

# **Multi-user FSO Communication Link**

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# Outline

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□ BLIND SOURCE SEPARATION

□ INDEPENDENT COMPONENT ANALYSIS

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□ 1°SYSTEM SETUP

➤ NO TURBULENCE CASE

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➤ NO TURBULENCE CASE

➤ HIGH TURBULENCE CASE

□ PERFORMANCE ANALYSIS

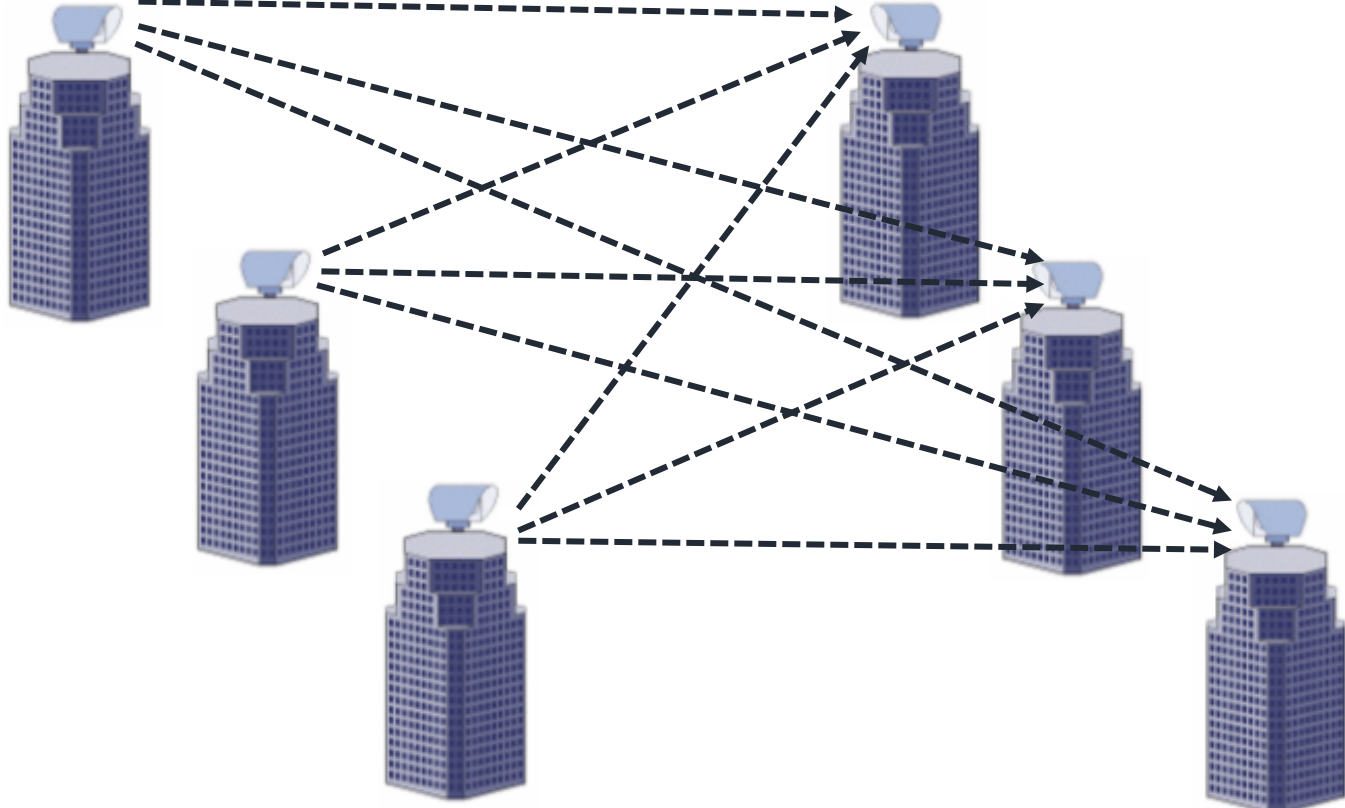
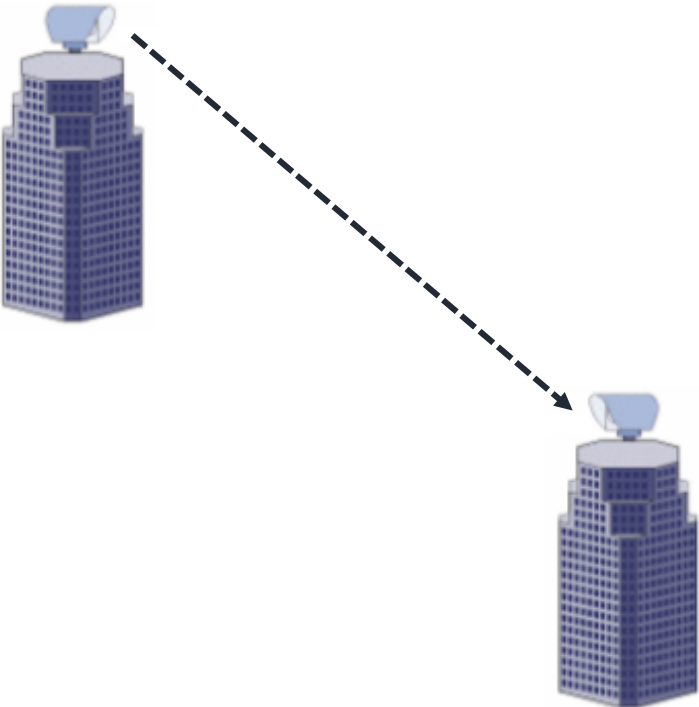
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# Motivation

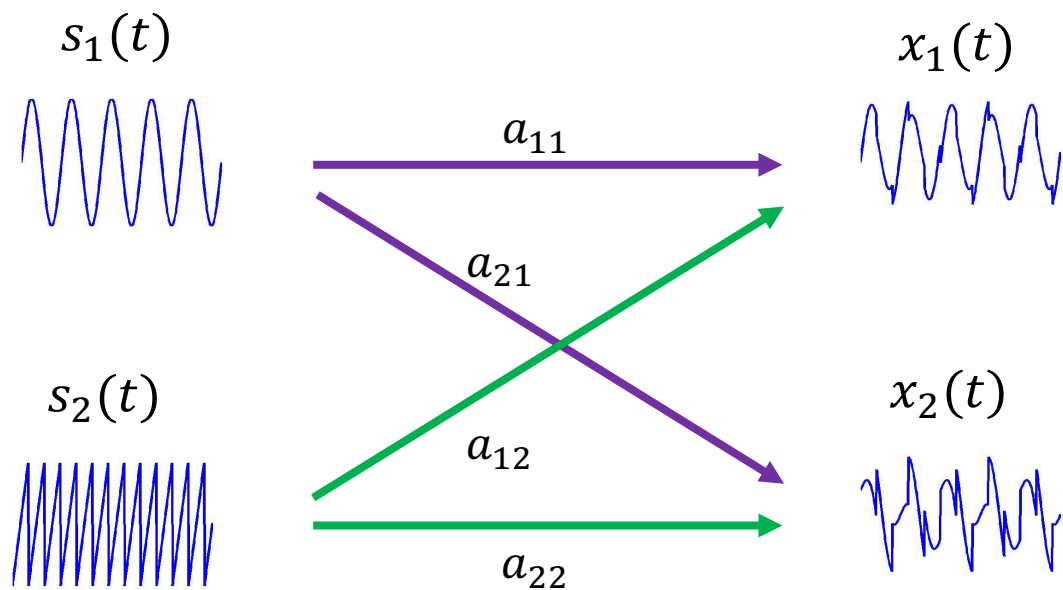
*FSO point to point topology*



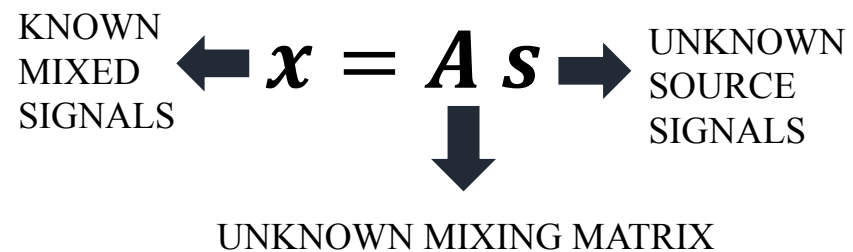
*FSO multipoint topology*



# Blind Source Separation



$$\begin{cases} x_1(t) = a_{11}s_1(t) + a_{12}s_2(t) \\ x_2(t) = a_{21}s_1(t) + a_{22}s_2(t) \end{cases}$$



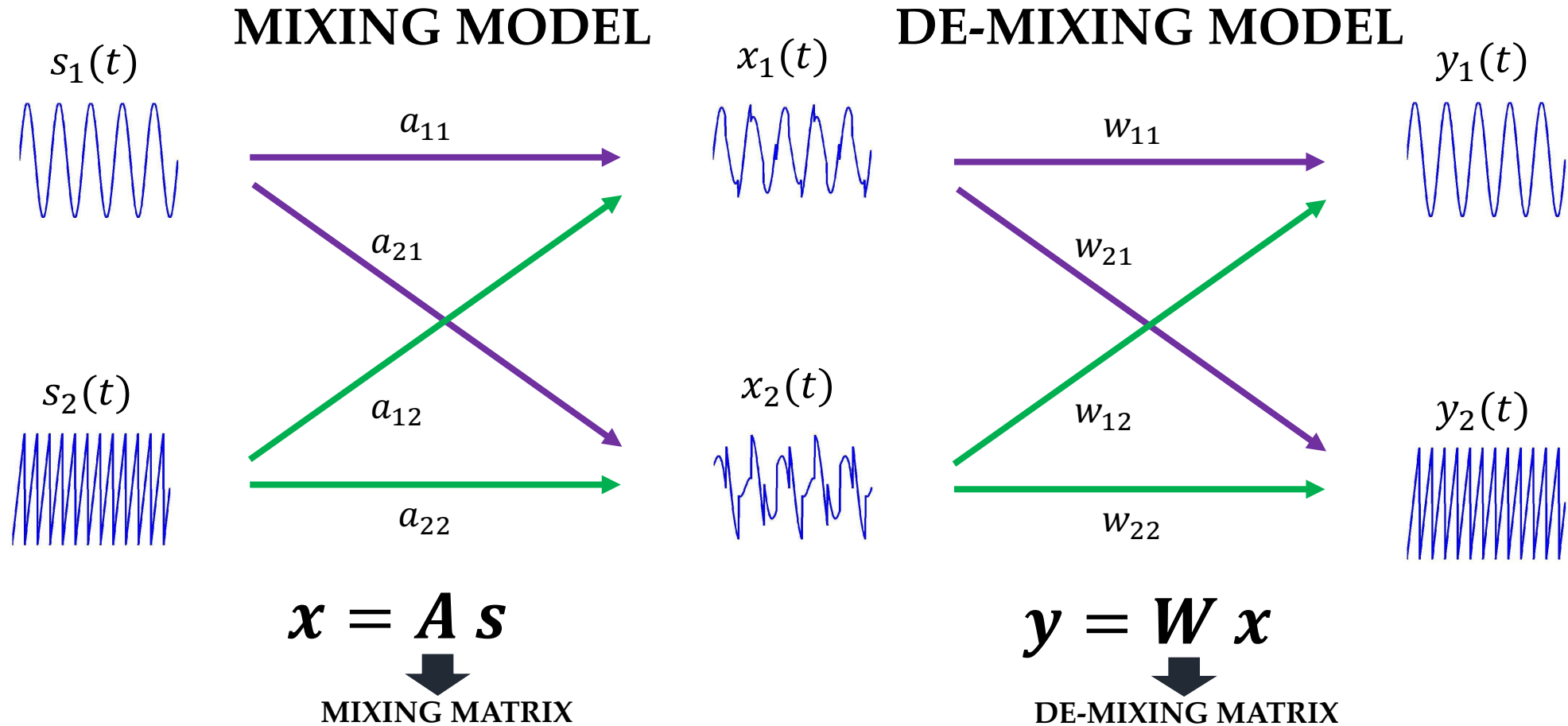
We need to estimate source signals  $\mathbf{s}$  from their observed mixtures  $\mathbf{x}$  sans information about the mixing process and original signals.



## BLIND SOURCE SEPARATION

# Independent Component Analysis

ICA is the most used method for BSS and it aims to estimate the **DE-MIXING MATRIX**



# Independent Component Analysis

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## ICA assumptions:

- Original sources  $s_i$  should be statistically independent
- At most one Gaussian distribution (not assumed to be known)
- Same number of transmitters and receivers (A is a square and non singular matrix)


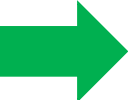
## ICA ambiguities:



$$x = \sum_i \left( \frac{1}{\alpha_i} a_i \right) (\alpha_i s_i)$$

- We cannot determine the order of the independent components
- We cannot determine the variance of the independent components:
  - Ambiguity of magnitude
  - Ambiguity of sign

# FastICA algorithm

- The most used and high-performing algorithm is the **FastICA** algorithm
- This is a high order statistic (**HOS**) methods that wants to maximize the non-Gaussianity of the data
- A measure of non-Gaussianity used is the **NEGENTROPY**:   $J(y) = H(y_{gauss}) - H(y)$  that is zero for Gaussian variables and non negative for non Gaussian variables.
- The following approximation of **NEGENTROPY** is used:   $J(y) \propto \left( E(G(y)) - E(G(v)) \right)^2$  where  $G$  is a non quadratic function

## ADVANTAGES OF THE ALGORITHM

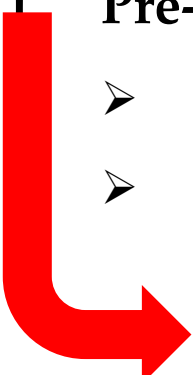
- Fast convergence (cubic or at least quadratic)
- Valid for any non-Gaussian distribution (no estimation of the probability distribution is required)
- Robust and easy to use

# FastICA algorithm

This is a *two-step* algorithm:

## 1 Pre-processing:

- **Centering:**  $x$  became a *zero-mean* variable and this implies  $s$  is *zero-mean* too
- **Whitening:**  $x$  is linearly transformed (EVD) in a new vector  $\tilde{x}$  that is *white* ( $E\{\tilde{x}\tilde{x}^T\}=I$ ) and  $A$  is transformed in a new *orthogonal* matrix  $\tilde{A}$  ( $\tilde{A}\tilde{A}^T = I$ )


 Lower solution complexity from  $n^2$  to  $n(n-1)/2$  parameters should be estimated

## 2. Algorithm:

- The optimum  $E\{G(w^T x)\}$  that maximizes  $J(w^T x)$  is found using Lagrange:

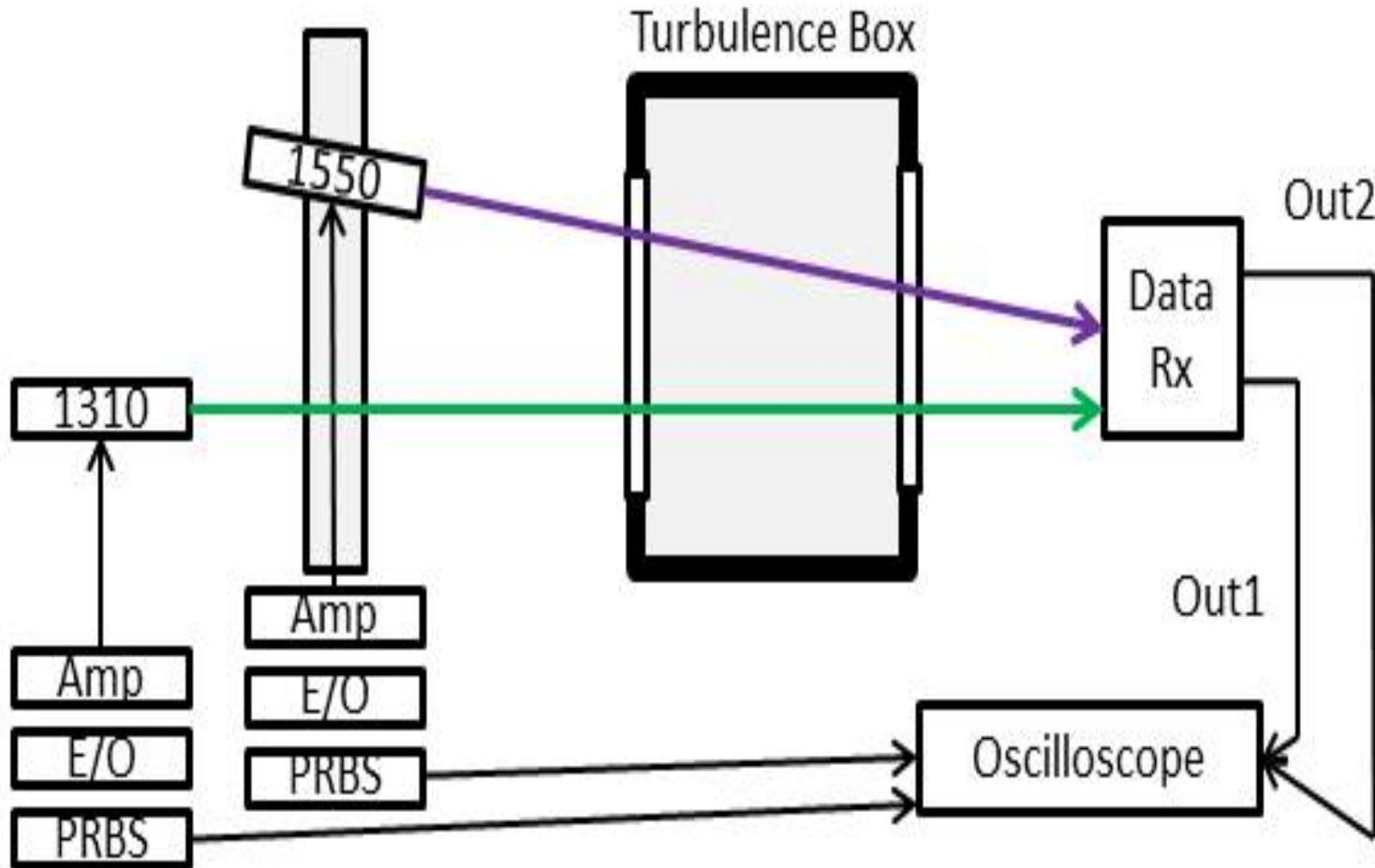
1)  $\mathcal{L} = E\{xg(w^T x)\} + \lambda w$

2)  $\frac{d\mathcal{L}}{dw} = E\{xx^T g'(w^T x)\} + \lambda I = 0$

3)  $w = E\{xg(w^T x)\} - E\{g'(w^T x)\} w$   Iterate until convergence



# 1° System Setup



$Tx_1$  1310 nm ( $\theta_{Tx1} = 0^\circ$ )

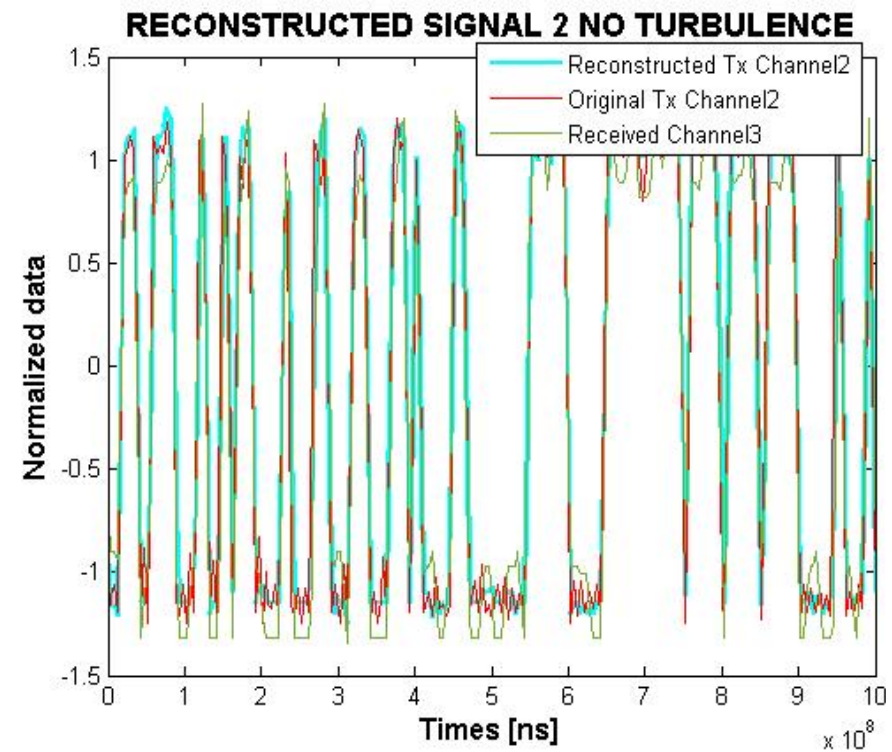
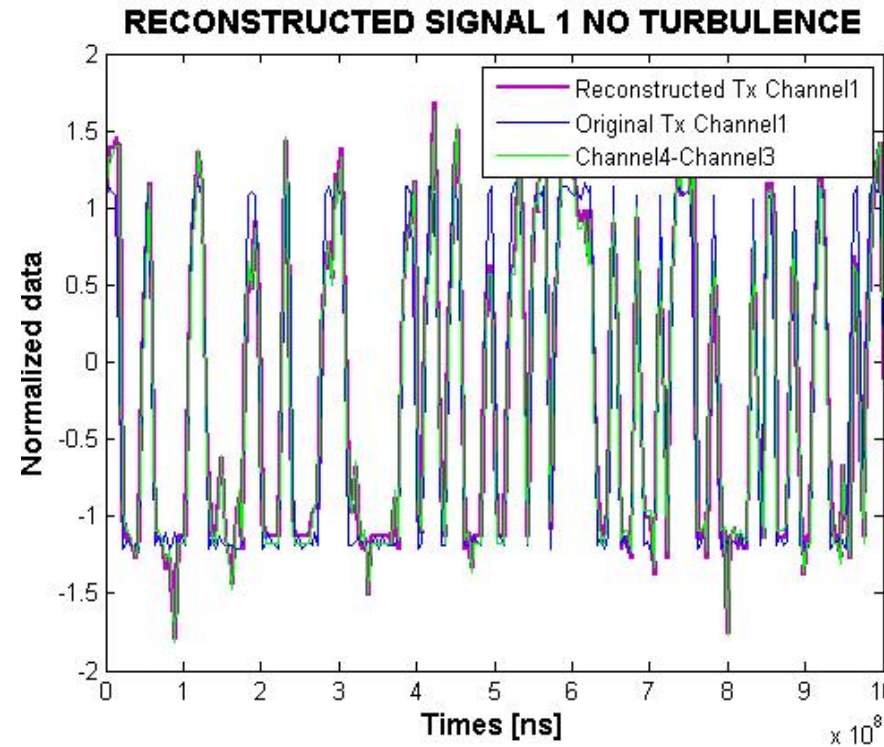
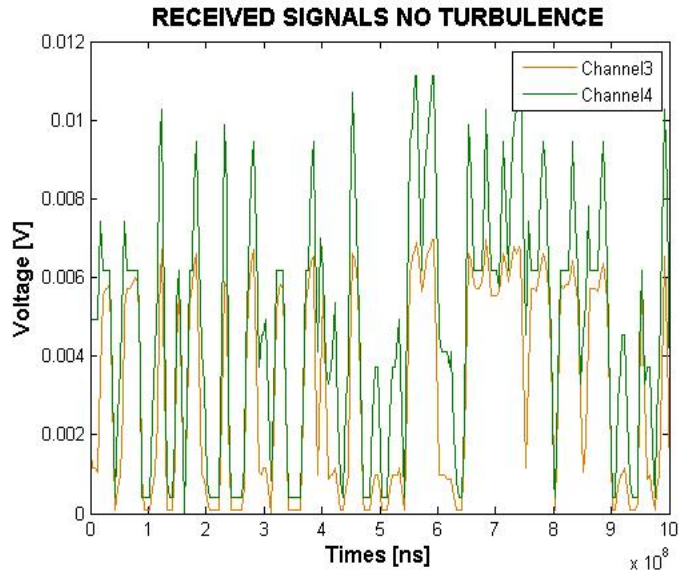
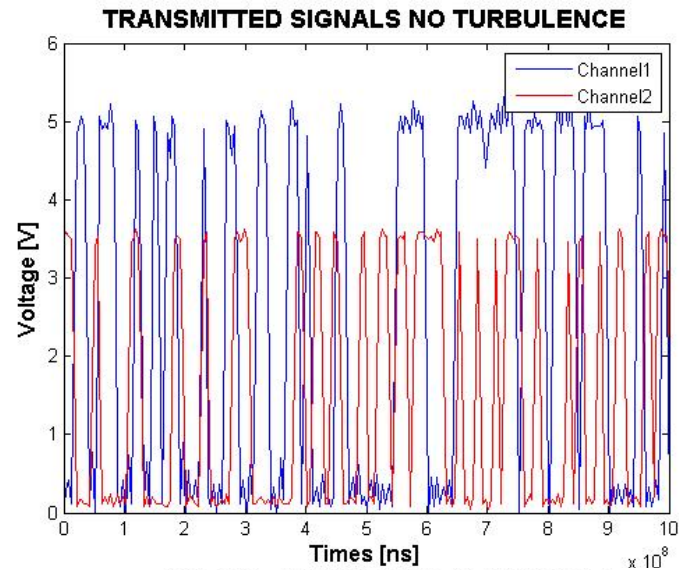
$Tx_2$  1550 nm ( $\theta_{Tx2} = 15^\circ$ )

$$\begin{cases} Out_1 = a_{11}Tx_1 + a_{12}Tx_2 \\ Out_2 = a_{22}Tx_2 \end{cases}$$

**DIFFERENT LEVELS OF TURBULENCE:**

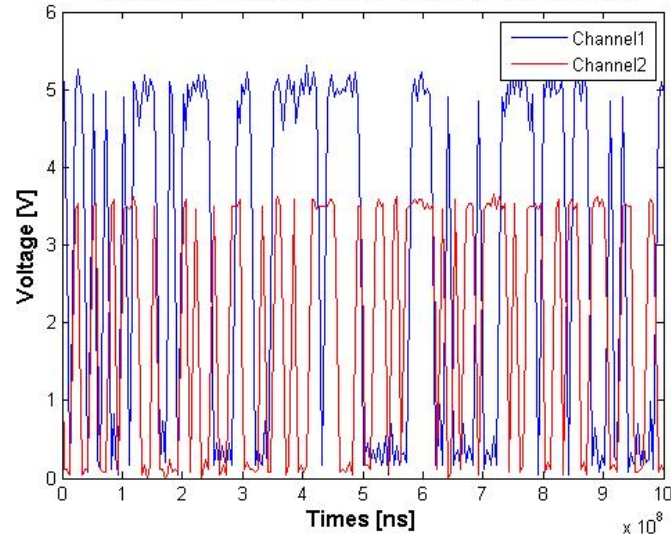
no turbulence, low, medium, high

# No turbulence case

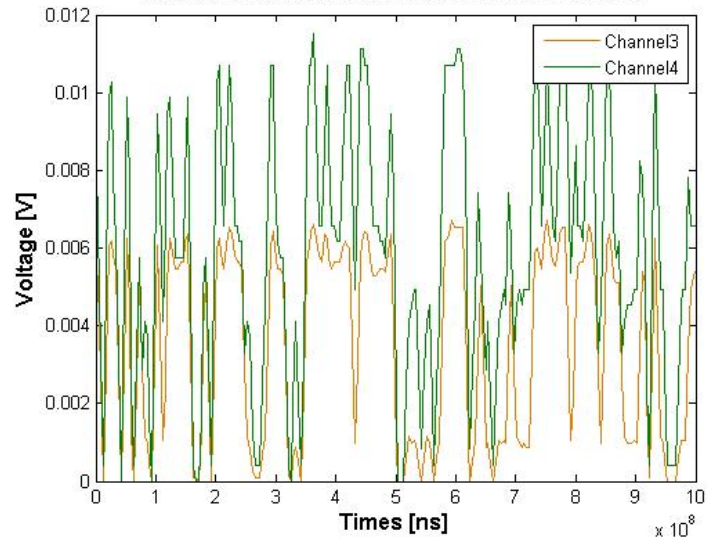


# High turbulence case

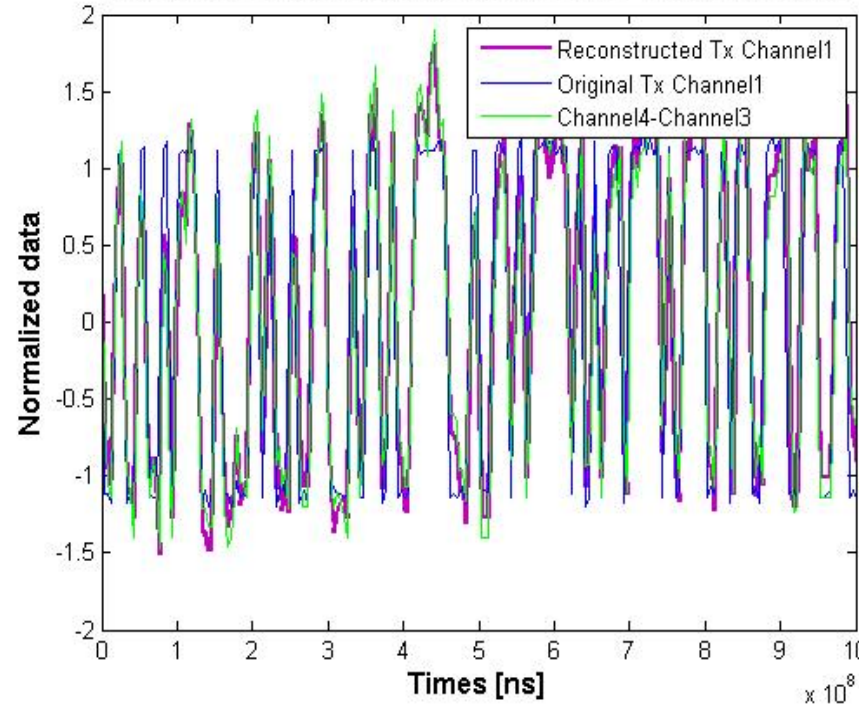
TRANSMITTED SIGNALS HIGH TURBULENCE



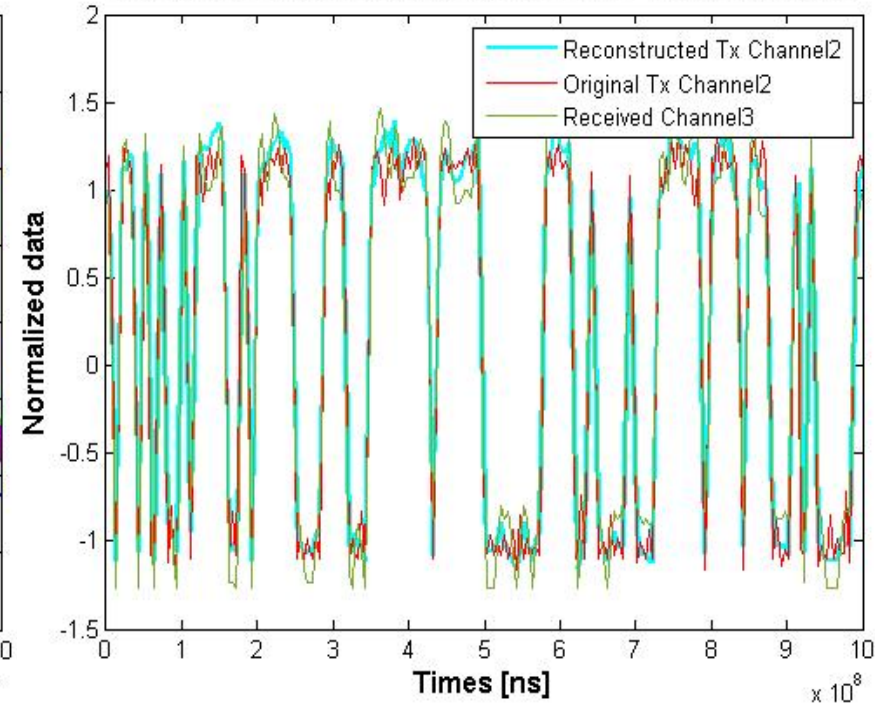
RECEIVED SIGNALS HIGH TURBULENCE



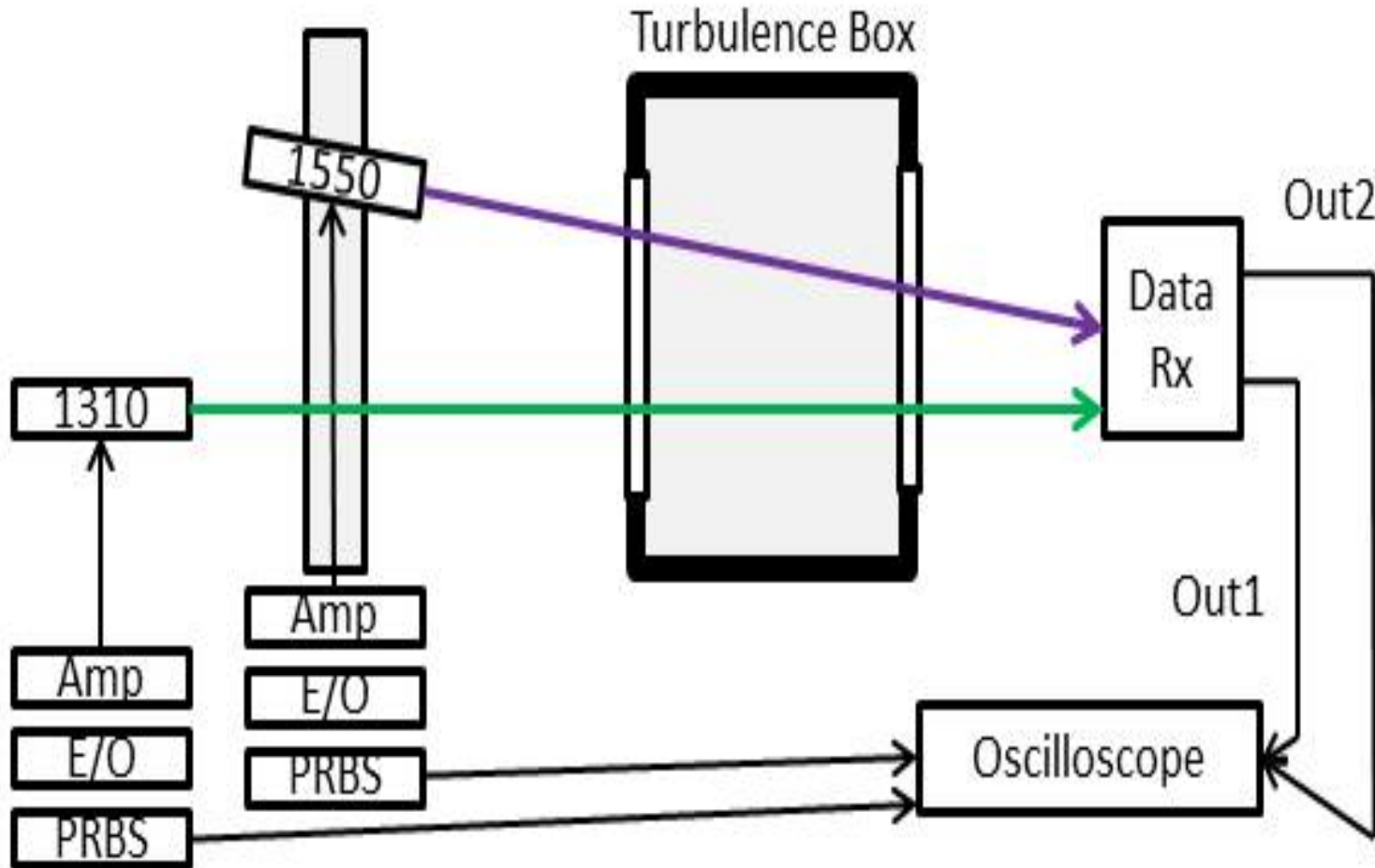
RECONSTRUCTED SIGNAL 1 HIGH TURBULENCE



RECONSTRUCTED SIGNAL 2 HIGH TURBULENCE



# 2° System Setup



$Tx_1$  1310 nm ( $\theta_{Tx1} = 0^\circ$ )

$Tx_2$  1550 nm ( $\theta_{Tx2} = 10^\circ$ )

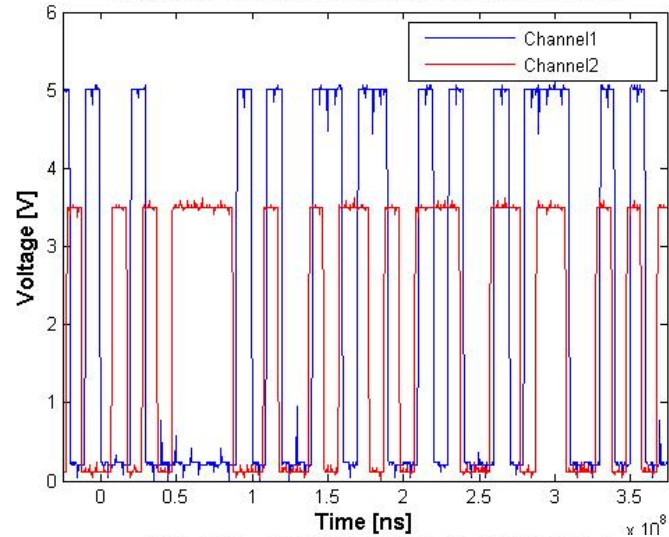
$$\begin{cases} Out_1 = a_{11}Tx_1 + a_{12}Tx_2 \\ Out_2 = a_{21}Tx_1 + a_{22}Tx_2 \end{cases}$$

**DIFFERENT LEVELS OF TURBULENCE:**

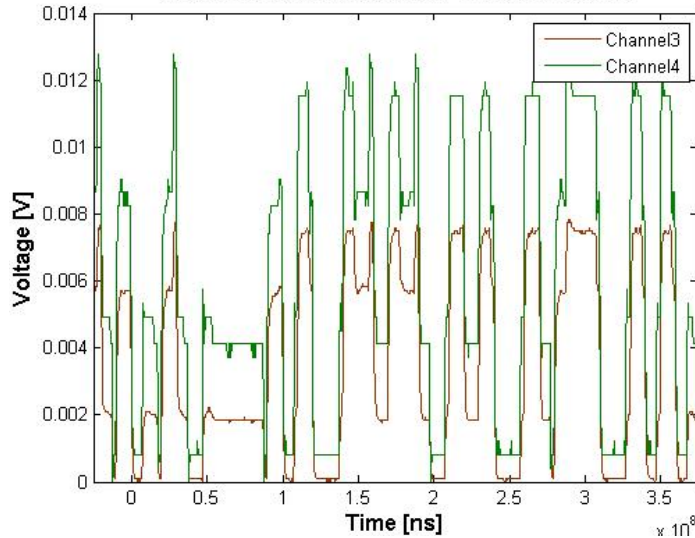
no turbulence, low, medium, high

# No turbulence case

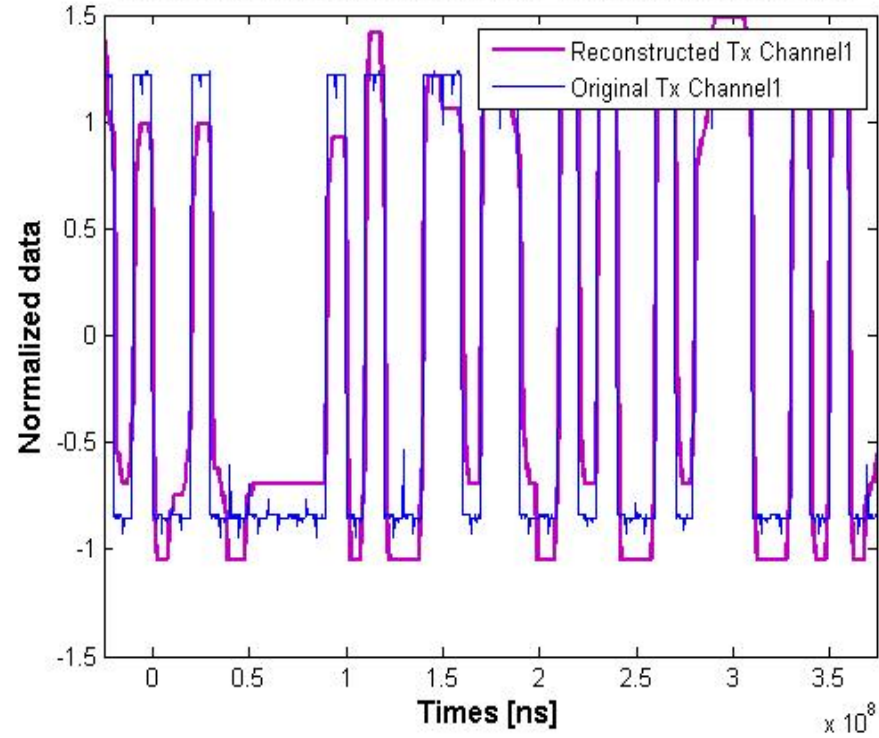
TRANSMITTED SIGNALS NO TURBULENCE



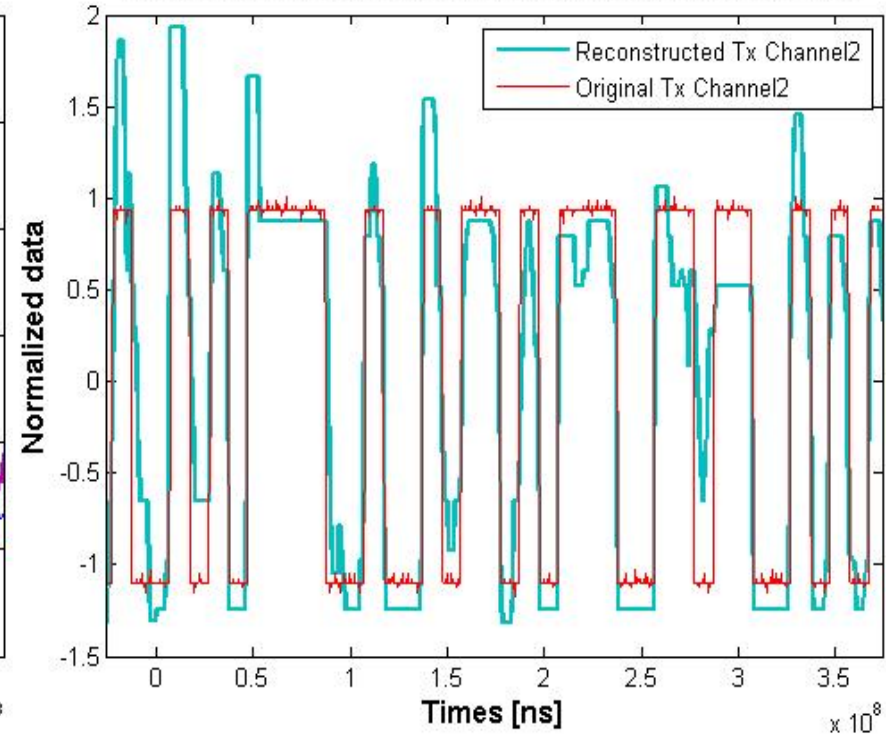
RECEIVED SIGNALS NO TURBULENCE



RECONSTRUCTED SIGNAL 1 NO TURBULENCE

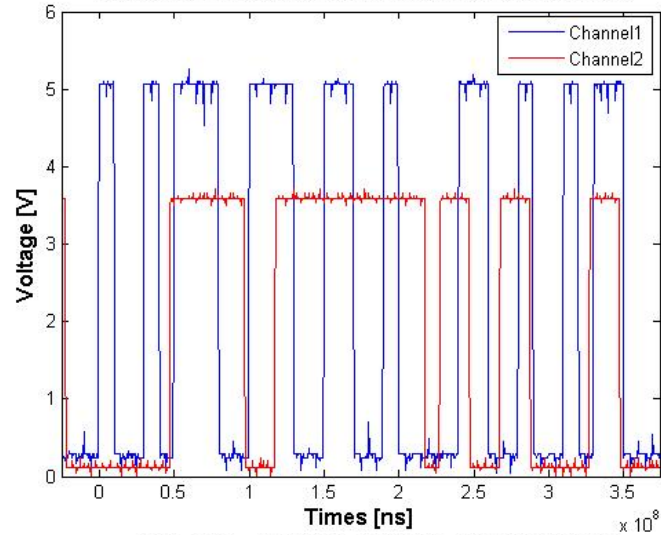


RECONSTRUCTED SIGNAL 2 NO TURBULENCE

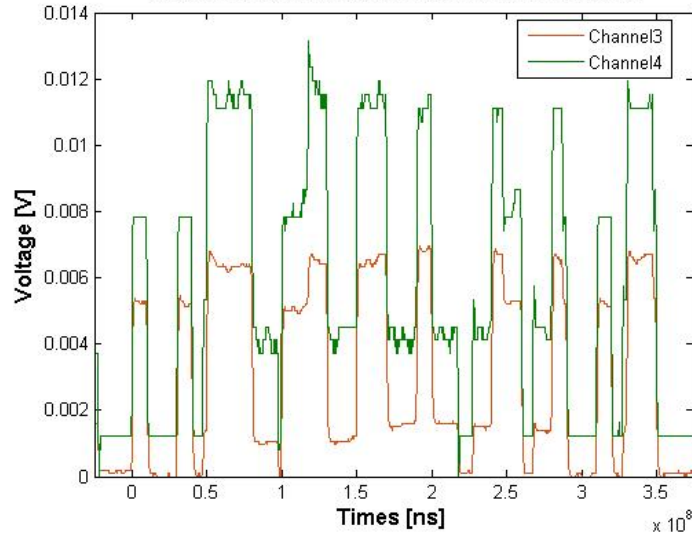


# High turbulence case

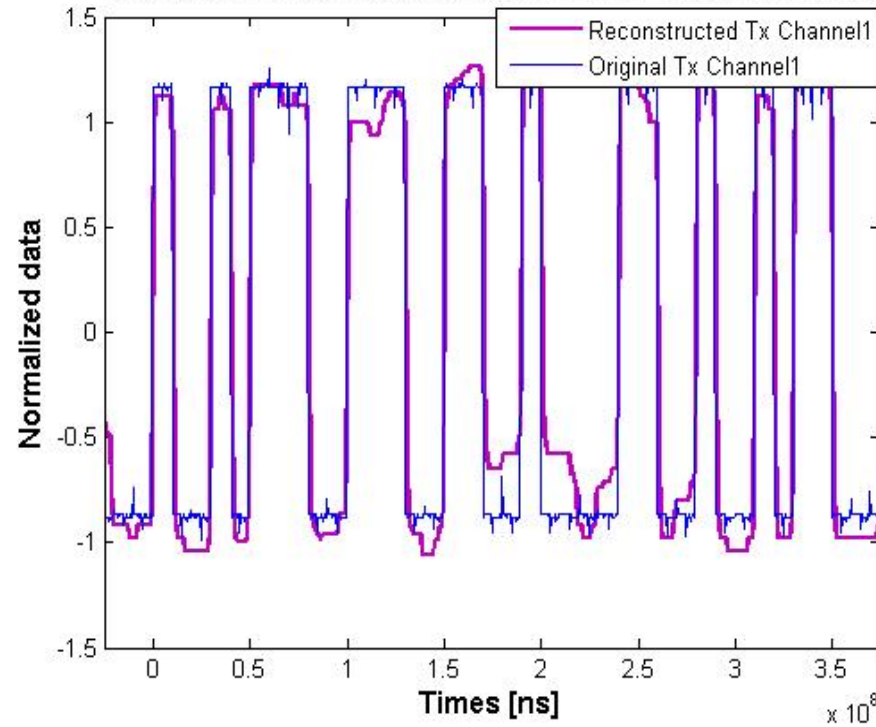
TRANSMITTED SIGNALS HIGH TURBULENCE



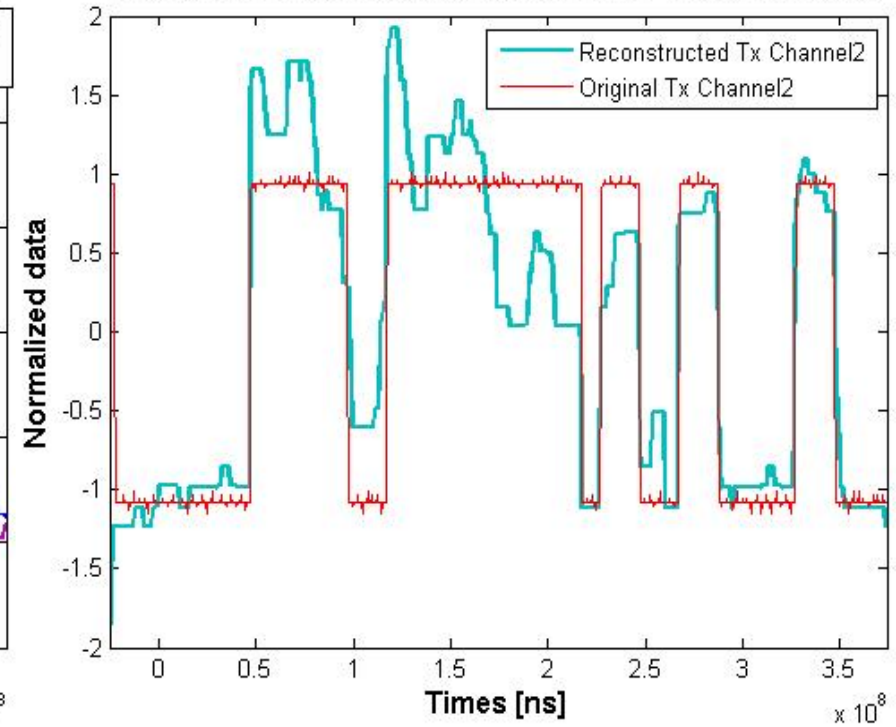
RECEIVED SIGNALS HIGH TURBULENCE



RECONSTRUCTED SIGNAL 1 HIGH TURBULENCE



RECONSTRUCTED SIGNAL 2 HIGH TURBULENCE



# Performance Analysis

**PERFORMANCE INDEX** →

$$PI = \sum_{i=1}^N \left( \frac{\sum_{k=1}^N |q_{ik}|^2}{\max_p [ |q_{ip}|^2 ]} - 1 \right) + \sum_{k=1}^N \left( \frac{\sum_{i=1}^N |q_{ik}|^2}{\max_p [ |q_{pk}|^2 ]} - 1 \right)$$

where  
 $Q = WA$

In the Second System Setup the PI was evaluated:

**NO TURBULENCE**

**PI=0.301**



**GOOD SEPARATION!!!**

**HIGH TURBULENCE**

**PI=1.834**



**ACCEPTABLE SEPARATION!!!**

**Thanks!!!**