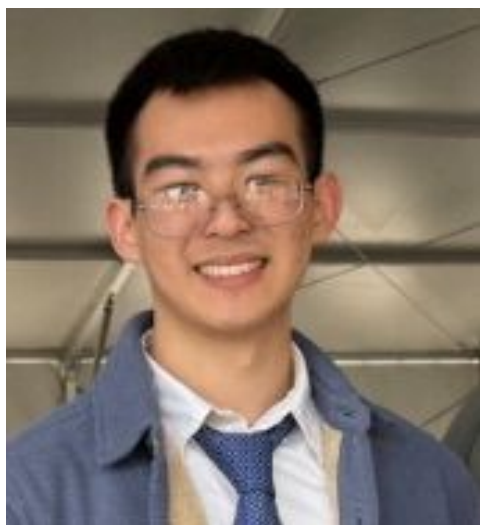




# **Quantum-Inspired Computing for Large-Scale NOMA-MIMO Wireless Networks**

Interns: Jeffrey Tang, Alex Markley  
Advisors: Minsung Kim, Byungjun Kim

# Project Team



Jeffrey Tang

Rutgers Undergraduate,  
B.S. Computer Science  
and Mathematics



Alex Markley

Rutgers Graduate Student,  
M.S. Computer Science



Minsung Kim

Rutgers Assistant Professor,  
Dept. of Computer Science



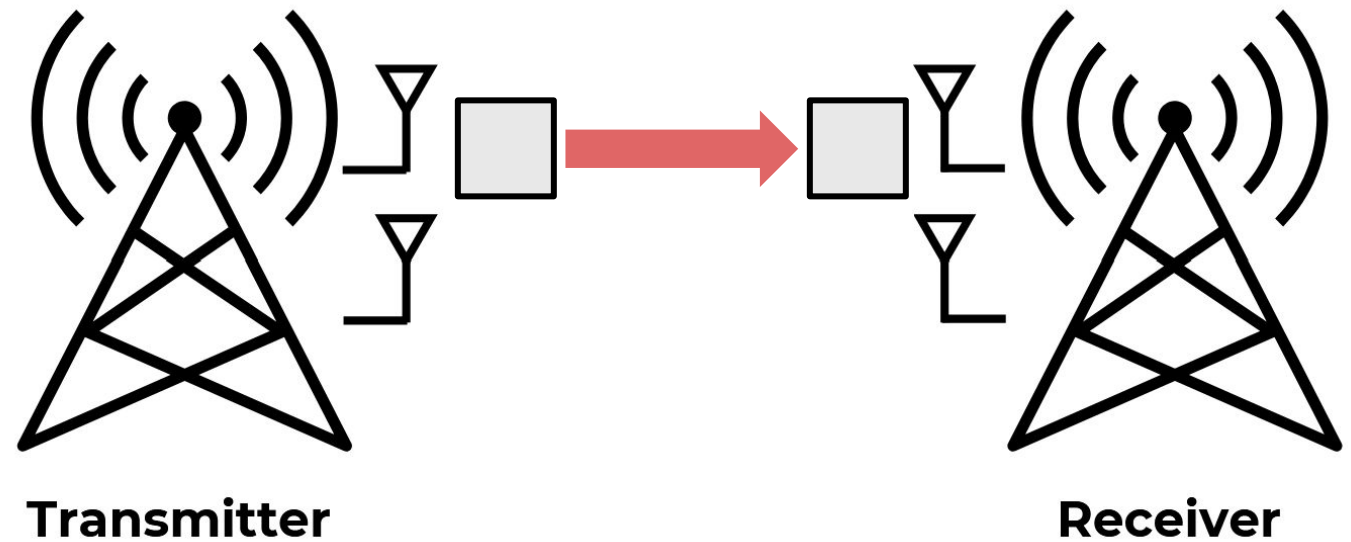
Byungjun Kim

Rutgers Postdoc Researcher

# Set Up

For wireless communication, we send data using radio waves.

The path over the air is called a “channel”.



**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

**Solution 2: MIMO Detection**

**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

**Solution 2: MIMO Detection**

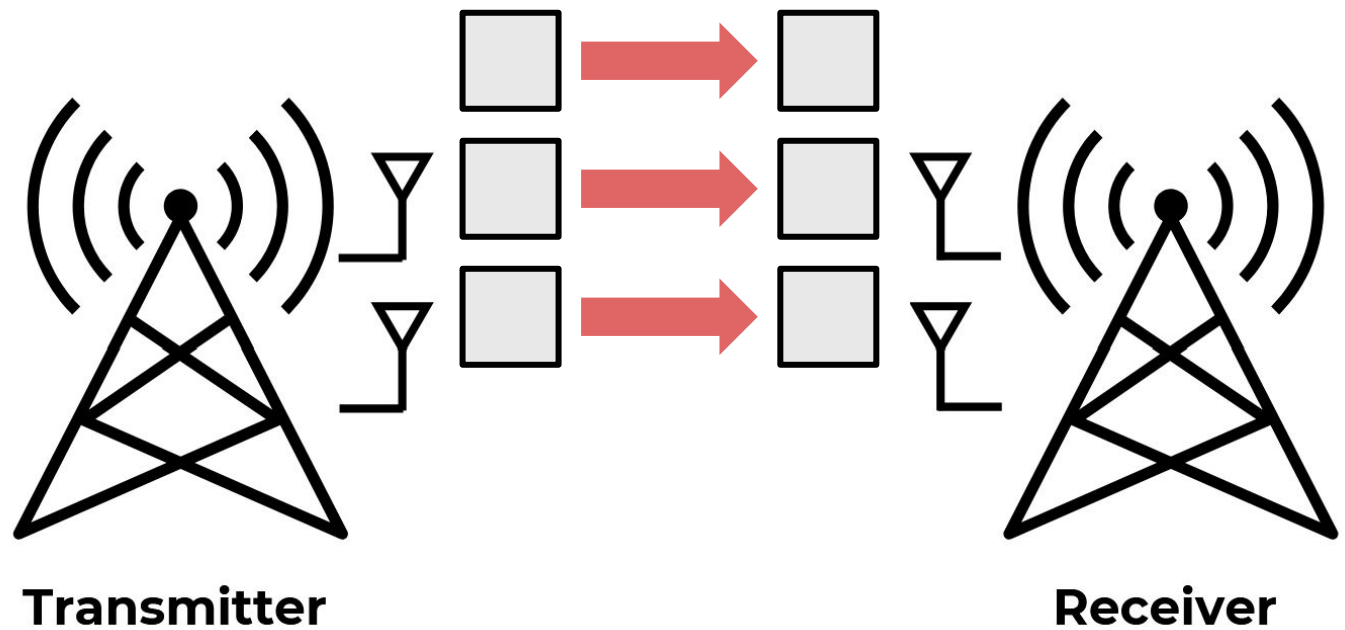
**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

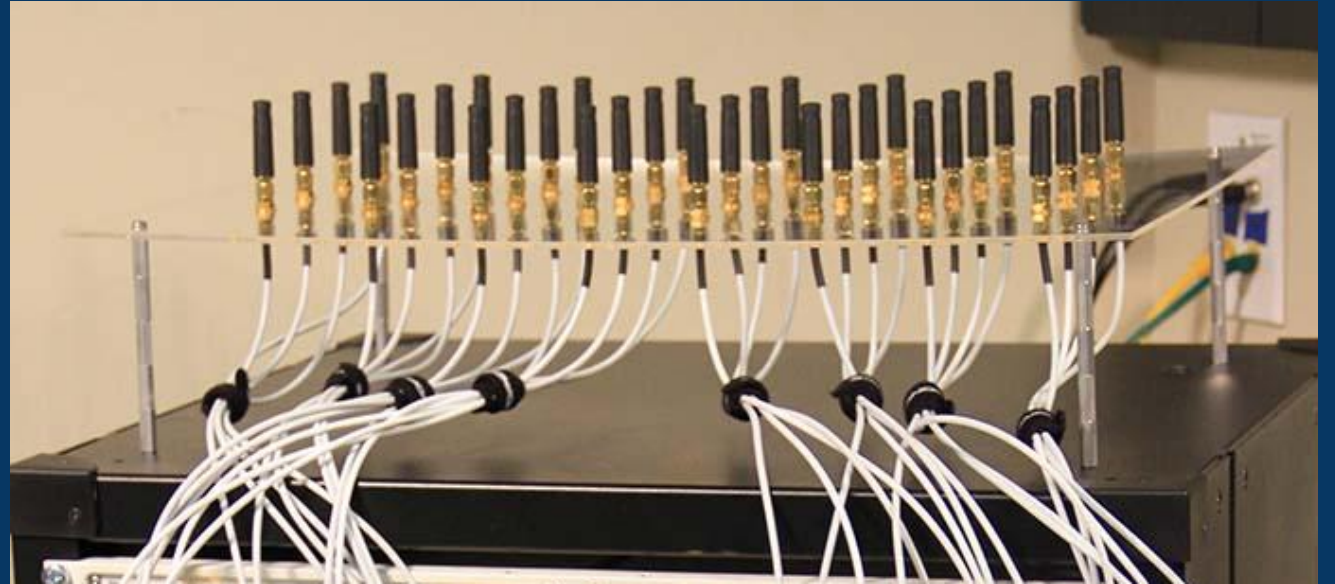
# Solution 1: MIMO

Send more data at once.

We can use Multiple Input Multiple Output (MIMO) to increase throughput and service more users!



# MIMO Rack





**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

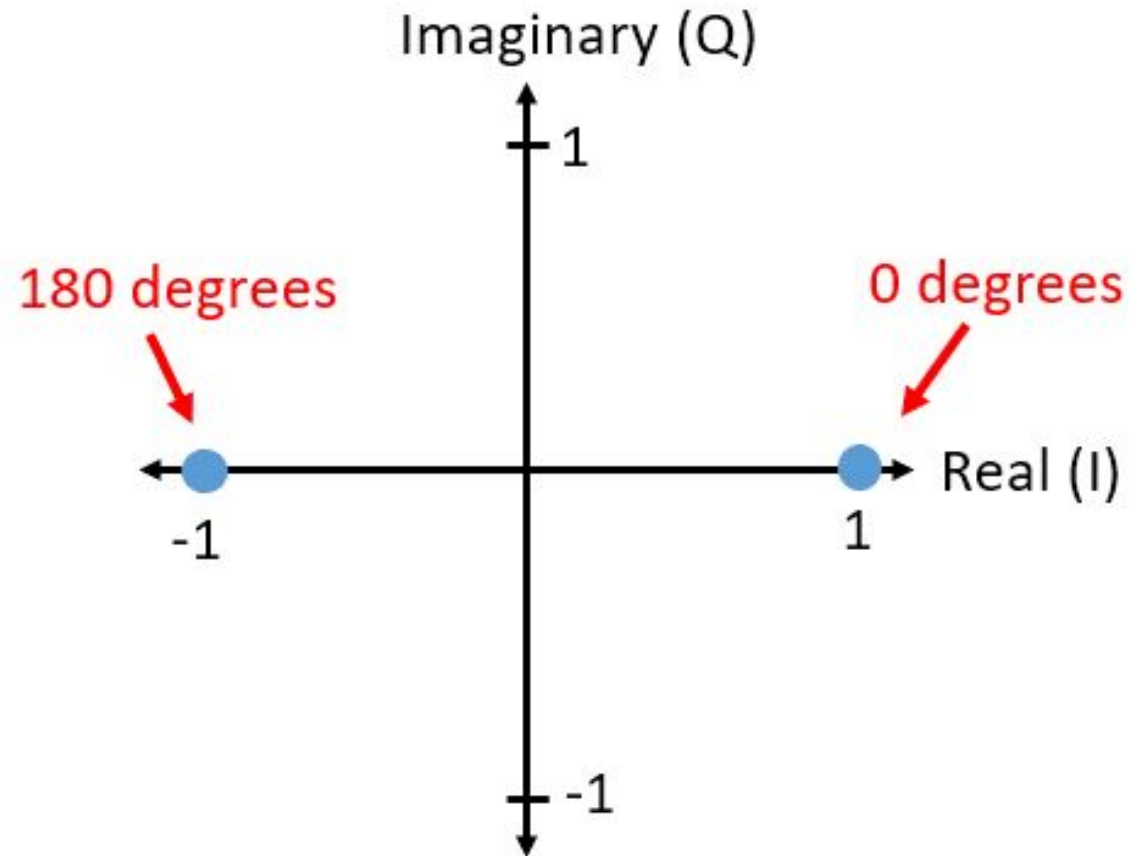
**Solution 2: MIMO Detection**

**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

# Problem

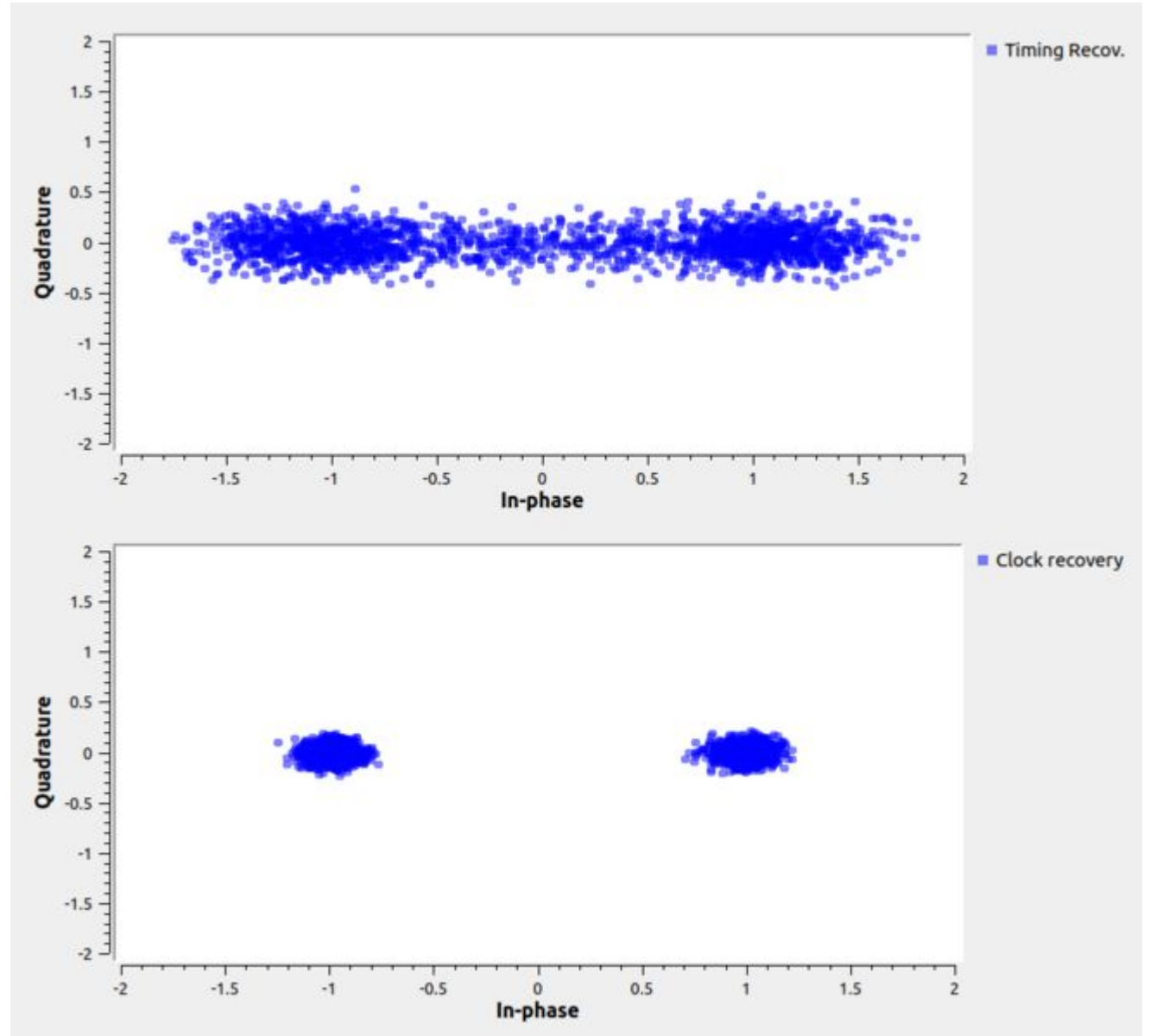
Transmitted messages are exact “symbols” (like 1s and -1s)



# Problem

Noisy channel conditions can disrupt the message

What was the intended message?



**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

**Solution 2: MIMO Detection**

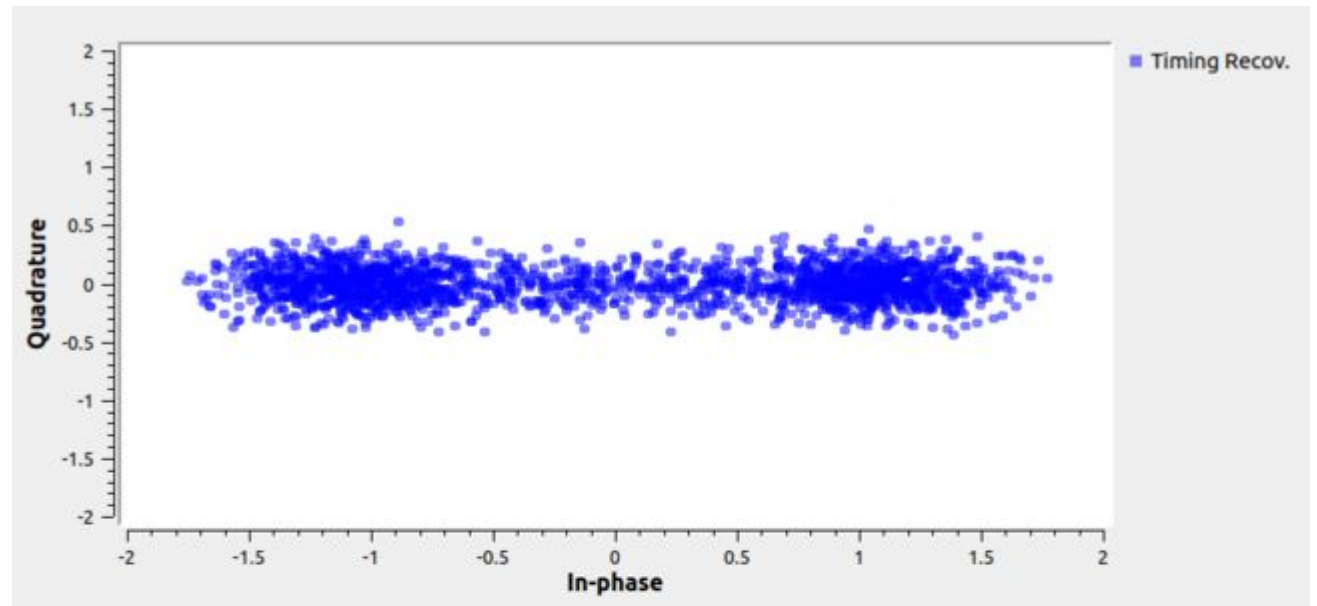
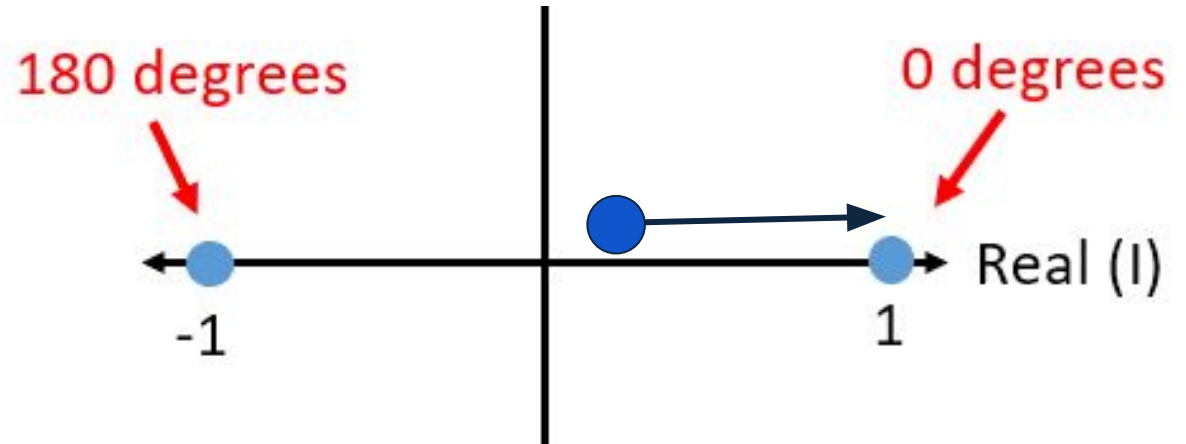
**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

# Solution: MIMO Detection

MIMO Detection maps the observed signal back to the intended message

In noisy environments, this is challenging.



**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

**Solution 2: MIMO Detection**

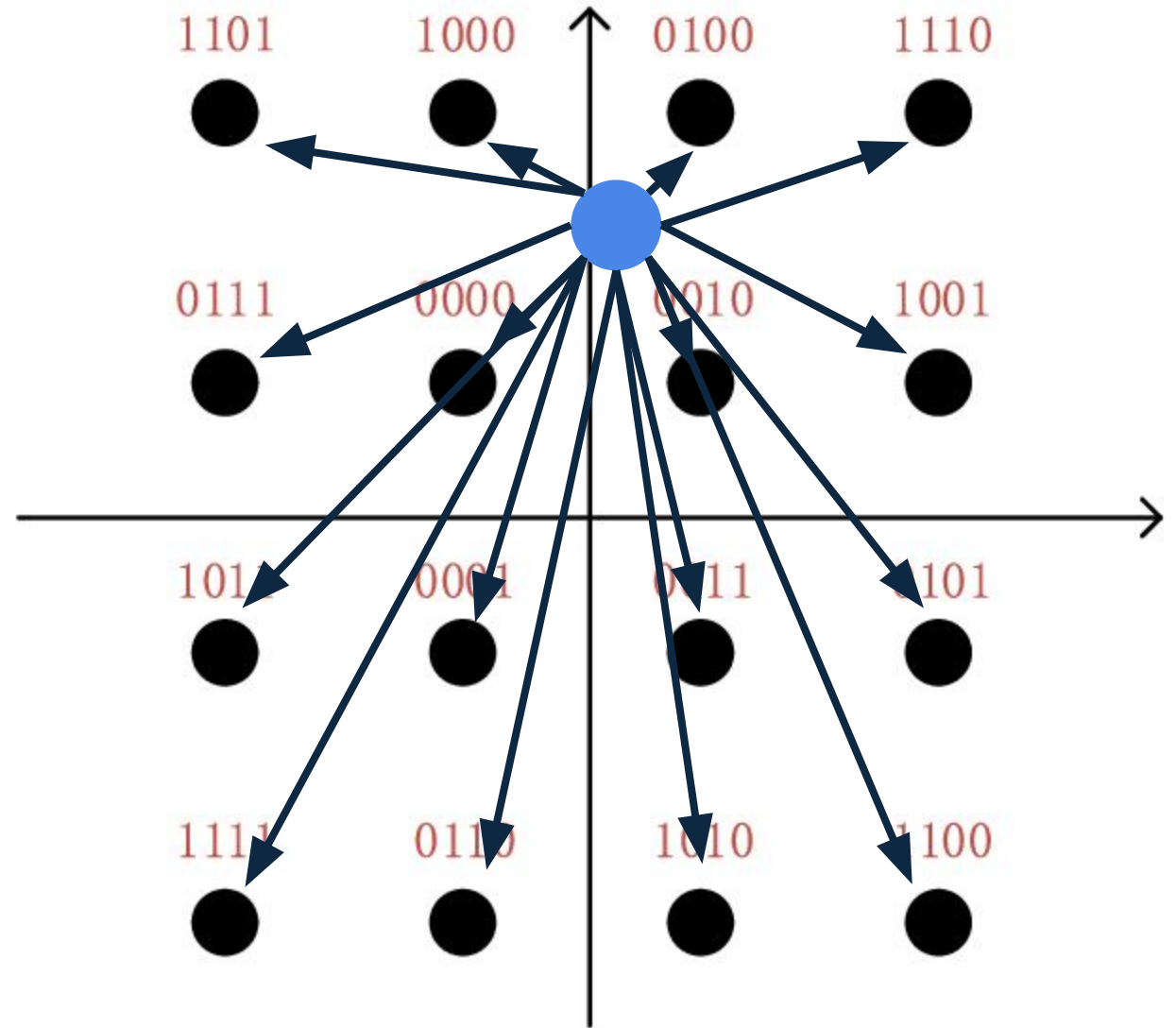
**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

# Maximum Likelihood (ML) MIMO Detection

Compute distance of every combination.

The closest message is most likely to be correct.



# Maximum Likelihood (ML) MIMO Detection

Compute distance of every combination.

The closest message is most likely to be correct.



$2^1 = 2$  possibilities



$2^2 = 4$  possibilities



$2^3 = 8$  possibilities



$2^4 = 16$  possibilities



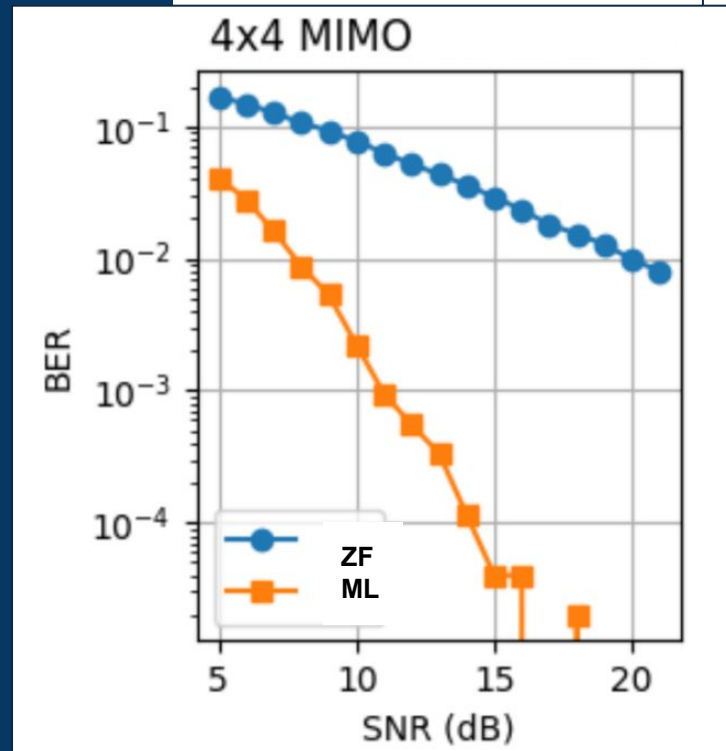
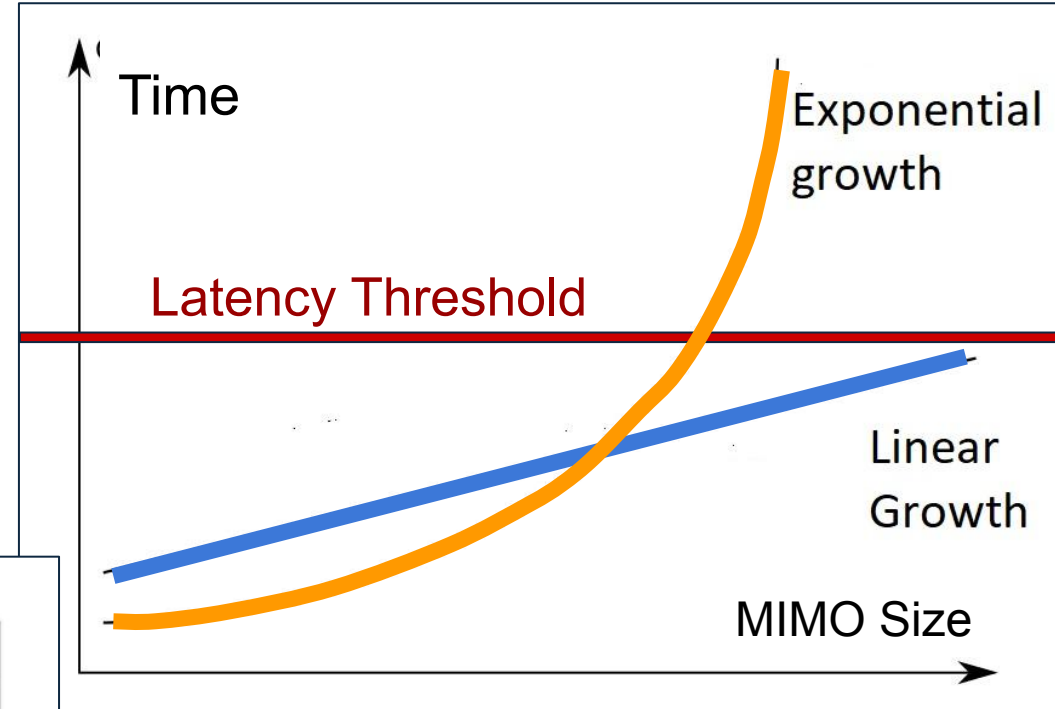
$2^8 = 256$



$2^{16} = 65,536$

# Maximum Likelihood (ML) MIMO Detection

We want to use optimal MIMO detectors since they have lower error rate, but they're too slow.



Note: Lower is better on both plots

**Problem 1: Low Performance**

**Solution 1: MIMO**

**Problem 2: Noise**

**Solution 2: MIMO Detection**

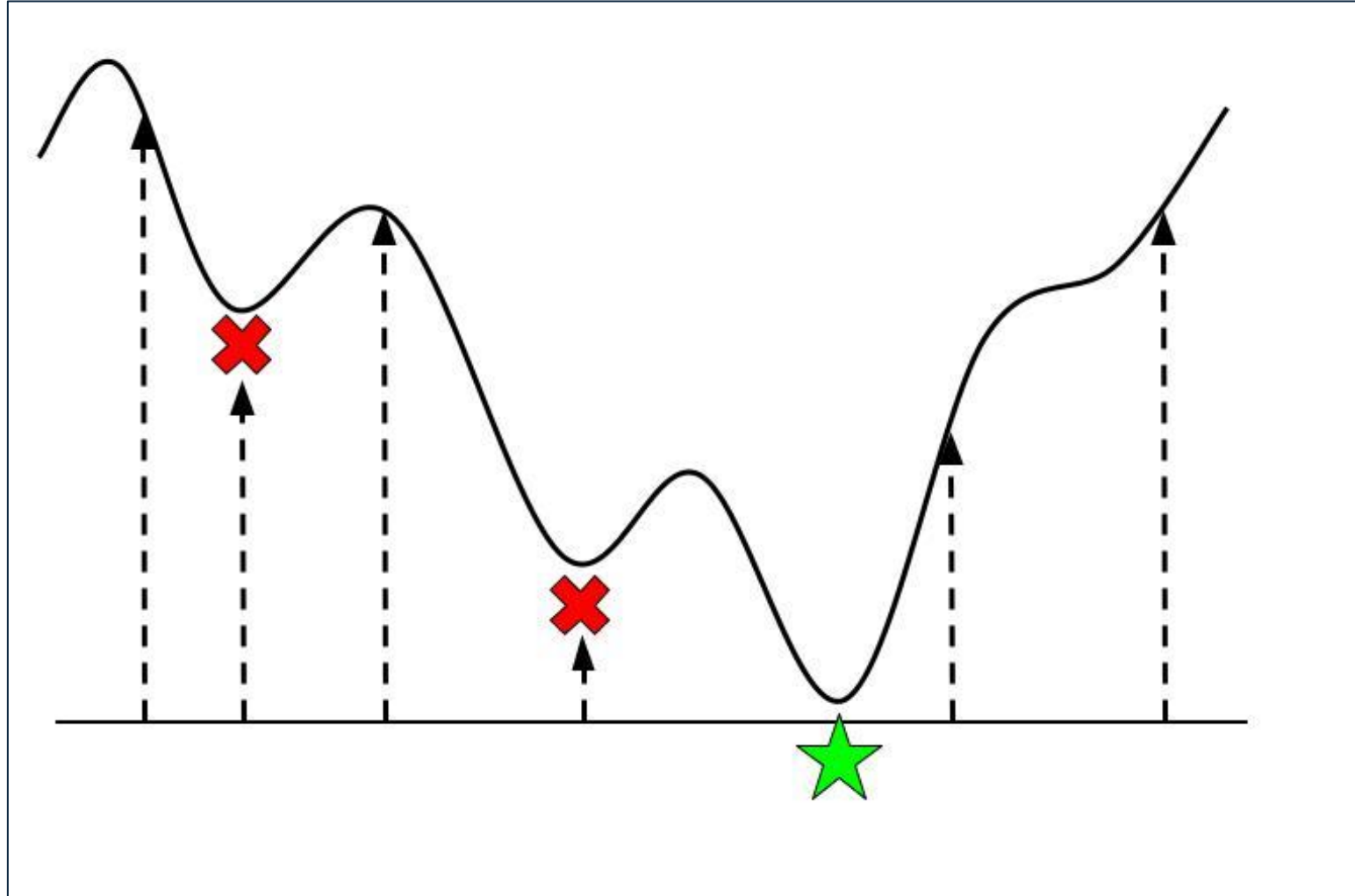
**Problem 3: MIMO Detection is slow**

**Solution 3: ParaMax!**

# ParaMax MIMO Detection

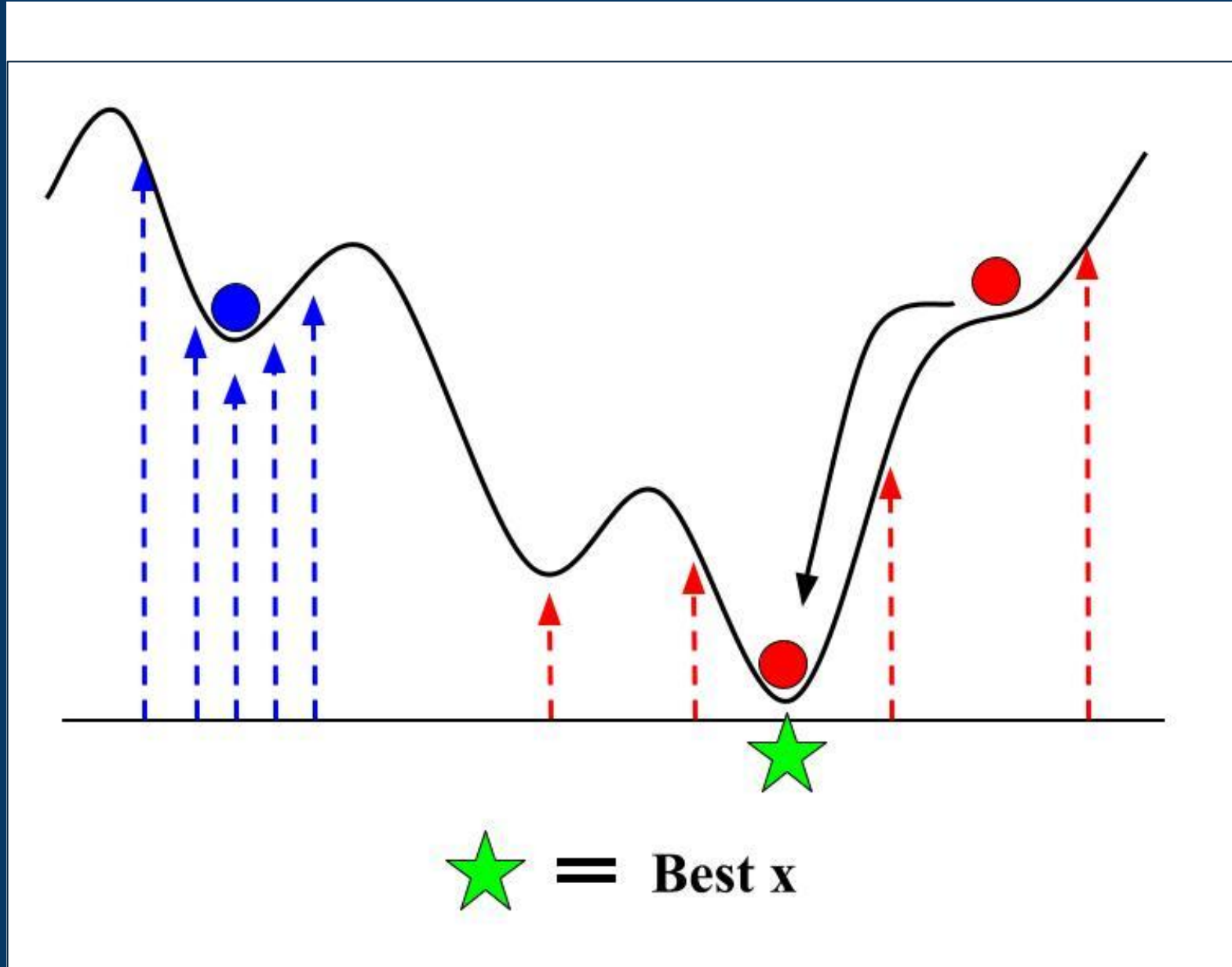
Instead of trying all values.

Sample possible values and start to settle into a minima if we find one.



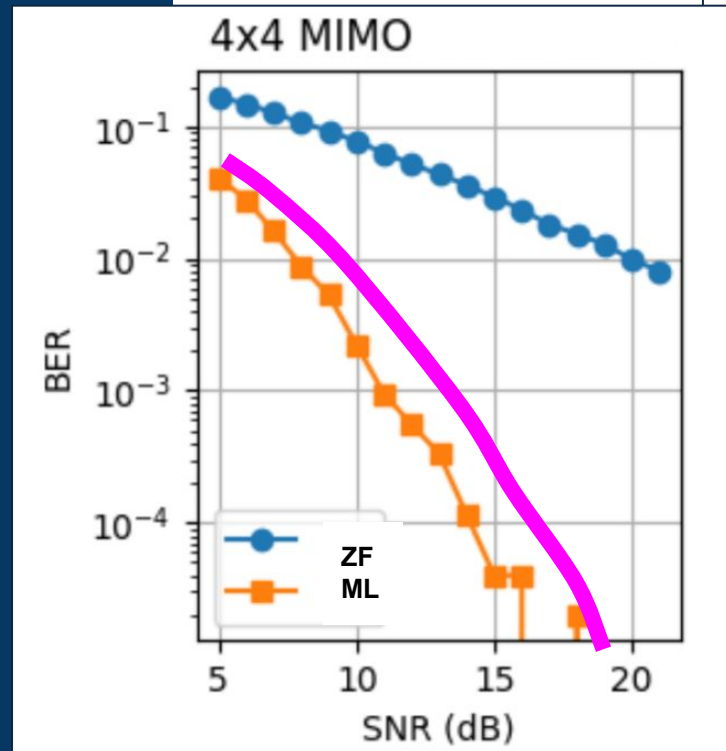
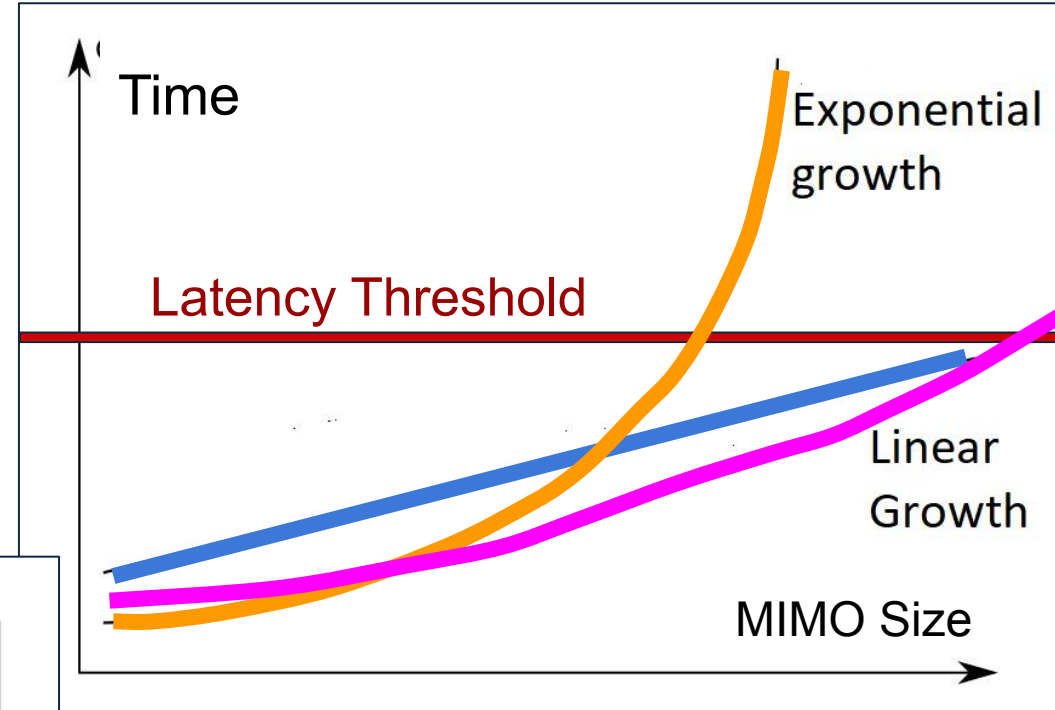
# ParaMax MIMO Detection

Add multiple parallel annealers, one that stays near the best solution so far and one that explores for a better minima.



# ParaMax MIMO Detection

ParaMax is designed to provide near-optimal BER and run quickly.



Note: Lower is better on both plots

**Our goal:**  
**Hardware Implementation of ParaMax**

First ever hardware implementation of a  
quantum-inspired MIMO detection algorithm

# **Internship Results & Relation to Quantum-Inspired Computing and Project Objectives**

**TX 1**

**DATA**

EMPTY

EMPTY

**TX 2**

EMPTY

**DATA**

EMPTY

**TX 3**

EMPTY

EMPTY

**DATA**

**TIME**

# ParaMax Implementation

**Single Transmitter**

**Single Receiver**

**Multiple Transmitters**

**Multiple Receivers**

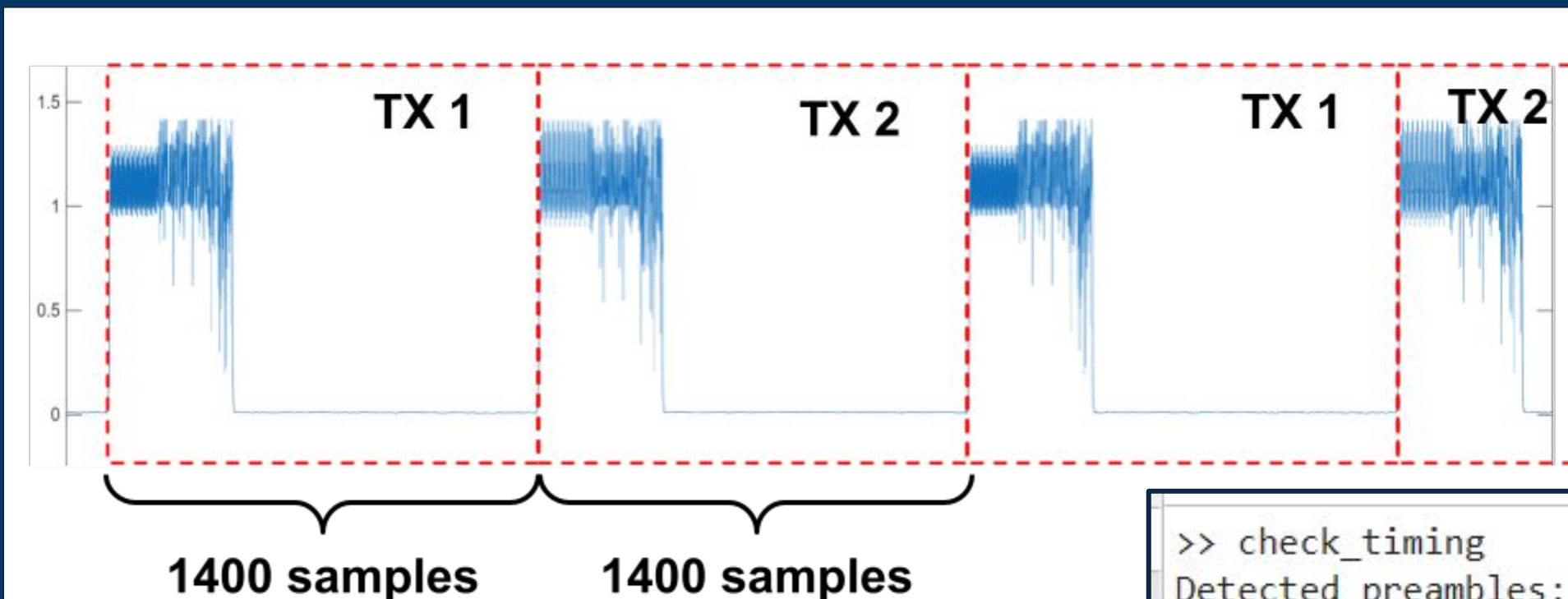
**Offline MIMO Detectors**

**Real-time MIMO Detectors**

**Blind MIMO**

**NOMA**

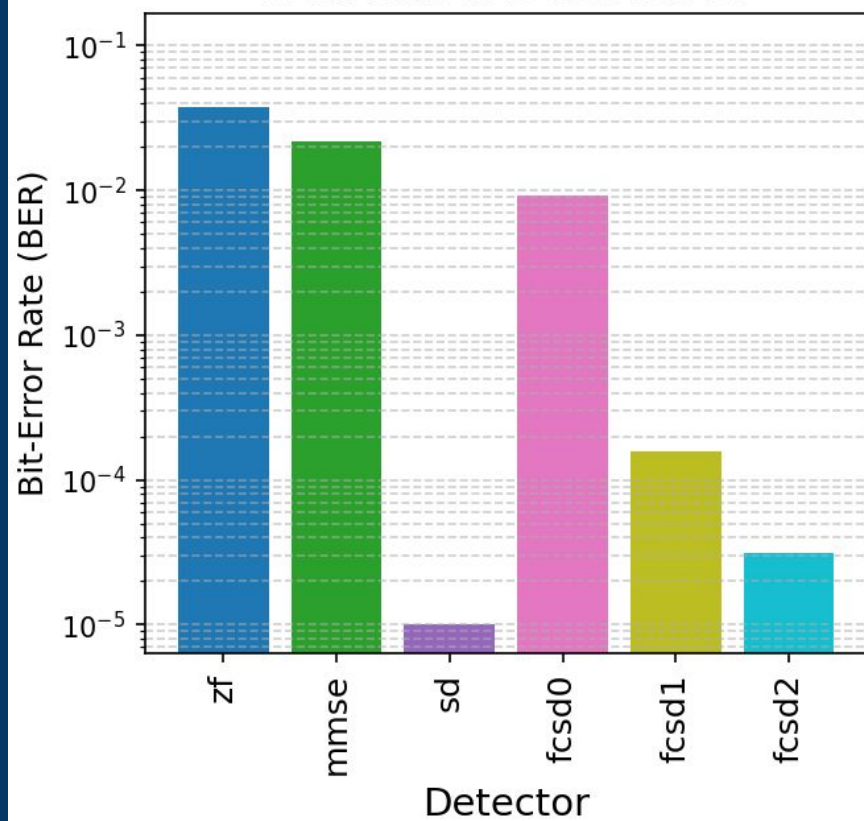
**We achieved perfect time synchronization, with precision down to 50 nanoseconds - 50 billionths of a second!**



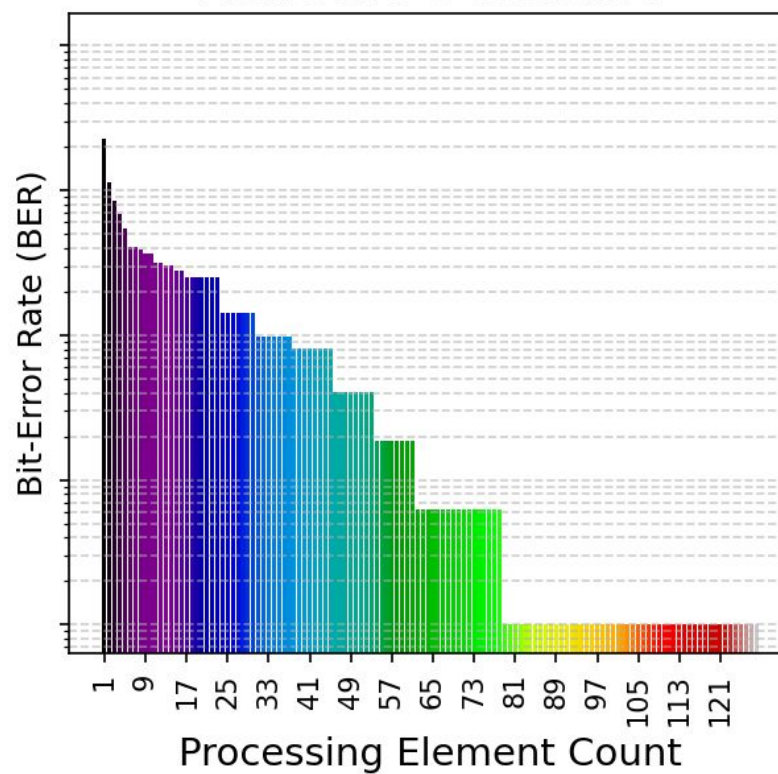
```
>> check_timing  
Detected preambles: 600  
Distance is consistent: 1400 samples  
>>
```

# Bit Error Rate (BER) by Detector Type at Signal-to-Noise Ratio (SNR) = 25 dB

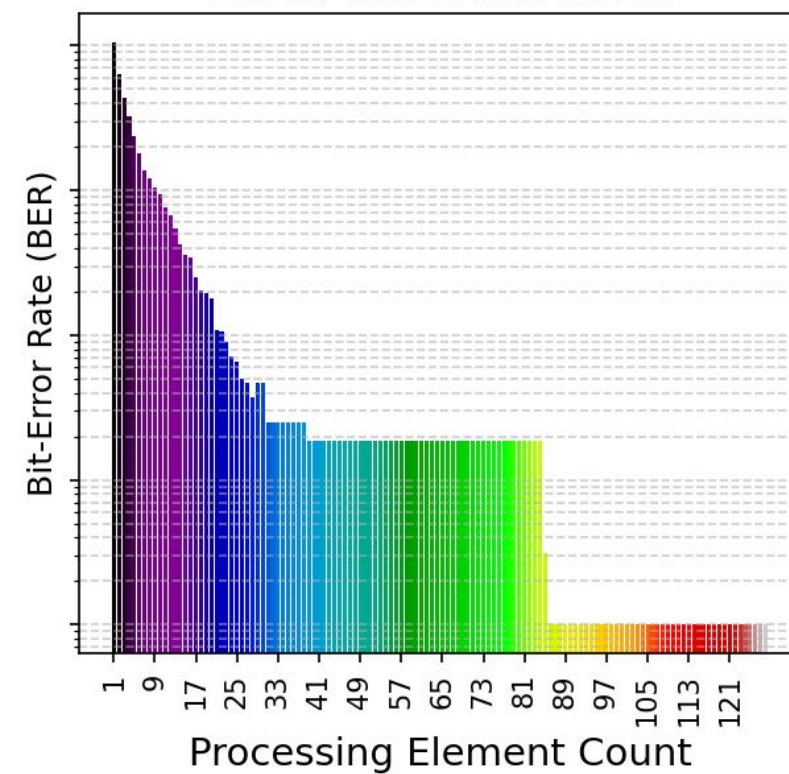
## Standard Detectors



## FlexCore Detectors



## ParaMax Detectors



# ParaMax Implementation

**Single Transmitter**

**Single Receiver**

**Multiple Transmitters**

**Multiple Receivers**

**Offline MIMO Detectors**

**Real-time MIMO Detectors**

**Blind MIMO**

**NOMA (Non-Orthogonal Multiple Access)**

# Thank you!

Any Questions?