

# Wireless Communications SSY135 – Lecture 4

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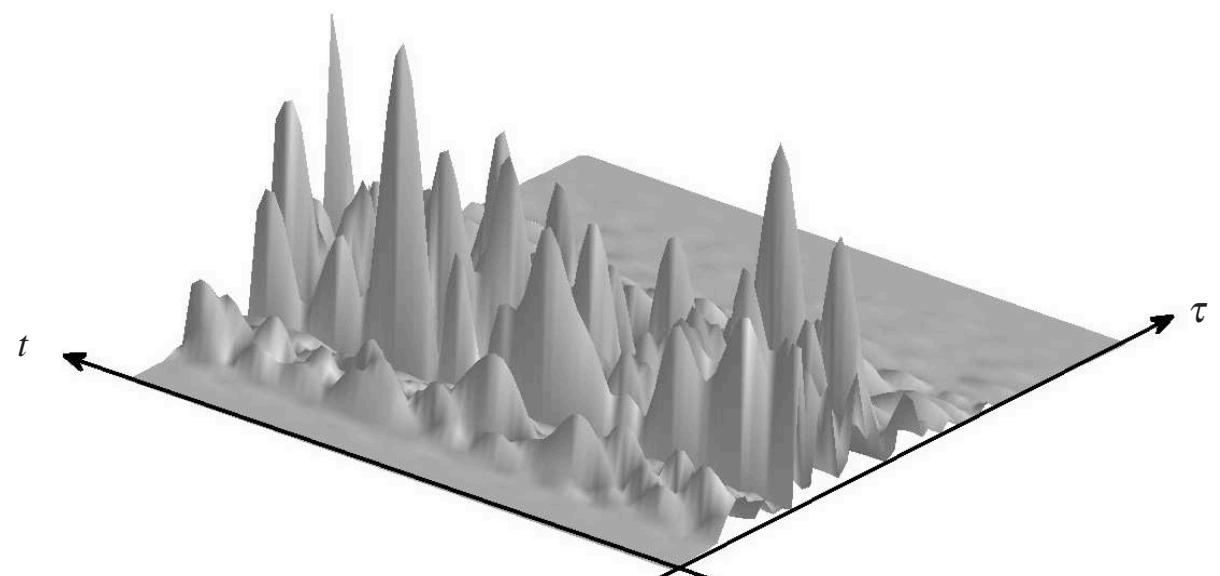
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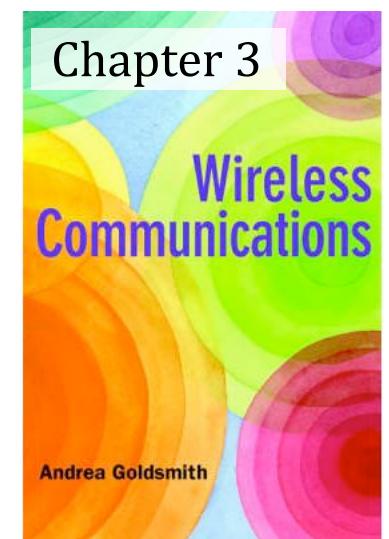


**CHALMERS**



## Topics for today

- Lecture learning outcomes
- Time-varying convolution
- Wideband models: the WSS-US assumption
- Coherence bandwidth and delay spread
- Coherence time and Doppler spread



Suggested reading:

- Every section from Chapter 3, except 3.2.4
- No derivations from sections 3.2.3
- Not derivations (3.18)-(3.27)

## Today's learning outcomes

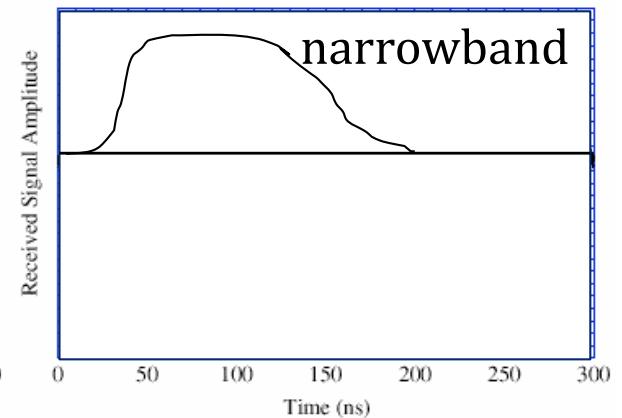
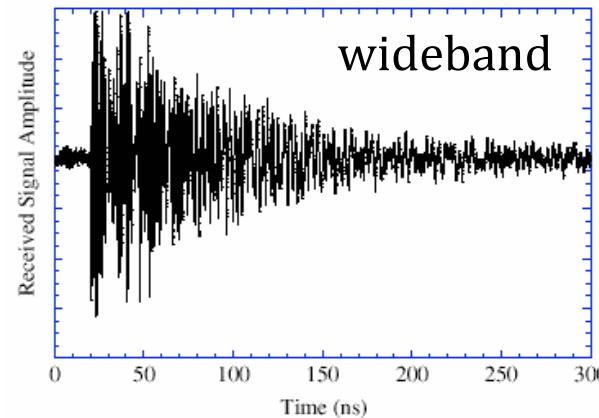
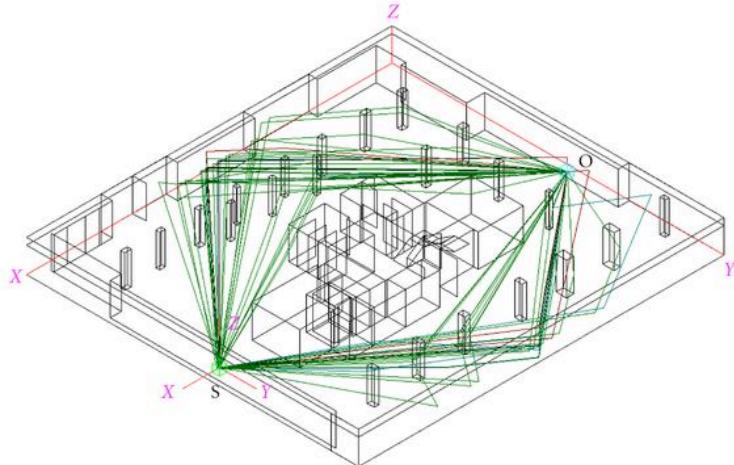
At the end of this lecture, you must be able to

- Describe the difference between
  - (a) delay spread, coherence time, Doppler spread and coherence bandwidth
  - (b) narrowband and wideband communication
  - (c) slow fading and fast fading
- Compute the 2D autocorrelation function of WSS-US processes
- Quantify (a) from the 2D autocorrelation function and its various transforms
- Design a communication system to satisfy (b)-(c)

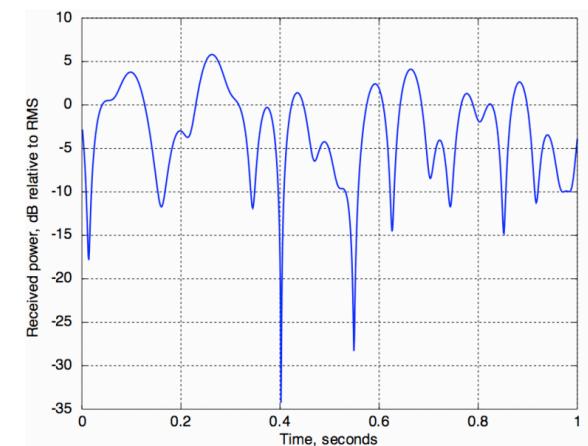


## Last time

- Many signal paths add up incoherently



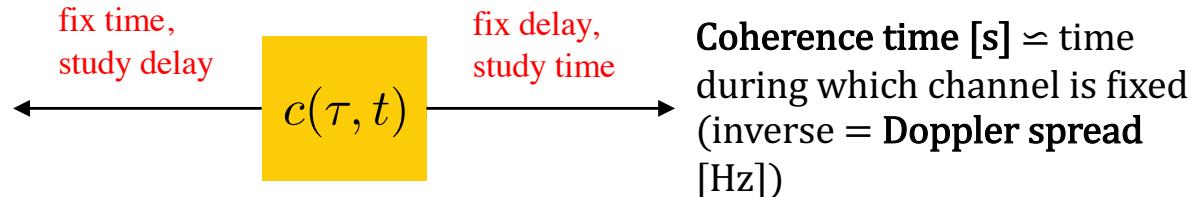
- Signal varies over time due to mobility
  - Modeled through **distribution** and **autocorrelation**
  - Distribution: Rayleigh, Rician
  - Autocorrelation (determines time variation): Jakes' model, related to coherence time



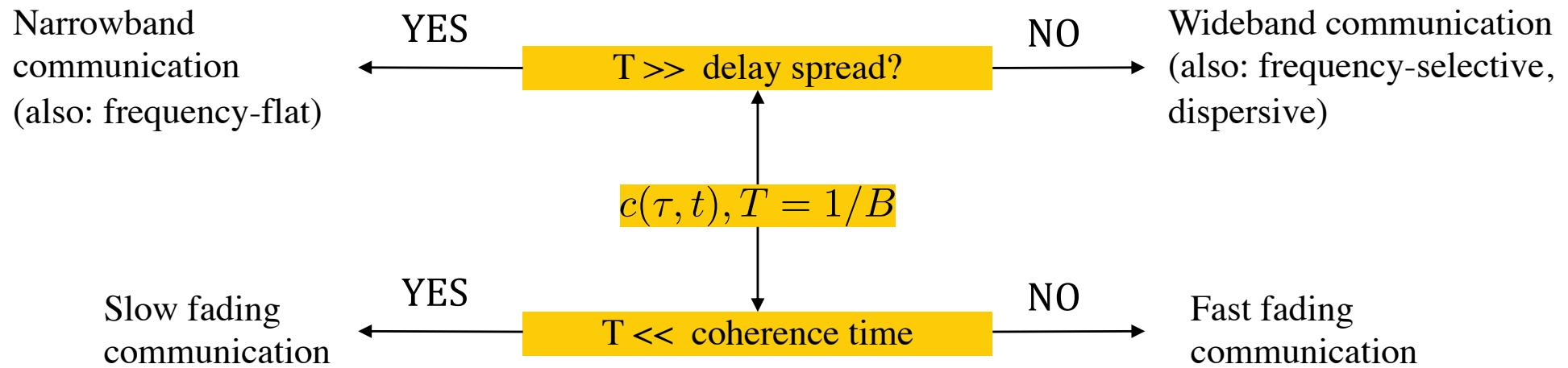
# Time-varying impulse response

- Channel: physics

**Delay spread [s]**  $\simeq$  time between first arrival and last reflection  
(inverse = **coherence bandwidth** [Hz])



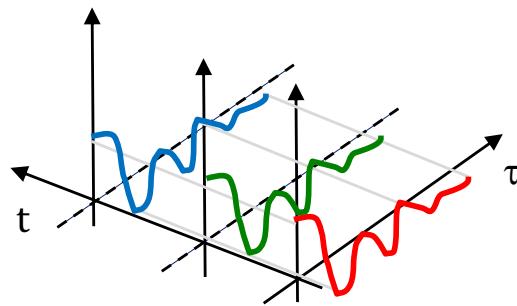
- Communication over a channel: engineering, choose a bandwidth  $B$  ( $T=1/B$ )



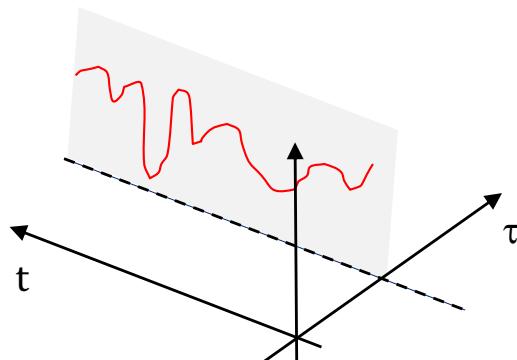
- Today: wideband communication, both slow and fast fading

## Extreme cases

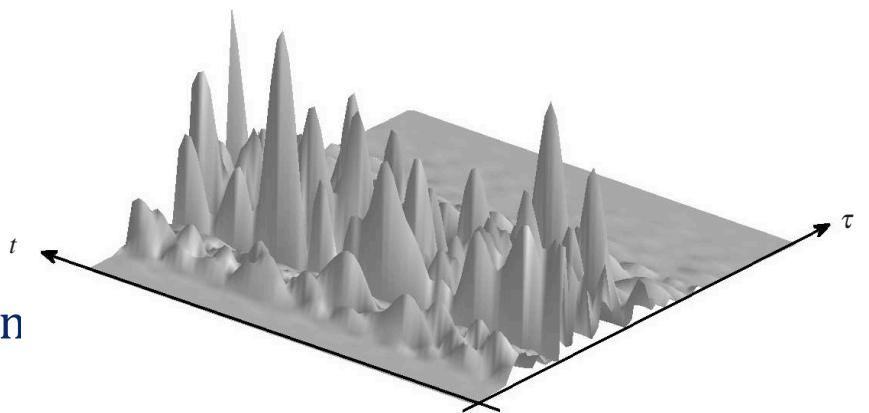
- Wideband (very) slow fading communication



- Narrow-band fast fading communication



Today: more general



# Time-varying impulse response

- Many paths, different angles

$$r(t) = \Re \left\{ \sum_{n=1}^N u(t - \tau_n(t)) \alpha_n(t) e^{j2\pi(f_c + f_{n,D})(t - \tau_n(t))} \right\} + n(t)$$

$$= \Re \left\{ e^{j2\pi f_c t} \sum_{n=1}^N u(t - \tau_n(t)) \alpha_n(t) e^{j\phi_n(t)} \right\} + n(t)$$

Baseband  
model:

$$\int_{-\infty}^{+\infty} c(\tau, t) u(t - \tau) d\tau$$

- Time-varying convolution

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

- Narrowband fading models:  $c(\tau, t) \rightarrow c(t)$ 
  - distribution of envelope: Rayleigh, Rice
  - time-variability: Jakes spectrum; relied on WSS assumption
- Wideband fading models:  $c(\tau, t)$

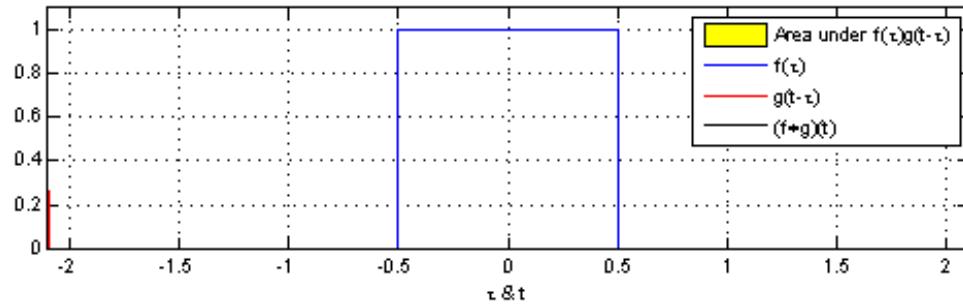
## Recall: convolution

- Convolution: time  $t$ , delay  $\tau$

$$y(t) = \int_{-\infty}^{+\infty} c(\tau)u(t - \tau)d\tau$$

$$Y(f) = C(f)U(f)$$

$$C(f) = \int c(\tau)e^{-j2\pi f\tau}d\tau$$



- Time varying convolution: the filter changes over time ( $t$ )

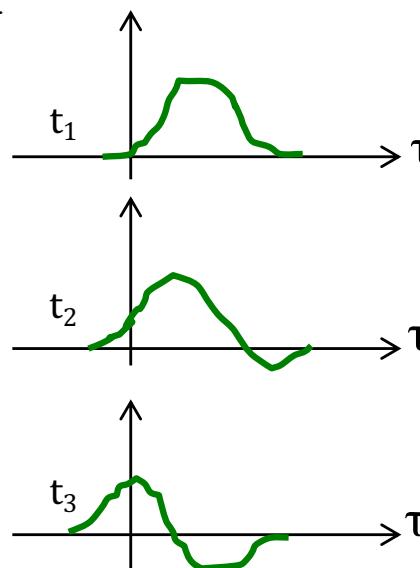
$$y(t) = \int_{-\infty}^{+\infty} c(\tau, t)u(t - \tau)d\tau$$

$$Y(f) \neq C(f)U(f)$$

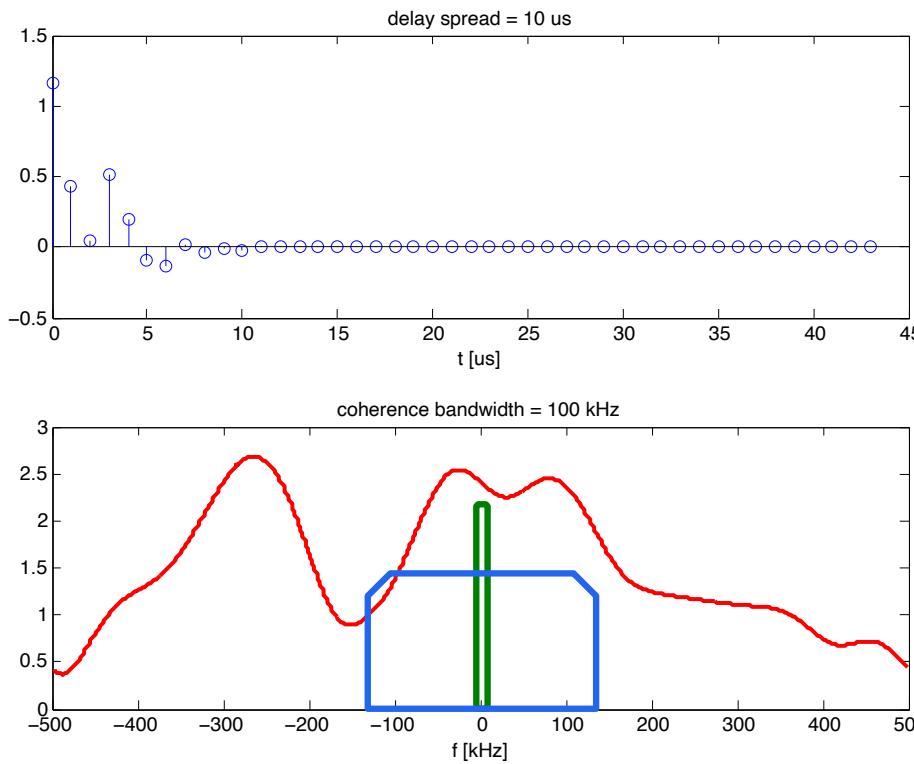
$$C(f, t) = \int c(\tau, t)e^{-j2\pi f\tau}d\tau$$

$$u(t) = e^{j2\pi f_0 t}$$

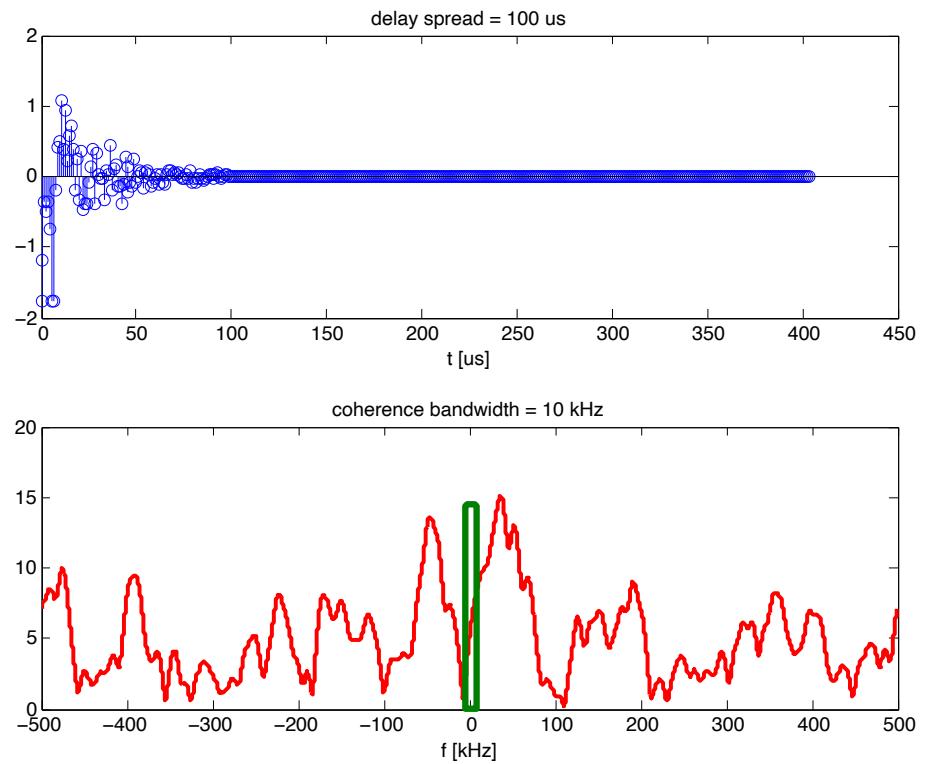
$$y(t) = e^{j2\pi f_0 t}C(f_0, t)$$



# Delay spread [s] and coherence bandwidth [Hz] example



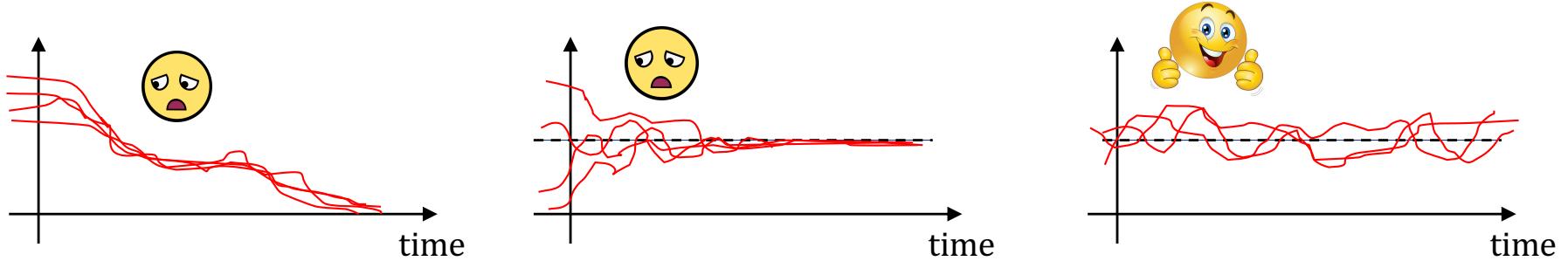
narrowband  
wideband



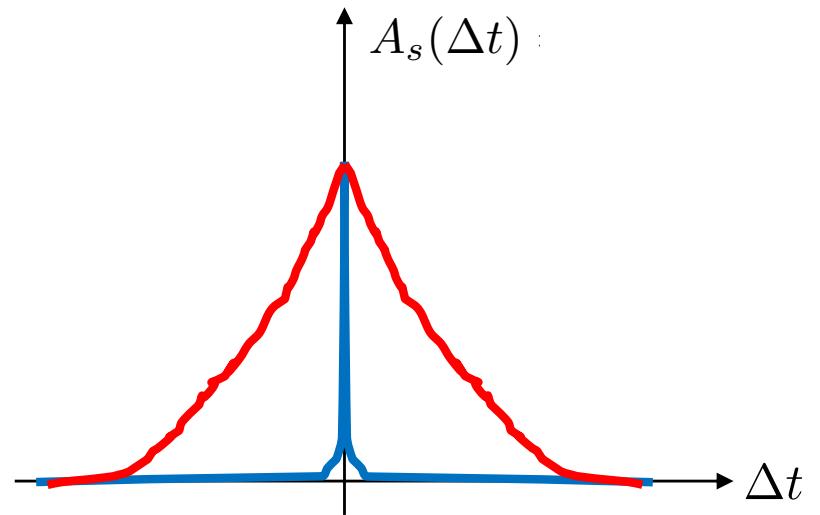
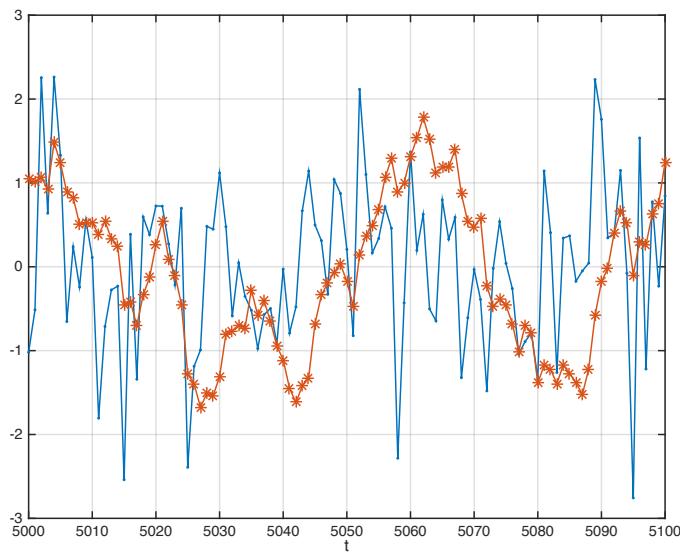
wideband

## Autocorrelation function (ACF) for 1D signal

- Wide-sense stationary random signal  $s(t)$ : 1<sup>st</sup> and 2<sup>nd</sup> moment not vary in time

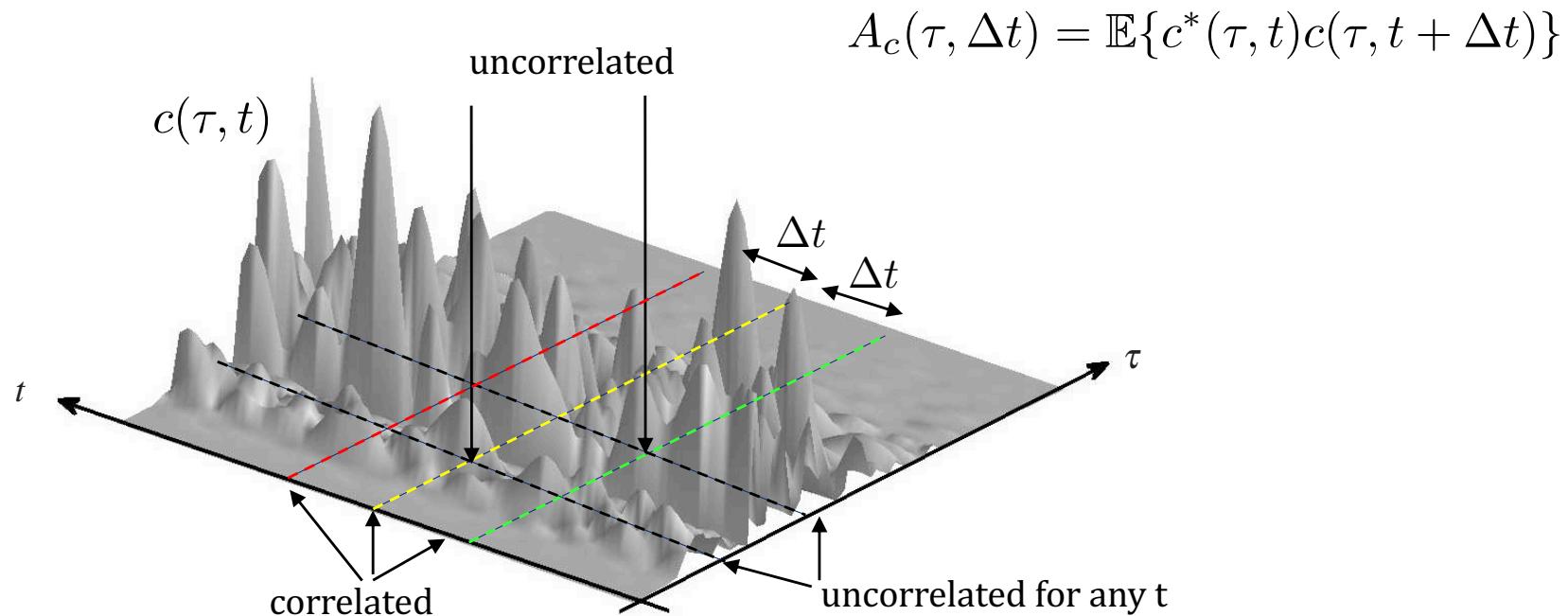


- Autocorrelation does not depend on  $t$ :  $A_s(\Delta t) = \mathbb{E}\{s^*(t)s(t + \Delta t)\}$



## ACF for 2D signal

- Channel is special case
- In general: 4D autocorrelation function  $A_c(\tau_1, \tau_2; t, t + \Delta t) = \mathbb{E}\{c^*(\tau_1, t)c(\tau_2, t + \Delta t)\}$
- We consider “simple” model: only 2 dimensions remain in ACF:

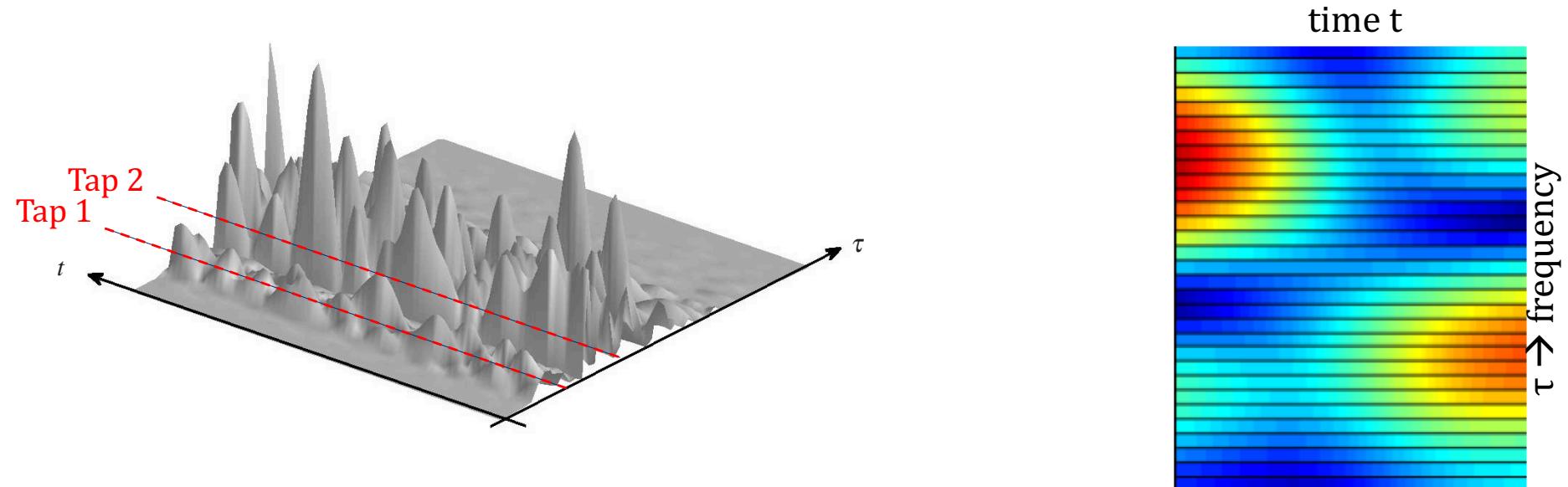


# Wideband fading models

- Key assumptions (ignoring path loss, shadowing, only NLOS)
  1.  $c(\tau, t)$  is a 2D complex Gaussian process: characterized by mean, autocorrelation and cross-correlation (I/Q)
  2. phases of multipath component uniform, independent: mean = 0, cross-correlation = 0
- Autocorrelation  $A_c(\tau_1, \tau_2; t, t + \Delta t) = \mathbb{E}\{c^*(\tau_1, t)c(\tau_2, t + \Delta t)\}$
- Additional assumptions: WSS-US:  $A_c(\tau, \Delta t) = \mathbb{E}\{c^*(\tau, t)c(\tau, t + \Delta t)\}$ 
  1. Wide-sense stationary (WSS): no dependence on  $t$
  2. Uncorrelated scattering (US): no correlation for different delays ( $\tau$ )
- Important quantities derived from autocorrelation function
  1. RMS delay spread  $\sigma_{T_m}$
  2. Coherence bandwidth  $B_c \approx 1/\sigma_{T_m}$
  3. Doppler spread  $B_D$
  4. Coherence time  $T_c \approx 1/B_D$

## Tapped delay line model: satisfies WSS-US

- M time-varying taps, spaced  $\Delta$  apart ( $\Delta$  smaller than  $1/B$ )
- $M \Delta >$  delay spread
- Each tap ( $m$ ) is *independent* random process
  - Average power derived from  $A_c(\tau, 0)$
  - Autocorrelation derived from  $A_c(\tau, \Delta t)$
  - Statistics: Rayleigh (i.e., Gaussian values), Ricean, Nakagami, ...



## Generating a Rayleigh wideband channel

Given signaling band  $B$ , delay spread  $D$ , total power  $P_{RX}$

1. Set  $L$  channel taps  $1/(2B)$  apart, with  $L = D \times 2B$
2. Choose variance for each tap according to a profile  $A_c(\tau, 0)$  (e.g. exponential)  $\sigma_i^2 = \alpha\sigma_{i-1}^2, \alpha \leq 1$  such that power is [more dense taps, same total power]

$$\sum_{i=1}^L \sigma_i^2 / (2B) = P_{RX}$$

3. Generate channel tap  $i$ :  $c_i = \mathcal{CN}(0, \sigma_i^2)$
4. To model time-evolution  $A_c(\tau, \Delta t)$  of  $c_i$ , use a proper filter with bandwidth equal to Doppler spread

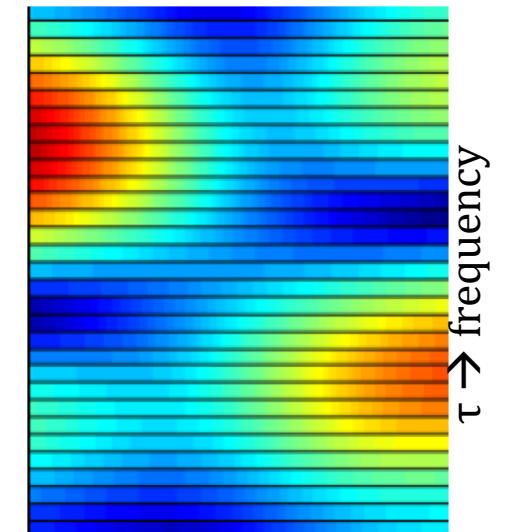
Comments:

- Instead of  $P_{RX}$  in step 2, use “1” for a normalized PDP
- For Ricean fading: add constant to first tap, redistribute energy based on K-factor

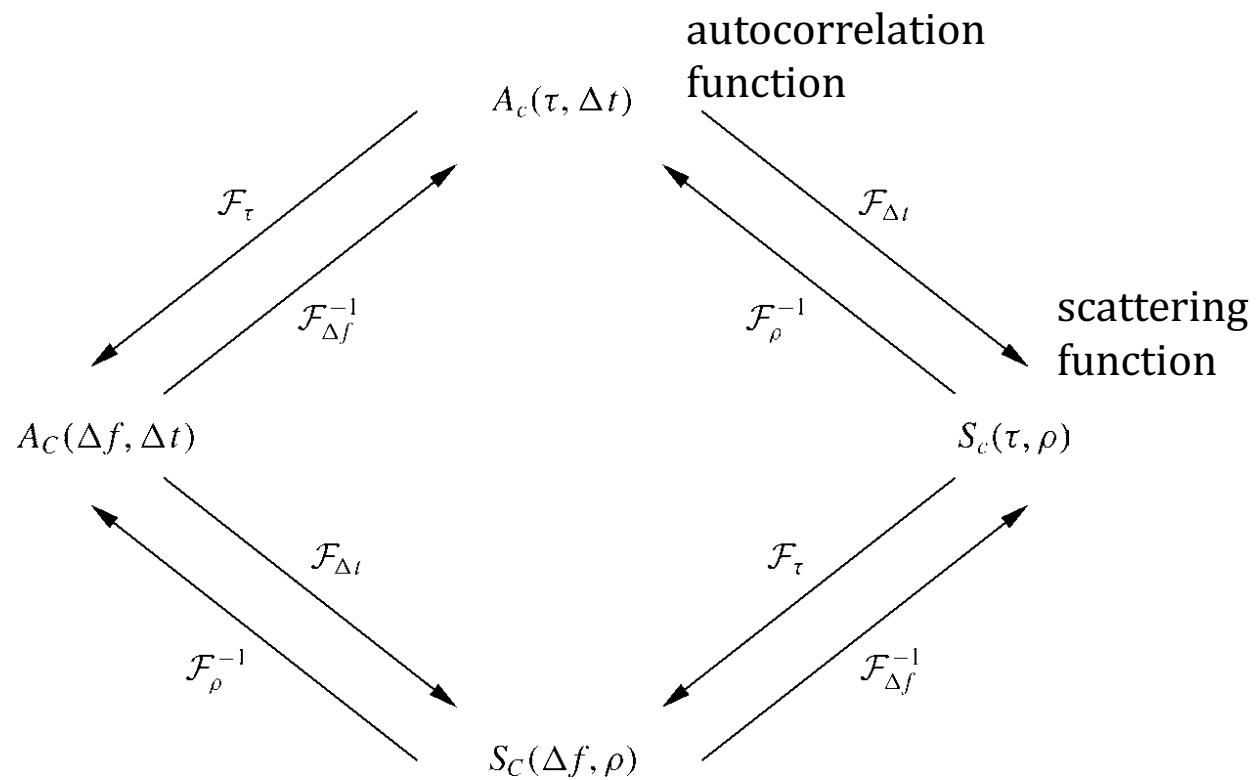
## What can be derived from autocorrelation function?

- Example: correlation of channel at time t for two different frequencies?  
 $\mathbb{E}\{C^*(f_1, t)C(f_2, t)\}$
- Use US property:

$$\begin{aligned}
 \mathbb{E}\{C^*(f_1, t)C(f_2, t)\} &= \mathbb{E}\left\{\int c^*(\tau_1, t)e^{-j2\pi f_1 \tau_1} d\tau_1 \int c(\tau_2, t)e^{j2\pi f_2 \tau_2} d\tau_2\right\} \\
 &= \int \int \mathbb{E}\{c^*(\tau_1, t) \quad c(\tau_2, t)\} e^{-j2\pi f_1 \tau_1} d\tau_1 e^{j2\pi f_2 \tau_2} d\tau_2 \\
 &= \int \mathbb{E}\{c^*(\tau, t) \quad c(\tau, t)\} e^{-j2\pi f_1 \tau} e^{j2\pi f_2 \tau} d\tau \\
 &= \int A_c(\tau, 0) e^{j2\pi(f_2 - f_1)\tau} d\tau \\
 &\doteq A_C(\Delta f)
 \end{aligned}$$

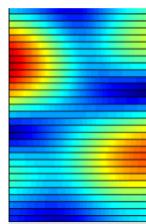


# Autocorrelation function and Fourier transforms



# Autocorrelation function and Fourier transforms

\*easy to measure

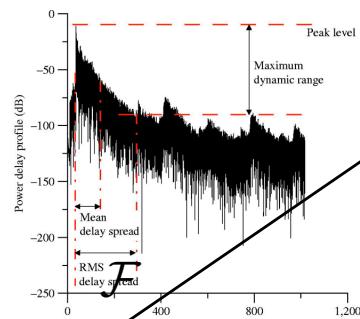


Coherence bandwidth

$A_C(\Delta f)$

Coherence time

$A_C(\Delta t)$



\*  $A_c(\tau)$

$A_c(\tau, \Delta t)$

power delay profile (PDP),  
generally normalized  
**Delay spread**

autocorrelation  
function

$\mathcal{F}_{\Delta t}$

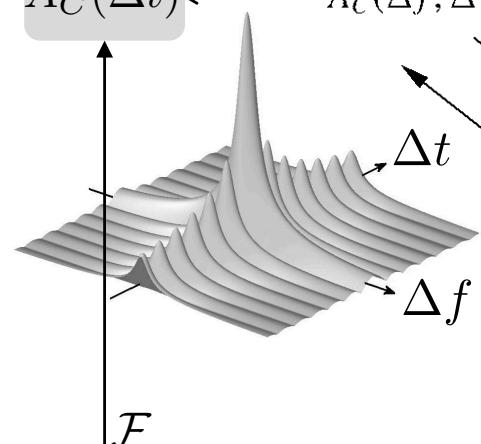
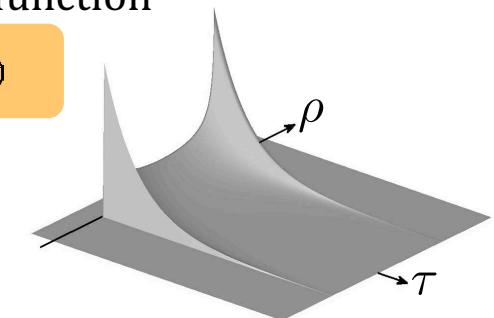
$\mathcal{F}_{\rho}^{-1}$

scattering  
function

$S_c(\tau, \rho)$

$\mathcal{F}_{\tau}$

$\mathcal{F}_{\Delta f}^{-1}$



Doppler  
Spread

$S_c(\Delta f, \rho)$

$S_C(\rho)$

Doppler power  
spectrum

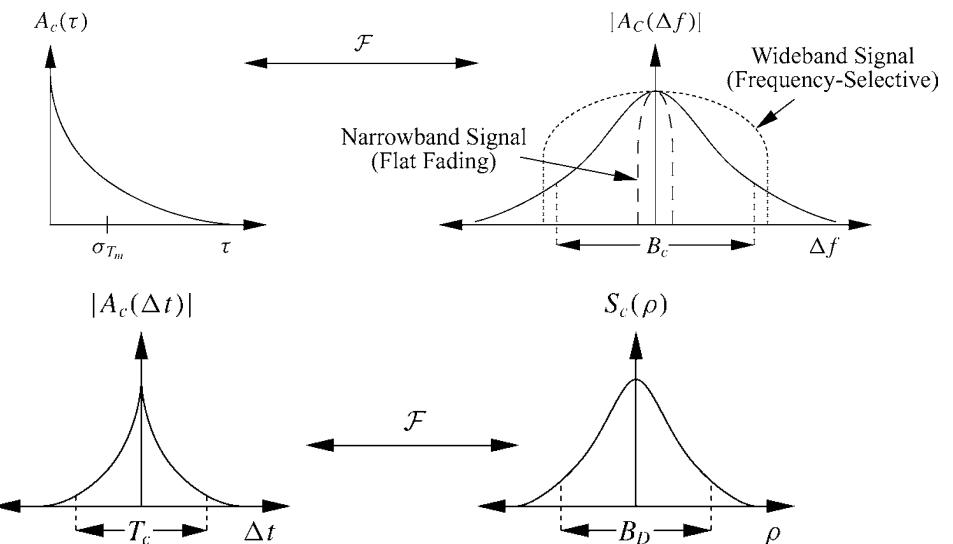
$\mathcal{F}_{\Delta f}$

$\mathcal{F}_{\Delta t}$

$\mathcal{F}_{\rho}^{-1}$

# Flat, Dispersive, Fast, Slow

- Flat fading:  $B \ll B_c$
- Frequency-selective fading:  $B \gg B_c$
- Slow fading:  $T \ll T_c$
- Fast fading:  $T \approx T_c$



(RMS) delay spread [s]: fix t, how fast does channel decay with  $\tau$ ?

Coherence bandwidth [Hz]: fix t, over which bandwidth is the channel flat?

Coherence time [s]: how long does it take for the channel to decorrelate?

Doppler spread [Hz]: at what rate does a frequency component change?

# Autocorrelation function: special cases



## Given

- A time-invariant channel
- A frequency-flat time-varying channel

## Task

- What are the expressions for the 2D autocorrelation function?
- How would you determine the 4 important quantities?

# Coherence time and coherence bandwidth



## Given

- A communication system with a data rate of  $R_s$
- A channel with coherence time 12.5 ms and a delay spread of 50 ns

## Task

- What is the coherence bandwidth?
- What is the Doppler spread?
- For what values of  $R_s$  is there only negligible ISI?
- For a baud rate of 1MBaud, is it reasonable to assume that the channel remains fixed for around 100 consecutive symbols?

## Today's learning outcomes

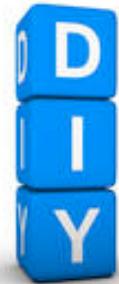
At the end of this lecture, you must be able to

- Describe the difference between
  - (a) delay spread, coherence time, Doppler spread and coherence bandwidth
  - (b) narrowband and wideband communication
  - (c) slow fading and fast fading
- Compute the 2D autocorrelation function of WSS-US processes
- Quantify (a) from the 2D autocorrelation function and its various transforms
- Design a communication system to satisfy (b)-(c)



# Solutions

# Autocorrelation function: special cases



## Given

- A time-invariant channel
- A frequency-flat time-varying channel

## Task

- What are the expressions for the 2D autocorrelation function?
- How would you determine the 4 important quantities?

## Solution

**Time-invariant channel**  $c(\tau, t) = c(\tau)$

with autocorrelation function  $A_c(\tau, \Delta t) = A_c(\tau) = \mathbb{E}\{|c(\tau)|^2\}$  from which we can determine delay spread. The coherence time is infinite (the channel is constant).



**Frequency-flat time-varying channel**  $c(\tau, t) = c(t)$

with autocorrelation function  $A_c(\tau, \Delta t) = \mathbb{E}\{c^*(t)c(t + \Delta t)\} = A_c(\Delta t)$  from which we can compute the coherence time. The coherence bandwidth is infinite (the channel is flat).

# Coherence time and coherence bandwidth



## Given

- A communication system with a data rate of  $R_s$
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- What is the coherence bandwidth?
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## Solution

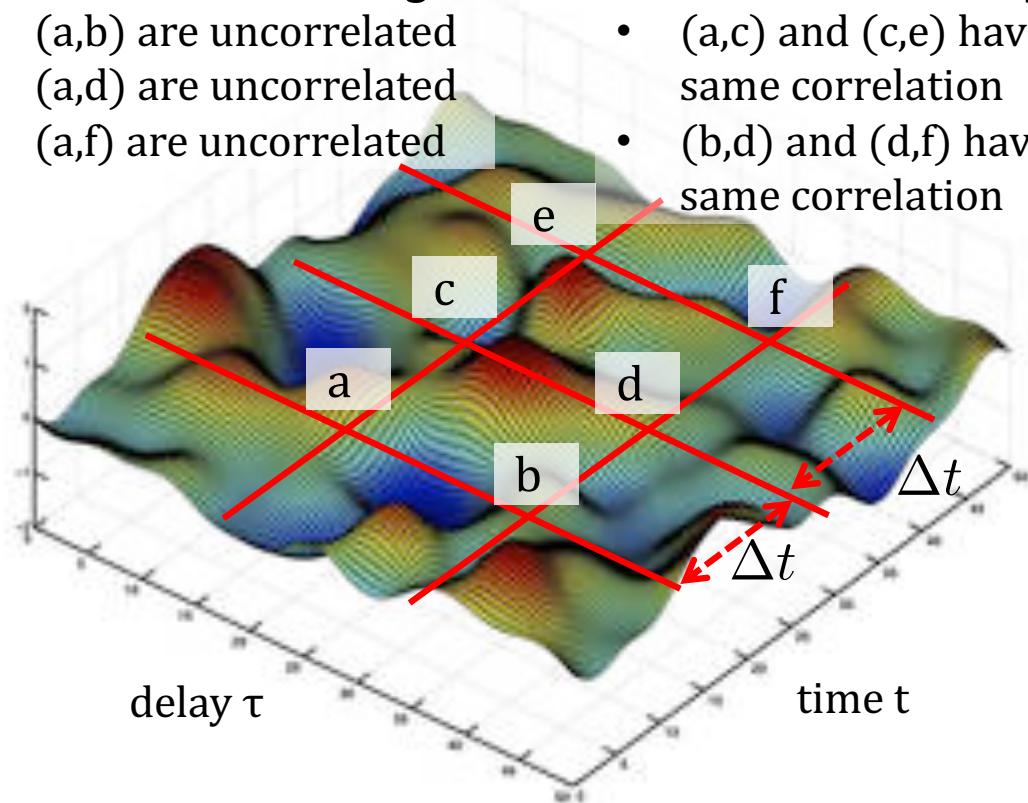
- Coherence bandwidth =  $1/(50\text{ns}) = 20 \text{ MHz}$
- Doppler spread =  $1/(12.5\text{ms}) = 80 \text{ Hz}$
- Negligible ISI:  $R_s \ll 20 \text{ MHz}$ , so one should transmit at a rate significantly smaller than 20 Mbaud
- 1Mbaud: 1 symbol = 1 us, so 100 symbols is 0.1ms. Since the coherence time is 12.5ms $\gg$ 0.1ms, the channel will be approximately constant during 100 symbols.



## Two-dimensional Gaussian process

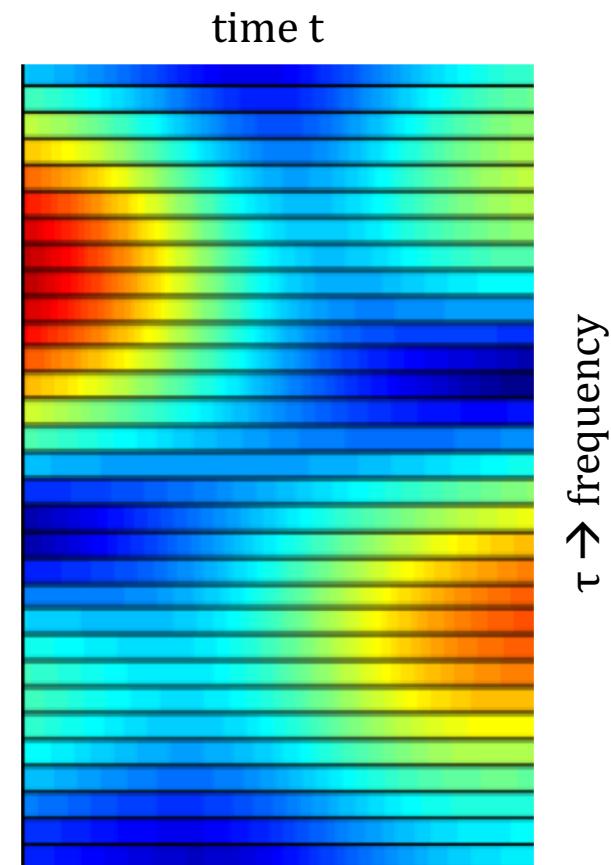
### Uncorrelated scattering

- (a,b) are uncorrelated
- (a,d) are uncorrelated
- (a,f) are uncorrelated



### Wide-sense stationary

- (a,c) and (c,e) have same correlation
- (b,d) and (d,f) have same correlation



**RMS delay spread [s]:** fix  $t$ , how fast does channel decay with  $\tau$ ?

**Coherence bandwidth [Hz]:** fix  $t$ , over which bandwidth is the channel flat?

**Doppler spread [Hz]:** at what rate does a frequency component change?

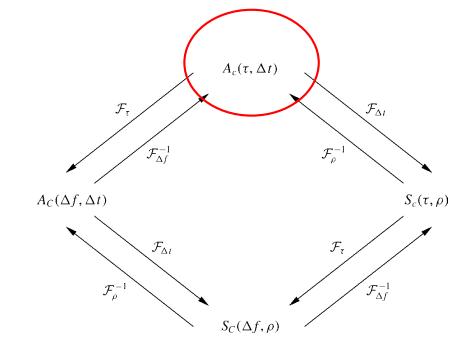
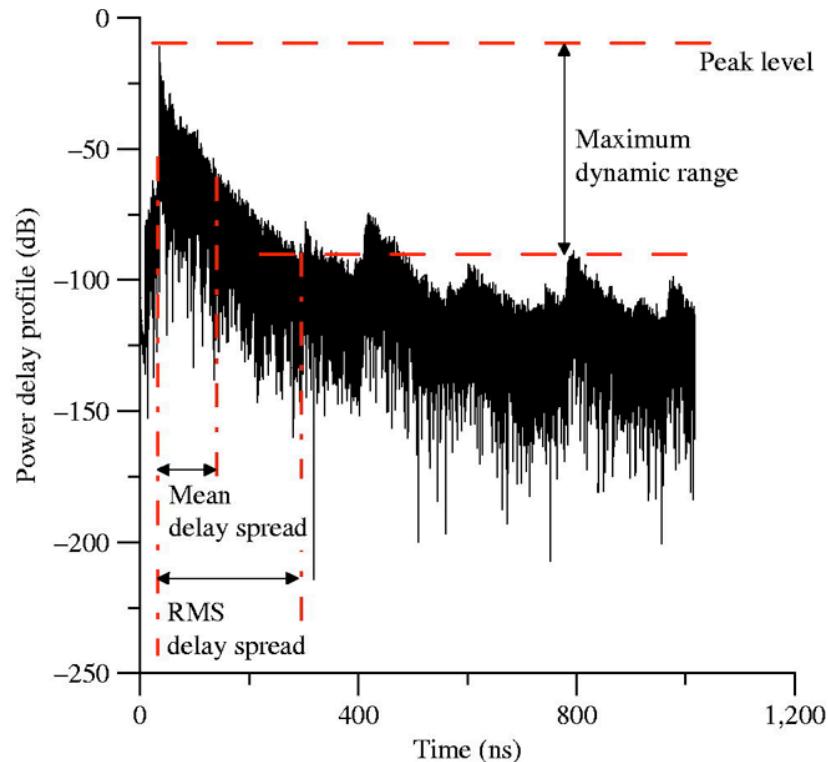
**Coherence time [s]:** over what time window does a frequency component remain flat?

# Delay spread

Derivations, starting from  $A_c(\tau, \Delta t)$

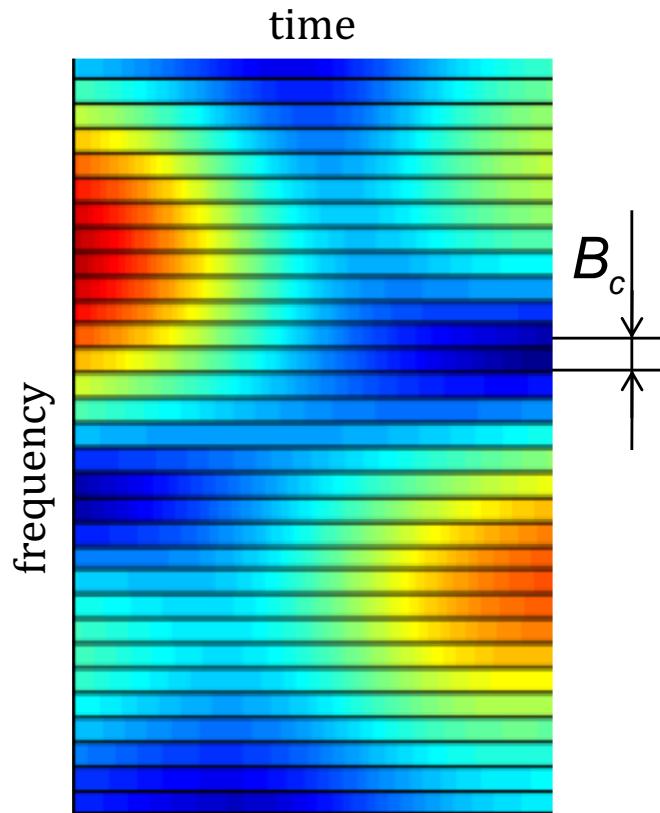
- Set  $\Delta t = 0$  to obtain PDP:  $A_c(\tau, 0) = \mathbb{E}\{|c(\tau, t)^2\} = \mathbb{E}\{|c(\tau, 0)^2\}$
- Then

$$\sigma_{T_m} = \sqrt{\frac{\int_0^\infty (\tau - \mu_{T_m})^2 A_c(\tau) d\tau}{\int_0^\infty A_c(\tau) d\tau}}.$$



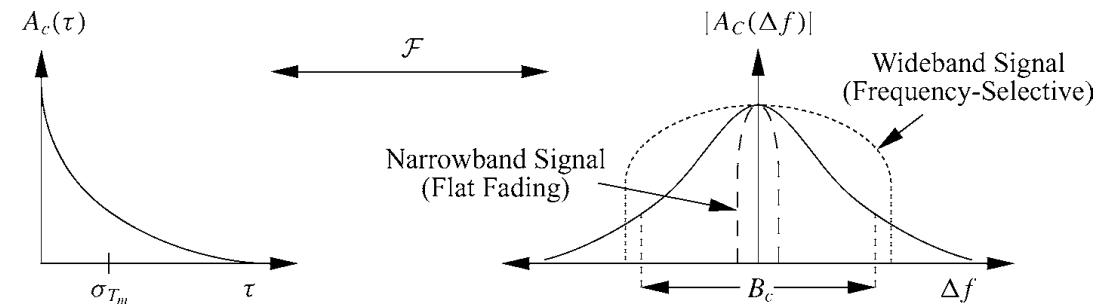
# Coherence bandwidth

## Realization of channel

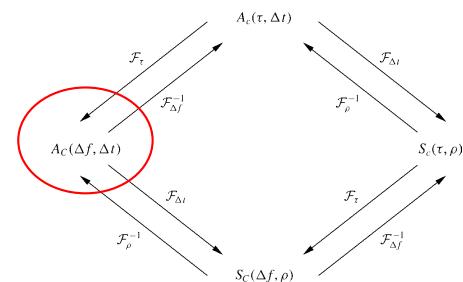


Derivations, starting from  $A_c(\tau, 0)$

- **Coherence bandwidth:** from Fourier transform of PDP

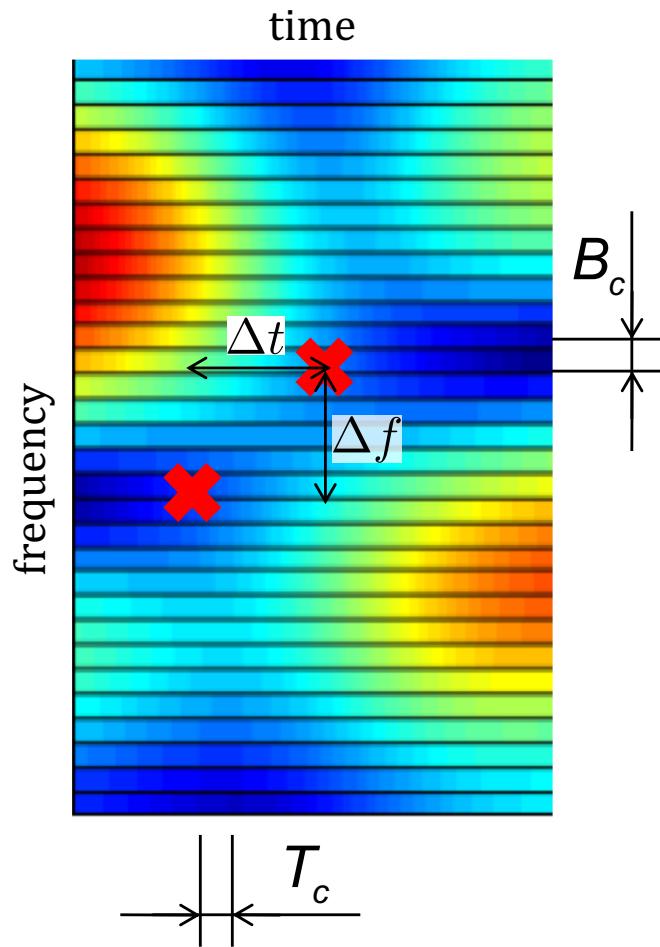


- **Flat fading:**  $B \ll B_c$
- **Frequency-selective fading:**  $B \gg B_c$



# Coherence time and Doppler spread

## Realization of channel



Derivations, starting from  $A_c(\tau, \Delta t)$

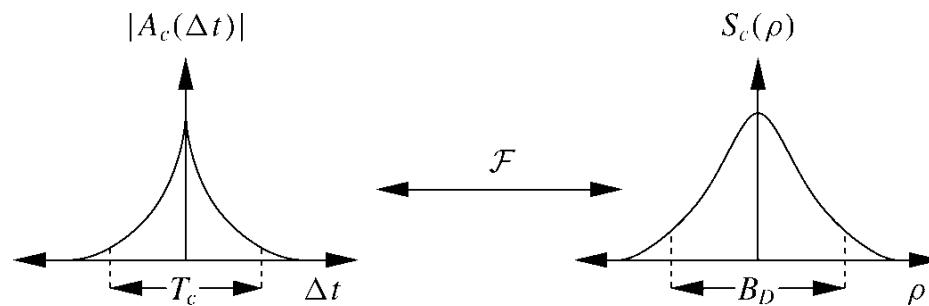
- **Coherence time, Doppler spread: fixed frequency**

1. go to frequency domain

$$A_C(\Delta f, \Delta t) = \int_{-\infty}^{+\infty} A_c(\tau, \Delta t) e^{-j2\pi\Delta f\tau} d\tau$$

1. Let  $\Delta f \rightarrow 0$  to obtain  $A_C(\Delta t)$ , describing overall time variation of channel impulse response

2. Fourier transform of  $A_C(\Delta t)$  is Doppler power spectrum  $S_c(\rho)$



- Slow fading (w.r.t. symbol rate)
- Fast fading (w.r.t. symbol rate)