

EE401: Advanced Communication Theory

Professor A. Manikas
Chair of Communications and Array Processing

Imperial College London

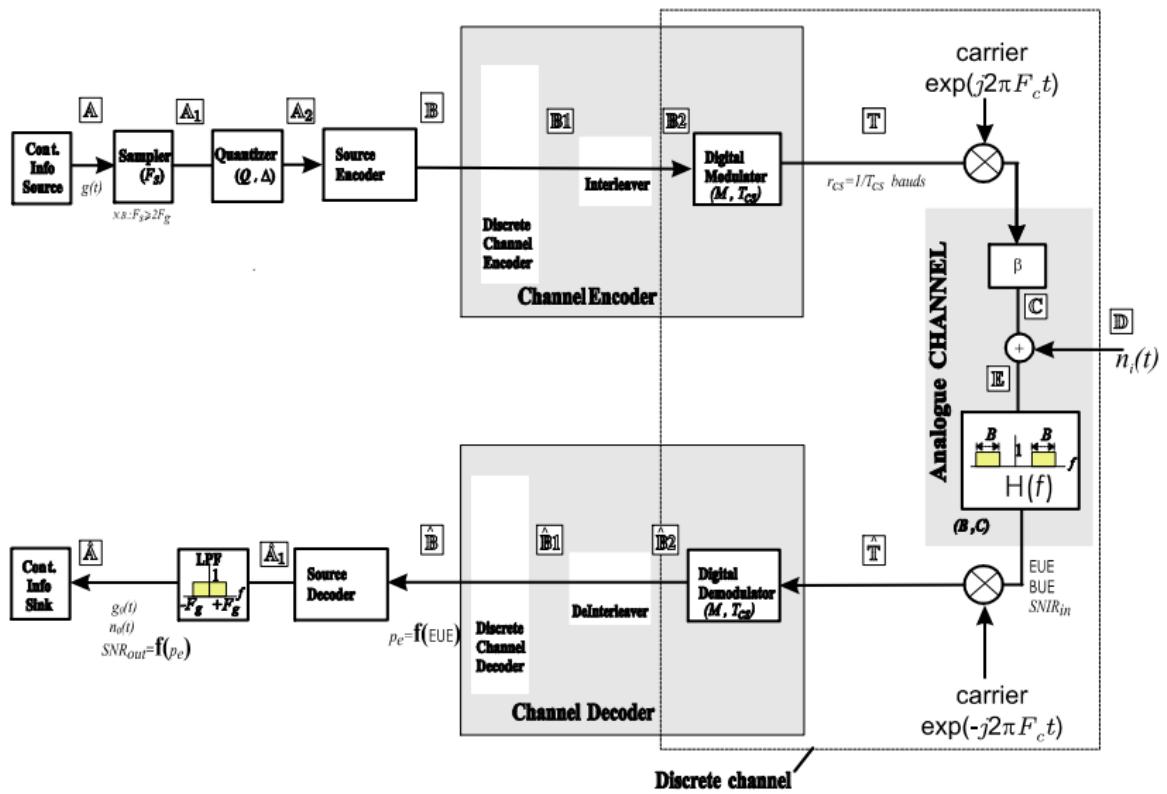
An Introductory Overview

Table of Contents

1	Communication Systems - Block Diagrams	4
2	Basics of Wireless Systems <ul style="list-style-type: none">Main Parts (SISO): Tx, Wireless Channel & RxClassifications of Wireless Systems	6
3	SIMO, MISO and MIMO <ul style="list-style-type: none">Non-Parametric ModelsParametric Models	12
4	Array Processing <ul style="list-style-type: none">Examples of Antenna Arrays for Modern Wireless SystemsExamples of Antenna Arrays for Classical Wireless Systems<ul style="list-style-type: none">A 2GHz Antenna Array of 48 ElementsOwens Valley Radio Observatory ArrayThe New Mexico Very Large Array of 27 ElementsA Large Circular Array	17
5	Basic Wireless System Architecture	26
6	Array Manifold Vector	31
7	Mobile Evolution <ul style="list-style-type: none">Antenna Array Space ResponseAntenna Array Patterns, Beamforming and Channel CapacityMotivation Examples<ul style="list-style-type: none">SIMO Wireless Reception and TrackingMAI CancellationInterference Cancellation with Motion	38
8	Appendices <ul style="list-style-type: none">A: Comm Systems: Basic Performance CriteriaB: Tail function (or Q-function) for Gaussian SignalsC: Tail Function GraphD: Fourier Transform Tables	53

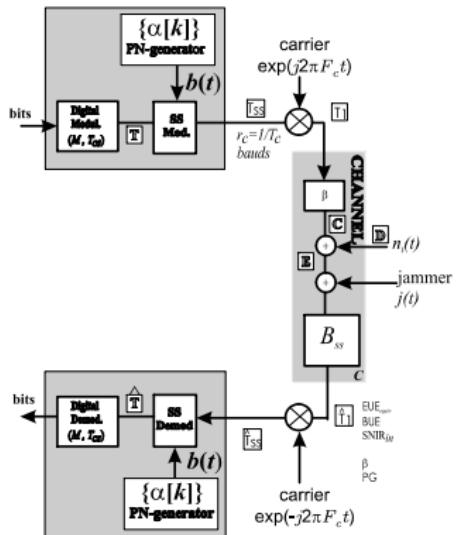


Block Structure of a Basic Digital Comm System

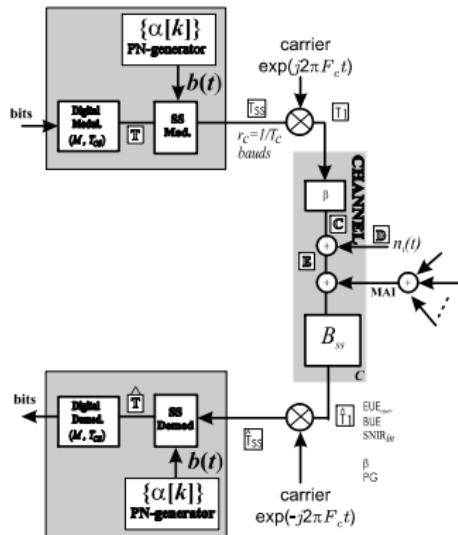


Block Structure of a Spread Spectrum Comm System

SSS:



CDMA:



Main Parts (SISO): Tx, Wireless Channel & Rx

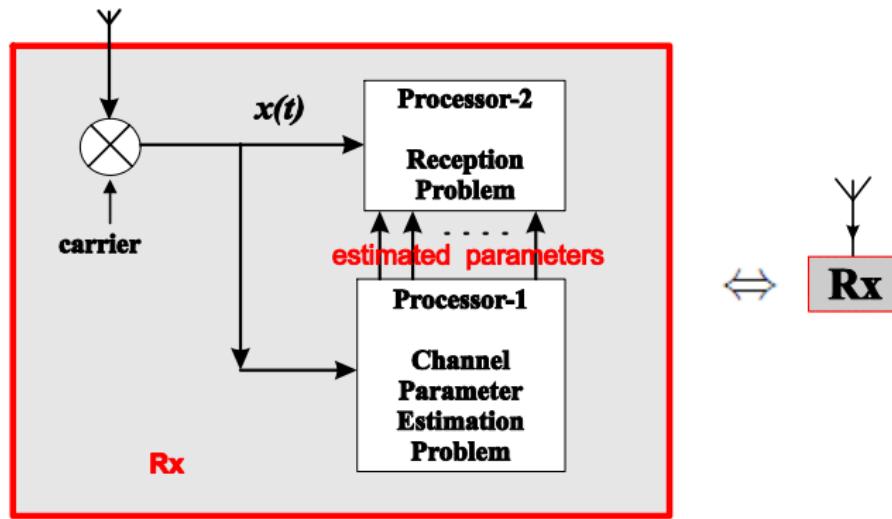
- A wireless system can be partitioned into 3 main parts:
 - ① **Tx** (a "**source**" that sends/transmits some information using wave propagation)
 - ② **Wireless Channel** (the **physical propagation paths**)
 - ③ **Rx** (a "**sink**" that receives the transmitted waves)

and the objective in general is

- ▶ to increase the **communication speed** (which is known as channel capacity)
without sacrificing the **quality of service** (for a given energy + bandwidth)



Generic Rx Architecture

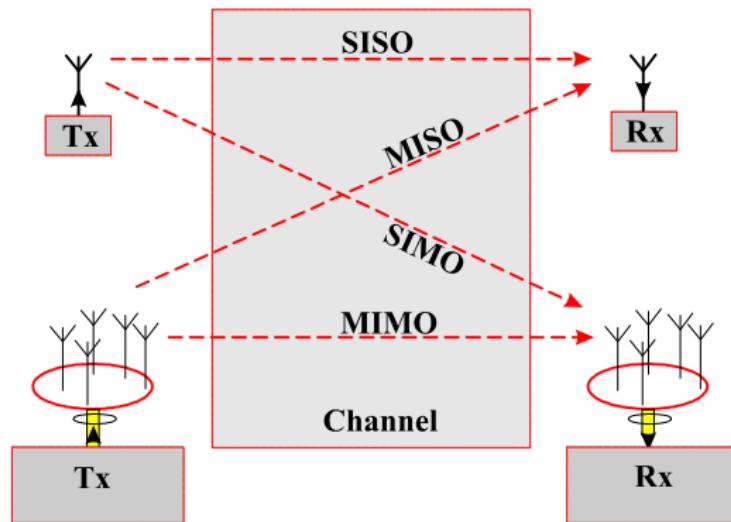


- The **quality of the receiver (Rx)** is a function of the **quality of the estimated channel parameters**
- Note that the receiver is **continuously designed** (based on these estimates) from **time frame to time frame**.

Classifications of Wireless Systems

- There are many classifications. For instance:
 - ① according to the **bandwidth/carrier**: **narrowband** or **wideband**
 - ② according to the **spreading capabilities**: **conventional** or **spread spectrum**
 - ③ according to the **number of carriers**: **single carrier** or **multicarrier**
 - ④ according to the "generation": 1G, 2G, **3G**, **3G+**
 - ⑤ according to the "access": **TDMA, FDMA**, **CDMA**,
- The **overall aims**:
 - ▶ **speed = ↑**,
 - ▶ **but maintaining reliability** (quality of service) & **spectral efficiency** (EUE,BUE)
- The current speed is expected to increase by the utilisation of the new technology of multiple antennas (MIMO) and this gives rise to **a new classification which super-sets all the above**.

- New classification: according to the **number of sensors/antennas** used in both Tx and RX



Terminology			
S:	Single	M:	Multiple
I:	Input	O:	Output

- **My Terminology**

Terminology-1 (More Representative)

- | | | |
|----------|-------|------------------------------------|
| 1 | SISO: | Scalar-Input-Scalar-Output Channel |
| 2 | SIVO: | Scalar-Input-Vector-Output Channel |
| 3 | VISO: | Vector-Input-Scalar-Output Channel |
| 4 | VIVO: | Vector-Input-Vector-Output Channel |

- **Alternative Terminology**

Terminology-2 (Initial)

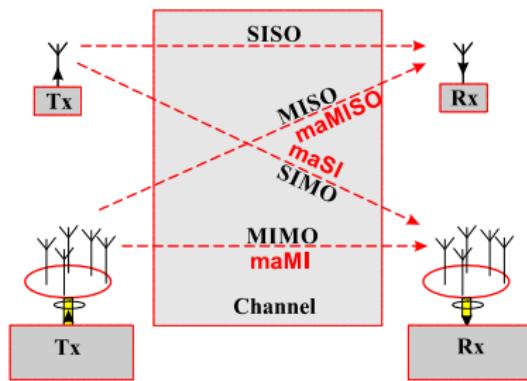
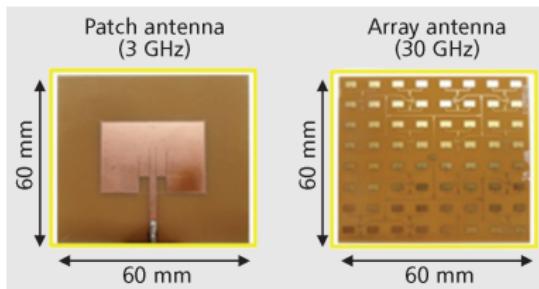
- | | | |
|----------|-------|---|
| 1 | SESE: | from Single-Element (SE) Tx to Single-Element (SE) Rx |
| 2 | SEME: | from Single-Element (SE) Tx to Multiple-Element (ME) Rx |
| 3 | MESE: | from Multiple-Element (ME) Tx to Single-Element (SE) Rx |
| 4 | MEME: | from Multiple-Element (ME) Tx to Multiple-Element (ME) Rx |

Terminology-3 (More Popular)

- | | | |
|----------|-------|--------------------------------|
| 1 | SISO: | Single-Input-Single-Output |
| 2 | SIMO: | Single-Input-Multiple-Output |
| 3 | MISO: | Multiple-Input-Single-Output |
| 4 | MIMO: | Multiple-Input-Multiple-Output |

Massive MIMO

- There is an increased interest in "massive" MIMO (i.e. to increase the "degrees-of-freedom" by increasing the number of antennas).



SIMO, MISO, MIMO: Two modelling philosophies

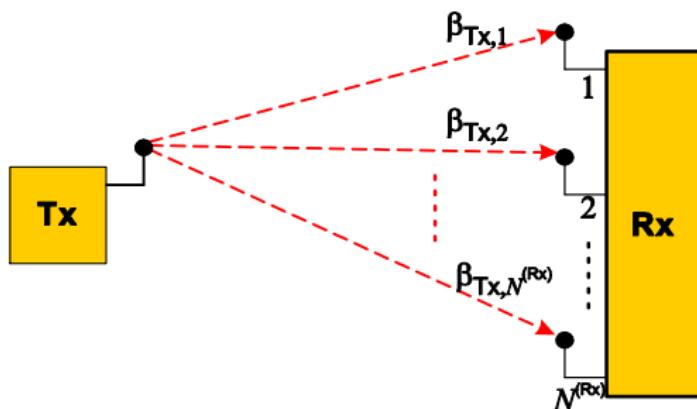
- **Non-Parametric :**

The antennas are assumed to work independently and thus the various links from antenna-to-antenna are represented by single complex numbers.

- **Parametric:**

All antennas are "working together" as a single system (an antenna array system) and the various links are mathematically modelled

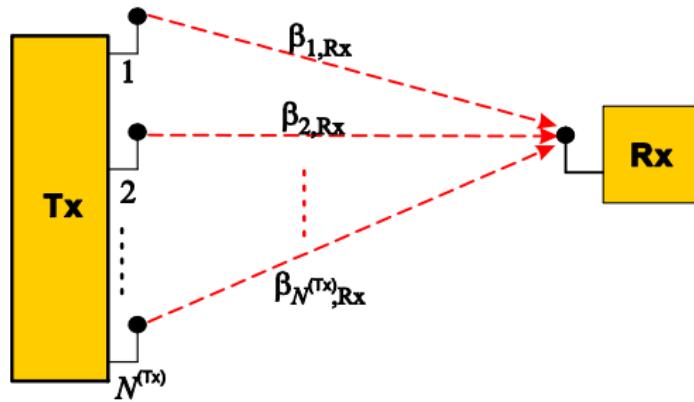
SIMO Wireless Systems (non-parametric)



Single-Input Multiple-Output (SIMO)

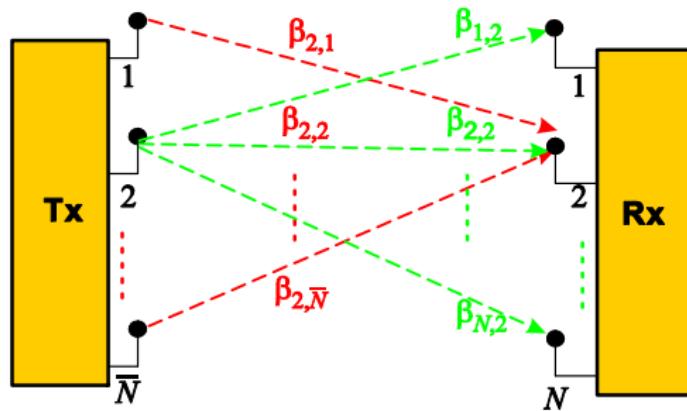
- Remember: SISO - one complex number β per path

MISO Wireless Systems (non-parametric)



Multiple-Input Single-Output (MISO)

MIMO Wireless Systems (non-parametric)



Multiple-Input Multiple-Output (MIMO)

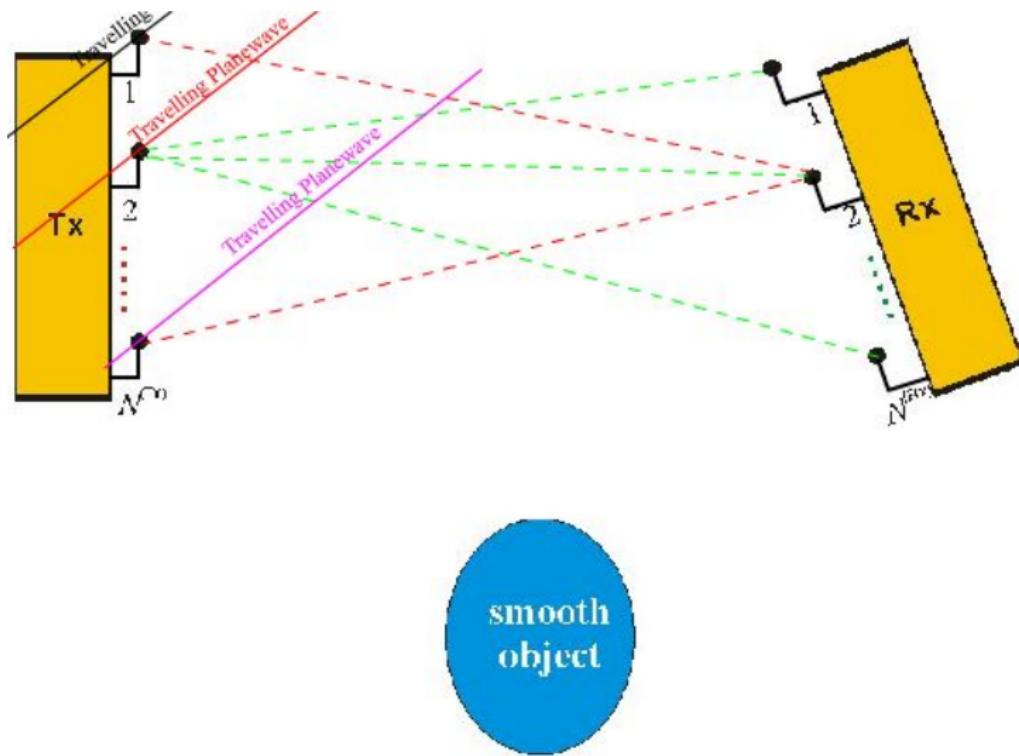
$$\begin{bmatrix} \beta_{1,1} & \beta_{1,2} & \dots & \beta_{1,N^{(\text{Tx})}} \\ \beta_{2,1} & \beta_{2,2} & \dots & \beta_{2,N^{(\text{Tx})}} \\ \vdots & \vdots & \ddots & \vdots \\ \beta_{N^{(\text{Rx})},1} & \beta_{N^{(\text{Rx})},2} & \dots & \beta_{N^{(\text{Rx})},N^{(\text{Tx})}} \end{bmatrix}$$

Parametric Approaches (Array Processing)

Introduction

- The above modelling will result into a statistical approach (**used in Wiener's estimation theory and Shannon's communication theory**).
e.g. many MIMO books, papers and tutorials: non parametric
- Although this approach is suitable for single antenna systems (i.e. SISO), it does not properly fit multiple antennas since it
 - ▶ ignores the **Cartesian coordinates** and orientations of Tx and Rx (i.e. ignoring the geometry/location of the multiple antennas),
 - ▶ ignores the **directions** of the signals,
 - ▶ ignores **propagation models** (planewaves or spherical waves),
 - ▶ etc.

Revisiting Multiple-Input Multiple-Output (MIMO)

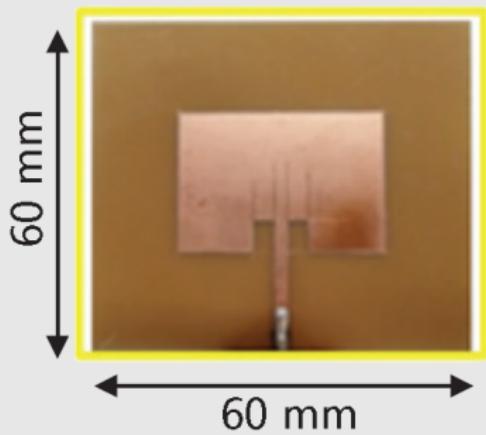


Summary Table of SISO, MISO, SIMO and MIMO

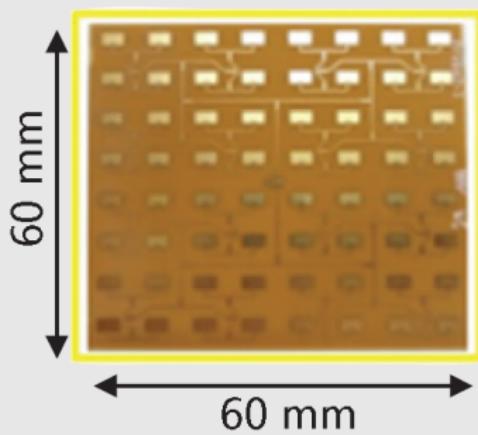
	Non-Parametric	Parametric (Array Processing)
SISO:	β	
SIMO:	$\begin{bmatrix} \beta_{Tx,1} \\ \beta_{Tx,2} \\ \dots \\ \beta_{Tx,N^{(Rx)}} \end{bmatrix}$	$= \beta \underline{a}^{(Rx)}$
MISO:	$\begin{bmatrix} \beta_{1,Rx} \\ \beta_{2,Rx} \\ \dots \\ \beta_{N^{(Tx)},Rx} \end{bmatrix}$	$= \beta \underline{a}^{(Tx)}$
MIMO:	$\begin{bmatrix} \beta_{1,1} & \beta_{1,2} & \dots & \beta_{1,N^{(Tx)}} \\ \beta_{2,1} & \beta_{2,2} & \dots & \beta_{2,N^{(Tx)}} \\ \dots & \dots & \dots & \dots \\ \beta_{N^{(Rx)},1} & \beta_{N^{(Rx)},2} & \dots & \beta_{N^{(Rx)},N^{(Tx)}} \end{bmatrix}$	$= \beta \underline{a}^{(Rx)} \underline{a}^{(Tx)^H}$ $\Leftrightarrow \beta \underline{a}^{(virtual)}$

Examples of Antenna Arrays for Modern Wireless Systems

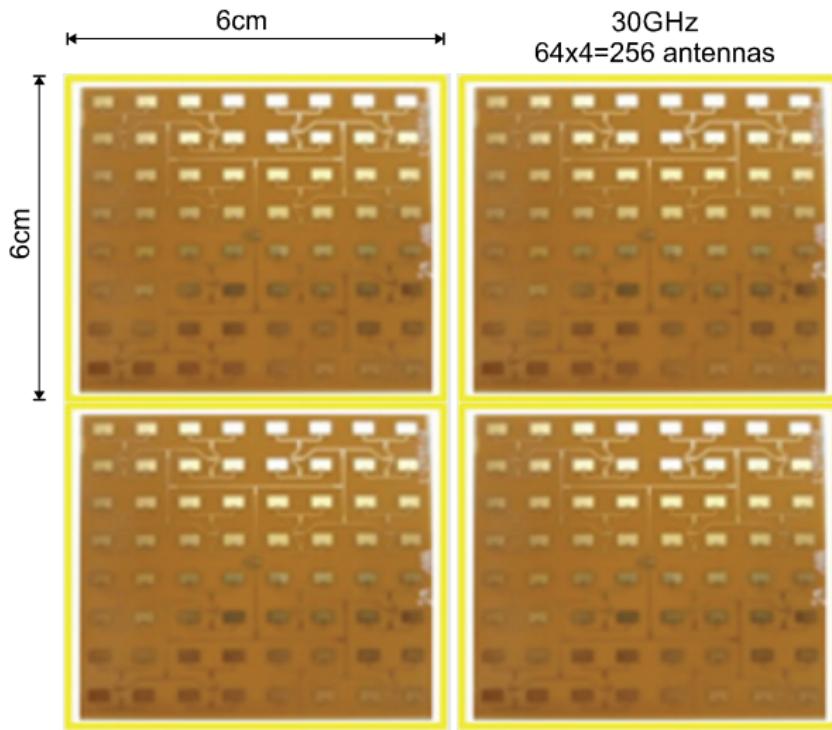
Patch antenna
(3 GHz)



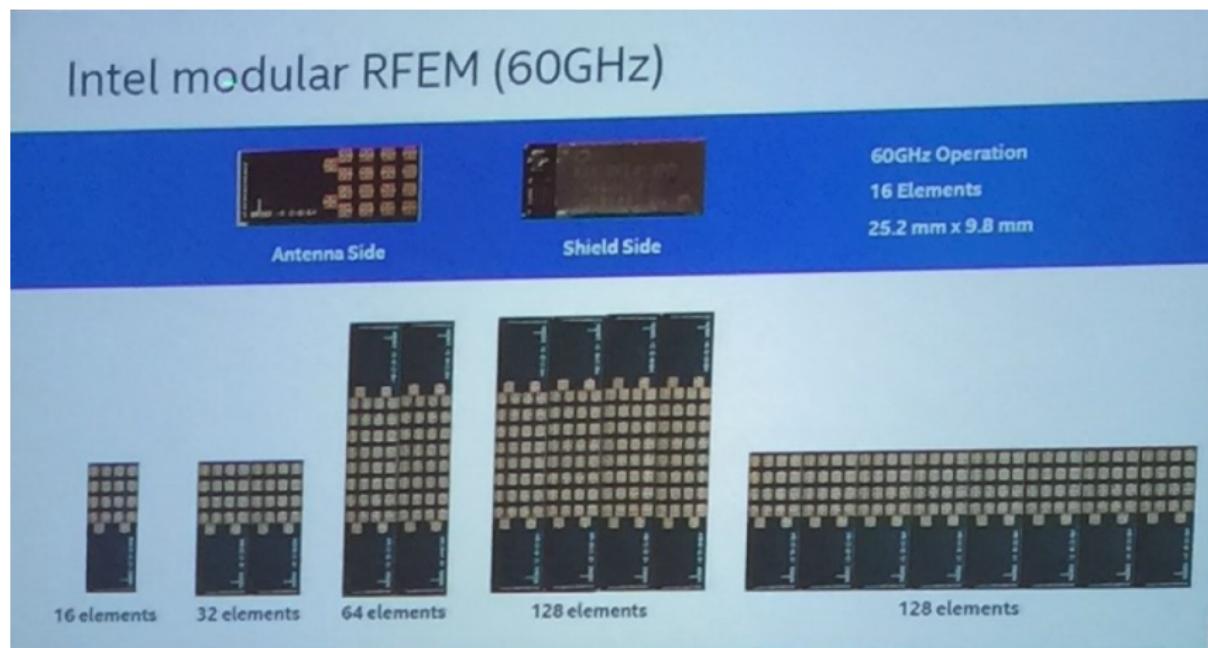
Array antenna
(30 GHz)



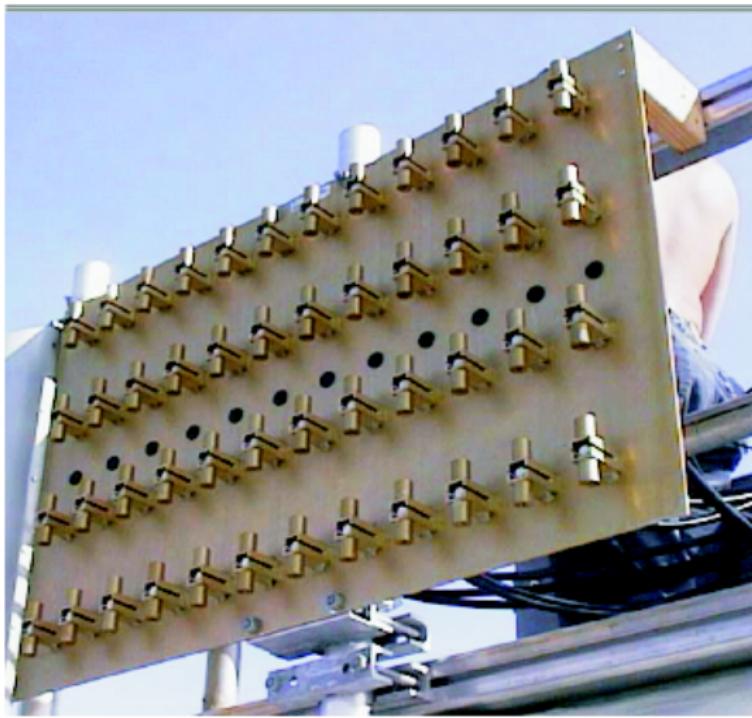
A Planar Array Geometry of 256 antennas at 30GHz



Intel Antenna Arrays - 60GHz



A 2GHz Antenna Array of 48 Elements



Owens Valley Radio Observatory Array

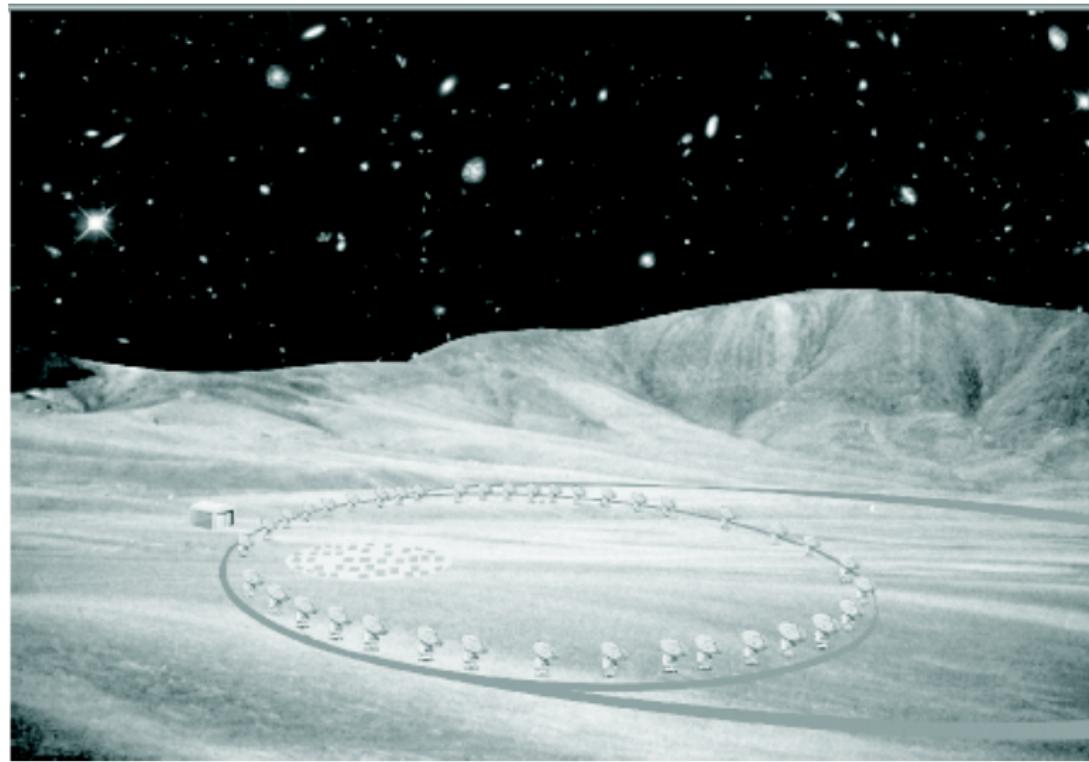


The New Mexico Very Large Array of 27 Elements

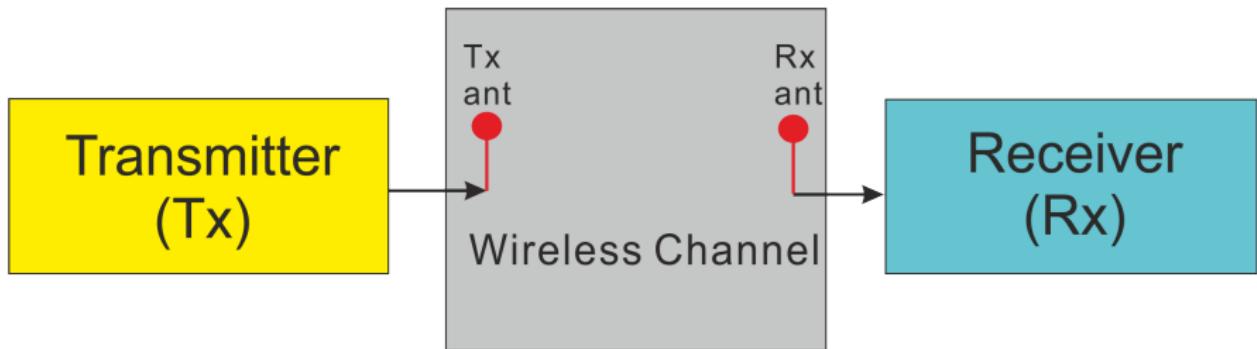


(along rail road tracks - 35km)

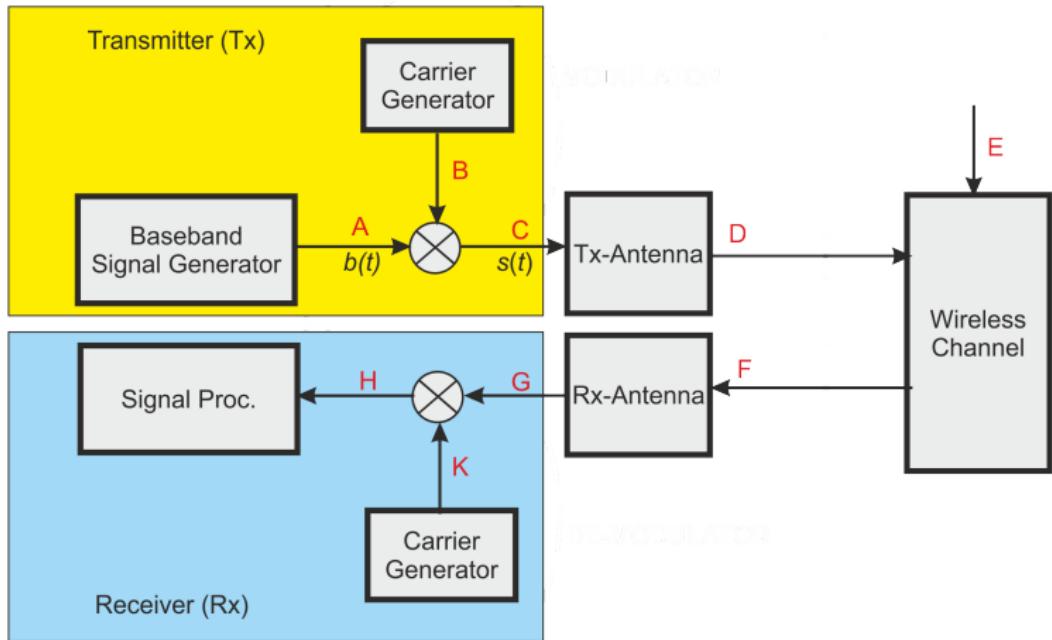
A Large Circular Array



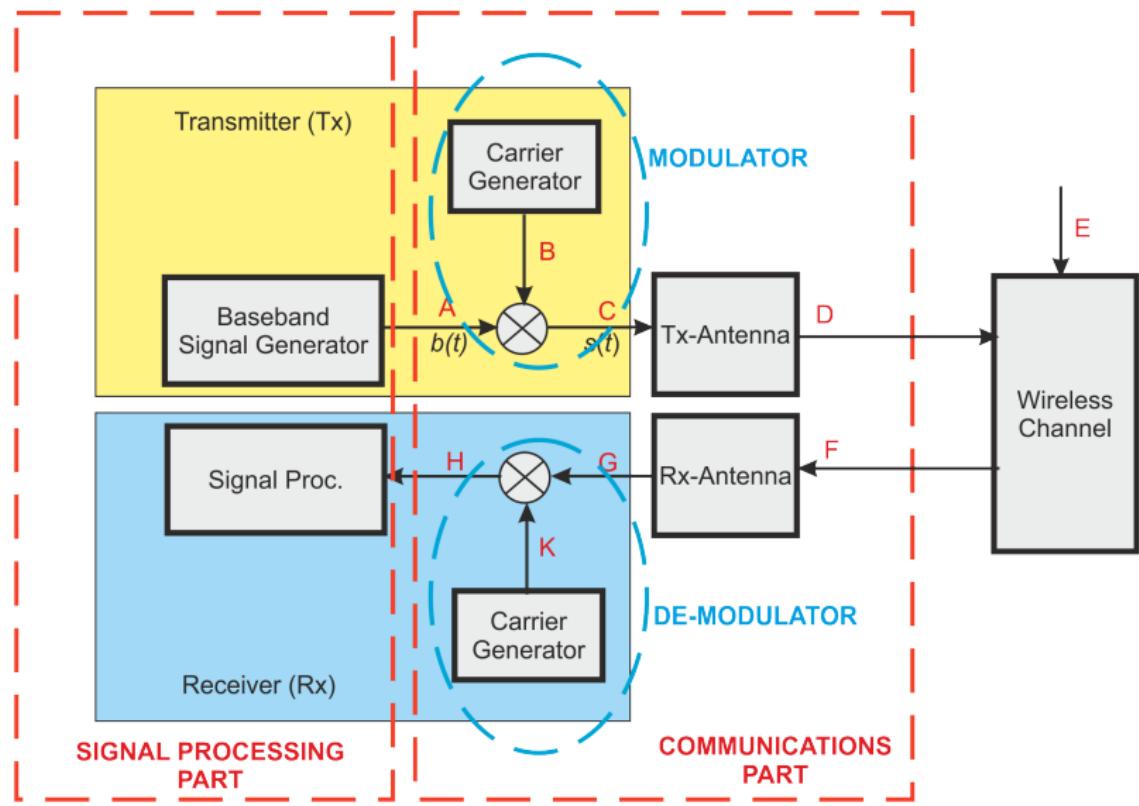
Basic SISO System Architecture



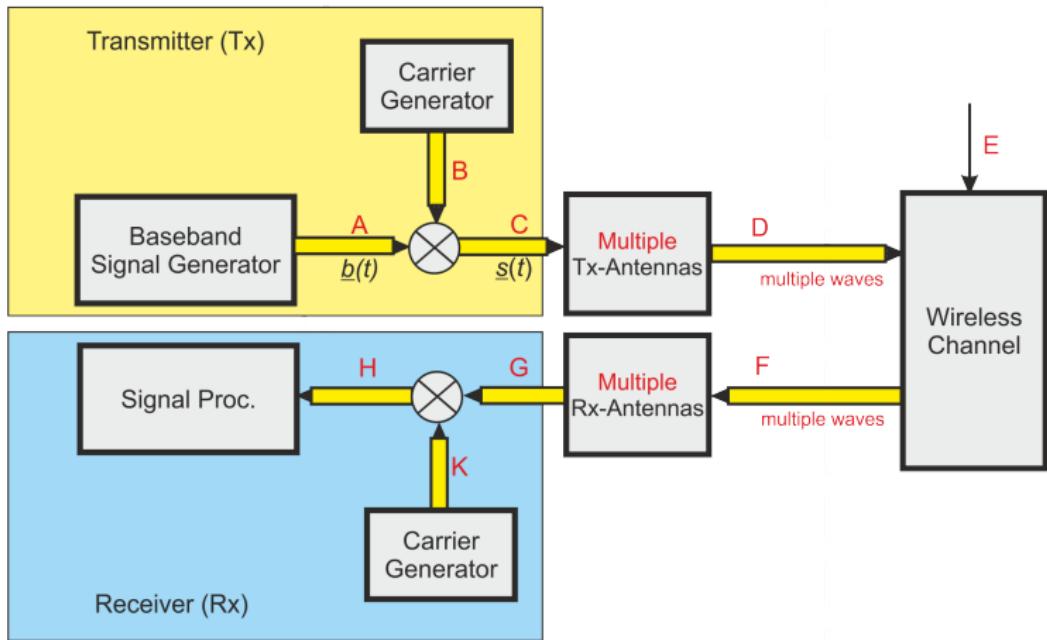
Basic SISO System Architecture



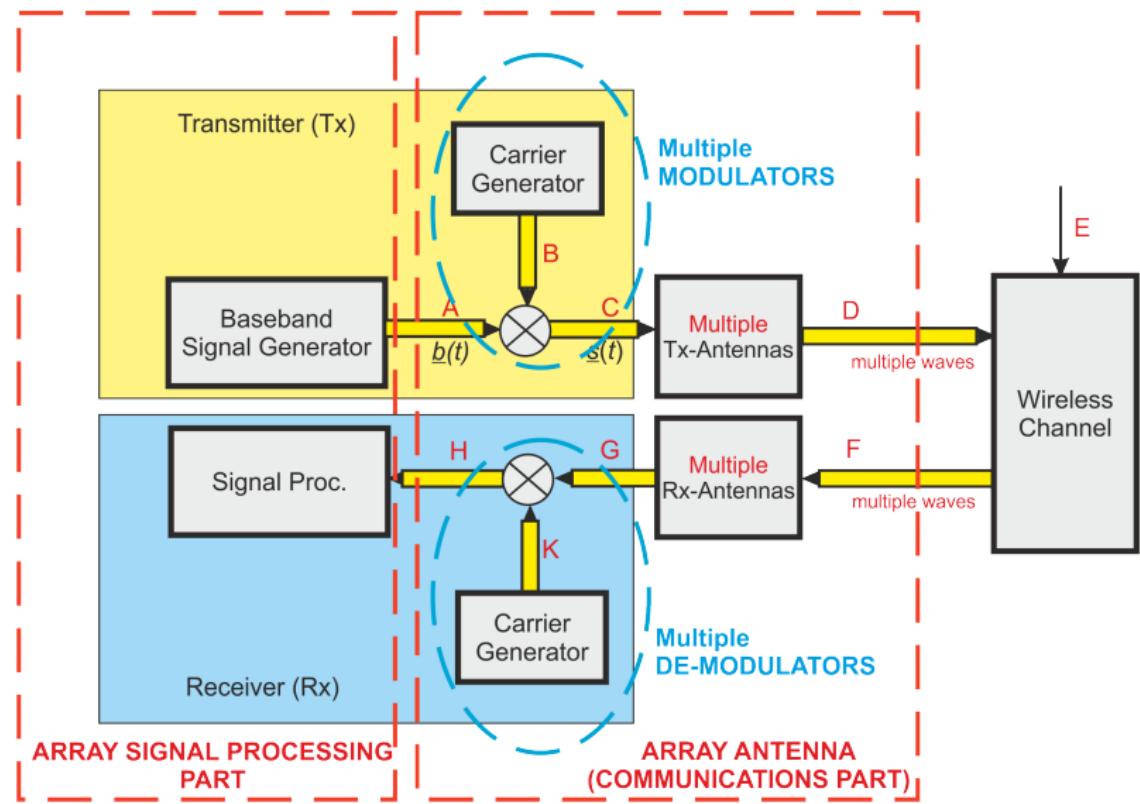
Basic SISO System Architecture



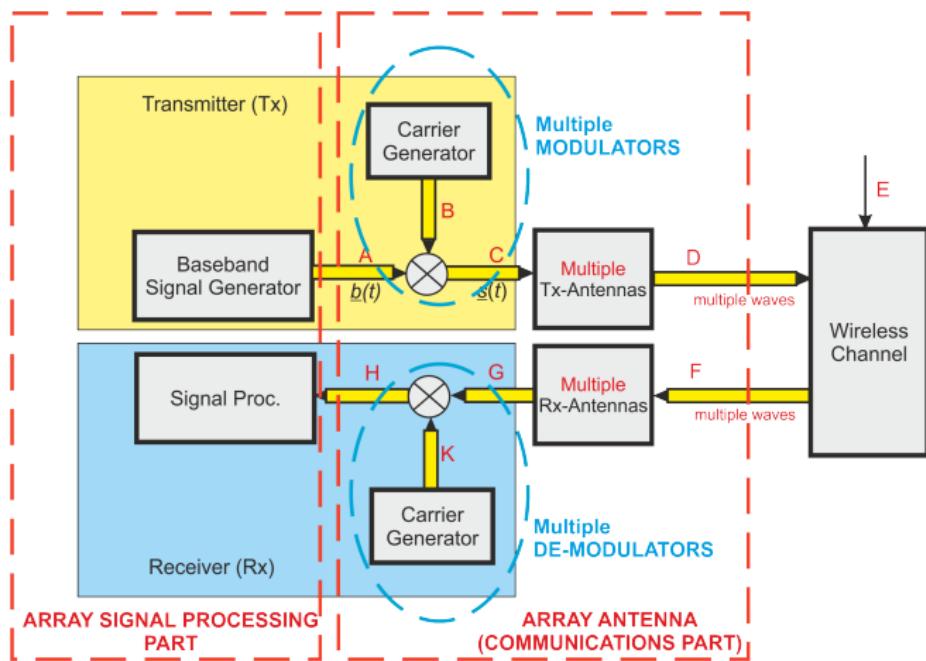
Basic MIMO System Architecture



Basic MIMO System Architecture



Signal at point-H



signal at point H : $\underline{x}(t)$ = function of "array manifold vector" S

The Structure of the Array Manifold Vector

- The vector \underline{S} is known as
 - ▶ Array Manifold Vector or
 - ▶ Array Response Vector, or
 - ▶ Source Position Vector (SPV)
- The vector \underline{S} has a **profound mathematical structure** and is a function of a number of parameters such as Directions, carrier,etc

$$\underline{S}(\theta, \phi, F_c, c, \underline{r}_1, \underline{r}_2, \underline{r}_3, \dots, \underline{r}_N)$$

Extended Manifolds

- array manifold: we can add more wireless parameters from the Tx, Rx and channel
- For instance

$\underline{S}(\theta, \phi, F_c, c, \underline{r}_x, \underline{r}_y, \underline{r}_z,$
pseudorandom sequ, delay, polarisation parameters,
No.of subcarriers/carriers, bandwidth, Doppler frequency).



$\underline{h} \triangleq$ spatiotemporal manifold [it is a function of the
original $\underline{S}(\theta, \phi, F_c, c, \underline{r}_x, \underline{r}_y, \underline{r}_z)$]

The Structure of the Array Response Vector

- From now on in this presentation the vector \underline{a} will represent all multiple antenna wireless systems, i.e.

$$\underline{a} \triangleq \left\{ \begin{array}{ll} \underline{S}^{(\text{Rx})} & \text{SIMO} \\ \underline{S}^{(\text{Tx})} & \text{MISO} \\ \underline{S}^{(\text{virtual})} = \underline{S}^{(\text{Tx})} \otimes \underline{S}^{(\text{Rx})} & \text{MIMO} \end{array} \right\}$$

- The vector \underline{a} is known as
 - ▶ Array Manifold Vector or
 - ▶ Array Response Vector (alternative symbol \underline{S})
- The vector \underline{a} has a **profound mathematical structure** and is a function of a number of parameters such as Directions, carrier,etc

$$\underline{a}(\theta, \phi, F_c, c, \underline{r}_1, \underline{r}_2, \underline{r}_3, \dots, \underline{r}_N)$$

- Various forms of \underline{a} have different dimensions but always a **profound mathematical structure**

This leads to Differential Geometry which complements the statistical signal processing and Shannon's communication theory.

Differential Geometry

- **Differential geometry** is a branch of mathematics that is concerned with the application of differential calculus for the investigation of the properties of geometric **curves**, **surfaces** and **other objects** known as '**manifolds**'.
- Manifolds have a **deep** and **profound mathematical structure** and have been **an area of intense pure mathematical analysis**.

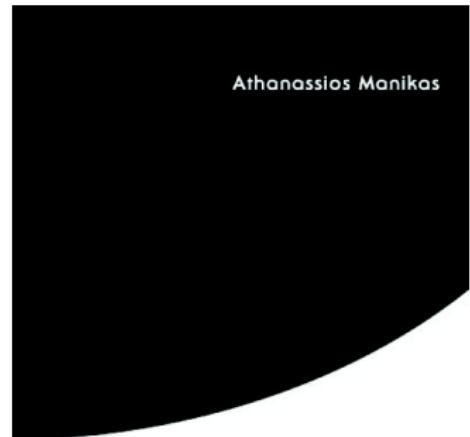
$\underline{p} \mapsto$ mathematical object

- In Physics, Albert Einstein (Nobel 1921) used differential geometry to express his **general theory of relativity**
 - ▶ where the universe is a **smooth manifold** equipped with pseudo-Riemannian metric (described the curvature of space-time).

Fundamental Questions

- Diff. Geom. helps **answering some fundamental questions** such as:

- Q1** Is it possible to **express** a wireless system as a space curve or a surface (or a manifold - in general)?
- Q2** Is it possible to **analyse** a wireless system **by analysing** a curve or a surface?
- Q3** Is it possible to **design** a wireless system **by designing** a curve or a surface?
- Q4** What do we **stand to gain** by expressing wireless systems as mathematical objects such as curves or surfaces?



DIFFERENTIAL GEOMETRY IN **ARRAY PROCESSING**

Imperial College Press

Conclusion

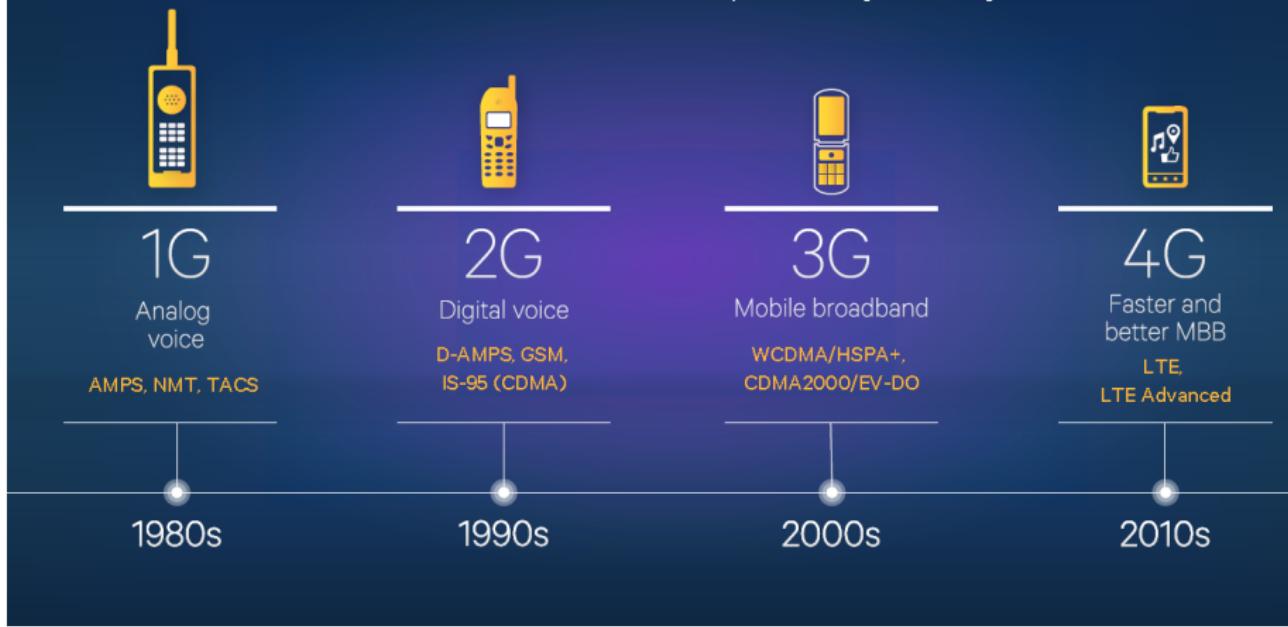
- The overall conclusions that can be drawn are:
 - 1) Differential Geometry is **hand in hand** with **SIMO , MISO** and **MIMO**



- 2) Differential Geometry is at **locked horns** with **SISO**

Mobile Evolution

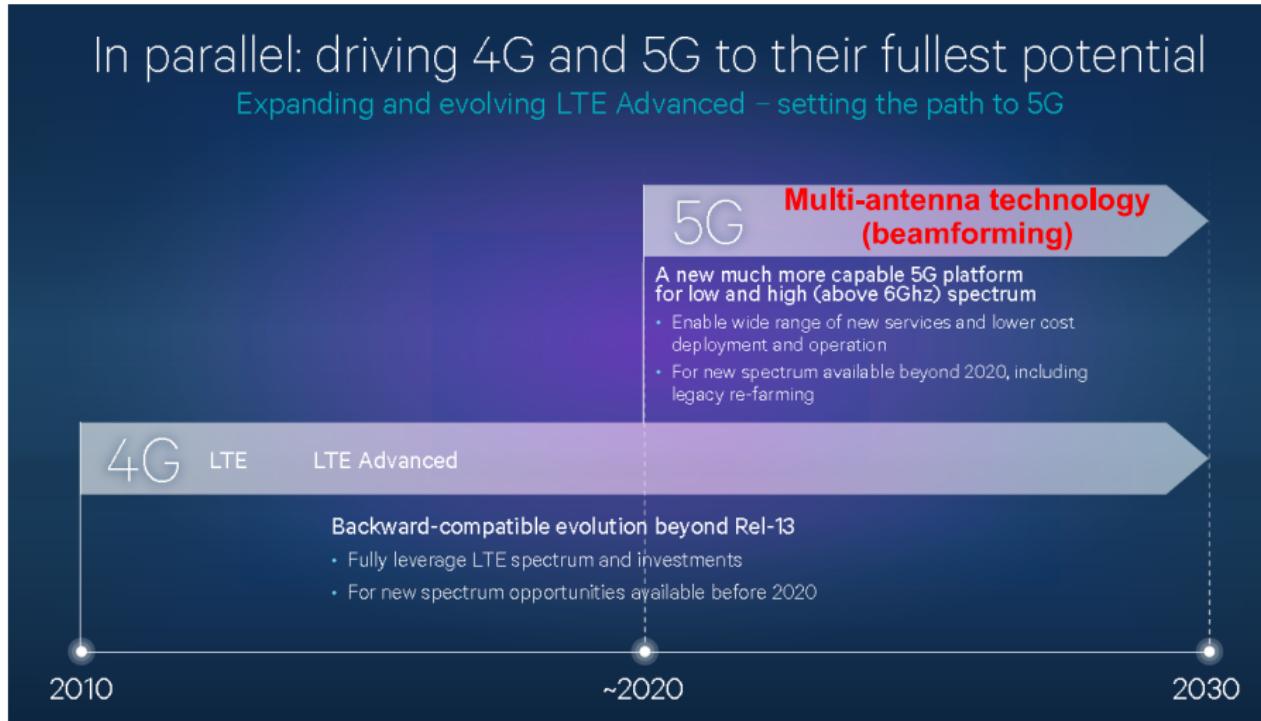
Mobile has made a leap every ~10 years



Mobile Evolution (cont.)

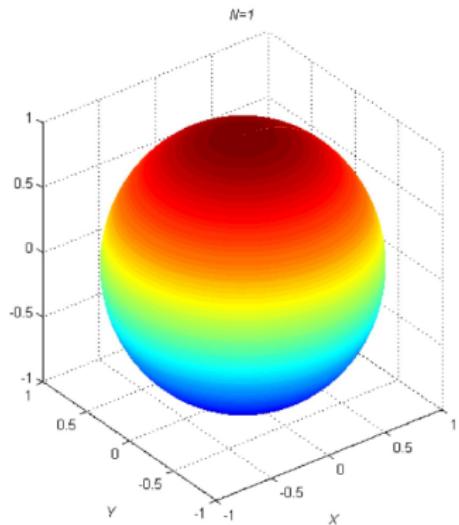
In parallel: driving 4G and 5G to their fullest potential

Expanding and evolving LTE Advanced – setting the path to 5G

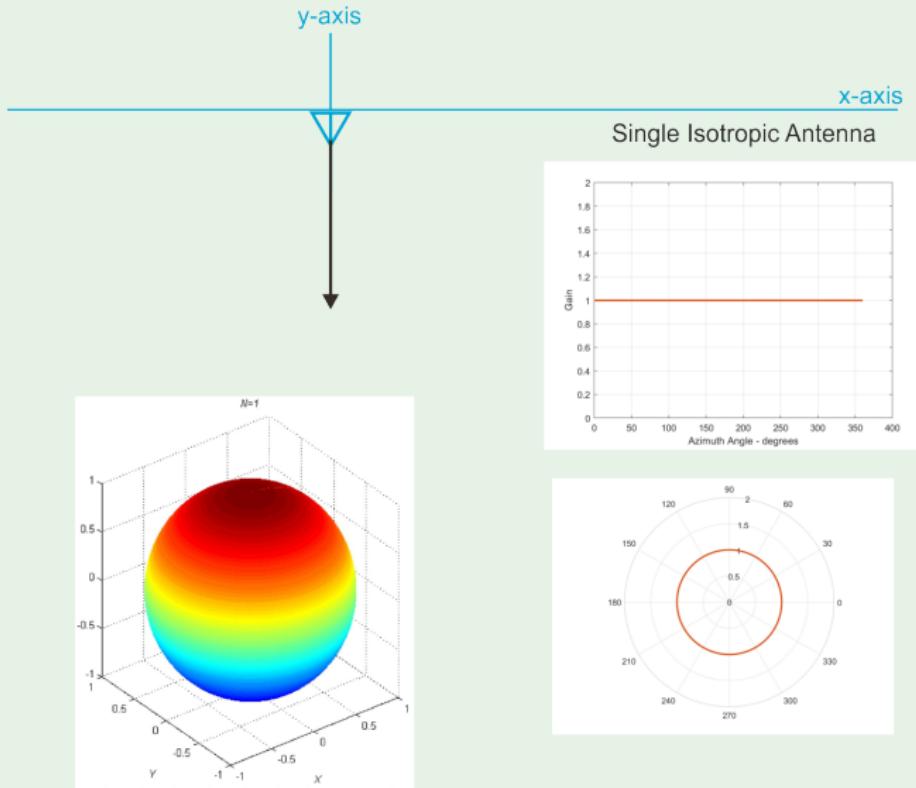


Antenna Array Space Response

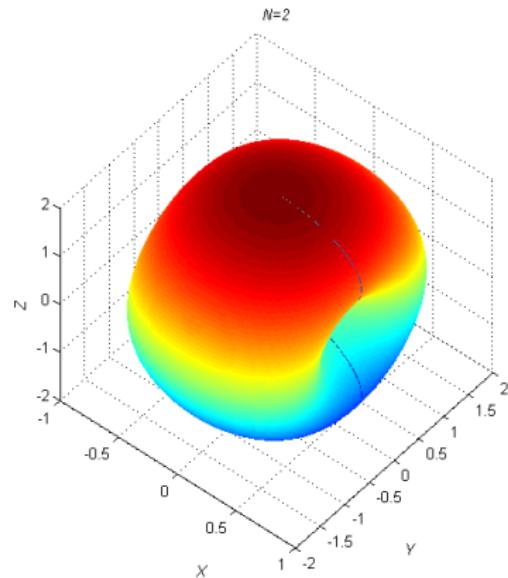
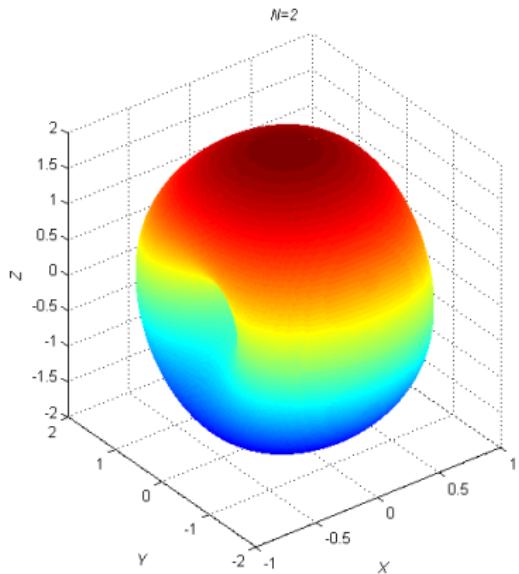
- Isotropic Antenna:



Example (Single Antenna: $N = 1$)

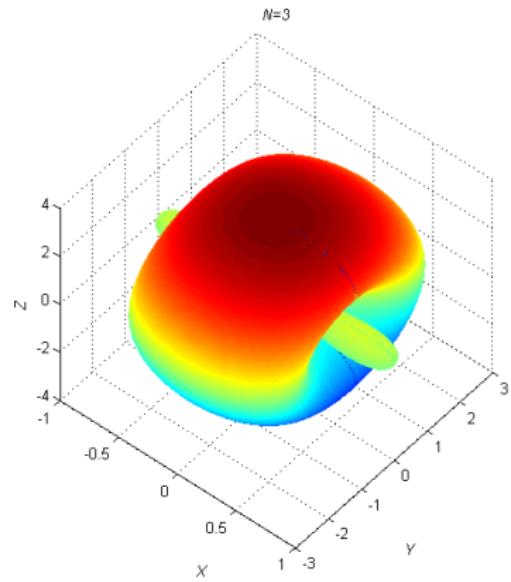
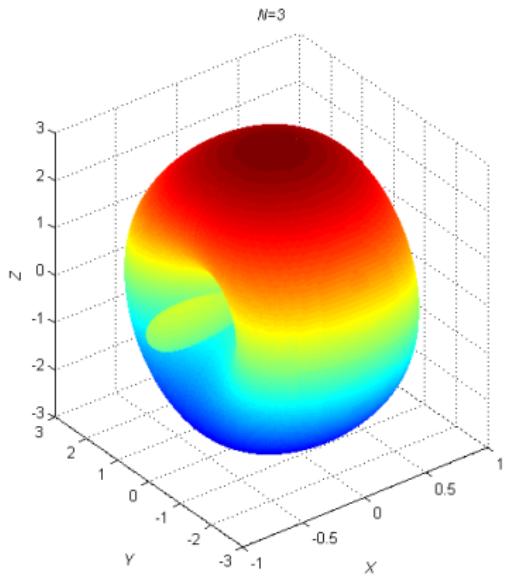


Two Antennas ($N=2$): Space Response



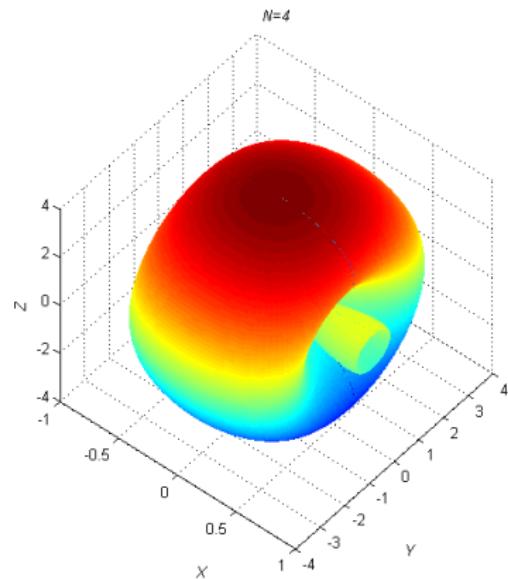
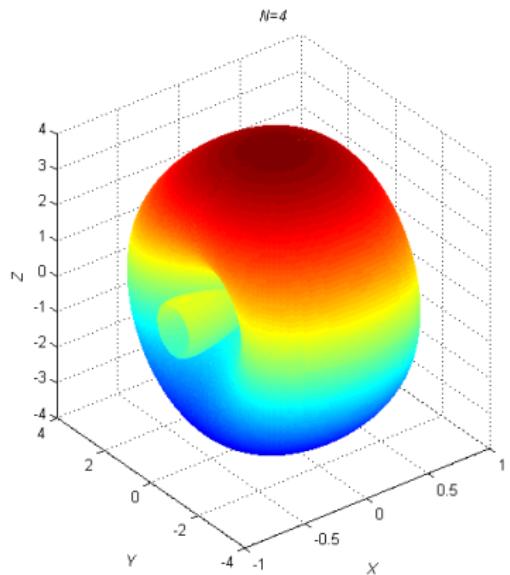
(rotated by 90°)

Three Antennas ($N=3$): Space Response



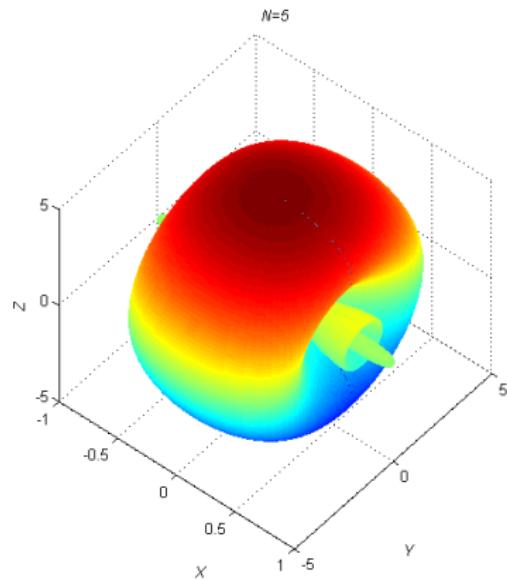
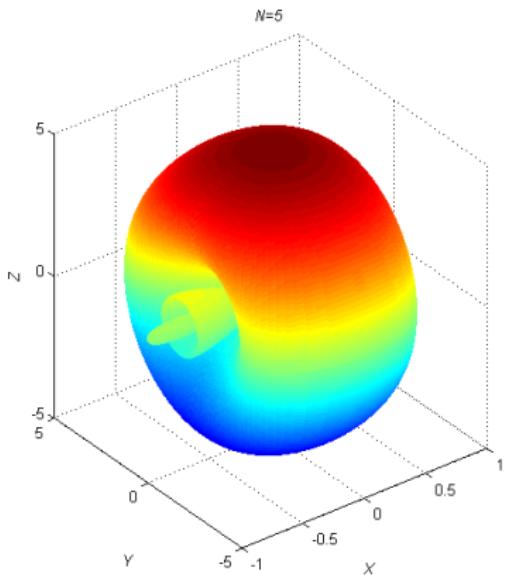
(rotated by 90°)

Four Antennas ($N=4$): Space Response



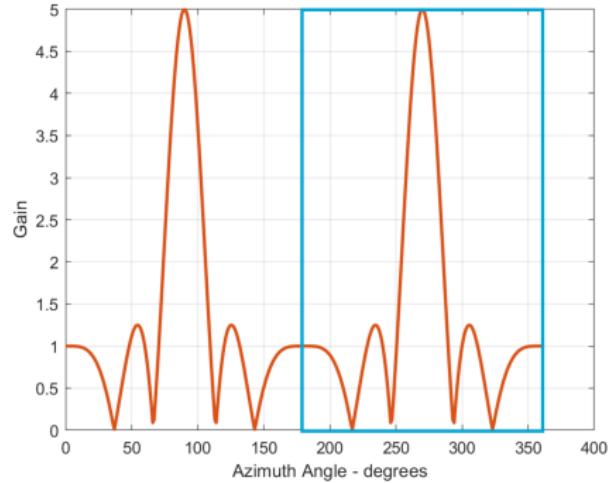
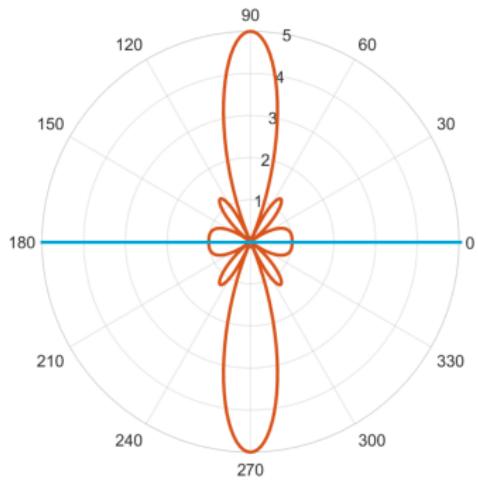
(rotated by 90°)

Five Antennas ($N=5$): Space Response



(rotated by 90°)



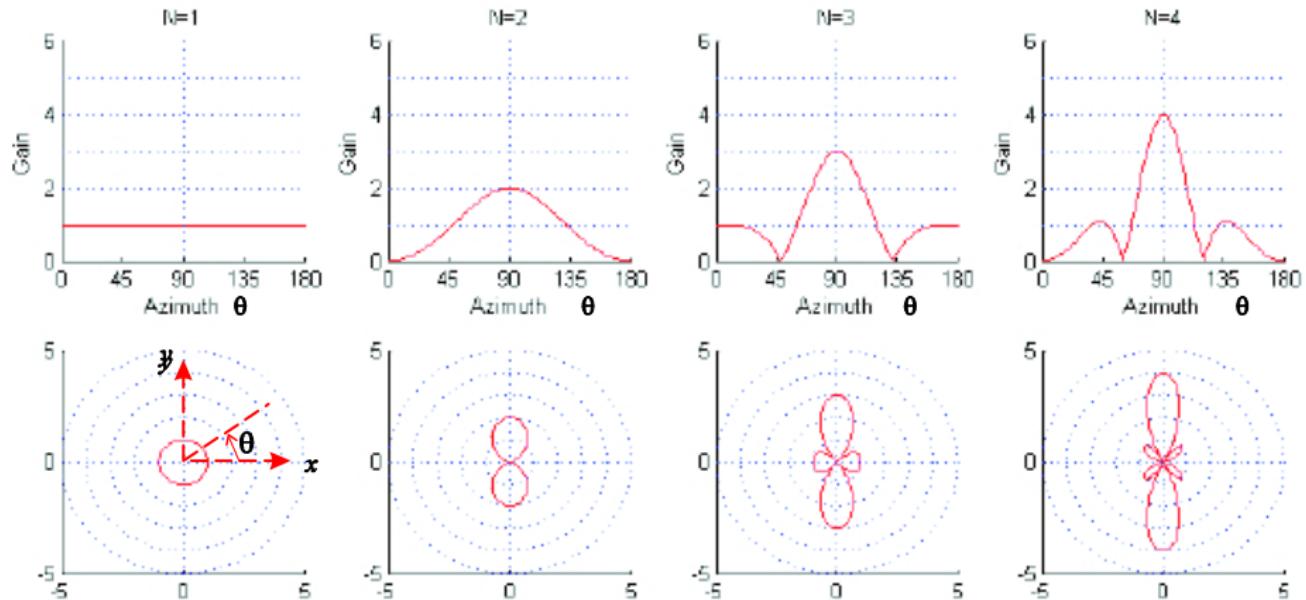
Example (Linear Antenna Arrays of 5 elements: $N = 5, d = \lambda/2$)

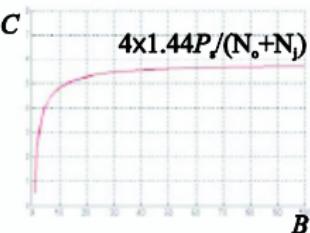
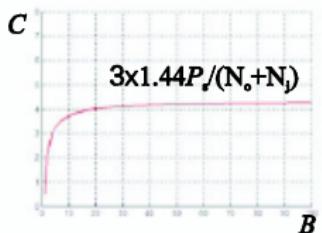
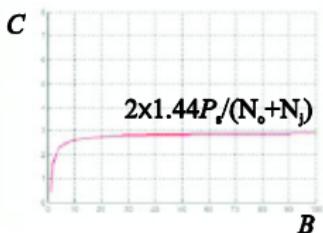
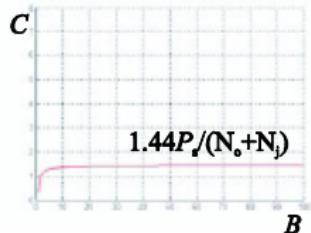
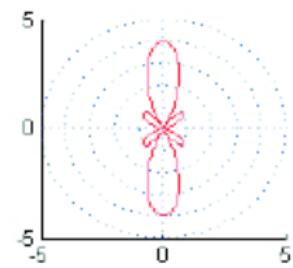
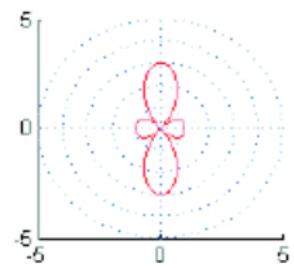
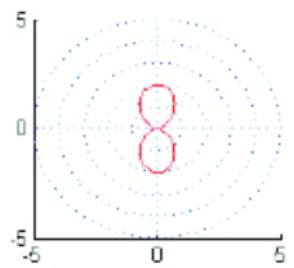
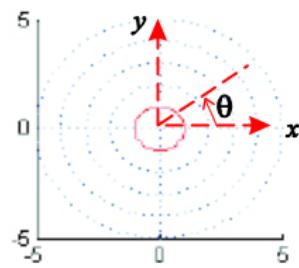
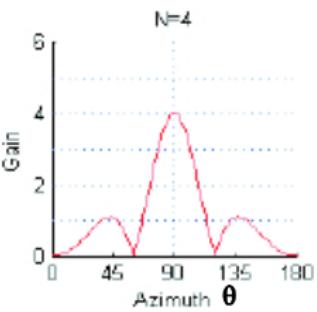
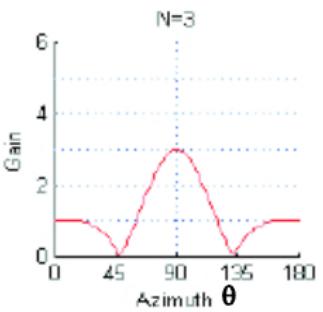
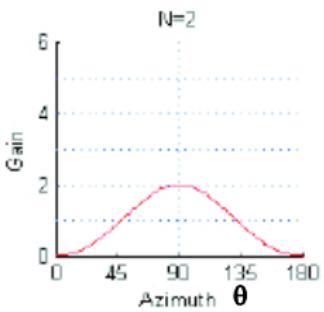
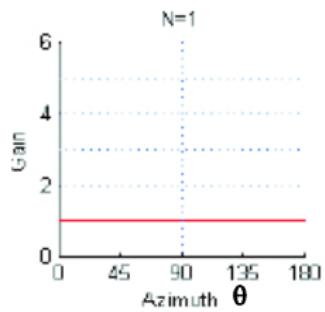
Capacity: Uniform Linear Array (ULA)

- Intersensor spacing = $\lambda/2$;
- N = number of antennas (located on the x-axis).
- Channel Capacity (AWGN):

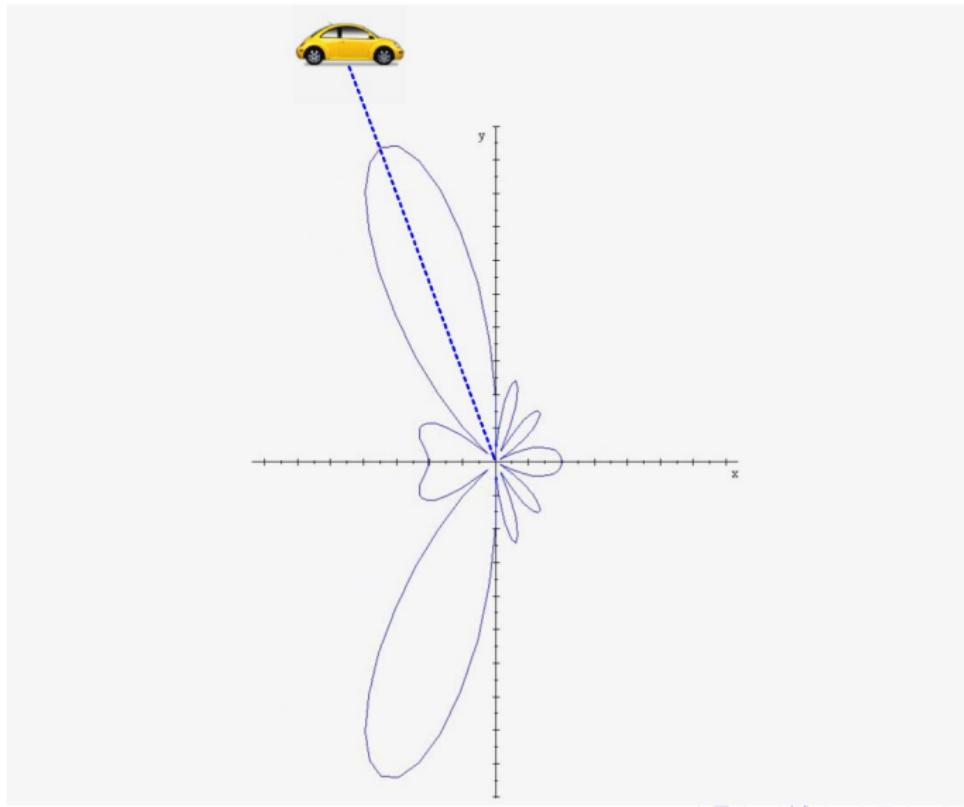
$$C = B \log_2(1 + N \times \text{SNIR}_{in}) \quad (1)$$

$$B \rightarrow \infty \Rightarrow C \rightarrow N \times 1.44 \frac{P_s}{N_0 + N_j} \downarrow \quad (2)$$

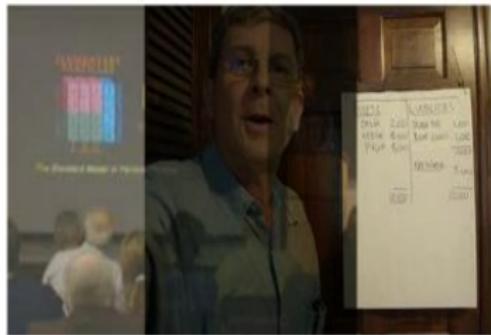




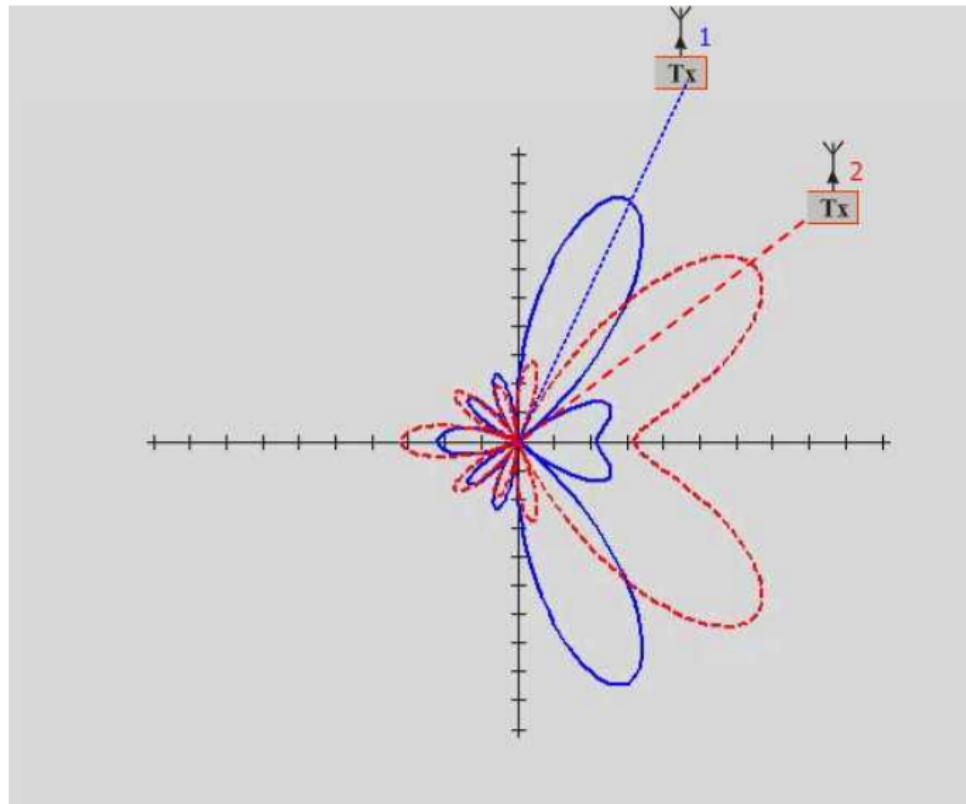
SIMO Wireless Reception and Tracking (ULA, N=5)



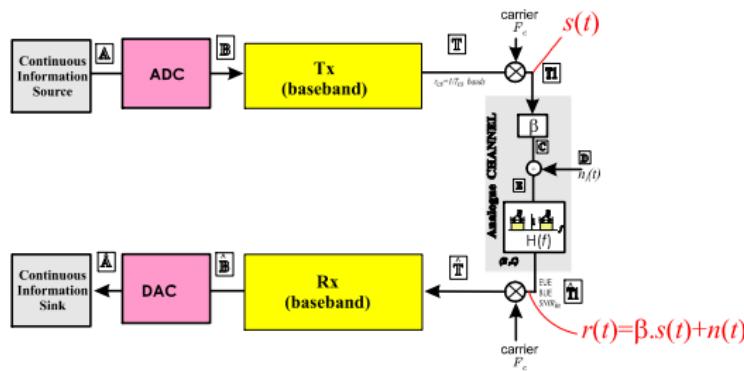
Multiple Access Interference Cancellation (ULA, N=5)



Interference Cancellation with Motion (ULA, N=5)



Appendices - A: Basic Performance Criteria



$$\text{SNR}_{in} = \frac{\text{Power of signal at } \hat{T}}{\text{Power of noise at } \hat{T}} = \frac{\mathcal{E}\{(\beta s(t))^2\}}{\mathcal{E}\{n(t)^2\}} = \underbrace{\frac{\beta^2 P_s}{N_0 B}}_{\triangleq P_n} \quad (3)$$

$$p_e = \text{BER at point } \hat{B} \quad (4)$$

$$\text{SNR}_{out} = \frac{\text{Power of signal at } \hat{A}}{\text{Power of noise at } \hat{A}} = \underbrace{f\{p_e\}}_{\text{denotes: a function of } p_e} \quad (5)$$

denotes: a function of p_e

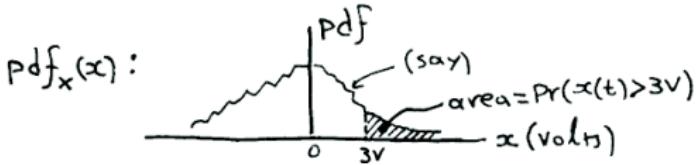
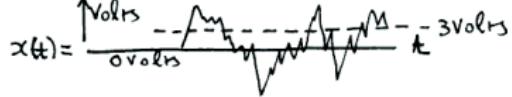
Tail function (or Q-function) for Gaussian Signals

Probability and Probability-Density-Function (pdf)

- Consider a random signal $x(t)$ with a known amplitude probability density function $\text{pdf}_x(x)$ - not necessarily Gaussian. Then the probability that the amplitude of $x(t)$ is greater than A Volts (say) is given as follows:

$$\Pr(x(t) > A) = \int_A^{\infty} \text{pdf}_x(x).dx \quad (6)$$

- e.g.
if $A = 3V \Rightarrow \Pr(x(t) > 3V) = \int_3^{\infty} \text{pdf}_x(x).dx = \text{highlighted area}$



Gaussian pdf and Tail function

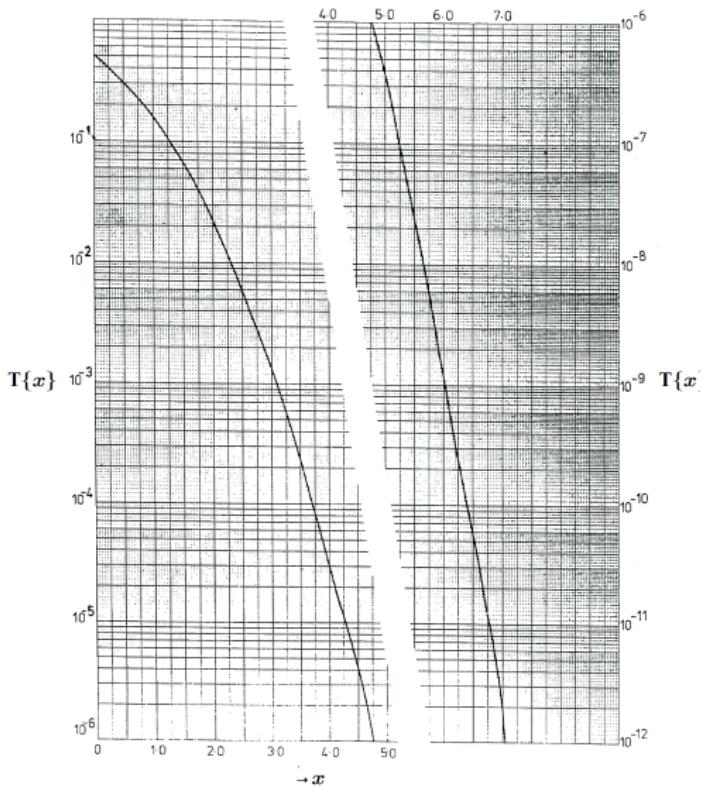
- If $\text{pdf}_x(x) = \text{Gaussian of mean } \mu_x \text{ and standard deviation } \sigma_x$ (notation used: $\text{pdf}_x(x) = N(\mu_x, \sigma_x^2)$), then the above area is defined as the Tail-function (or Q-function)

$$\Pr(x(t) > A) = \int_A^{\infty} \text{pdf}_x(x).dx \triangleq T\left\{ \frac{|A - \mu_x|}{\sigma_x} \right\} \quad (7)$$

- e.g.
 - if $\text{pdf}_x(x) = N(1, 4)$ - i.e. $\mu_x = 0, \sigma_x = 2$ - and $A = 3V$
 then $\Pr(x(t) > 3V) = \int_3^{\infty} \text{pdf}_x(x).dx \triangleq T\left\{ \frac{|3-1|}{2} \right\} = T\{1\}$
 - if $\text{pdf}_x(x) = N(0, 1)$ and $A = 3V$
 then $\Pr(x(t) > 3V) = \int_3^{\infty} \text{pdf}_x(x).dx \triangleq T\{3\}$
- The Tail function graph is given in the next page

The graph below shows the Tail function $T\{x\}$ which represents the area from x to ∞ of the Gaussian probability density function $N(0,1)$, i.e.

$$T\{x\} = \int_x^{\infty} \frac{1}{\sqrt{2\pi}} \exp\left(-\frac{y^2}{2}\right) dy$$



Note that if $x > 6.5$ then $T\{x\}$ may be approximated by $T\{x\} \approx \frac{1}{\sqrt{2\pi}x} \exp\left(-\frac{x^2}{2}\right)$

Fourier Transform Tables

	Description	Function	Transformation
1	Definition	$g(t)$	$G(f) = \int_{-\infty}^{\infty} g(t).e^{-j2\pi ft} dt$
2	Scaling	$g(\frac{t}{T})$	$ T \cdot G(fT)$
3	Time shift	$g(t-T)$	$G(f).e^{-j2\pi fT}$
4	Frequency shift	$g(t).e^{j2\pi ft}$	$G(f-F)$
5	Complex conjugate	$g^*(t)$	$G^*(-f)$
6	Temporal derivative	$\frac{d^n}{dt^n}g(t)$	$(j2\pi f)^n \cdot G(f)$
7	Spectral derivative	$(-j2\pi t)^n \cdot g(t)$	$\frac{d^n}{df^n} G(f)$
8	Reciprocity	$G(t)$	$g(-f)$
9	Linearity	$A.g(t) + B.h(t)$	$A.G(f) + B.H(f)$
10	Multiplication	$g(t).h(t)$	$G(f) * H(f)$
11	Convolution	$g(t) * h(t)$	$G(f).H(f)$
12	Delta function	$\delta(t)$	1
13	Constant	1	$\delta(f)$
14	Rectangular function	$\text{rect}\{t\} \triangleq \begin{cases} 1 & \text{if } t < \frac{1}{2} \\ 0 & \text{otherwise} \end{cases}$	$\text{sinc}\{f\} \triangleq \frac{\sin(\pi f)}{\pi f}$
15	Sinc function	$\text{sinc}(t)$	$\text{rect}\{f\}$
16	Unit step function	$u(t) \triangleq \begin{cases} 1 & t > 0 \\ 0 & t < 0 \end{cases}$	$\frac{1}{2}\delta(f) - \frac{j}{2\pi f}$
17	Signum function	$\text{sgn}(t) \triangleq \begin{cases} 1 & t > 0 \\ -1 & t < 0 \end{cases}$	$-\frac{j}{\pi f}$
18	decaying exp (two-sided)	$e^{- t }$	$\frac{2}{1+(2\pi f)^2}$
19	decaying exp (one-sided)	$e^{- t } \cdot u(t)$	$\frac{1-2\pi f}{1+(2\pi f)^2}$
20	Gaussian function	$e^{-\pi t^2}$	$e^{-\pi f^2}$
21	Lambda function	$\Lambda\{t\} \triangleq \begin{cases} 1-t & \text{if } 0 \leq t \leq 1 \\ 1+t & \text{if } -1 \leq t \leq 0 \end{cases}$	$\text{sinc}^2\{f\}$
22	Repeated function	$\text{rep}_T\{g(t)\} = g(t) * \text{rep}_T\{\delta(t)\}$	$\frac{1}{T} \cdot \text{comb}_{\frac{1}{T}}\{G(f)\}$
23	Sampled function	$\text{comb}_T\{g(t)\} = g(t) \cdot \text{rep}_T\{\delta(t)\}$	$\frac{1}{T} \cdot \text{rep}_{\frac{1}{T}}\{G(f)\}$