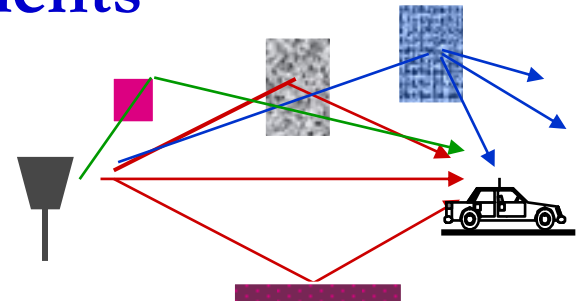


Review of Last Lecture

- Model Parameters from Measurements
- Random Multipath Model
- Channel Impulse Response



$$c(\tau, t) = \sum_{n=1}^N \alpha_n(t) e^{-j\phi_n(t)} \delta(\tau - \tau_n(t))$$

- Many multipath components, Amplitudes change slowly, Phases change rapidly
- For delay spread $\max |\tau_n(t) - \tau_m(t)| \ll 1/B$, $u(t) \approx u(t - \tau)$.
- Received signal given by

$$r(t) = \Re \left\{ u(t) e^{j2\pi f_c t} \left[\sum_{n=0}^{N(t)} \alpha_n(t) e^{-j\phi_n(t)} \right] \right\}$$

- No signal distortion in time
- Multipath yields complex scale factor in brackets

Review Continued:

Narrowband Model

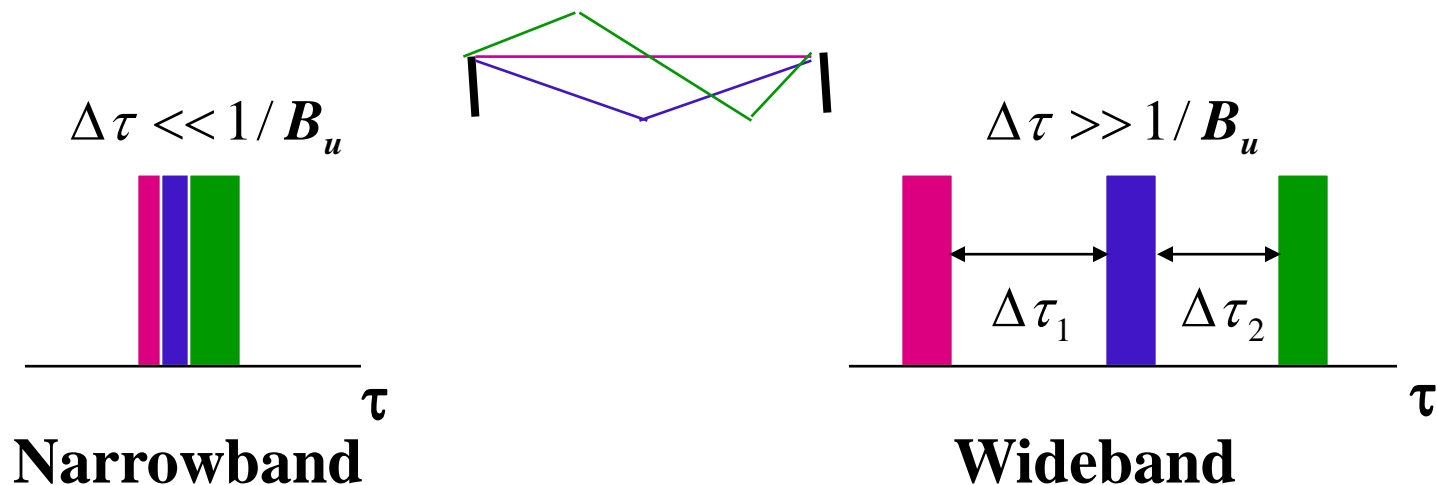
- For $N(t)$ large, in-phase $r_I(t)$ and quadrature $r_Q(t)$ components are jointly Gaussian by CLT (sum of large # of random vars).
- Received signal characterized by its mean, auto-correlation, and cross-correlation.
- If phase distribution is uniform, the in-phase/quad components are zero mean, independent, and stationary

Signal Envelope Distribution

- CLT approx. leads to Rayleigh distribution (power is exponential)
- When LOS component present, Ricean distribution is used
- Measurements support Nakagami distribution in some environments
 - Similar to Ricean, but models “worse than Rayleigh”
 - Lends itself better to closed form BER expressions

Wideband Channels

- Individual multipath components resolvable
- True when time difference between components exceeds signal bandwidth
- Requires statistical characterization of $c(\tau, t)$
 - Assume CLT, stationarity and uncorrelated scattering
 - Leads to simplification of its autocorrelation function

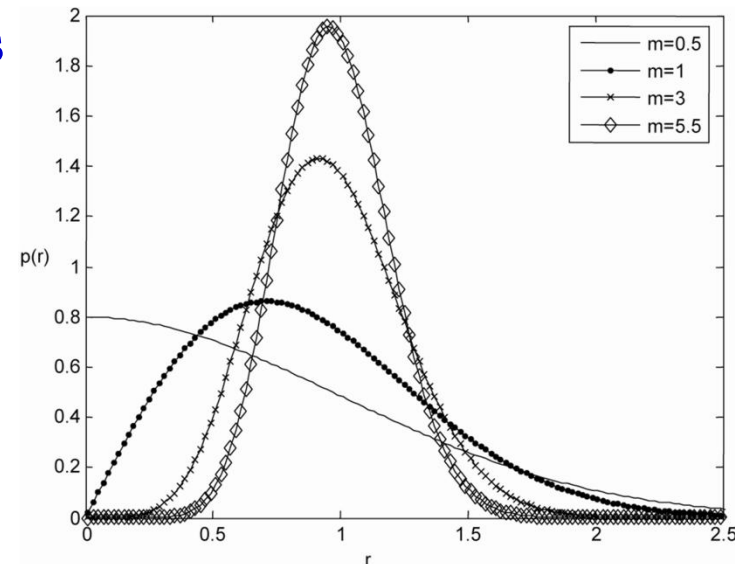


Signal Envelope Distribution

- CLT approx. for no dominant multipath component leads to Rayleigh distribution (power is exponential).
- When LOS component present, Ricean distribution is used
- Some measurements support Nakagami distribution
 - Parameterized by $m > 0.5$, varying from LOS power to multipath
 - Similar to Ricean ($m \approx K$, $K \geq 1$), but models “worse than Rayleigh”
 - Yields closed form BER expressions

$$p_Z(z) = \frac{2m^m z^{2m-1}}{\Gamma(m) P_r^m} \exp\left[-\frac{mz^2}{P_r}\right]$$

$$m \geq .5$$



Shannon Capacity

- Defined as the maximum mutual information of channel
- Maximum error-free data rate a channel can support.
- Theoretical limit (not achievable)
- Channel characteristic
 - Not dependent on design techniques

Capacity of Flat-Fading Channels

- Capacity defines theoretical rate limit
 - Maximum error free rate a channel can support
- Depends on what is known about channel
- Only fading distribution is known
 - Hard to find capacity

- Fading known at receiver only

$$C = \int_0^{\infty} B \log_2(1 + \gamma) p(\gamma) d\gamma \leq B \log_2(1 + \bar{\gamma})$$

- Fading known at TX and RX
 - Multiplex optimal strategy over each channel state

Capacity with Fading Known at Transmitter and Receiver

- For fixed transmit power, same as with only receiver knowledge of fading
- Transmit power $P(\gamma)$ can also be adapted
- Leads to optimization problem where \bar{P} is the average power constraint

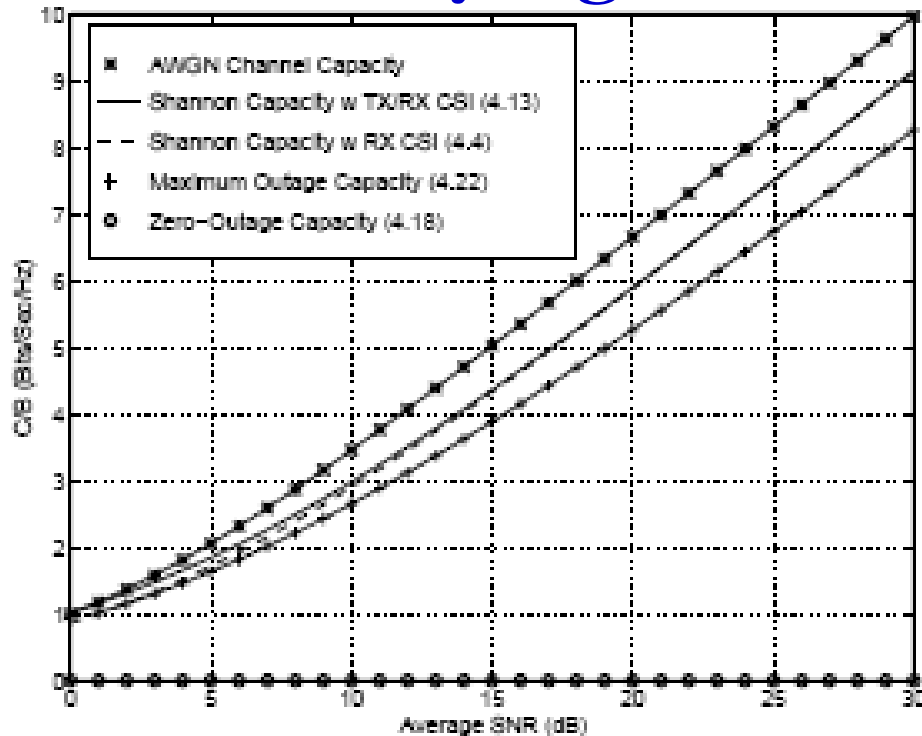
$$C = \max_{P(\gamma) : E[P(\gamma)] = \bar{P}} \int_0^{\infty} B \log_2 \left(1 + \frac{\gamma P(\gamma)}{\bar{P}} \right) p(\gamma) d\gamma$$

Channel Inversion

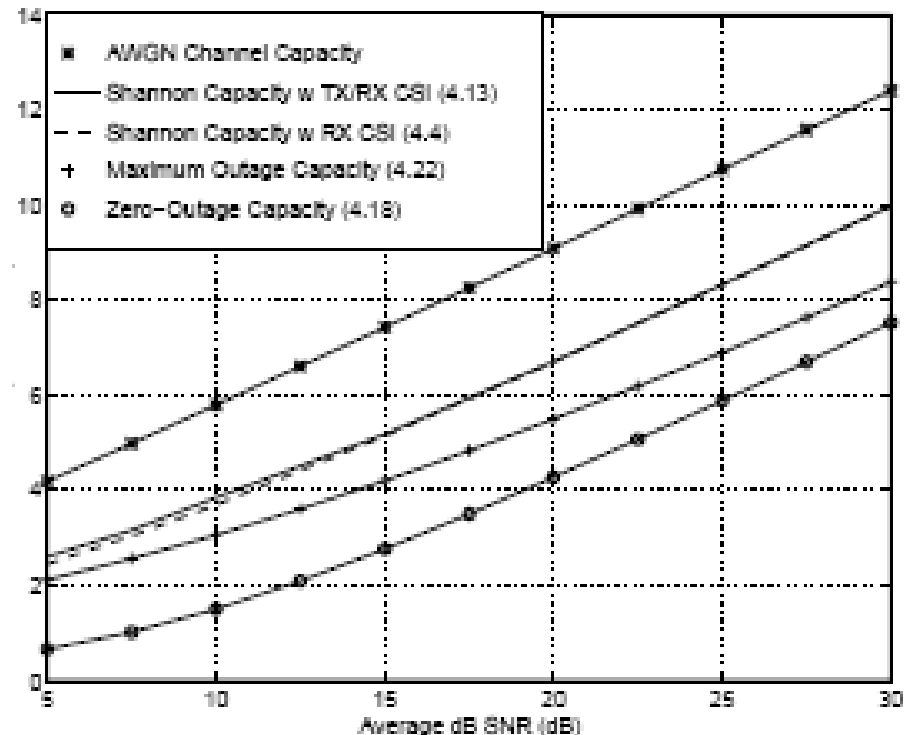
- Fading inverted to maintain constant SNR
- Simplifies design (fixed rate)
- Greatly reduces capacity
 - Capacity is zero in Rayleigh fading
- Truncated inversion
 - Invert channel above cutoff fade depth
 - Constant SNR (fixed rate) above cutoff
 - Cutoff greatly increases capacity
 - Close to optimal

Capacity in Flat-Fading

Rayleigh



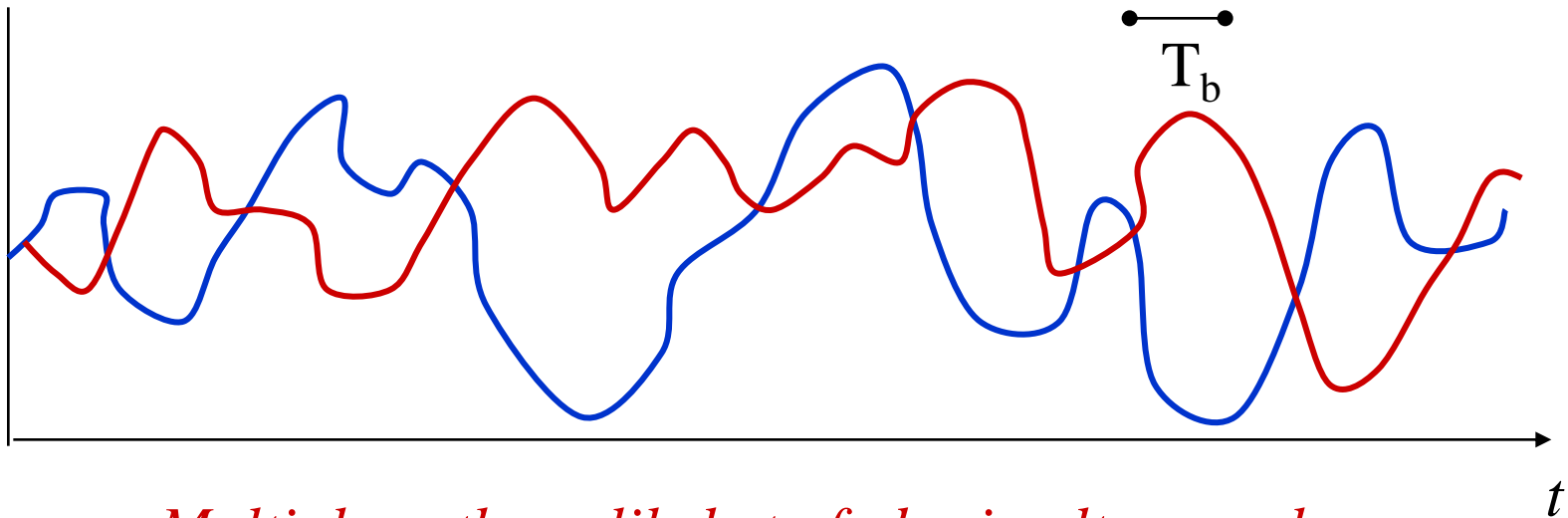
Log-Normal



Introduction to Diversity

- Basic Idea

- Send same bits over independent fading paths
 - Independent fading paths obtained by time, space, frequency, or polarization diversity
- Combine paths to mitigate fading effects



Multiple paths unlikely to fade simultaneously

Combining Techniques

- Selection Combining
 - Fading path with highest gain used
- Maximal Ratio Combining
 - All paths cophased and summed with optimal weighting to maximize combiner output SNR
- Equal Gain Combining
 - All paths cophased and summed with equal weighting
- Array/Diversity gain
 - Array gain is from noise averaging (AWGN and fading)
 - Diversity gain is change in BER slope (fading)

Selection Combining Analysis and Performance

- Selection Combining (SC)
 - Combiner SNR is the maximum of the branch SNRs.
 - CDF easy to obtain, pdf found by differentiating.
 - Diminishing returns with number of antennas.
 - Can get up to about 20 dB of gain.

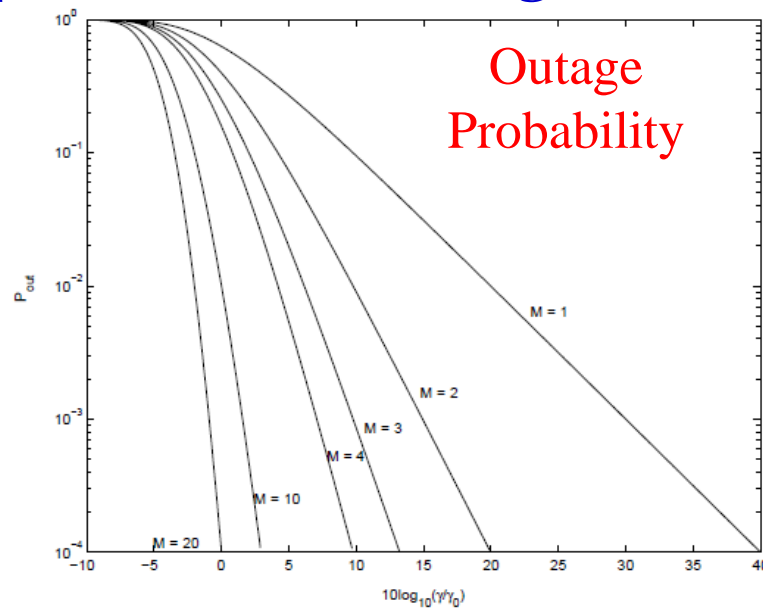


Figure 7.2: Outage Probability of Selection Combining in Rayleigh Fading.

MRC and its Performance

- With MRC, $\gamma_{\Sigma} = \sum \gamma_i$ for branch SNRs γ_i
 - Optimal technique to maximize output SNR
 - Yields 20-40 dB performance gains
 - Distribution of γ_{Σ} hard to obtain
- Standard average BER calculation

$$\bar{P}_b = \int P_b(\gamma_{\Sigma}) p(\gamma_{\Sigma}) d\gamma_{\Sigma} = \int \int \dots \int P_b(\gamma_{\Sigma}) p(\gamma_1) * p(\gamma_2) * \dots * p(\gamma_M) d\gamma_1 d\gamma_2 \dots d\gamma_M$$

- Hard to obtain in closed form
 - Integral often diverges
- Preview: MGF Approach:

$$\bar{P}_b = \frac{1}{\pi} \int_0^{.5\pi} \prod_{i=1}^M \mathcal{M}_i \left[\frac{-\mathbf{g}}{\sin^2 \varphi}; \gamma_i \right] d\varphi$$

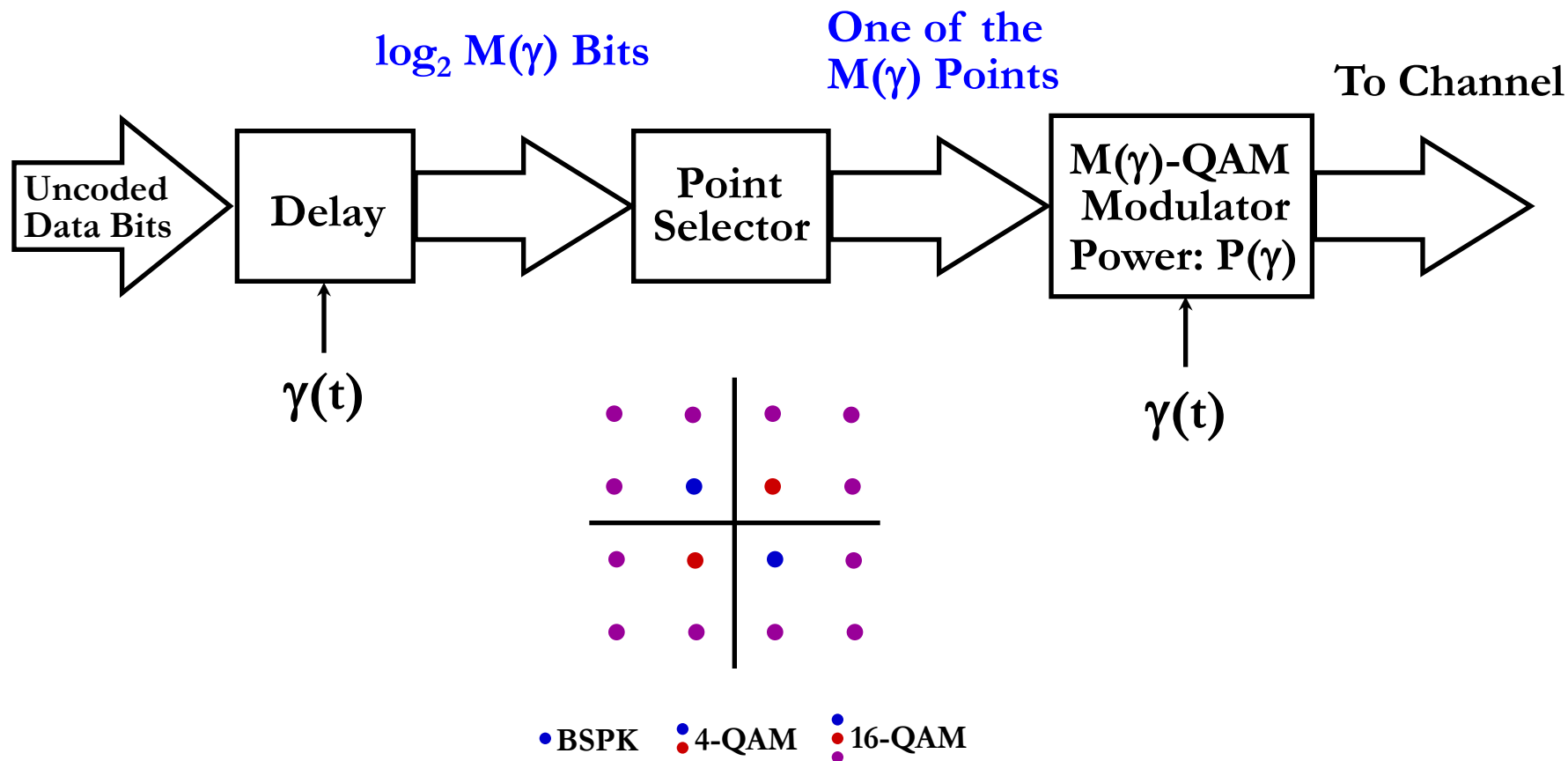
Adaptive Modulation

- Change modulation relative to fading
- Parameters to adapt:
 - Constellation size
 - Transmit power
 - Instantaneous BER
 - Symbol time
 - Coding rate/scheme

Only 1-2 degrees of freedom needed for good performance

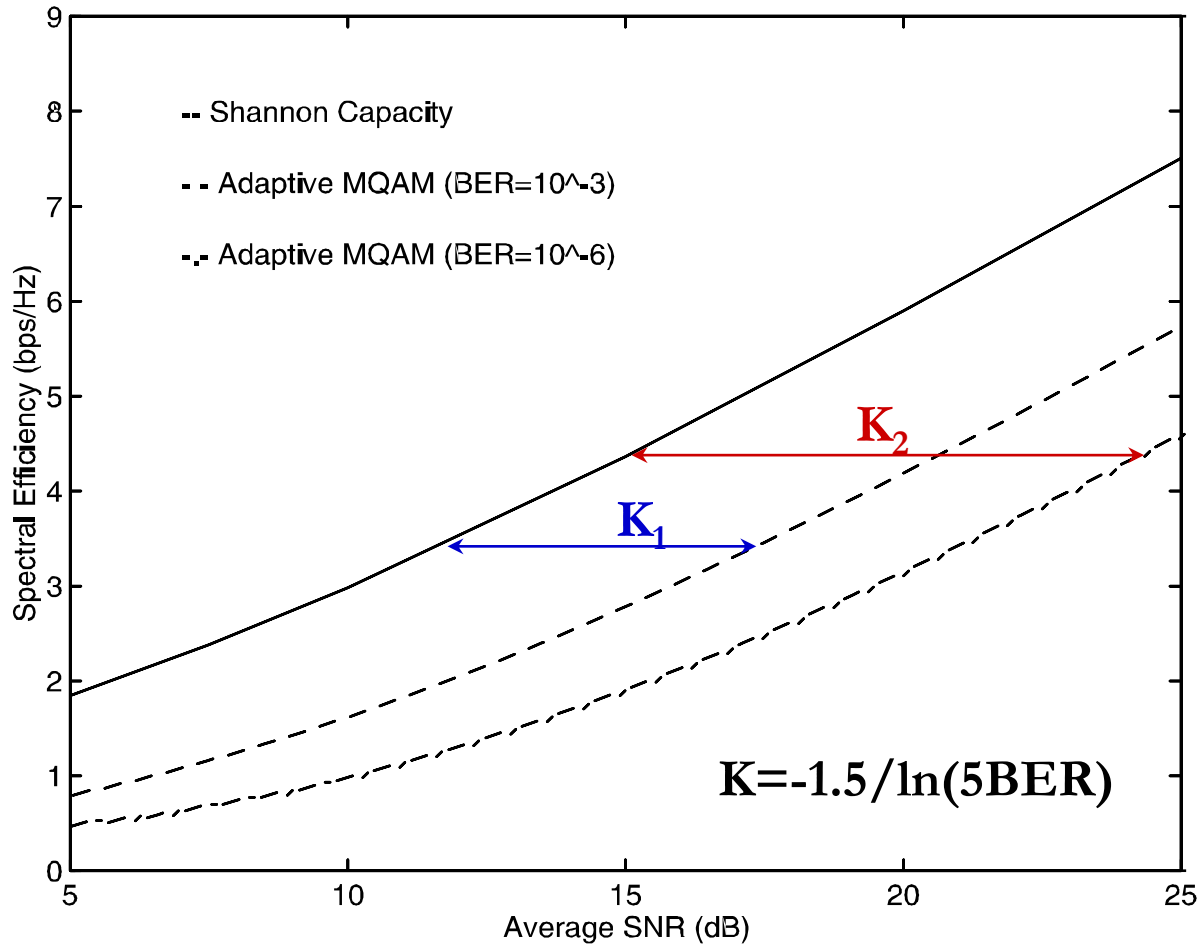
- Optimization criterion:
 - Maximize throughput
 - Minimize average power
 - Minimize average BER

Variable-Rate Variable-Power MQAM



Goal: Optimize $P(\gamma)$ and $M(\gamma)$ to maximize $R = E \log[M(\gamma)]$

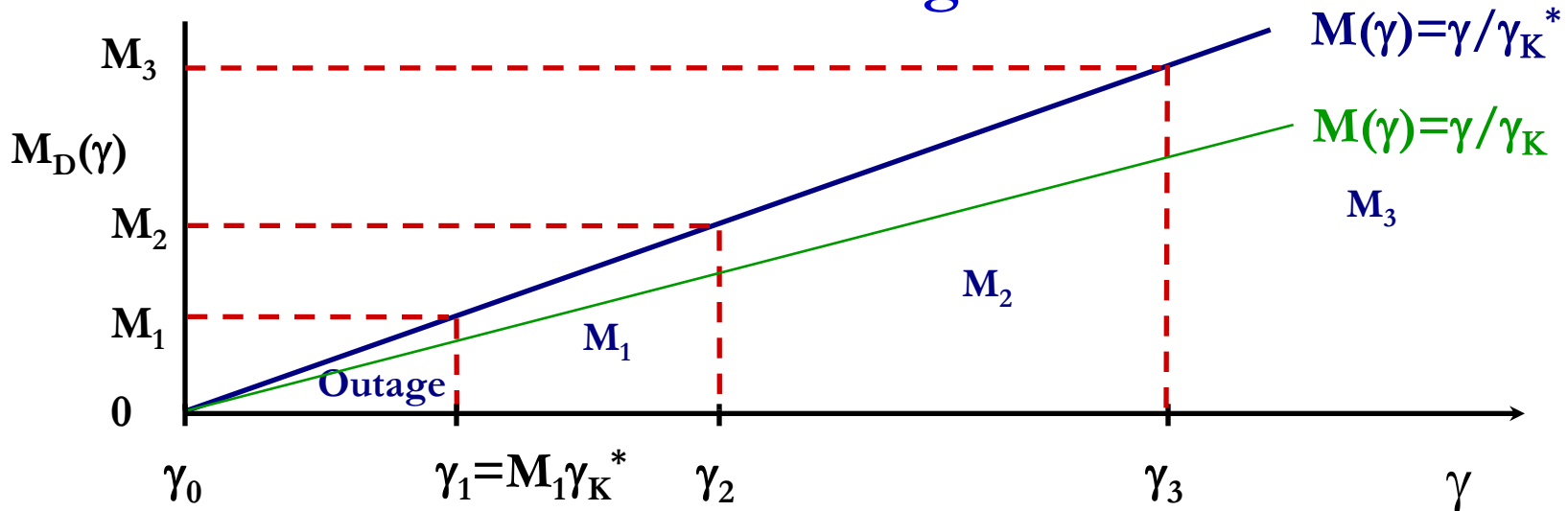
Spectral Efficiency



Can reduce gap by superimposing a trellis code

Constellation Restriction

- Restrict $M_D(\gamma)$ to $\{M_0=0, \dots, M_N\}$.
- Let $M(\gamma) = \gamma / \gamma_K^*$, where γ_K^* is optimized for max rate
- Set $M_D(\gamma)$ to $\max_j M_j: M_j \leq M(\gamma)$ (conservative)
- Region boundaries are $\gamma_j = M_j \gamma_K^*$, $j=0, \dots, N$
- Power control maintains target BER



Power Adaptation and Average Rate

- Power adaptation:

- Fixed BER within each region

- $E_s/N_0 = (M_j - 1)/K$

- Channel inversion within a region

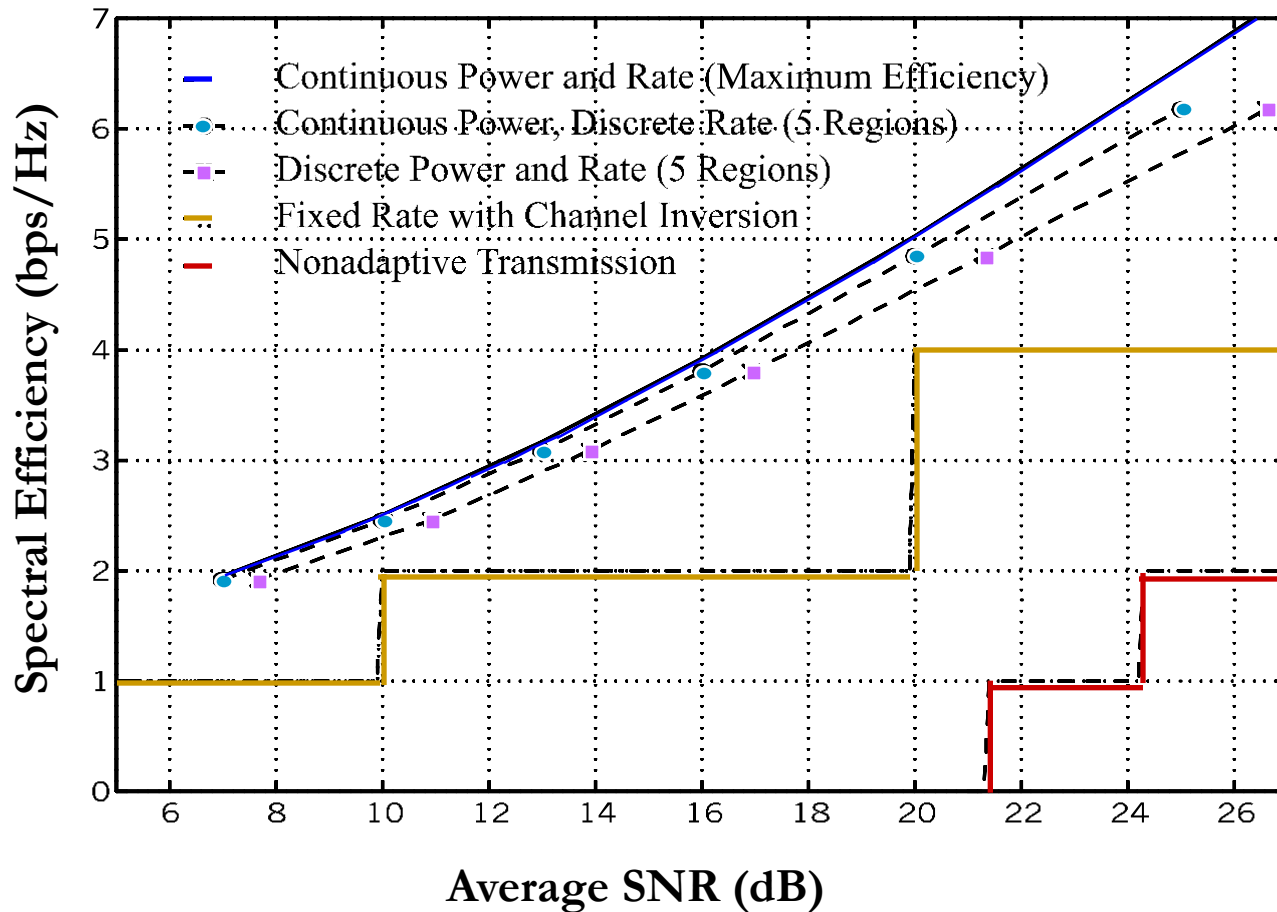
- Requires power increase when increasing $M(\gamma)$

$$\frac{P_j(\gamma)}{P} = \begin{cases} (M_j - 1)/(\gamma K) & \gamma_j \leq \gamma < \gamma_{j+1}, j > 0 \\ 0 & \gamma < \gamma_1 \end{cases}$$

- Average Rate

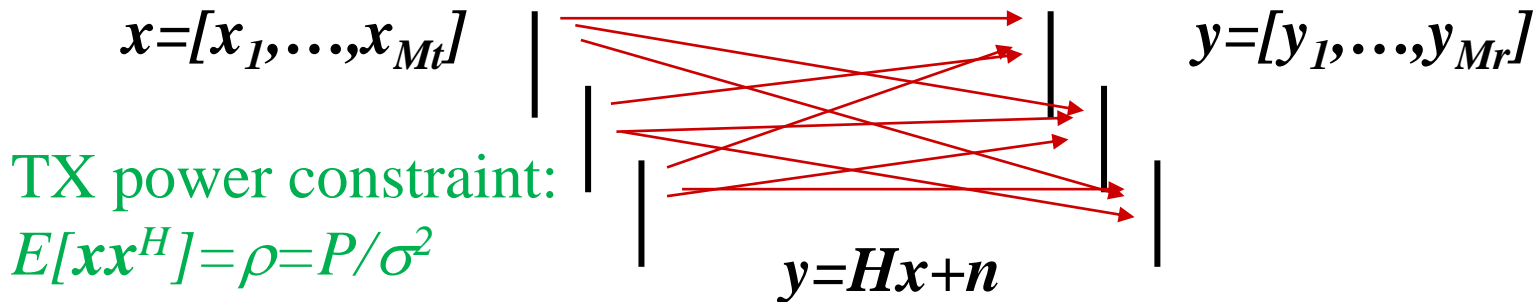
$$\frac{R}{B} = \sum_{j=1}^N \log_2 M_j p(\gamma_j \leq \gamma < \gamma_{j+1})$$

Efficiency in Rayleigh Fading



Multiple Input Multiple Output (MIMO) Systems

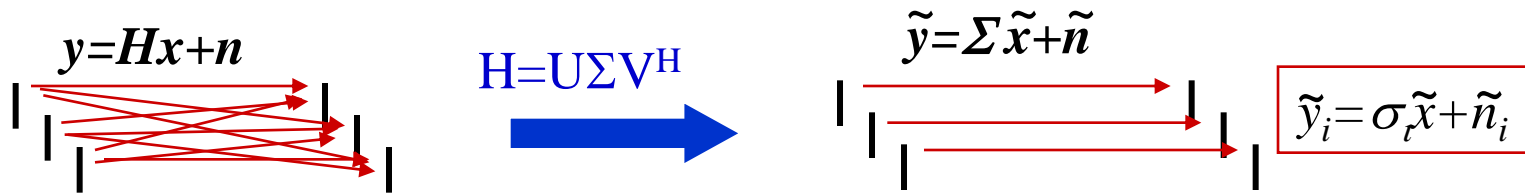
- MIMO systems have multiple transmit and receiver antennas (M_t at TX, M_r at RX)



- Input described by vector x of dimension M_t
- Output described by vector y of dimension M_r
- Channel described by $M_r \times M_t$ matrix
- Design and capacity analysis depends on what is known about channel H at TX and RX
 - If H unknown at TX, requires vector modulation/demod

MIMO Decomposition

- Decompose channel through transmit precoding ($\mathbf{x}=\mathbf{V}\tilde{\mathbf{x}}$) and receiver shaping ($\tilde{\mathbf{y}}=\mathbf{U}^H\mathbf{y}$)



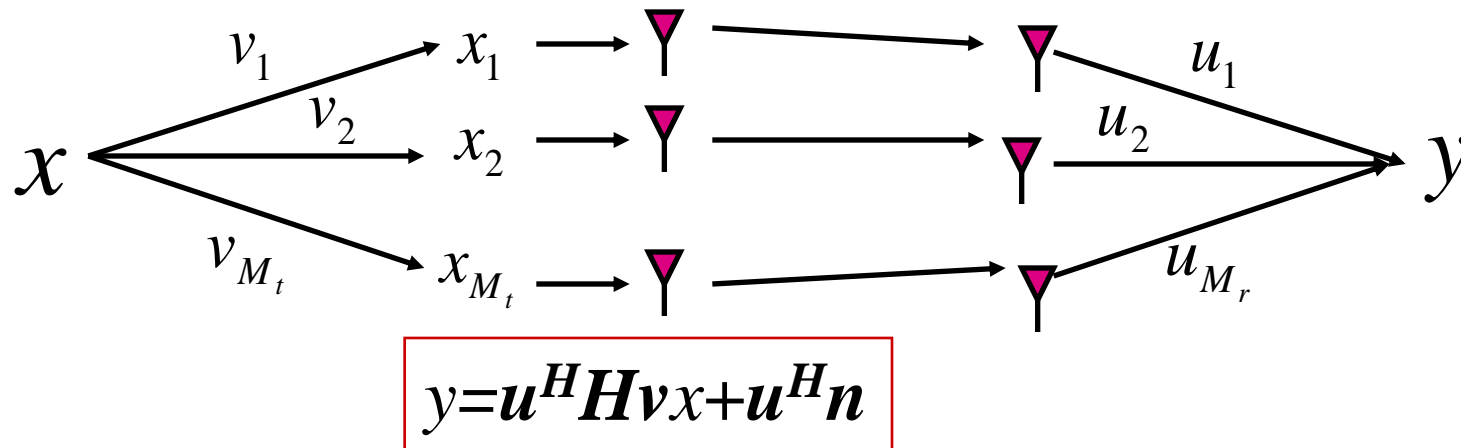
- Leads to $R_H \leq \min(M_t, M_r)$ independent channels with gain σ_i (i^{th} singular value of H) and AWGN
- Independent channels lead to simple capacity analysis and modulation/demodulation design

Capacity of MIMO Systems

- Depends on what is known at TX and RX and if channel is static or fading
- For static channel with perfect CSI at TX and RX, power water-filling over space is optimal:
 - In fading waterfill over space (based on short-term power constraint) or space-time (long-term constraint)
- Without transmitter channel knowledge, capacity metric is based on an outage probability
 - P_{out} is the probability that the channel capacity given the channel realization is below the transmission rate.

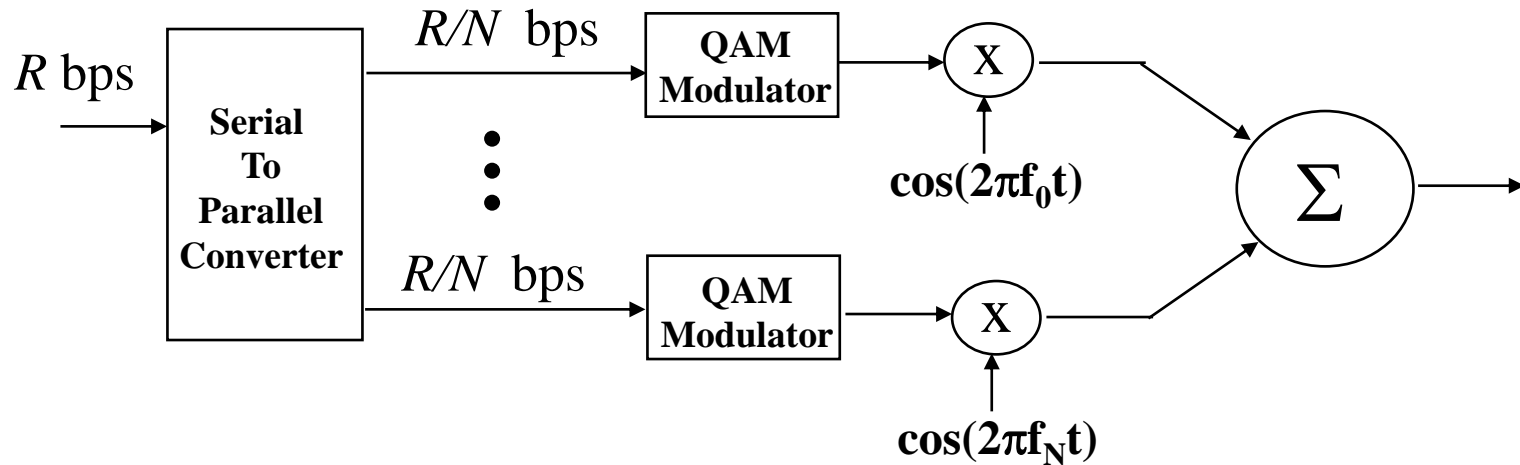
Beamforming

- Scalar codes with transmit precoding



- Transforms system into a SISO system with diversity.
 - Array and diversity gain
 - Greatly simplifies encoding and decoding.
 - Channel indicates the best direction to beamform
 - Need “sufficient” knowledge for optimality of beamforming

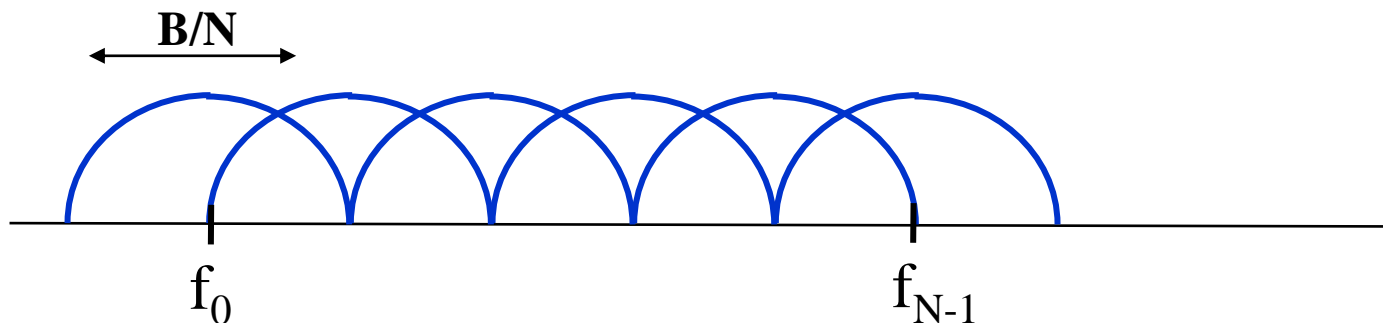
Multicarrier Modulation



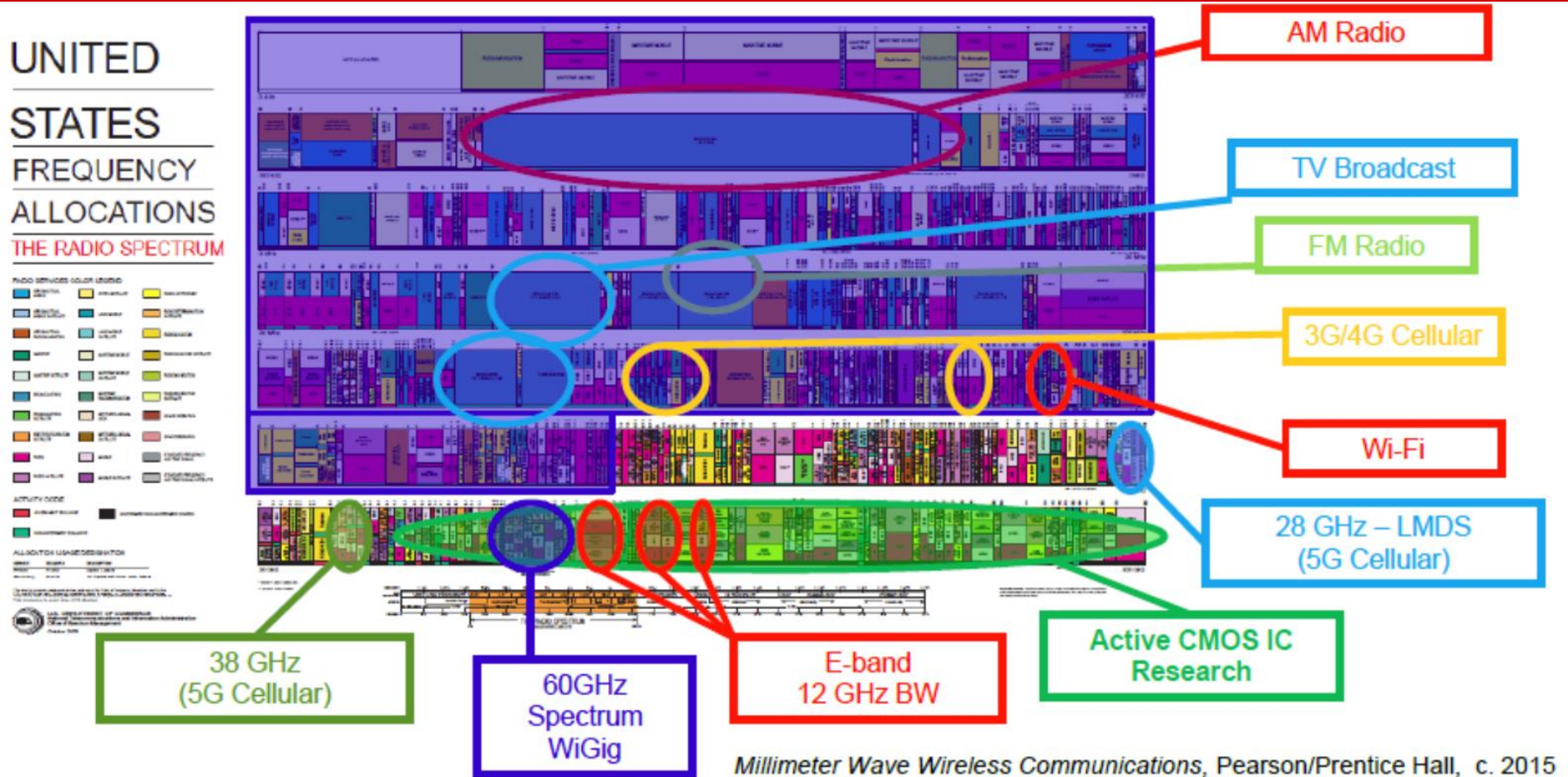
- Breaks data into N substreams
- Substream modulated onto separate carriers
 - Substream passband BW is B/N for B total BW
 - $B/N < B_c$ implies flat fading on each subcarrier (no ISI)

Overlapping Substreams

- Can have completely separate subchannels
 - Required passband bandwidth is B .
- OFDM overlaps substreams
 - Substreams (symbol time T_N) separated in RX
 - Minimum substream separation is $1/T_N$ for rectangular pulses
 - Total required bandwidth is $B/2$



mmWave: What's the big deal?



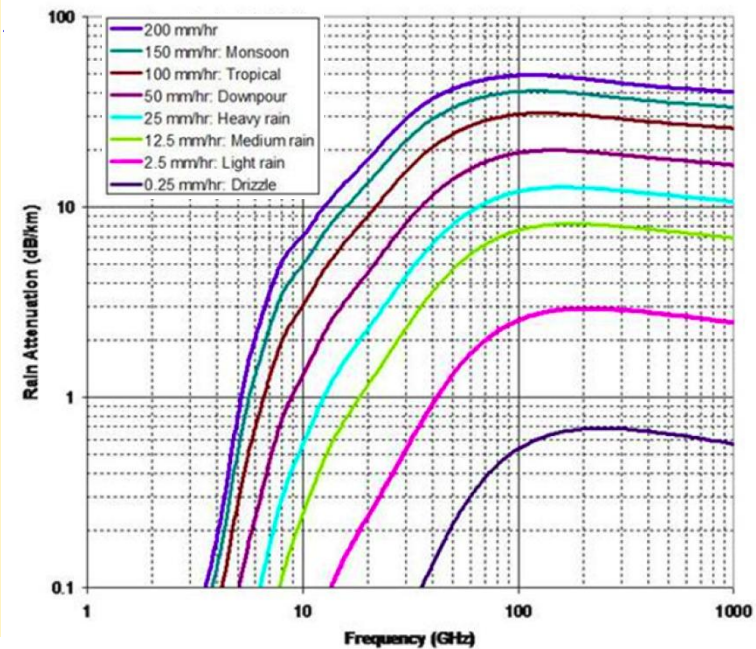
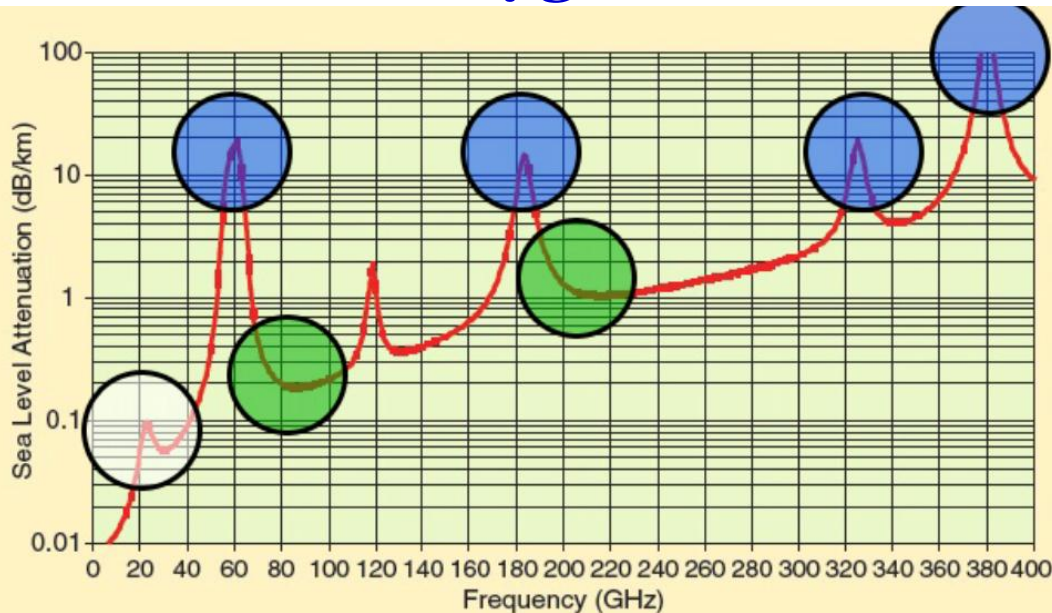
All existing commercial systems fit into a small fraction of the mmWave band

mmWave Propagation (60-100GHz)

mmW
Massive
MIMO



- Channel models immature
 - Based on measurements, few accurate analytical models
- Path loss proportion to λ^2 (huge)
- Also have oxygen and rain absorption



mmWave systems will be short range or require “massive MIMO”