## Sistemas de Comunicaciones Master en Ingeniería de Telecomunicación

## Unit 4. The Channel Model and Parameters

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#### Main Resources

- 1. These slides are the most recommended material
- 2. Fundamentals of Wireless Communication. David Tse and Pramod Viswanath. Cambridge University Press, 2005. http://stanford.edu/~dntse/wireless\_book.html
- 3. Modelling the Wireless Propagation Channel: A simulation approach with Matlab Fernando Pérez Fontán, Perfecto Mariño Espiñeira. Wiley 2008
- MIMO-OFDM Wireless Communications with MATLAB. Y. S. Cho, J. Kim, W.Y. Yang, C. G. Kang. Wiley-IEEE 2010.
- **5.** Other resources:
  - ► https://es.mathworks.com/discovery/channel-model.html
  - ▶ Channel Modeling in 5G Wireless Communication Systems, Hao JiangGuan Gui. Springer 2020.

The EM channel

## Free space EM

• Under *free space* (f.s.) propagation and in far field ( $r >> \lambda$ ), the electric field in the location of the received antenna behaves as a plain wave

$$e(f,t,\mathbf{r}) = \frac{\alpha(\varphi,\theta,f)\cos(2\pi f(t-r/\epsilon))}{r} \tag{1}$$

where **r** is a vector given by spheric coordinates  $\mathbf{r} = [r, \varphi, \theta]^{\mathsf{T}}$ , pointing to the receiving antenna, and  $\alpha(\varphi, \theta, f)$  depends on the transmitting antenna used and the power delivered by it.

The average power in the same point is given by the average Poynting's vector

$$\langle \mathcal{S} \rangle = \frac{e^2}{\eta} = \frac{eirp}{4\pi r^2} \tag{2}$$

where  $\eta$  is the medium characteristic impedance (120 $\pi$  in free space) and we made use of the definition of  $eirp = p_t'g_t$ , where  $p_t'$  is the delivered power to the antenna and  $g_t$  its isotropic gain. And here  $e^2 = e_{ms}^2 = e_{mox}^2/2$ .

Through the course, when needed, we will used lower case letters to denote magnitudes in natural units and capital letters to denote magnitudes in decibels).

eirp: equivalent isotropic radiated power (eirp), pire in Spanish

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## Friis

 $\blacksquare$  The received power, the power delivered by the receiving antenna, is the product of  $\langle \mathcal{S} \rangle$  by its effective area

$$p_{r}' = \langle \mathcal{S} \rangle S_{eq} = \langle \mathcal{S} \rangle \frac{\lambda^{2}}{4\pi} g_{r} = \frac{eirp(\varphi_{t}, \theta_{t})}{4\pi r^{2}} \frac{\lambda^{2}}{4\pi} g_{r}(\varphi_{r}, \theta_{r}) = eirp(\varphi_{t}, \theta_{t}) \frac{1}{I_{hf}} g_{r}(\varphi_{r}, \theta_{r})$$
(3)

• This expression, in dB, leads to the well-known Friis formula

$$P'_r(dBm) = EIRP(dBm) - L_{bf}(dB) + G_r(dB).$$
(4)

where  $L_{bf}$  are the *basic free space (bf) losses*, and  $G_t$ ,  $G_R$  are the gains of antennas (dB).

• The  $e_b/n_0$  received is a function of the power of the envelop,  $p_r$ , and the bit time,  $T_b$ 

$$e_b/n_0 = \frac{e_b}{n_0} = \frac{p_r I_b}{n_0} = \frac{p_r}{n_0 R_b} = \frac{p_r}{K T_0 f_s R_b}$$
 (5)

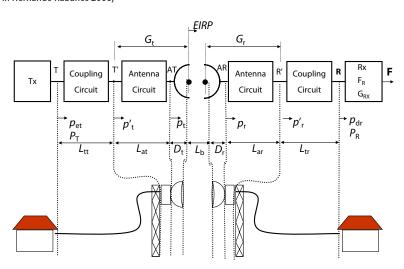
In dB, we get the sensitivity

$$P_r(dBm) \ge E_b/N_0(dBm) + F_s(dB) + 10\log(R_b) - 174(dBm/Hz)$$
 (6)

where K is the Boltzmann constant,  $T_0 = 290$  K is the *room* temperature,  $F_s$  is the noise figure of the system and  $E_h/N_0$  is given by the desired BER and the modulation used.

### **Notation**

As in Hernando Rábanos 2006,





## Simple flat LTI system

Most important to note that:

**1.**  $e(f,t,\mathbf{r})$  is the value at a given frequency, if we *define*,

$$H(f) \stackrel{\text{def}}{=} \frac{1}{\sqrt{2}} \frac{\alpha(\varphi, \theta, f) e^{-j2\pi fr/c}}{r}$$
 (7)

and 
$$e(f,t,\mathbf{r}) = \sqrt{2} \operatorname{Re}[H(f)e^{j2\pi ft}]$$

- **2.** the propagation in f.s. (free space) just introduces a loss of 1/r to the field and  $1/r^2$  to the power
- **3.** the antenna frequency response is almost flat in its frequency bandwidth
- **4.** there is a remarkable dependency on the antennas radiation patterns
- **5.** the antennas and propagation are considered to be lineal, so we can integrate over the frequency responses to get the overall powers, it is easy given the previous assumptions
- **6.** when computing  $\langle S \rangle$  we integrate over all transmitted frequencies, using  $e(f,t,\mathbf{r})$

#### LTI

The systems behaves as *linear and time invariant, LTI*: the received signal is built as a linear combination of delayed versions of the transmitted one and the weights of the linear combinations and the delays are constant through time.

### **Additional losses**

In propagation (f>100MHz) and fixed service we have additional constant in time losses to  $L_{bf}$  as follows

- 1.  $+L_a$  if the transmitting or/and receiving directions are not the maximum gain ones
- **2.**  $+L_a$  attenuation due to gasses, quite strong above 20 GHz
- **3.**  $+L_d$  diffraction losses (obstacles), above 20 GHz, *Line Of Sight* (LOS) is a necessary
- **4.**  $+L_{\nu}$  due to vegetation, similar to gases (as diffraction for large frequencies)
- **5.**  $+L_r$  due to *permanent* reflections, see *example of Flat Earth*. (Reflections may also provoke selective fading)

and also slow variant ones, so the system can be considered LTI

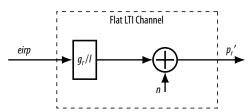
- **6.**  $+L_1$  due to rain, strong above 10 GHz
- those due to additional diffraction losses caused by variations on the refraction phenomena (grazing incidence).

#### Flat channel

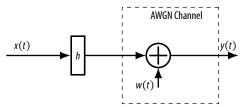
The received power can be written as  $p_r' = eirp \cdot g_r/I$ , where I depends on  $f_c$ , the carrier frequency, the distant  $r_c$ ... but It does not change for frequencies in the Tx bandwith.

#### Flat LTI model and AWGN channel

• From the power point of view, the model reduces to



• From the signal point of view,

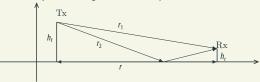


that it is equivalent to an AWGN channel: y(t)' = y(t)/h = x(t) + w'(t) with w'(t) = w(t)/h, and  $\sigma'_w^2 = \sigma_w^2/h^2$ , the variance of the noise.

#### Flat Earth

## Example: Flat Earth

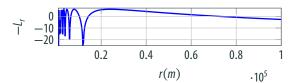
Also, we may have strong fixed reflected path



• The effect is a loss,  $+L_r$ , for  $r \ge 12h_th_r/\lambda$ , proportional to  $r^4$ 

$$L_{bf} + L_r = 40 \log(r \text{ (km)}) - 20 \log(h_t h_r) + 120$$
(8)

Flat Earth, 
$$R = -1$$
,  $h_t = 30$ ,  $h_r = 20$ ,  $\lambda = 0.1$ 



## A generalized model: Loss exponent

• An extended expression for the loss is as follows,

$$L = 10\log(kd^n) \tag{9}$$

where *n* is the so called, loss exponent, and *k* models all constant losses

- ▶ Propagation models for flat losses can be rewritten using this simple formula: n = 2 in f.s., n = 4 in flat Earth, 3 < n < 5 in urban areas
- ▶ Empirical methods such as the Okumura-Hata can be rewritten in this form
- The models: free-space plus additional losses, loss exponent model, empirical approaches such as
  - 1. Okumura-Hata
  - 2. Cost 231
  - 3. ITU-R P.1546
  - 4. Longley-Rice

or the point to point software analysis provide a mean value for the losses, do not explain

- ► variations along distance (not due to *r*)
- variations along frequency
- ▶ variations along time (moving or not)
- a log-normal model can be assumed to explain variations around the mean value

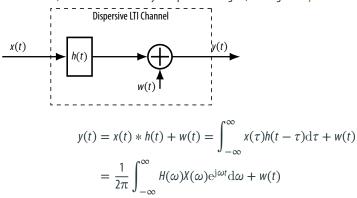
## Questions

- **1.** A flat channel is denoted as flat because
  - a) the earth below the propagation is flat
  - b) the frequency response is flat
  - c) the impulsive response is flat
- 2. In a radio flat channel in free space
  - a) the received field decreases with the square of the distance
  - b) the received field decreases with the distance
  - c) the received field decreases with the distance, but the dependence depends on the scenario
- 3. In flat earth
  - a) the received field decreases with the square of the distance
  - b) the received field decreases with the distance
  - c) the received field decreases with the cube of the distance
- 4. In a radio flat channel
  - a) the final BER depends on the distance, antennas, transmitted power and propagation losses
  - b) the final BER depends on the noise figure of the receiver and the throughput
  - c) both answers are correct

# Dispersive/Selective channel

## **Dispersive/Selective channel**

- Whenever multi-path is present, we may have a channel frequency response changing with frequency
- If the modulation bandwidth, W, is large enough, one frequency components experience a different attenuation than another: selective channel
- In time, we have a sum of delayed copies of the signal, causing ISI: dispersive channel



## Static two ray model: frequency response

#### Two ray model

The channel impulse response yields

$$h(t) = a(\delta(t) + b\delta(t - \tau_1)), -1 < a, b < 1$$
 (10)

with frequency response  $H(\omega) = a[1 + be^{-j\omega\tau_1}]$  with module

$$10 \log |H(\omega)|^2 = 10 \log(a^2[1 + b^2 - 2|b|\cos(\omega\tau_1 - \omega_0\tau_1)]), \ |\omega_0\tau_1| = \begin{cases} 0, \ b < 0 \\ \pi, b > 0 \end{cases}$$

Nulls at *notches* with period  $1/\tau_1$ , with maximum null for b=1

## **Channel Frequency Response**

#### **Channel Frequency Response**

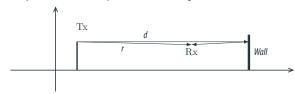
 Observe selectiveness and dispersion. Try changing b, its module, sign and delay. What is the effect of changing a?

```
close all; clear all; rng(30)
Nfft=2048;U=1/sqrt(Nfft)*exp(-1j*2*pi*([0:Nfft-1]')*([0:Nfft-1])/Nfft);%DFT matrix
%% Channel
a=1;b=+0.8;
h=a*[1,0,0,0,0,b,0,0,0]; L=10; %L:channel length;
%% Filtering, using DFT
ht=U*[h'; zeros(Nfft-L,1)]; %DFT of channel

%% Representation
Tm = 1e-6/5; %tau=Tm*5=1e-6
T = 1e-3;
Ht = 20*log10(abs(ht));
figure(1),plot([1:Nfft]/Nfft*1/Tm,20*log10(abs(ht))), grid on, hold on,
plot(ones(1,2)*(1/(2*T)),[min(Ht),max(Ht)],'--k')
title('Channel Frequency Response'), xlabel('Hz'), legend('a[\delta(t)+b\delta(t-\tau)]','h''W')
```

## Reflection on a wall: response along distance

• In time, the two ray model can be analyzed in the following reflection scenario,



• if we assume the receive antenna to be omnidirectional in the horizontal plane, and the reflection coefficient to be R=-1, the received electric field yields

$$e(f,t,r) = \frac{\alpha(f)\cos(2\pi f(t-r/c))}{r} - \frac{\alpha(f)\cos(2\pi f(t-(2d-r)/c))}{2d-r}$$
(11)

• the phase difference is as follows, with peaks for e(f,t,r) at multiples of  $2\pi$  and valleys (nulls) for odd multiples of  $\pi$ 

$$\Delta\theta = \left(\frac{2\pi f(2d-r)}{c} + \pi\right) - \left(\frac{2\pi fr}{c}\right) = \frac{4\pi f}{c}(d-r) + \pi = \frac{4\pi}{\lambda}(d-r) + \pi \quad (12)$$

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• The  $\Delta r$  that makes  $\Delta \theta$  vary  $\pi$  (peak to a valley) is the *coherence distance*,

## Coherence distance, $\Delta r$ : $\Delta \theta' = \Delta \theta + \pi$

$$\Delta r \stackrel{\text{def}}{=} \frac{\lambda}{4} \tag{13}$$

• As a function of f the distance between a peak to a valley is given by a change in f, make  $f' = f + \Delta f$ , and estimate  $\Delta f$  such that  $\Delta \theta' = \Delta \theta + \pi$ ,

$$\Delta f = \frac{1}{2} \left( \frac{2d - r}{c} - \frac{r}{c} \right)^{-1} = \frac{c}{4(d - r)} \tag{14}$$

being the delay spread

#### Delay Spread: $T_d$

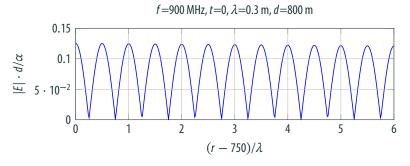
$$T_d \stackrel{\text{def}}{=} \frac{2d-r}{\epsilon} - \frac{r}{\epsilon} = 2 \frac{d-r}{\epsilon} \tag{15}$$

the difference between the propagation delay along the two paths and

#### Coherence bandwidth: W.

$$W_c \stackrel{\text{def}}{=} 1/(2I_d) = \Delta f \tag{16}$$

- This model, for a given distance *r* has equal frequency response as the static two ray model.
  - The coherence bandwidth is the inverse of the delay spread: we have nulls in frequency every  $1/I_d=1/ au$
- The interesting point now is to analyze the variation with the position r How would the field change if I were at some other points?



## **Approximation**

• We can approximate the summation of the two sinusoids (Tse pp.17):

$$e(f,t,r) = \frac{\alpha(f)\cos(2\pi f(t-r/c))}{r} - \frac{\alpha(f)\cos(2\pi f(t-(2d-r)/c))}{2d-r}$$
(17)

We first recall that

$$\cos(u) - \cos(v) = -2\sin\left(\frac{u-v}{2}\right)\sin\left(\frac{u+v}{2}\right)$$
 (18)

- Then in the denominator we assume  $r \approx 2d r$ , i.e. we are near the wall, and for simplicity denote  $\alpha(f) = \alpha$
- And approximate

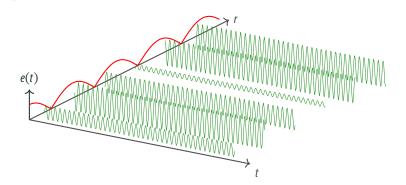
$$e(f,t,r) = -\frac{2\alpha\sin(2\pi f(d-r)/c)\sin(2\pi f(t-d/c))}{r}$$
(19)

where we have the carrier multiplied by amplitude  $2\alpha \sin(2\pi(d-r)/\lambda)/r$ 

## LTI Channel in a wall reflection: representation

At every distance we receive a sinusoidal form whose amplitude depends on the distance: the distance between a maximum and minimum amplitud value is  $\lambda/4$ 

- red:  $2\alpha \sin(2\pi(d-r)/\lambda)/r$
- ► the module is depicted • green:  $\operatorname{red} \cdot \sin(2\pi f(t - d/c))$



#### **Example: Fixed Service**

- In fixed point to point we have atmospheric multi path, called scattering, due to reflections on atmospheric layers
- This effect grows with frequency and approximately the cube of the distance,  $r^3$
- The channel is modeled as a two components:
- **1.** flat fading, can be seen as a AWGN channel where the  $E_h/N_0$  varies slowly with time
- 2. selective/fading, that vanishes as the bandwidth decreases; it must be modeled as a LTI system with ISI that varies slowly with time

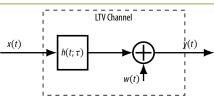
#### Exercise: delay spread

Consider a channel where the largest path has no more than double the length of the shortest one, compute the delay spread, and the coherence bandwidth, if

- 1. the shortest path has 30 km
- 2. the shortest path has 3 km
- 3. the shortest path has 3 m

LTV and Doppler channels

## Linear time variant channel (LTV)



The response depends on time t. At any  $t = t_0$ , we have a different channel impulse  $h(t; t_0)$ 

$$y(t) = x(t) * h(t;t_0) + w(t) = \int_{-\infty}^{\infty} x(\tau)h(t-\tau;t_0)d\tau + w(t)$$
 (20)

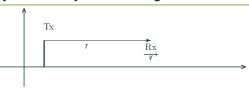
$$y(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} H(\omega; t_0) X(\omega) e^{j\omega t} d\omega + w(t)$$
 (21)

We assume that the channel is under spread

#### under spread

An LTV channel is *under spread* if the channel can be considered LTI during a time larger than the channel response in  $\tau$ , i.e. its delay spread.

## Doppler: free space, moving antenna



• If the receiver antenna moves away the transmitter with velocity v and  $r(t) = r_0 + vt$ , the delay changes from r/c to  $(r_0 + vt)/c$ , and (1) yields,

$$e(f,t,r_0+vt) = \frac{\alpha(f)\cos(2\pi f(t-r_0/c-vt/c))}{r_0+vt}$$
(22)

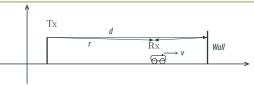
- Note that as the antenna moves, the variations on the phase in the numerator are quite fast compared to the effect in the denominator
- ▶ By rewriting  $f(t r_0/c vt/c)$  =  $f[(1 v/c)t r_0/c]$
- It follows

$$e(f,t,r_0 + vt) = \frac{\alpha(f)\cos(2\pi f[(1 - v/c)t - r_0/c])}{r_0 + vt}$$
(23)

where we observe frequency deviation, a *Doppler shift*, of  $-fv/c = -v/\lambda$ 

It cannot be modeled as linear time invariant.

## Doppler and multipath: moving antenna and wall reflection



We have the same case that in (11) but with a frequency variation due to the doppler effect, described in (22): combining both equations:

$$\begin{split} e(f,t,r_0+vt) &= \frac{\alpha(f)\cos(2\pi f[(1-v/c)t-r_0/c])}{r_0+vt} \\ &- \frac{\alpha(f)\cos(2\pi f[(1+v/c)t-(2d-r_0)/c])}{2d-r_0-vt} \end{split}$$

- ightharpoonup assume we are near the wall, so  $r_0 + vt \approx 2d r_0 vt$  in the denominator and we can sum the numerators:
- It follows

$$e(f,t,r_0+vt) \approx -\frac{2\alpha(f)\sin(2\pi f[-vt/c+(d-r_0)/c])\sin(2\pi f[t-d/c])}{r_0+vt}$$
 (24)

## Doppler spread in the wall scenario

- We add two sinusoids
  - ► The first one has as Doppler shift of  $D_1 = -fv/c$ ,
  - ► The second one has a Doppler shift of  $D_2 = fv/c$
  - ► The overall Doppler is  $D_s = D_2 D_1 = 2fv/c$
  - For f = 900 MHz and v = 60 km/h we have  $D_c = 100$  Hz

#### Doppler Spread: D<sub>s</sub>

$$D_{s} \stackrel{\text{def}}{=} D_{2} - D_{1} \tag{25}$$

- that can be rewritten as the product of two sinusoids, one of frequency D<sub>s</sub>/2 and the other with the
  original frequency f
- the effect can be seen as a modulation of the carrier by a sinusoid of Doppler frequency: we have a fading every  $1/D_c$  seconds!!. From (24),

$$2\pi f v \Delta t/c = \pi \Rightarrow \Delta t = \frac{c}{2f v} = \frac{1}{D_s}$$

Note that in space,  $\Delta r = v\Delta t = \lambda/2$ .

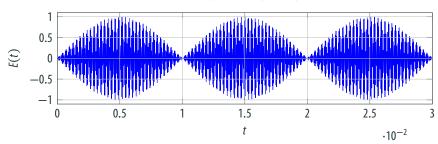
## Fading due to Doppler in the wall scenario

### Coherence time: $T_c$

$$T_c \stackrel{\text{def}}{=} 1/(4D_s) \tag{26}$$

- While moving we may have fading due to
  - **1.** Multi path+Doppler effect, with significant variations of the order of ms  $(T_c)$ , or  $\lambda/4$  m  $(\Delta r)$ .
    - Same coherence distance than in the LTI case!!
  - Shadowing effect, the obstacles in the environment change causing fading, of the order of s or m: large scale.

$$f$$
=900 MHz,  $v$ =60 km/h,  $d$ =800,  $r$ =750



## Two ray impulse response of the moving Rx and wall

- The scenario can be modeled with an LTV system given in (20) with response  $h(t; t_0)$ ,
  - but where the  $h(t; t_0)$  is given by deltas delayed  $\tau_i(t_0)$  and values  $a_i(t_0)$  that vary with time
  - ▶ and the integral yields a sum

$$y(t) = \sum_{i} a_{i}(t_{0})x(t - \tau_{i}(t_{0}))$$
 (27)

In the wall case we have two deltas with values

$$a_{1}(t) = \frac{|\alpha(f)|}{r_{0} + vt} \qquad a_{2}(t) = \frac{|\alpha(f)|}{2d - r_{0} - vt}$$

$$\tau_{1}(t) = \frac{r_{0} + vt}{\epsilon} \qquad \tau_{2}(t) = \frac{2d - r_{0} - vt}{\epsilon} - \frac{\pi}{2\pi f}$$

- The doppler effect is not readily seen in this representation
  - ▶ In the table above, the delay for a path is changing with

$$\frac{d\tau_i(t)}{dt} = \tau_i'(t) \Rightarrow \tau_1'(t) = v/c \Rightarrow \Delta\tau_1(t) = \tau_1'(t)t \tag{28}$$

the Doppler shift can be rewritten as

$$-f\tau_i'(t) \tag{29}$$

## Impulse response of $\ensuremath{\mathcal{N}}$ rays in a moving channel

• If we model the multi path channel by several rays, from i=1 to i=N, and consider a moving Rx, we have similar definitions, for a carrier frequency  $f_c$ ,

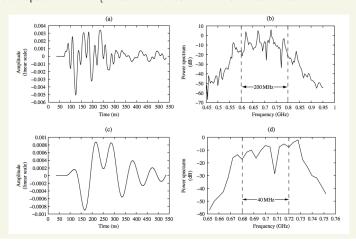
#### Moving LTV

- ▶ Doppler Spread:  $D_s \stackrel{\text{def}}{=} \max_{i,j} f_c |\tau_i'(t) \tau_i'(t)|$
- ightharpoonup Coherence time:  $T_c=rac{1}{4D_s}$
- ▶ Delay Spread:  $I_d \stackrel{\text{def}}{=} \max_{i,j} |\tau_i(t) \tau_i(t)|$
- ► Coherence Bandwidth:  $W_c = \frac{1}{2T_d}$
- ▶ Underspread Channel : if  $T_c >> T_d$

## Example: a moving multi path channel

#### Frequency selective

We show a bandpass channel for  $f_c = 0.7$  GHz for 200 MHz and 40 MHz bandwidth



## Example: a moving multi path channel

#### Example of values

Key channel parameters and time-scales	Symbol	Representative values
Carrier frequency	$f_{ m c}$	1 GHz
Communication bandwidth	W	1 MHz
Distance between transmitter and receiver	d	1 km
Velocity of mobile	v	64 km/h
Doppler shift for a path	$D = f_c v/c$	50 Hz
Doppler spread of paths corresponding to		
a tap	$D_{\rm s}$	100 Hz
Time-scale for change of path amplitude	d/v	1 minute
Time-scale for change of path phase	1/(4D)	5 ms
Time-scale for a path to move over a tap	c/(vW)	20 s
Coherence time	$T_{c} = 1/(4D_{s})$	2.5 ms
Delay spread	$T_{\rm d}$	1 μs
Coherence bandwidth	$W_{c} = 1/(2T_{d})$	500 kHz

## Types of wireless channels

#### Types of wireless channels

Types of channel	Defining characteristic	
Fast fading	$T_c <<$ delay requirement	
Slow fading	$T_c >>$ delay requirement	
Flat fading	$W \ll W_c$	
Frequency-selective fading	$W >> W_c$	
Underspread	$T_d \ll T_c$	

The delay requirement depends on the transmission, it may be

- the frame length
- the burst length
- · ...

#### Important: wall example

In the wall examples above we did transmit a tone of amplitude  $\alpha(f)$ . If a signal is transmitted instead, we must include the dependence with time in the  $\alpha(f,t)$  term.

## Questions

- **5.** In an under spread channel
  - a) we have just a few multi paths
  - b) we have uniform (equidistant in time) multi path
  - c) the difference, in time, between the last and first multi path is lower than the coherence time
- **6.** In a fast fading channel
  - a) the multi paths delays are changing fast
  - b) the multi paths amplitudes are changing fast
  - c) the channel changes faster than the delay requirement
- 7. In a frequency selective fading
  - a) at least two frequencies have different attenuation
  - b) the channel frequency response changes significantly within the used bandwidth
  - c) the coherence bandwidth is wider than the used bandwidth
- 8. A frequency selective fading is caused by
  - a) the transmitter and/or receiver moving
  - b) just one path in the propagation between transmitter and receiver
  - c) more than one path in the propagation between transmitter and receiver

#### **Excersises**

# Exercise 5.1 (Wall reflection LTI)

Given a radio transmission of a sinusoid at frequency f = 900 MHz, this signal gets the receiver at a distance 750 m. The transmitter power is 1 W, the transmitter (Tx) is omnidirectional with gain 10 dBi and it is assumed it transmits with this gain into the direction of the receiver (Rx). The receiver antennas is isotropic

- a) Compute the received field in the surroundings of the Rx, and the value of  $\alpha$  in (1)
- b) If a wall, at 800 m from the Tx in the direction Tx-Rx reflects the transmitted signal with coefficient -1, compute the amplitude of the field from 750 to 750  $+6\lambda$  meters. Hint: use Equation (2.13) in Tse and Vis. with v=0, t=0 and changing distance, r.
- c) In the previous scenario compute the signal along t at 750, at 750  $+ \lambda/8$  and 750  $+ \lambda/4$ , and its Fourier transform. For the Fourier transform you may read the documentation and use fftshift. For example

```
f=1e9; Tm=1/f/20; fm=1/Tm; %,carrier, sampling time and frequency
t=[0:Tm:200/f]; %observed time period
y= 2*cos(2*pi*f*t);
L=length(t); Nfft = 4*1024;
Y = fftshift(fft(y,Nfft)/L);
fq = fm/2*linspace(-Nfft/2,Nfft/2-1,Nfft)/(Nfft/2);
figure, plot(fq,abs(Y),'r')
```

#### **Exercises**

#### Exercise 5.2 (Wall reflection LTV)

In the same scenario than in the previous excercise the Rx moves towards the wall at a constant speed v = 50 km/h.

- a) Compute the averaged received field in the surrounds of the Rx
- b) Compute the Fourier transform

# Equivalent discrete-time lowpass channel model

# **Equivalent lowpass signal model (Review)**

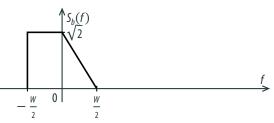
We define

$$S_b(f) \stackrel{\text{def}}{=} \sqrt{2}S_+(f + f_c)$$

• We can reconstruct S(f) and s(t) from  $S_b(f)$ 

$$S(f) = \frac{1}{\sqrt{2}} \left( S_b(f - f_c) + S_b^*(-f - f_c) \right)$$

$$S(t) = \frac{1}{\sqrt{2}} \left( S_b(t) e^{j2\pi f_c t} + S_b^*(t) e^{-j2\pi f_c t} \right) = \sqrt{2} \operatorname{Re} \left[ S_b(t) e^{j2\pi f_c t} \right]$$



Note: the following transforms are used:  $s^*(t) \longleftrightarrow S^*(-f)$  and  $s(t)e^{j2\pi f_c t} \longleftrightarrow S(f-f_c)$ .

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# Step 1. Channel lowpass equivalent model

 We can rewrite the channel model to lowpass equivalent, given N multi paths and the bandpass signal

$$y(t) = \sum_{i=1}^{N} a_i(t)x(t - \tau_i(t))$$

$$= \sum_{i=1}^{N} a_i(t)\sqrt{2} \operatorname{Re}[x_b(t - \tau_i(t))e^{j2\pi f_c(t - \tau_i(t))}]$$

$$= \sqrt{2} \operatorname{Re}\left[\left\{\sum_{i=1}^{N} a_i(t)e^{-j2\pi f_c\tau_i(t)}x_b(t - \tau_i(t))\right\}e^{j2\pi f_ct}\right]$$

• by comparison with  $y(t) = \sqrt{2} \operatorname{Re} \left[ y_b(t) \mathrm{e}^{\mathrm{j} 2\pi f_c t} \right]$ 

$$y_b(t) = \sum_{i=1}^{N} a_i^b(t) x_b(t - \tau_i(t)); \text{ where: } a_i^b(t) \stackrel{\text{def}}{=} a_i(t) e^{-j2\pi f_c \tau_i(t)},$$
(30)

and we may define: 
$$h_b(\tau;t) = \sum_{i=1}^{N} a_i^b(t) \delta(\tau - \tau_i(t))$$
 (31)

# Step 2. Discrete-time equivalent lowpass channel model

# Discrete-time lowpass equivalent

To get a sampled version,  $x_h[m]$ , of the lowpass equivalent signal we

- **1.** filter with lowpass filter of width W/2: to get  $x_h(t)$
- **2.** sample at rate  $T_m = T = 1/W$ :  $x_h[m] = x_h(m/W)$ 
  - $x_b(t)$  yields, by the Nyquist–Shannon sampling theorem, with  $\operatorname{Sinc}(t) = \sin(\pi t)/\pi t$ ,

$$x_b(t) = \sum_{m} x_b[m] \operatorname{Sinc}(t/T_m - m)$$
(32)

After the channel, using the discrete-time lowpass channel model, we have

$$y_b[m] = \sum_{l=1}^{L} h_b[l; m] x_b[m-l]$$
 (33)

for the sake of simplicity we will denote  $h_l[m] = h_b[l;m]$  and  $y[m] = y_b[m]$ , where, as explained in the following slide,

$$h_b[l;m] \stackrel{\text{def}}{=} h_l[m] = \sum_{i=1}^{N} a_i^b[m] \text{Sinc}[l - \tau_i[m]/T_m]$$
 (34)

# Notes on discrete samples of the channel

• From (30), (31) and the sampling theorem

$$\begin{split} y_b(t) &= \sum_{i=1}^N x_b(t) a_i^b(t) \delta(t-\tau_i(t)) = \sum_{i=1}^N \Biggl(\sum_n x[n] \mathrm{Sinc}(Wt-n) \Biggr) a_i^b(t) \delta(t-\tau_i(t)) \\ y_b(t) &= \sum_n x[n] \sum_{i=1}^N a_i^b(t) \mathrm{Sinc}(Wt-\tau_i(t)W-n) \end{split}$$

• The samples at multiples of  $T_m = 1/W$ ,  $y[m] \stackrel{\text{def}}{=} y_h(m/W)$ 

$$y[m] = \sum_{n} x[n] \sum_{i=1}^{N} a_i^b(m/W) \text{Sinc}[m - n - \tau_i(m/W)W]$$
 (35)

■ Let  $I \stackrel{\text{def}}{=} m - n$ , then

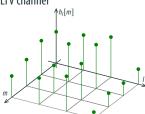
$$y[m] = \sum_{l} x[m-l] \sum_{i=1}^{N} a_i^b(m/W) \text{Sinc}[l - \tau_i(m/W)W]$$
 (36)

and we define

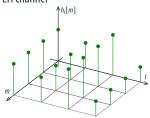
$$h_{l}[m] \stackrel{\text{def}}{=} \sum_{i=1}^{N} a_{i}^{b}(m/W) \operatorname{Sinc}[I - \tau_{i}(m/W)W]$$
(37)

# Channel

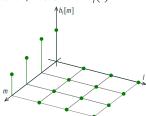
LTV channel



LTI channel



• Case  $1/W >> \max \tau_i(t)$ 



# Discrete low pass equivalent model

- As the Rx moves the delay spread changes
  - when the Rx moves a distance  $\Delta r = c \cdot T_m = c/W$  the path moves from one tap to the next one (equivalently we have  $\Delta \tau = \Delta r/c$  equal to the sampling time, 1/W).
- ▶ this is the *time-scale for a path to change over a tap*
- As the Rx moves the path phase changes
  - $\blacktriangleright$  when the distance shift,  $\Delta r$ , is  $\lambda/4$  the phase difference changes  $\pi$
  - since  $\Delta r = v \Delta t$ , we conclude  $\Delta r = \lambda/4 = v \Delta t \Rightarrow \Delta t = \lambda/(4v) = 1/(4D)$
  - ▶ this is the *time-scale for change of path phase*

#### Task 2.2: discrete equivalent low-pass model

Rewrite the equations for the discrete equivalent low-pass model for the LTI scenario.

#### Task 2.3: discrete equivalent low-pass model

Determine and represent the discrete equivalent low-pass model at time  $t=4\,\mathrm{s}$  of the channel given by

$$h(t;\tau) = a_1(t)\delta(t - \tau_1(t)) + a_2(t)\delta(t - \tau_2(t))$$
(38)

if 
$$a_1(4) = 1$$
,  $a_2(4) = -0.5$ ,  $\tau_1(4) = 0$   $\mu$ s,  $\tau_2(4) = 2$   $\mu$ s,  $f_c = 900$  MHz and  $W = 1$  MHz.

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# AWGN; Degree of Freedom

- When AWGN noise is present we may easily model it by either
  - adding a noise of power N<sub>0</sub>, CN(0, N<sub>0</sub>), (complex-valued Gaussian) to the equivalent lowpass signal model.
  - **2.** adding two iid noises of power  $N_0/2$ ,  $\mathcal{N}(0, N_0/2)$  to the real (in phase) part of the equivalent lowpass signal model and the imaginary part (in quadrature)
- Degrees of Freedom

## Degree of freedom

Every 1/W we transmit a (complex) symbol: we say that it represents one (complex) dimension or degree of freedom

- ▶ A continuous-time band-limited signal can be represented by *W* complex *dimensions* per second
- The received signal y(t) is also, due to the channel, band-limited to approximately W and has W
  dimensions per second
  - We have also Doppler effect
- ▶ We say that the (received) signal space has dimension the dimension or degrees of freedom of the channel

**Stochastic Channel Models** 

# Motivation and Introduction

- Motivation
  - ▶ Real channels are not deterministic: they do not have a given known channel response
  - Even point-to-point radio links change greatly with time
  - ► We need to provide an statistical characterization
  - ► This allows to design, simulate, implement and test
- Introduction
  - If the channel is given by just one time-invariant tap (i.e. is flat LTI) we may characterize it by a random variable (r.v.)
  - However, if the tap changes with time or we have several taps, we need random processes (r.p.) to characterize the channel
- One tap is computed as the contributions of every multipath to that sample time: Gaussian
  approximations are good for one tap...

# **Review: Complex valued random variables**

- A complex random variable  $W = W_r + j W_j$ , can be seen as a vector of two variables  $W_{\mathbb{R}} = [W_r, W_i]^{\mathsf{T}}$  described statistically by its joint pdf.
- In complex-valued AWGN channels the real and imaginary parts are zero-mean and independent of variance  $N_0/2$ 
  - ► In this case the Gaussian rv it is said to be circular
- A complex-valued AWGN is usually denoted as

### Gaussian complex random variable

$$W = W_{\rm r} + j W_{\rm i} \sim \mathcal{CN}(0,N_0,0)$$
 where

$$W_{\rm r} \sim \mathcal{N}(0, N_0/2),$$
  
 $W_{\rm j} \sim \mathcal{N}(0, N_0/2),$  (39)

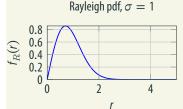
- Note that the variance is double of the one of the real, or imaginary, part
- The extension to multidimensional complex-valued AWGN is straight-forward  $W = W_r + j W_i \sim \mathcal{CN}(0,N_0 I_{W},0)$

# Complex valued random variable to model one tap

# Gaussian complex circular random variable

$$\begin{split} \boldsymbol{X}_{\mathrm{r}} &\sim \mathcal{N}\big(\mathbf{0}, \sigma_{\boldsymbol{X}}^2/2\big), \quad \boldsymbol{X}_{\mathrm{j}} &\sim \mathcal{N}\big(\mathbf{0}, \sigma_{\boldsymbol{X}}^2/2\big) \\ \boldsymbol{X} &= \boldsymbol{X}_{\mathrm{r}} + \mathrm{j}\boldsymbol{X}_{\mathrm{j}} \sim \mathcal{C}\mathcal{N}\big(\mathbf{0}, \sigma_{\boldsymbol{X}}^2\big) \end{split}$$

- If we transform  $[X_{\mathbf{r}}, X_{\mathbf{i}}]^{\mathsf{T}}$  into polar coordinates  $[|X|, \angle X]^{\mathsf{T}}$ 
  - $\triangleright$   $\angle X$  is a uniform v.a. in  $[0,2\pi]$
  - ▶ R = |X| is a Rayleigh r.v. with pdf  $f_R(r) = \frac{2r}{\sigma^2} e^{\frac{-r^2}{\sigma^2}} \sim Rayleigh(\sigma/\sqrt{2})$ .



Mode	σ
Median	$\sigma\sqrt{2\ln 2}=1.18\sigma$
Mean	$\sigma\sqrt{\pi/2} = 1.25\sigma$
RMS value	$\sigma\sqrt{2} = 1.41\sigma$
Standard dev.	$\sigma\sqrt{2-\pi/2}=0.655\sigma$

- The power,  $P = |X|^2$ , is an exponential r.v.  $P \sim Exp(1/\sigma^2)$ .
- The sum of the power of *standard* Gaussian r.v. is chi-squared distributed.
- The sum of the power of zero mean Gaussian r.v. is Gamma distributed.

# Rayleigh (NLOS) and Rician (LOS)

• The channel in the discrete-time lowpass model yields a set of L taps

$$h_{l}[m] = \sum a_{i}(m/W)e^{-j2\pi f_{c}\tau_{i}(m/W)}\operatorname{Sinc}[l - \tau_{i}(m/W)W]$$
(40)

- 1. Rayleigh channel (NLOS)
  - ▶ if no path is clearly stronger than the others: we have *non line-of-sight (NLOS)*
  - each tap  $h_l[m]$  can be modeled as  $\mathcal{CN}(0, \sigma_l^2)$ , here the module is Rayleigh distributed and its phase is uniform in  $[0,2\pi]$
  - ▶ this way we model several random paths contributing to one tap
- 2. Rician channel (LOS)
  - If one path is stronger than the other, the so-called specular path, we are modeling a LOS scenario, at least one of the taps is as follows,

$$h_{l}[m] = \sqrt{\frac{\kappa}{\kappa + 1}} \sigma_{l} e^{j\theta} + \sqrt{\frac{1}{\kappa + 1}} s$$
 (41)

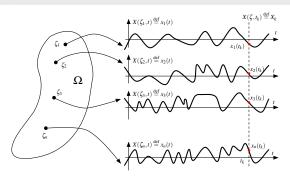
where  $\Theta$  is a r.v. distributed uniformly between 0 and  $2\pi$  and  $S \sim \mathcal{CN}(0, \sigma_l^2)$ , and  $\kappa$ , the K factor, adjusts the overall power,  $\sigma_l^2$ , distribution.

▶ the Rician pdf can be written using Bessels functions.

## **Review: Random Process**

### Process

- **1.** A *random process* (r.p.) X(t) can be seen a sequence of random variables where each outcome is a *sample function*.
  - $\blacktriangleright$  We use x[k] for a sample function in the discrete case.
- **2.** In a random process X(a),  $a \in \mathcal{T}$ , is a family of indexed r.v.  $\mathcal{T}$  represents the set of indexes and  $X(a) \equiv X_a$  the associated r.v.



# **Review: Random process**

- We have to specify
  - **1.** the statistical description of the r.p. at any given time, t: the pdf/pmf of a X(t)
  - **2.** the statistical description of the relation between a r.v. at a given time, X(t), and any other r.v. at other time,  $X(t + \Delta t)$ ,  $\forall \Delta t$ .

In the continuous r.v. discrete time case, we have to specify the joint probability density function  $f_{X_1X_2...X_n}(x_1x_2...x_n) \stackrel{\text{def}}{=} f_{\boldsymbol{X}}(\boldsymbol{x})$  for all indexes in  $\mathcal{T}$ ,  $n = |\mathcal{T}|$ .

- This is a formidable task in the general case: we may limit the random process by imposing some constraints, in the hope they model the real systems:
  - 1. Stationary: if we assume first that
    - the statistical description of all r.v., x[k] in the discrete case, at any time and  $\forall k$ , is the same one. We have  $f_{X(k)}(\mathbf{x}(k)) = f_{X(k+\tau)}(\mathbf{x}(k+\tau)) \qquad \forall \tau, k, n$
    - o accordingly the relation between two samples of the sample function, x[k] and x[l], only depends on the distance between samples d = k l.
  - **2.** Stationary in wide sense (WSS): in practice we only focus on the stationary of the mean and covariance

# **Review: Random process**

### Definition

A random process X[k] is *wide sense stationary* if and only if (iff):

- **1.**  $\mathbb{E}[X[k]] = m_X[k] = m_X$
- **2.**  $\mathbb{E}[X[k+\tau]X[k]] = R_X[k+\tau,k] = R_X[\tau]$

Given a stationary r.p. with  $X[k] \sim \mathcal{N}(m, \sigma^2)$  and  $R_X[\tau]$  we have a Gaussian random process.

$$R_X[0] = \sigma^2$$

Given a stationary r.p. with  $X[k] \sim \mathcal{N}(m, \sigma^2)$  and  $R_X[\tau \neq 0] = 0$  we have a *white Gaussian* random process. Used in many cases, e.g., to model noise.

- Note that if we have a finite set of indices, we have a vector of independent Gaussian r.v., it is said that
  the vector is a white Gaussian random vector.
- Note also that in this case, if m=0 and  $\sigma^2=1$ , n samples of a sample function, is distributed as a standard Gaussian.

# **Doubled time and frequency: auto-correlations**

- In our models we have two times axis
  - **1.** in continuous-time we have  $t,\tau$
  - **2.** in discrete-time we have *m,l* (Let us focus on the discrete-time case)
- In *m* we may define the *tap gain auto-correlation function*

$$R_{l}[\Delta m] \stackrel{\text{def}}{=} \mathbb{E}[h_{l}^{*}[m]h_{l}[m + \Delta m]] = \mathbb{E}[h_{l}^{*}[0]h_{l}[\Delta m]] \tag{42}$$

where we assume we have a *wide sense stationary (WSS)* process (in t or m)

- $\blacktriangleright$  as WSS, the response does not depends on time m, but on distance between times, $\Delta m$ .
- In / we might define the *power-delay profile (PDP)*

$$R_m[I,I+\Delta I] \stackrel{\mathrm{def}}{=} \mathbb{E}[h_I^*[m]h_{I+\Delta I}[m]] = \begin{cases} R_I[0] & \text{if } \Delta I = 0\\ 0 & \text{if } \Delta I \neq 0 \end{cases}$$

- we assume that  $h_I[m]$  and  $h_q[m']$  are independent r.v. for any  $I \neq q$  and m,m'.
- ▶ this assumption is denoted as *uncorrelated scattering (US)*

The overall resulting model is denoted as WSSUS

# **Further properties**

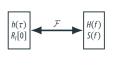
- Tap-gain autocorrelation function
  - ► This is the evolution of a tap along time. We expect that for times much shorter than the *coherence time*, *T*, the autocorrelation remains approximately constant
  - ▶ the coherence time can be also defined as the smallest value of  $\Delta m/W$  such that  $R_i[\Delta m]$  is statistically different from  $R_i[0]$
  - $\blacktriangleright$  the energy received in the *I*-th path is proportional to  $R_I[0]$
  - ▶ Its Fourier transform,  $S_l(\nu)$ , provides a notion of the variation along frequency  $\nu$ : in the moving channel is due to Doppler and measured through the Doppler spread,  $D_s$
- Power-delay profile (PDP)
  - ▶ the *multi path spread* can be defined as the smallest value L/W, such that  $\sum_{l=1}^{L} R_l[0]$  contains *most* of the total energy  $\sum_{l=1}^{\infty} R_l[0]$ : L is related to  $T_d$
  - ▶ it is not stationary:
    - o it cancels for I/W larger than the delay spread
    - o it may have different values for every / up to the delay spread

and we can not compute the Fourier transform of the autocorrelation

- we compute the Fourier transform,  $S_m(f)$ , of the sequence  $R_1[0]$ :  $R_1[0]$ ,  $R_2[0]$ ,  $R_3[0]$ , ...
- $\blacktriangleright$  these values are used to compute  $W_c$ , that it is related to  $T_d$

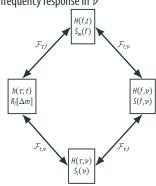
# Doubled time and frequency: deterministic and probabilistic

- In LTI systems we have time  $\tau$  or taps I, and its frequency response in f
  - ▶ No dependence with *m*



- Note that we
  - ▶ use h and H for deterministic models
  - ▶ use R and S for stochastics ones

 In LTV systems we have time τ or taps I, and its frequency response in f; but also the variation along time t or m, and the corresponding frequency response in v



# **Example: Clark's Model**

#### Clarke's Model (Description)

- The Clarke's model assumes that
  - 1. the transmitter is fixed and the receiver is moving at speed v
  - 2. the objects causing scattering are statics
  - 3. there are K paths, indexed with k = 1,...,K
  - **4.** in the simplest Clarke's model, each one coming from direction  $\theta=2\pi/k$ , with delay  $\tau_{\theta}$ , and equal amplitude  $a_{\theta}=a/\sqrt{K}$
  - 5. the total received power from all paths is  $a^2$
  - **6.** we also assume a *flat channel*,  $T_d < T = 1/W$
- The model yields

$$y(t) = \sum_{i=1}^{K} a_{\theta_i} x(t - \tau_{\theta_i}(t)) + w(t)$$
$$y[m] = h_0[m] x[m] + w[m]$$

# Clarke's Model (Solution)

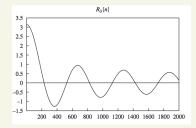
• if the phase of each path is iid and uniform in  $[0,2\pi]$  the tap  $h_0[m]$  is the sum of many small independent components

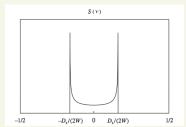
• we may model  $h_0[m]$  as a Gaussian stationary process with auto-correlation

$$R_0[n] = 2a^2 \pi J_0(n\pi D_s/W) \tag{43}$$

where

- **1.**  $J_0(x) = 1/\pi \int_0^{2\pi} e^{jx\theta} d\theta$  is the zeroth-order Bessel function of the first kind
- 2. its Fourier transform, the power spectral density, is given by ... see figure
- **3.** The time n/W at which  $R_0[n]=0.05R_0[0]$  is the coherence time  $T_c=\frac{J_0^{-1}(0.05)}{\pi D}$





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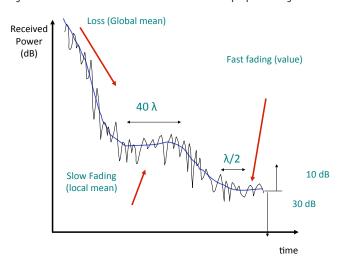
Fast (long-term) and slow (short-term) variations in a

moving channel

# **Fast and slow variations**

#### Given a traveling speed

- while the effect of diffraction (*shadowing*) evolves slowly with time
- the changes due to destructive and constructive sums of multiple path changes fast



# **Ouestions**

- 9. An equivalent discrete low-pass signal
  - a) is easier to model and simulate
  - b) is harder to model and simulate
  - c) can be computed just for analog modulations
- **10.** An equivalent discrete low-pass model for the channel
  - a) does not introduces inter symbol interference
  - b) may introduce inter symbol interference
  - c) cannot be computed because of the delays not being multiples of 1/W
- **11.** If we use a bandwidth *W* 
  - a) we have one degree of freedom per second
  - b) we have 1/W degrees of freedom per second
  - c) we have W degrees of freedom per second
- **12.** Slow variations in fading is caused by
  - a) shadowing
  - b) scattering
  - c) Doppler effect

Non AWGN and non linearity

## Non AWGN

- The noise added to the channel models above is additive white Gaussian noise.
- In some channels the noise may be non Gaussian and non white.
- Non Gaussian noise:
  - ▶ Impulse noise: we add to AWGN a noise, u[m], the product of a Bernouilli r.v., b[m], and a constant or another r.v. such as a Gaussian, v[m]

$$w[m] = u[m] + b[m]v[m]$$

$$(44)$$

hence w[n] is AWGN if b[m] = 0 and the sum of an AWGN and a given value or r.v. if b[m] = 1.

 Non white noise: the noise is non white stationary random process, that can be obtained by filtering AWGN

$$w[m] = u[m] * \psi[m] \tag{45}$$

where the filter response,  $\Psi(f)$ , the so called *noise shaping filter*, defines the frequency response of the noise.

#### DSL

In DSL the cable can be modeled as a LTI system with non white (coloured) noise.

# Non linear channels

- In the path from bits generation in the Tx to bits estimation in the Rx the system design aims at offering a *linear* channel
  - ► There are some frequency up and down converters, that are considered linear as long as they perfectly translate the central frequency
- However, amplifiers and converters exhibit high non linearity
  - ▶ Other elements such as connectors or antennas may exhibit some non-linearity
- The effect of non linearity in the low pass equivalent model is a deformation of the constellation: with different rotations and attenuations for every point
  - ▶ In general, constant envelop signals are more robust to non-linearity
    - O That is why 8-PSK is used in EDGE
- We may use a high back-off (BO) to ensure we work in the linear range, or some techniques as pre-distorters to linearize it by inverting the non linear response.

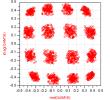
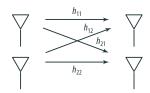


Figure by Agilent



# MIMO: Introduction

- Needs motivation? 3.5G, 4G, 5G mobile and WiFi already include them in the standards...
- We focus on a 2 × 2



- We have 4 channels where the output of each transmitted pair is added at each receiver antenna.
- We can apply every concept above to model this channel.
- For example, if flat, linear and invariant, we have a system model

$$\begin{bmatrix} y_1 \\ y_2 \end{bmatrix} = \begin{bmatrix} h_{11} & h_{12} \\ h_{21} & h_{22} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} + \begin{bmatrix} w_1 \\ w_2 \end{bmatrix}$$
 (46)

Or equivalently, if h<sub>1</sub> is the *i*-th column,

$$y = h_1 x_1 + h_2 x_2 + w = \mathbf{H} \mathbf{x} + \mathbf{w} \tag{47}$$

that it is widely used in MIMO systems.

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# Flat linear invariant MIMO

• Given  $N_t$  and  $N_r$  transmit and receive antennas, respectively, and a flat linear invariant MIMO channel

- ▶ what it is the impact of the MIMO system?
- *Multiplexing*: if  $N_t = N_r = N$  and matrix **H** is full rank (i.e. invertible) then we can sent N bits streams in parallel, in *SU-MIMO* (single user MIMO)
  - ▶ this is the *multiplexing gain*
  - ▶ the BER will depend on the  $E_b/N_0$ , that depends on the noise an the entries,  $h_{i,i}$ , of **H**.
  - ▶ for **H** to be invertible  $\Rightarrow$  different entries  $\Rightarrow$  *antennas must be far one from each other (in terms of \lambda)*
  - the detection problem is not straightforward, but one simple approach is multiply the observation y by H<sup>-1</sup>: inverse, canceller or zero-forcing detector
  - ▶ if **H** is known to the transmitter, we can easy the detection...*could you figure it out how?*
  - $\blacktriangleright$  if  $N_t \neq N_r$ , it can be concluded that at most  $\min(N_t, N_r)$  bit streams can be multiplexed.
- Diversity: we could decide not to multiplex to just improve the E<sub>b</sub>/N<sub>0</sub> at reception by combining the observations, in SU-MIMO.
- Beamforming: we could use the N<sub>t</sub> transmitting antennas to point the beam to given directions, where the users are, in MU-MIMO (multiuser-user MIMO)

MIMO can be used *either* to multiplex several throughputs, improve signal to noise ratio (diversity) *or* beamforming. But not all of them at the same time!

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#### **Exercises**

Exercise 1.3. Analysis of multipath fading Load series11.mat from Pérez Fontán and Mariño-Esperiña. It contais a two column signal. First column is time, second one is received power in dBm

load series11.mat

- a) Represent it
- b) What is it the mean of the received power in watts?
- c) Estimate the pdf of the received power in mW. Hint: you may choose part of the loaded vector, to avoid large computation times
- d) Repeat c) but with the peak voltage, if the impedance is 50 ohms
- e) Discuss if these fdp are similar to the Rayleigh, Rice or exponential fdp

#### **Exercises**

Exercise 1.4. Analysis of shadowing plus multipath fading, 2 GHz Load series 12.mat from Pérez Fontán and Mariño-Esperiña. It contais a twocolumn signal. First column is distance, second one is received power in dBm

```
load series12.mat
```

- a) Represent it
- b) Obtain the local mean of the received power averaging 40  $\lambda$  (average the voltage signal) and plot it on top of the received power. Discuss about the scattering/shadowing effect.
- c) Estimate the pdf of the received power in dBm and discuss which pdf could fit it.

Notes on the average: To average the signal the following code may be of help.

# Exercises

Exercise 1.5. Low pass equivalent multipath narrowband Clarke's model.

Suppose a Base Station (BS) located away from the origin, where the Rx is located. There is a fixed loss L due to free space propagation and other effects that are almost independent of the distance and speed, around the receiver. We assume we receive  $P_T' - L$  and compute  $P_T'$ , the received power just due to scattering. Hence, in addition to L we have multipath following the model of Clarke: K scattering objects around receiver uniformly placed in a ring. The amplitude of each one is  $a/\sqrt{K}$  and the overall fading a. a is the faded level of electric field (or voltage), modelled as Rayleigh.

Other data are: f = 2 GHz, v = 10 m/s (36 km/h), averaged received power -20 dBm, radius of the scatters 200 m, number of scatterers 1000.

The averaged received power is  $a^2$ . The receiver is moving along the x axis, the BS is placed at 1000 m from origin, at angle 135 degree.

Simulate the system and compute the envelope and angle of the received signal in the equivalent low pass model. Use the Project 511 from: [Pérez Fontán 2008].

Execute the code and try changing some parameters: frequency (100 MHz) and speed (3 km/h).

# Exercises

Exercise 1.6. ETSI TDT Channel Model. Given the channel model in ETSI EN 200 744 V1.5.1 (2004-11),

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ETSI EN 300 744 V1.5.1 (2004-11)

The performance of the system has been simulated with two channel models for fixed reception  $-F_1$  and portable reception  $-P_1$ , respectively.

The channel models have been generated from the following equations where x(t) and y(t) are input and output signals respectively:

a) Fixed reception F<sub>1</sub>:

$$y(t) = \frac{\rho_0 x(t) + \sum_{i=1}^{N} \rho_i e^{-j\theta_i} x(t - \tau_i)}{\sqrt{\sum_{i=0}^{N} {\rho_i}^2}}$$

where:

- the first term before the sum represents the line of sight ray;
  - N is the number of echoes equals to 20;
  - $\theta_i$  is the phase shift from scattering of the i'th path listed in table B.1;
- ρ<sub>i</sub> is the attenuation of the i'th path listed in table B.1;
- τ: is the relative delay of the i'th path listed in table B.1.

## Exercises

#### Exercise 1.6. (cont.) ETSI TDT Channel Model

The Ricean factor K (the ratio of the power of the direct path (the line of sight ray) to the reflected paths) is given as:

$$K = \frac{\rho_0^2}{\sum_{i=1}^{N} \rho_i^2}$$

In the simulations a Ricean factor K = 10 dB has been used. In this case:

$$\rho_o = \sqrt{10\sum_{i=1}^{N} {\rho_i}^2}$$

b) Portable reception, Rayleigh fading (P<sub>1</sub>):

$$y(t) = k \sum_{i=1}^{N} \rho_i e^{-j\theta_i} x(t - \tau_i)$$
 where  $k = \frac{1}{\sqrt{\sum_{i=1}^{N} \rho_i^2}}$ 

 $\theta_i$ ,  $\rho_i$  and  $\tau_i$  are given in table B.1.

#### **Exercises**

Exercise 1.6. (cont.) ETSITDT Channel Model

Table B.1: Relative power, phase and delay values for F<sub>1</sub> and P<sub>1</sub>

i	ρί	τ <sub>i</sub> [μs]	θ <sub>i</sub> [rad]
1	0,057 662	1,003 019	4,855 121
2	0,176 809	5,422 091	3,419 109
3	0,407 163	0,518 650	5,864 470
4	0,303 585	2,751 772	2,215 894
5	0,258 782	0,602 895	3,758 058
6	0,061 831	1,016 585	5,430 202
7	0,150 340	0,143 556	3,952 093
8	0,051 534	0,153 832	1,093 586
9	0,185 074	3,324 866	5,775 198
10	0,400 967	1,935 570	0,154 459
11	0,295 723	0,429 948	5,928 383
12	0,350 825	3,228 872	3,053 023
13	0,262 909	0,848 831	0,628 578
14	0,225 894	0,073 883	2,128 544
15	0,170 996	0,203 952	1,099 463
16	0,149 723	0,194 207	3,462 951
17	0,240 140	0,924 450	3,664 773
18	0,116 587	1,381 320	2,833 799
19	0,221 155	0,640 512	3,334 290
20	0,259 730	1,368 671	0,393 889

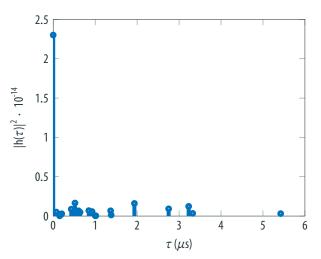
#### **Exercises**

#### Exercise 1.6. (cont.) ETSI TDT Channel Model

- **1.**  $f_c = 800$  MHz and the impulse response of the channel in the Figure, following this recommendation,
  - **1.1.** Describe the properties of the channel. In particular, if
    - It is a deterministic or stochastic description, and in this late case if it would be describe by a WSSUS process.
    - It is ITI or ITV.
    - It could be a Rayleigh or a Rice channel, explaining a LOS or NLOS scenario.
  - 1.2. If a signal with bandwith 3.9 kHz is transmitted, how many non-zero taps do we have? It will be flat or selective?
  - 1.3. If a signal with bandwith 7 MHz is transmitted, how many non-zero taps do we have? It will be flat or selective?
  - **1.4.** Estimate, approximately, the coherence bandwidth and the time dispersion.
- **2.** Suppose that the receiver is on top of a truck,
  - **2.1.** Estimate the minimum speed, in km/h, of the truck for the channel to change in 0.5 ms.

# **Exercises**

Exercise 1.6. (cont.) ETSI TDT Channel Model: F<sub>1</sub> or P<sub>1</sub>?



Channel DVB ETSI EN 300 744 V1.5.1 (2004-11)

#### **Further exercises**

For further knowledge, in the book by Cho *et al.* see

- Pp. 10 Model for IEEE 802.16d to see an example of path loss calculation (Flat LTI)
- Pp. 28 Model IEEE 802.11b for indoor channel, where a PDP is given (LTI).
- Pp. 20 The Saleh-Valenzuela (S-V) model for indoor (LT)
- Pp. 50 The Jakes Model, similar to the Clarke's Model but more flexible (Flat LTV)
- Pp. 64 Model for IEEE 802.16d for a Selective LTV channel
- Pp. 89 Model for the effect of correlation between antennas in MIMO
- · ..

You fill find the matlab code at

https://www.wiley.com//legacy/wileychi/cho/matlab.html