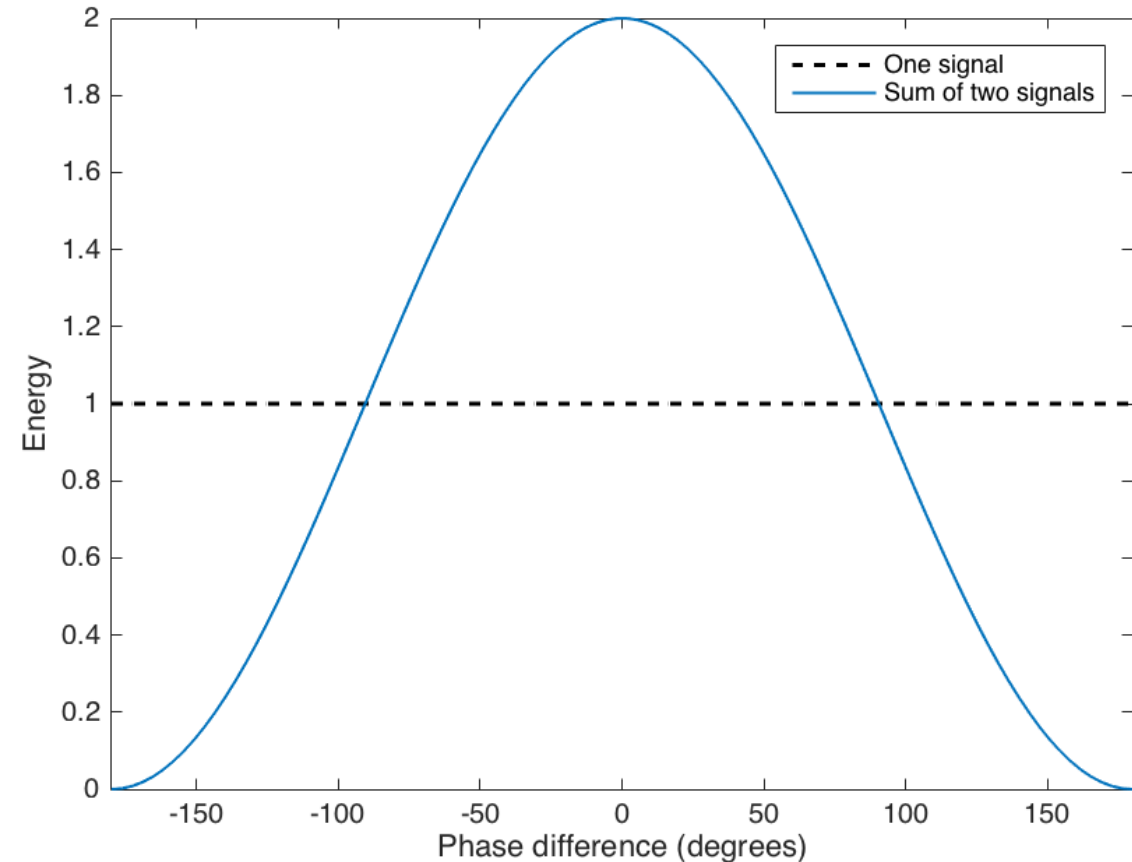
$$\sqrt{2} \sin(2\pi t)$$

(Normalization: $\int_0^1 (\sqrt{2} \sin(2\pi t))^2 dt = 1$)

- Two signals:

$$\sin(2\pi t) + \sin(2\pi t - \theta)$$

Power depends on the phase difference θ
(time delay)

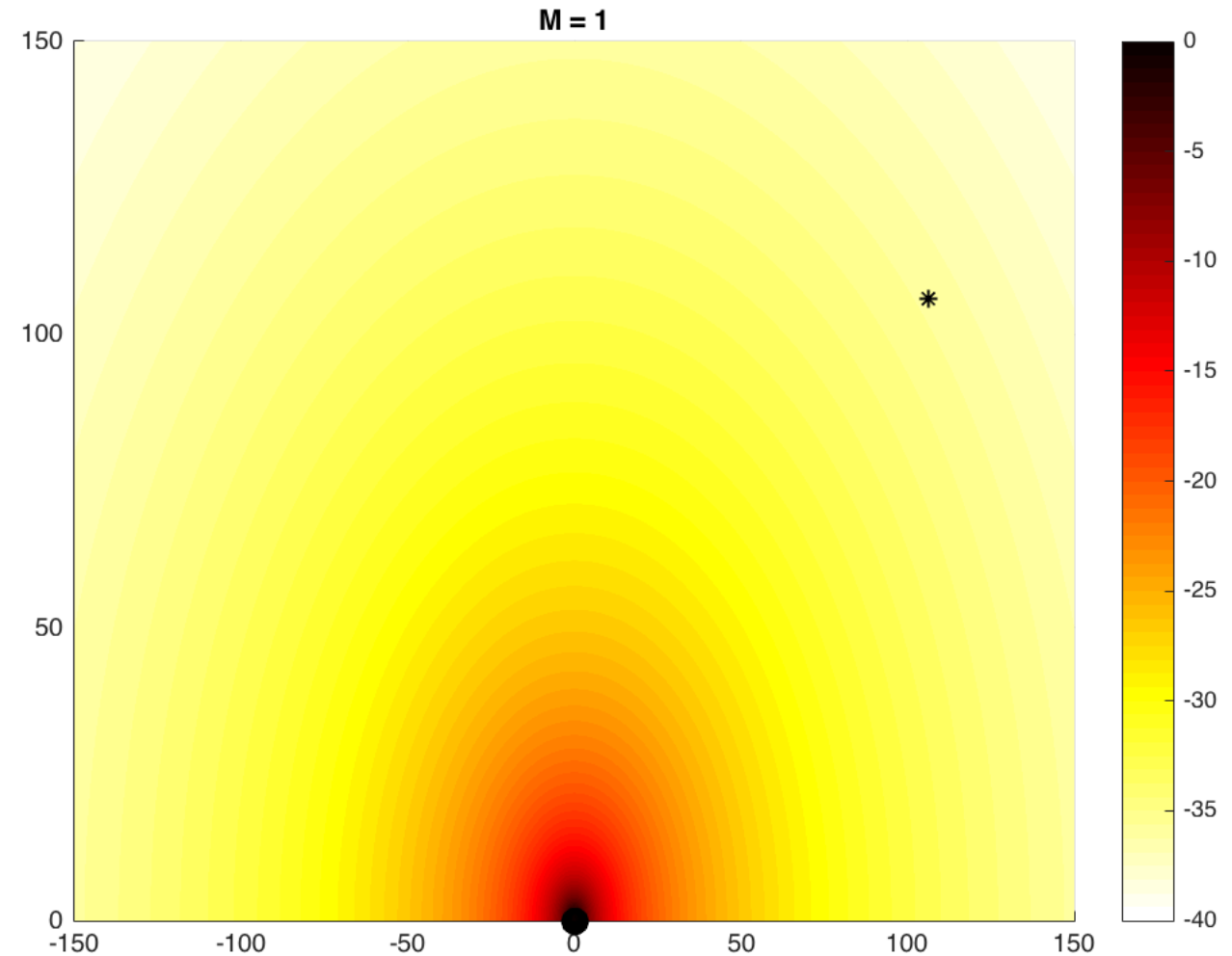


Omni-directional radiation

$M = 1$ antenna

Powers spread out as a sphere

- Received power decays as $1/\text{distance}^2$



Directive radiation – Beamforming gain

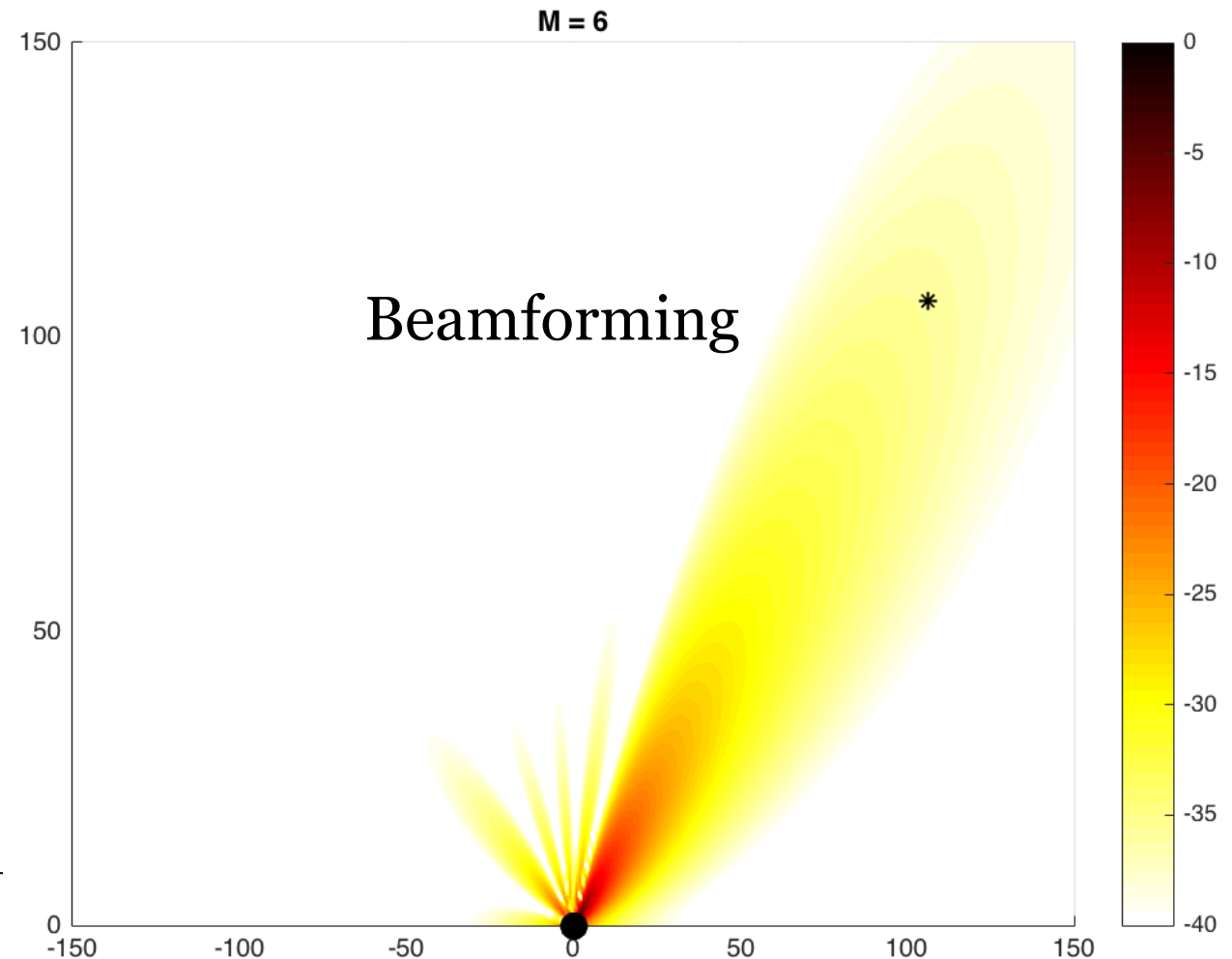
$M = 6$ antennas

Power directed towards receiver

- Constructive interference
- Send signals with time delays
- Needs to know “direction”

Two options:

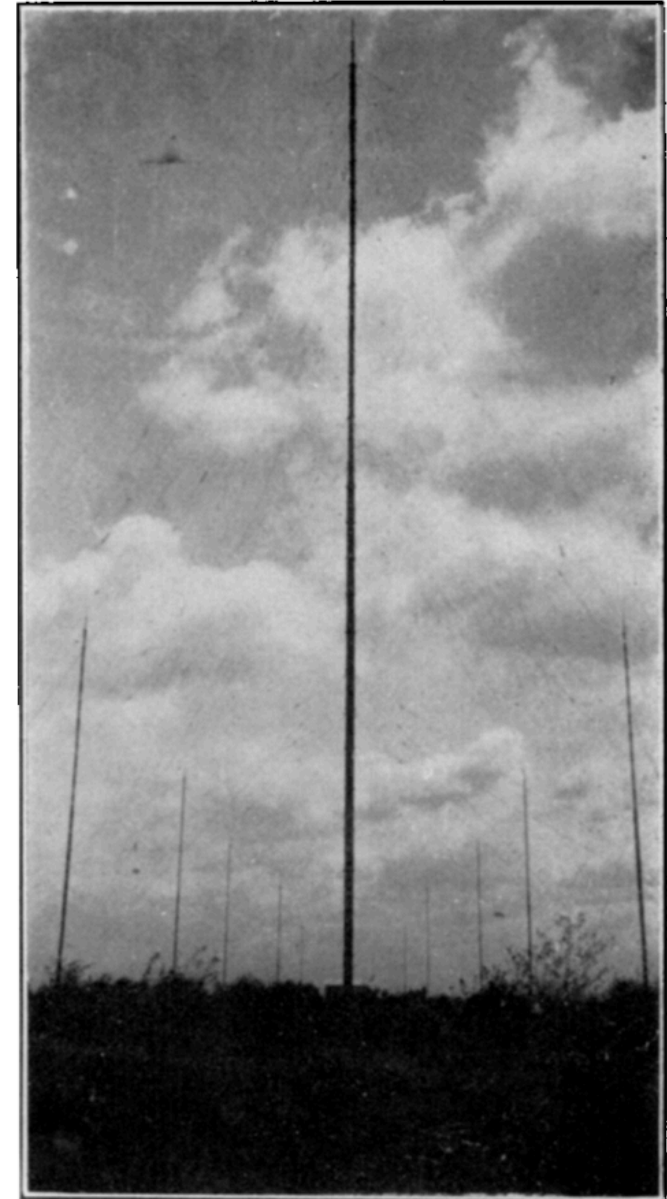
- 6 times larger received power
- Use 1/6 of power to achieve same received power



History: Beamforming

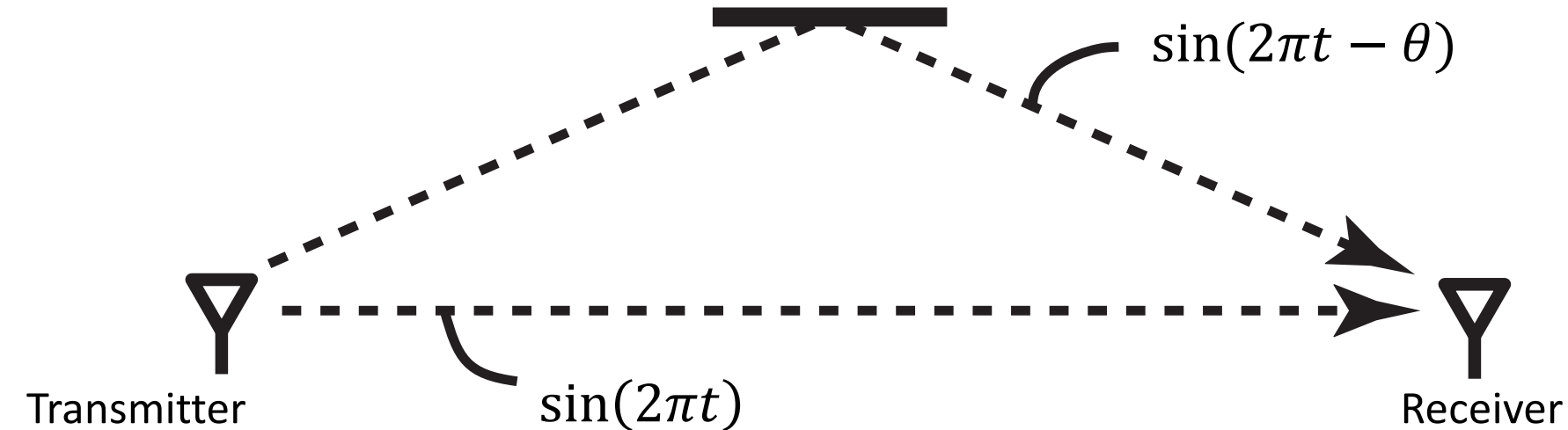
- Directional communication
 - E.F.W. Alexanderson, "Transatlantic Radio Communication", Trans. AIEE, 1919.
- Directive radiation pattern
 - Constructive/destructive interference patterns
 - Energy savings or better performance

Called *beamforming gain*



[ALEXANDERSON]

Multipath Propagation



Received signal: $\sin(2\pi t) + \sin(2\pi t - \theta)$

Multipath fading:
*Add constructively or
destructively depending on θ*

History: Spatial diversity

- Diversity combining
 - D.G. Brennan, "Linear diversity combining techniques," Proc. IRE, 1959
- Protect against fading/noise
 - Multiple antennas with independent observations
 - Small risk that multiple observations are all bad
 - Improve reliability

Called *diversity gain*

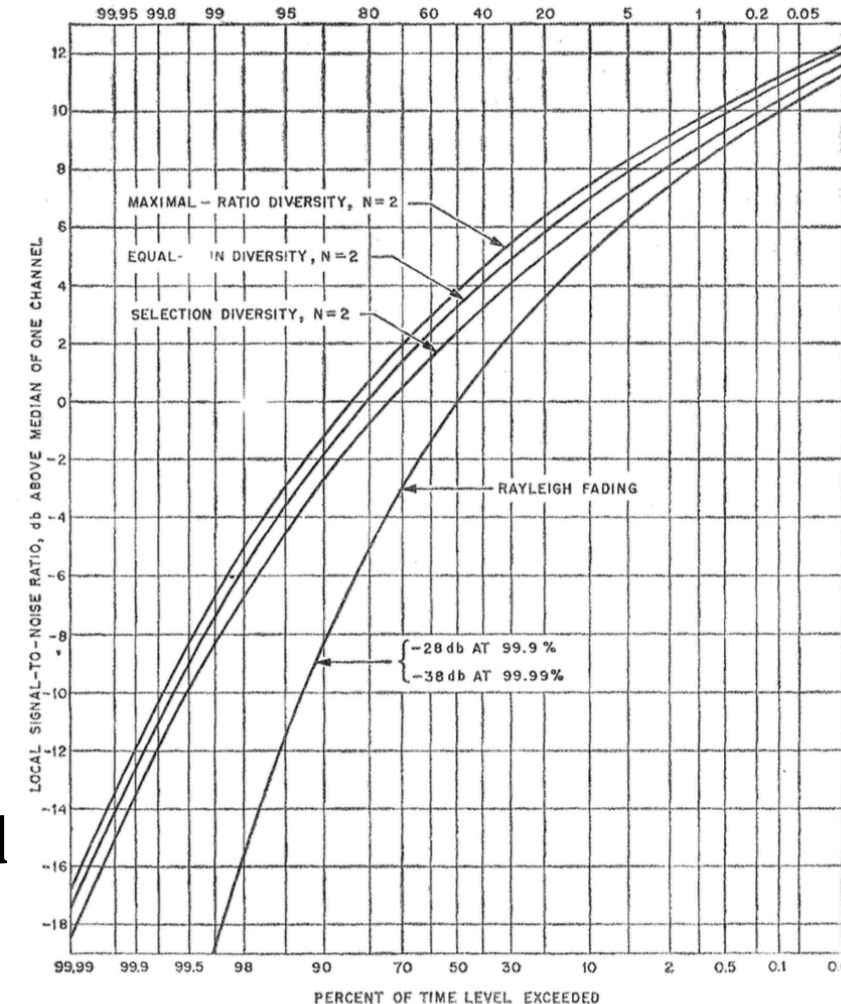
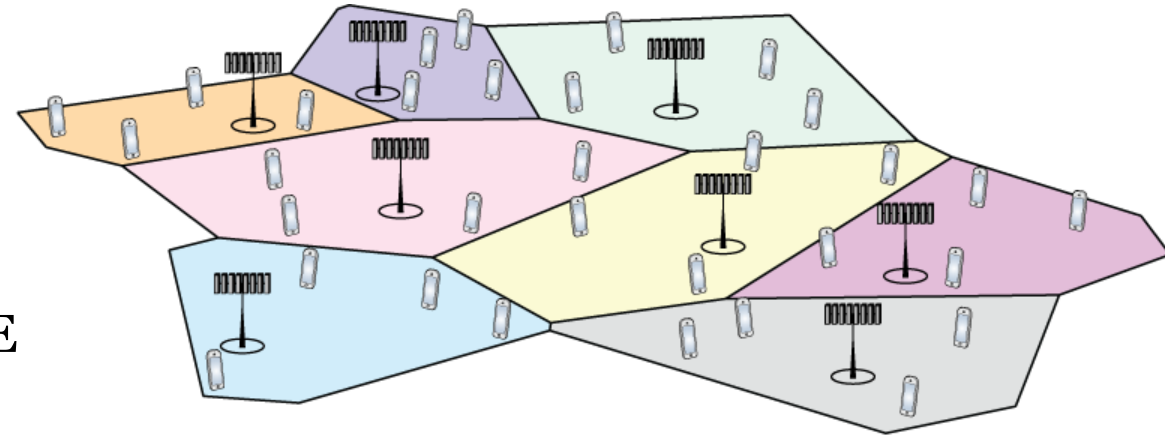


Fig. 9—Dual diversity distributions, conditions of Fig. 8.

Cellular networks

- Designed for mobile telephone systems
 - Bullington, K. (1953). “Frequency economy in mobile radio bands”. The Bell System Technical Journal.
 - Schulte, H. J. and W. A. Cornell (1960). “Multi-area mobile telephone system”. IEEE Trans. Veh. Technol.
- Reuse of spectrum in space:
 - Densify as usage increases
- Control interference by fractional spectrum reuse, power control



History: Space division multiple access (SDMA)

- Multiple user communication
 - S. C. Swales et al., “The Performance Enhancement of Multibeam Adaptive Base-Station Antennas for Cellular Land Mobile Radio Systems” Trans. on Vehicular Technology, 1990.
- Spatial multiplexing of users
 - Serve multiple users on same time and frequency
 - Handle more users per base station
 - Exists in 4G/5G and Wi-Fi

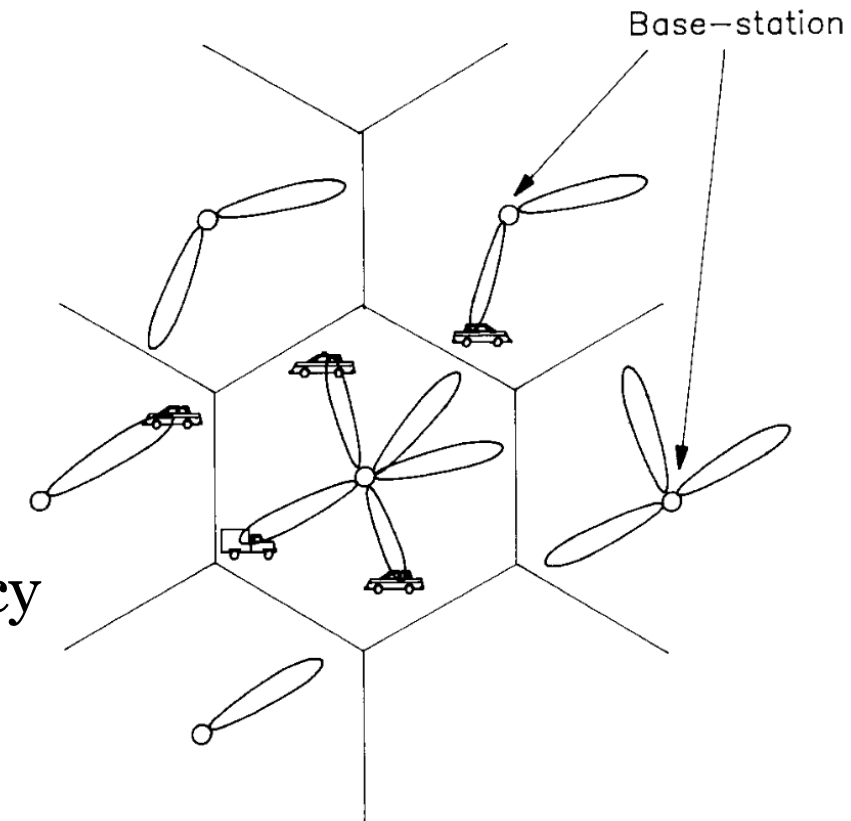


Fig. 2. Tracking of mobiles with multiple beams.

Called *multiplexing gain*

History: Point-to-point multi-antenna links

- Point-to-point multiple-input multiple-output (MIMO)
 - G. G. Raleigh and J. M. Cioffi, “*Spatio-temporal coding for wireless communications*,” Globecom 1996.
- Multiple streams per user
 - Increase capacity (bit/s) per user
 - Requires multiple paths
 - Exists in 4G/5G and Wi-Fi

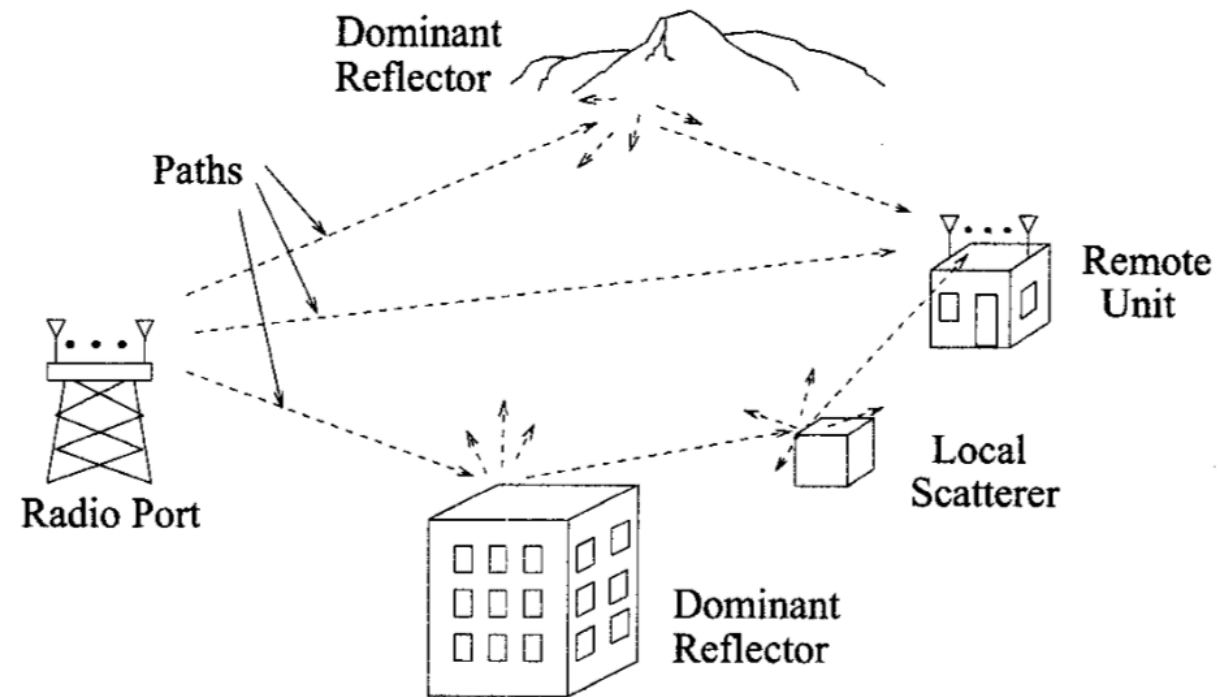



Figure 1: Illustration of the physical wireless channel.

Also called *multiplexing gain*

Outline of the course

- Lecture 1:
 - History of multiple antenna communications
 - Channel capacity for single-antenna channels
- Basic multi-antenna channels (Lecture 2)
- Diversity and ergodic capacity (Lecture 3)
- Point-to-point MIMO (Lecture 4)
- Multi-user MIMO (Lectures 5-12)
 - Capacity bounds, Channel estimation, Power control, etc.

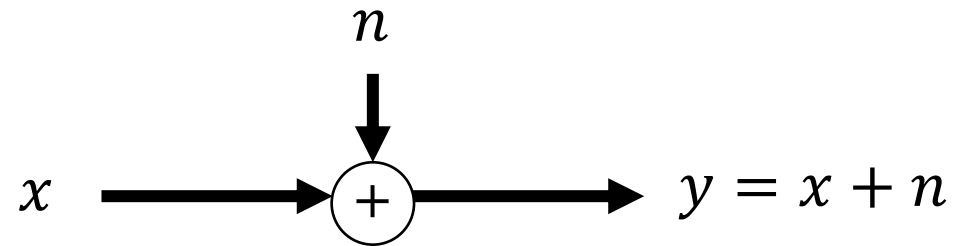


Based on lecture note document:
“Introduction to Multiple Antenna Communications”



Based on the book
“Fundamentals of Massive MIMO”

Example: Additive White Gaussian Noise (AWGN) Channel



- Noise: $n \sim N(0, N_0/2)$
- Energy per symbol: $E\{|x|^2\} \leq q$
- x, y, n real valued

How to measure performance?

- Data packet:



Information symbols

- Characterized by
 - How many symbols the packet contains
 - How many information bits these symbols represent (determined by the modulation and coding scheme)
 - Probability of incorrect decoding at the receiver

Channel capacity

- Channel capacity
 - Random variables X and Y
 - Channel described by conditional distribution

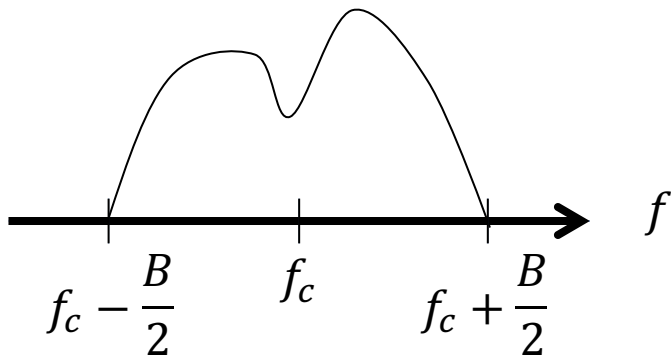
$$p_{Y|X}(y|x)$$



- **Channel coding theorem**
 - C [bit/channel use] is the capacity of the channel if:
For any given $\delta > 0$ and $\gamma > 0$,
there exist a channel coding codebook of a finite length N that has rate $R = C - \delta$ and offers an error probability $P(\text{error}) \leq \gamma$

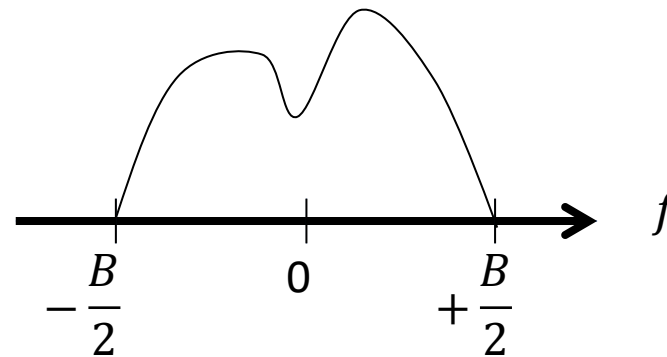
Passband and baseband signals

- Bandwidth: Distance from smallest to largest frequency



Bandwidth (passband): B
Real-valued signal

Described by $2B$ real samples/s



Bandwidth (baseband): $\frac{B}{2}$
Complex-valued signal

Described by B complex samples/s

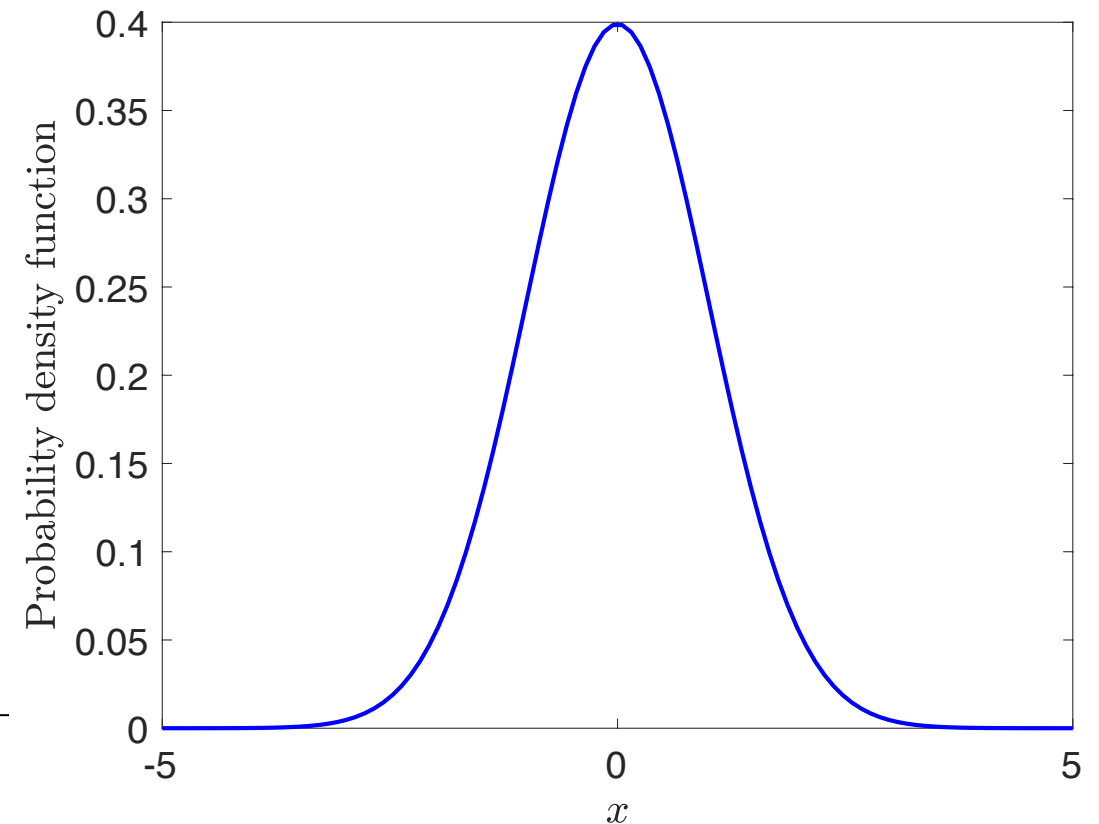
Gaussian Distribution

- x is zero-mean Gaussian distributed, $x \sim N(0, \sigma^2)$

- Probability density function (PDF):

$$p_X(x) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{x^2}{2\sigma^2}}$$

Properties: $E\{x\} = 0, E\{x^2\} = \sigma^2$

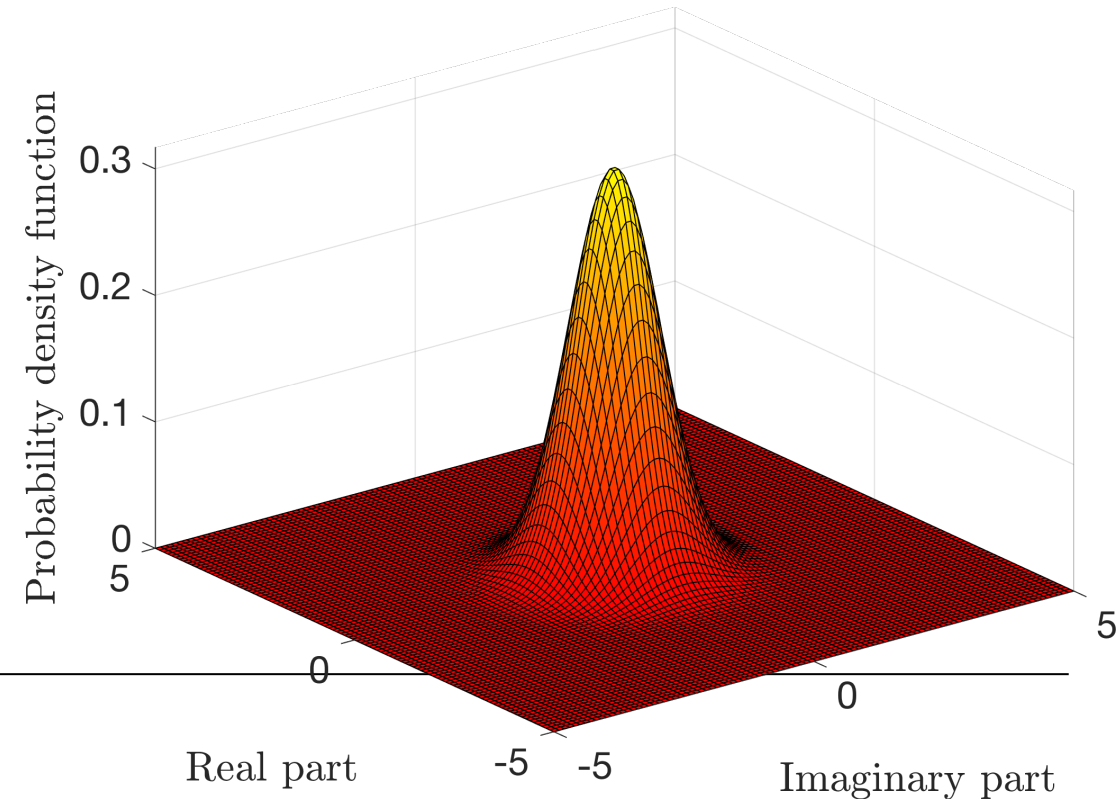


Complex Gaussian Distribution

- Consider independent $x_R, x_I \sim N(0, \sigma^2/2)$
 - $x = x_R + jx_I$ is circularly symmetric complex Gaussian distributed,
 $x \sim CN(0, \sigma^2)$, with

$$\begin{aligned} p_X(x) &= \frac{1}{\sqrt{\pi\sigma^2}} e^{-\frac{x_R^2}{\sigma^2}} \frac{1}{\sqrt{\pi\sigma^2}} e^{-\frac{x_I^2}{\sigma^2}} \\ &= \frac{1}{\pi\sigma^2} e^{-\frac{|x|^2}{\sigma^2}} \end{aligned}$$

Properties: $E\{x\} = 0, E\{|x|^2\} = \sigma^2$



Capacity and mutual information

- Channel capacity

$$C = \max_{p_X(x)} I(x; y)$$



- Mutual information: $I(x; y) = h(y) - h(y|x)$

- Differential entropy:

$$h(y) = -E\{\log_2(p_Y(y))\} \leq \log_2(\pi e \text{Var}\{y\})$$

- Conditional diff. entropy:

$$h(y|x) = -E\{\log_2(p_{Y|X}(y|x))\}$$

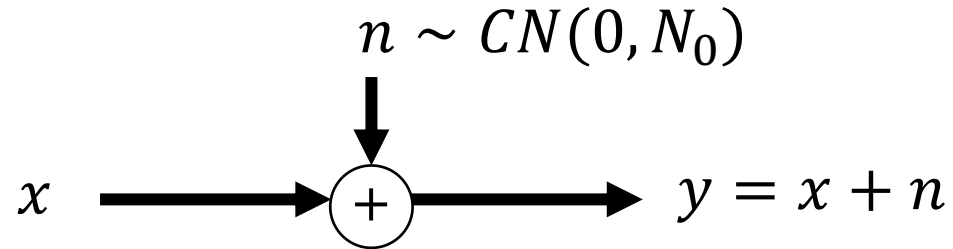
Equality if
Complex Gaussian

Differential entropy $h(x)$ of $x \sim \mathcal{CN}(0, p)$

- Direct computation

$$\begin{aligned} h(x) &= - \int_{x \in \mathbb{C}} \frac{1}{\pi p} e^{-\frac{|x|^2}{p}} \log_2 \left(\frac{1}{\pi p} e^{-\frac{|x|^2}{p}} \right) dx \\ &= \int_{x \in \mathbb{C}} \frac{1}{\pi p} e^{-\frac{|x|^2}{p}} \left(\log_2(\pi p) + \frac{|x|^2}{p} \log_2(e) \right) dx \\ &= \log_2(\pi p) \int_{x \in \mathbb{C}} \frac{1}{\pi p} e^{-\frac{|x|^2}{p}} dx + \frac{\log_2(e)}{p} \int_{x \in \mathbb{C}} \frac{|x|^2}{\pi p} e^{-\frac{|x|^2}{p}} dx \\ &= \log_2(\pi p) \cdot 1 + \frac{\log_2(e)}{p} E\{|x|^2\} = \log_2(\pi e p) \end{aligned}$$

Capacity of complex AWGN channel



- Recall: $I(x; y) = h(y) - h(y|x)$
 $h(y|x) = [y|x \sim CN(x, N_0)] = \log_2(\pi e N_0)$
- Mutual information maximized by $x \sim CN(0, q)$
 $h(y) \leq [y = x + n \sim CN(0, q + N_0)] = \log_2(\pi e (q + N_0))$
- Capacity:

$$C = h(y) - h(y|x) = \log_2 \left(1 + \frac{q}{N_0} \right)$$

Point-to-point scalar channel

- Continuous-time AWGN channel with channel response $g \in \mathbb{C}$
 - Bandwidth B (Hz)
 - Power P (Watt)
 - Noise power spectral density N_0 (Watt/Hz)
 - Sampling: $2B$ real samples/s, B complex samples/s:
$$y[l] = g \cdot x[l] + n[l], \quad l = \text{sample index}$$
 - Energy per sample: $q = P/B$
 - $x[l] \sim \mathcal{CN}(0, P/B)$
 - $n[l] \sim \mathcal{CN}(0, N_0)$
- Complex Gaussian signals are capacity achieving

Point-to-point scalar channel: Capacity

- Sampling: $2B$ real samples/s, B complex samples/s:

$$y[l] = g \cdot x[l] + n[l]$$

- $x[l] \sim CN(0, P/B)$

- $n[l] \sim CN(0, N_0)$

- Capacity:

- Depends on P and B

$$C = \log_2 \left(1 + \frac{P|g|^2}{BN_0} \right) \text{ bits per complex sample}$$

$$C = B \cdot \log_2 \left(1 + \frac{P|g|^2}{BN_0} \right) \text{ bits per second}$$

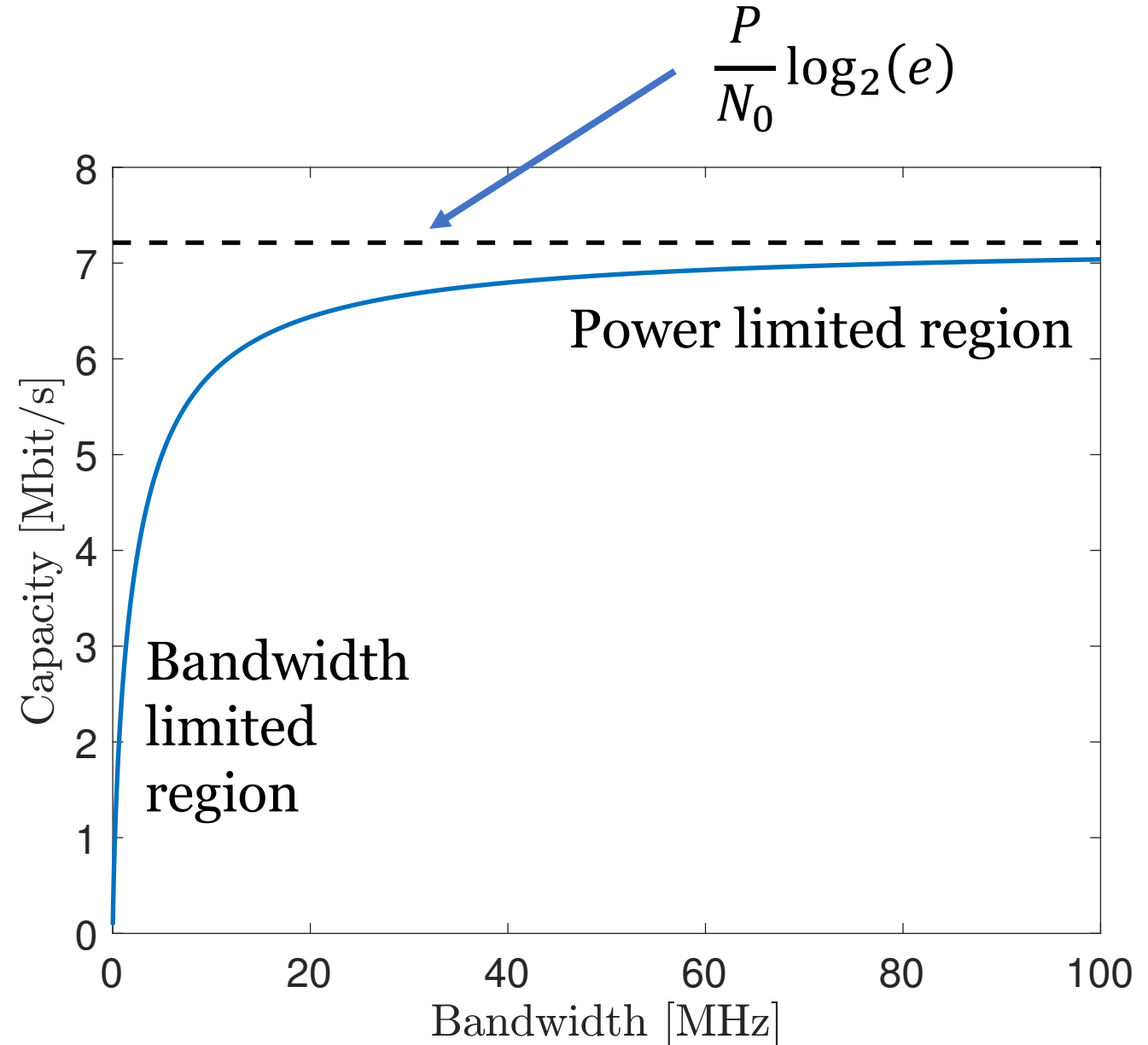
Capacity behaviors

- SNR:

$$\frac{P}{BN_0}$$

- $\log_2(1 + \text{SNR})$
 - Linear for small SNR
 - Almost flat for large SNR

Assumption: $\frac{P|g|^2}{N_0} = 5 \cdot 10^6 \text{ Hz}$



Summary

- Capacity of point-to-point channel:

$$C = B \cdot \log_2 \left(1 + \frac{P}{BN_0} \right) \text{ bits per second}$$

- SNR per degree of freedom (symbol): $\frac{P}{BN_0}$
- Behaviors
 - Low SNR: C grows linearly with power P
 - High SNR: C grows linearly with bandwidth B

End of Lecture 1

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