

# Towards Reproducible Wireless Experiments Using R2lab

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# General Outline

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Using R2lab for  
system design  
and validation

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# Motivation for Reproducibility

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## Learning

Learning with a hands-on experience

## Extending

Extending scientific work

## Reusing

Reusing tools for other scientific projects

# Orion: Context

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- Position and orientation estimation using Fingerprinting is inaccurate and inefficient<sup>[1][2]</sup>.
- Position estimation using MIMO techniques is accurate (decimeter level precision)<sup>[3][4][5]</sup>.
- Is it possible to estimate accurately the true heading of a terminal using MIMO?

# REFERENCES

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- [1] H. Mohd et al. Indoor Human Localization with Orientation Using WiFi Fingerprinting. ACM ICUIMC, New York, NY, USA, 2014.
- [2] C. Rohrig and F. Kunemund. Estimation of position and orientation of mobile systems in a wireless LAN. IEEE Decision Control, Dec 2007.
- [3] D. Vasisht et al. Decimeter-Level Localization with a Single WiFi Access Point. In *ACM NSDI*, Santa Clara, CA, 2016.
- [4] Y. Xie et al. Precise Power Delay Profiling with Commodity WiFi. In *ACM Mobicom*, pages 53–64, New York, NY, USA, 2015.
- [5] M. Kotaru et al. SpotFi: Decimeter Level Localization Using WiFi. In *ACM SIGCOMM*, London, UK, Aug 2015.

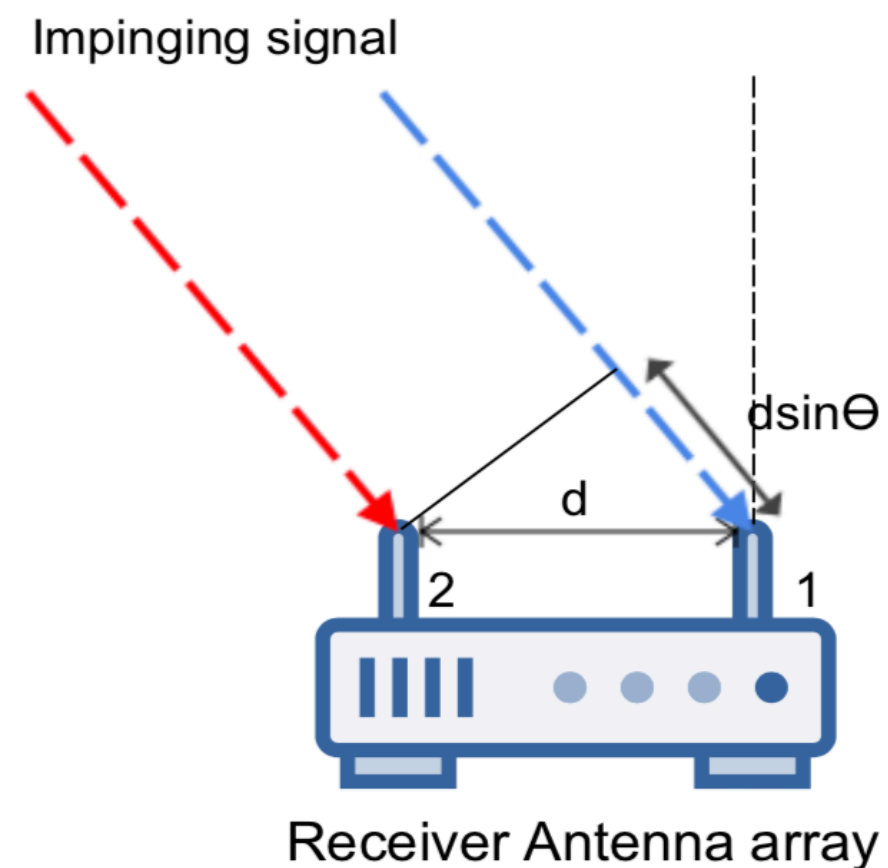
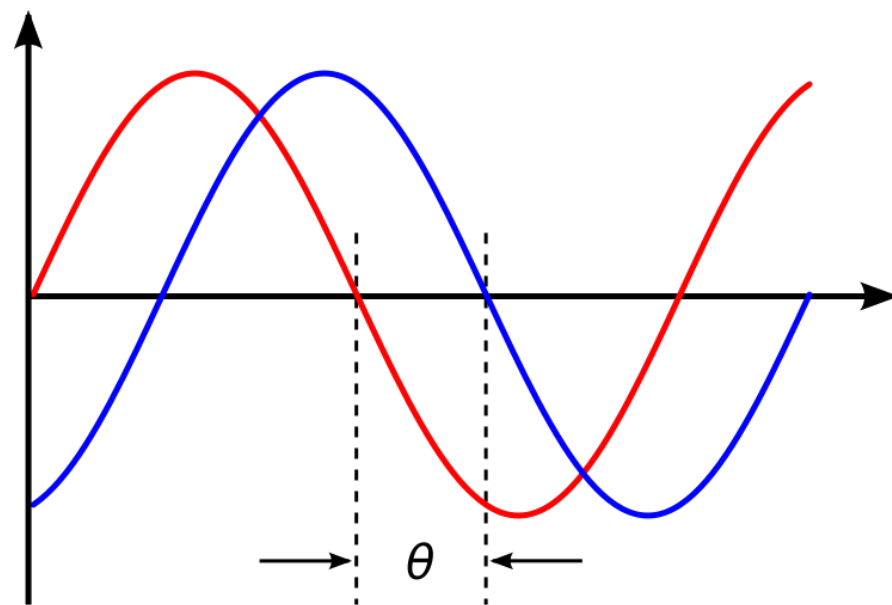
# Orion: Motivation

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- Enable an Access Point to measure the orientation of a client w/o soliciting IMU measurements (passive approach).
- Enhance low-cost IMU orientation estimation indoor by using Wi-Fi signal for calibration reference (Gyroscope drifts and magnetometer perturbation).

# Primer: MIMO and Signal Angle Estimation

- Measure the phase difference between the signal copies received by each antenna.



# Orion: Data Model

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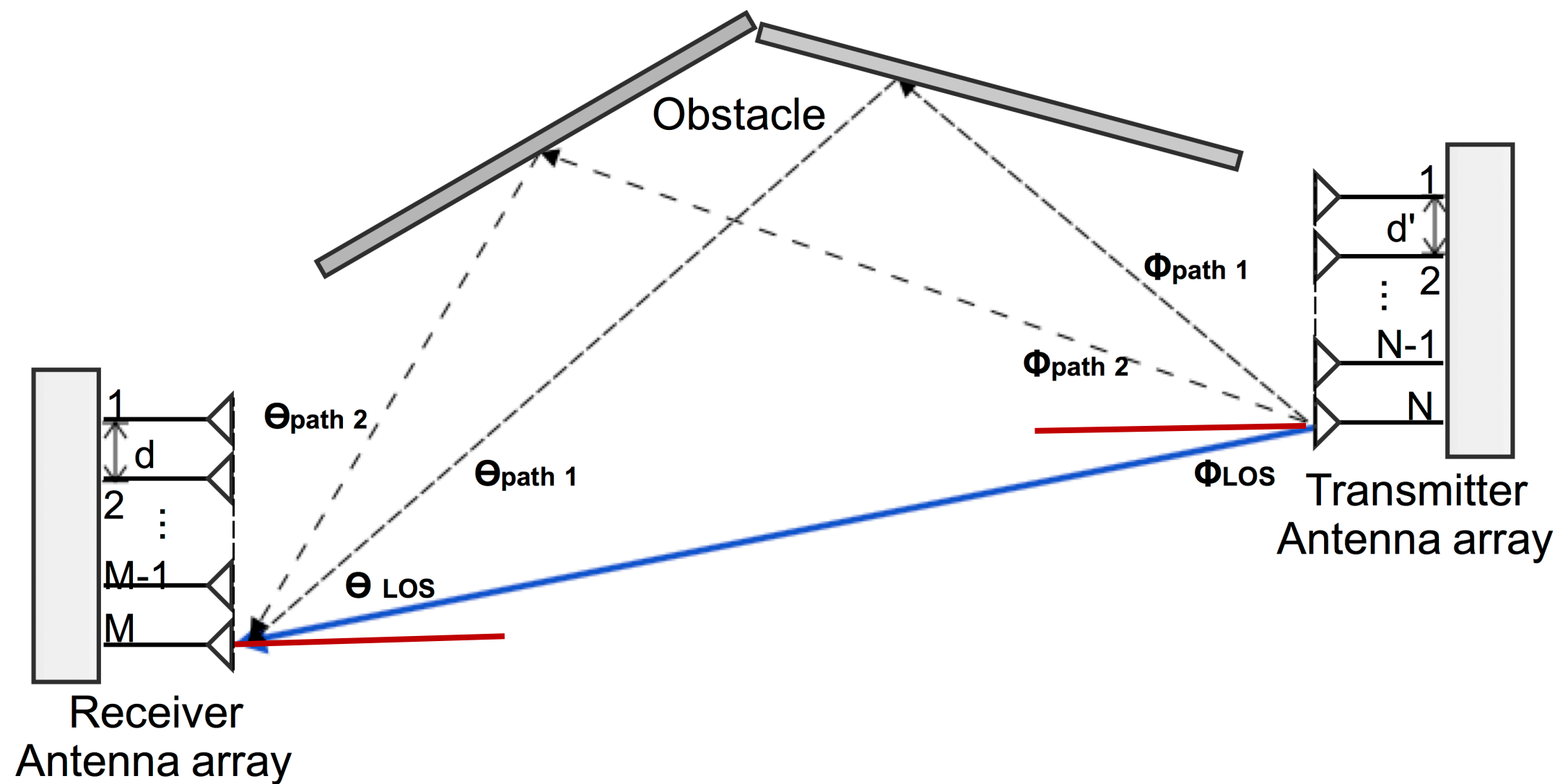
Matrix representation of the received signal vector:

$$\mathbf{x} = [\mathbf{a}_r(\theta_0) \otimes \mathbf{a}_t(\phi_0), \quad \mathbf{a}_r(\theta_1) \otimes \mathbf{a}_t(\phi_1), \quad \cdots, \\ \mathbf{a}_r(\theta_{p-1}) \otimes \mathbf{a}_t(\phi_{p-1})] \cdot \mathbf{s} + \mathbf{n}$$

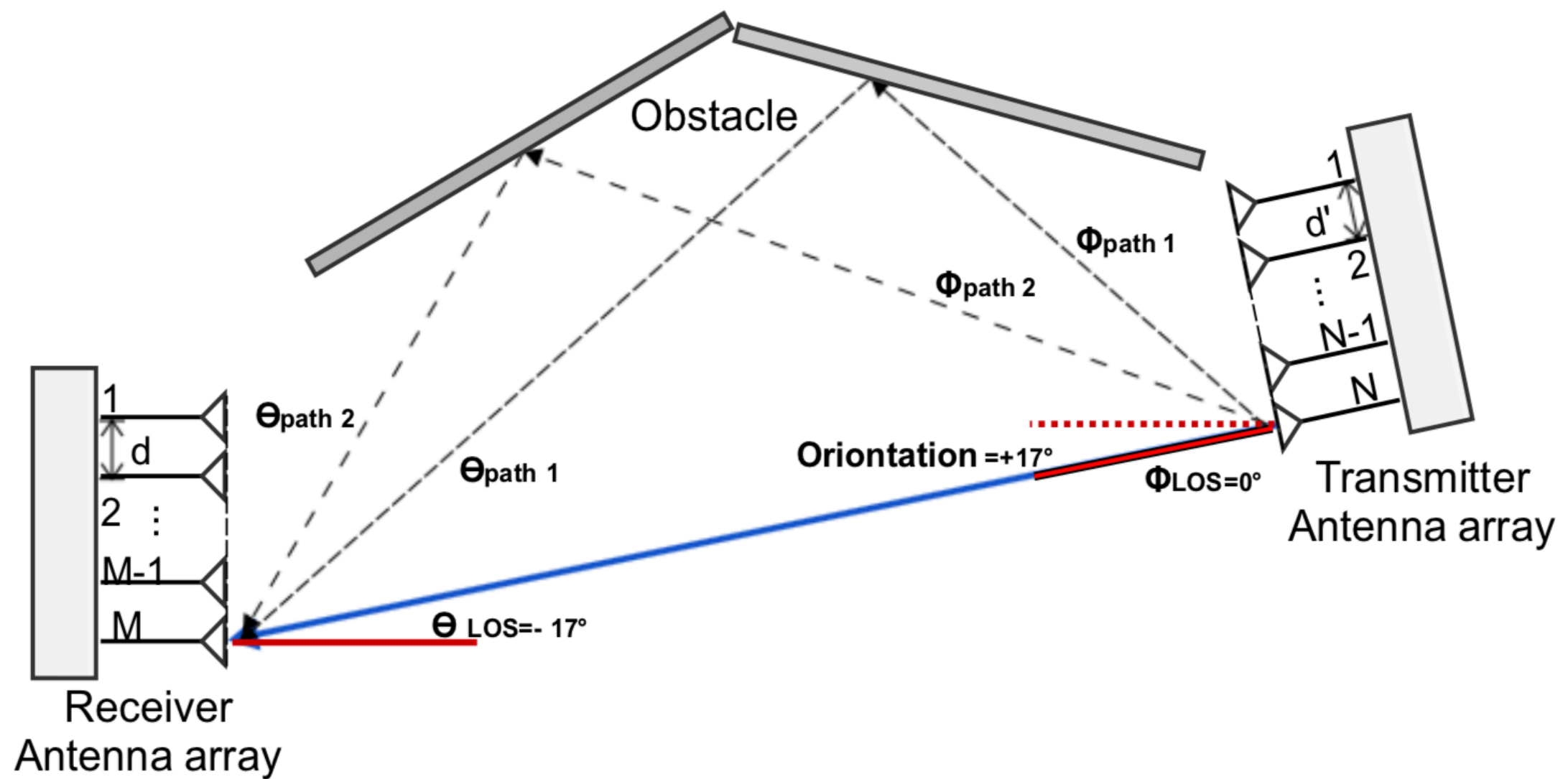
$\mathbf{x}$  is the  $MN \times 1$  received signal vector,  $\mathbf{a}_t(\phi)$  and  $\mathbf{a}_r(\theta)$  are the transmit and receive steering vectors,  $\mathbf{s}$  is the vector representing the complex gain of the  $p$  paths,  $\mathbf{n}$  is the white noise Gaussian vector with zero mean.



# Orion: Schema



# Orion: Schema



# 2D-MUSIC (Multiple Signal Classification)

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The matrix  $\mathbf{Q}_n$  is estimated from the Eigen-decomposition of the auto covariance matrix  $\mathbf{R}_{xx}$ .

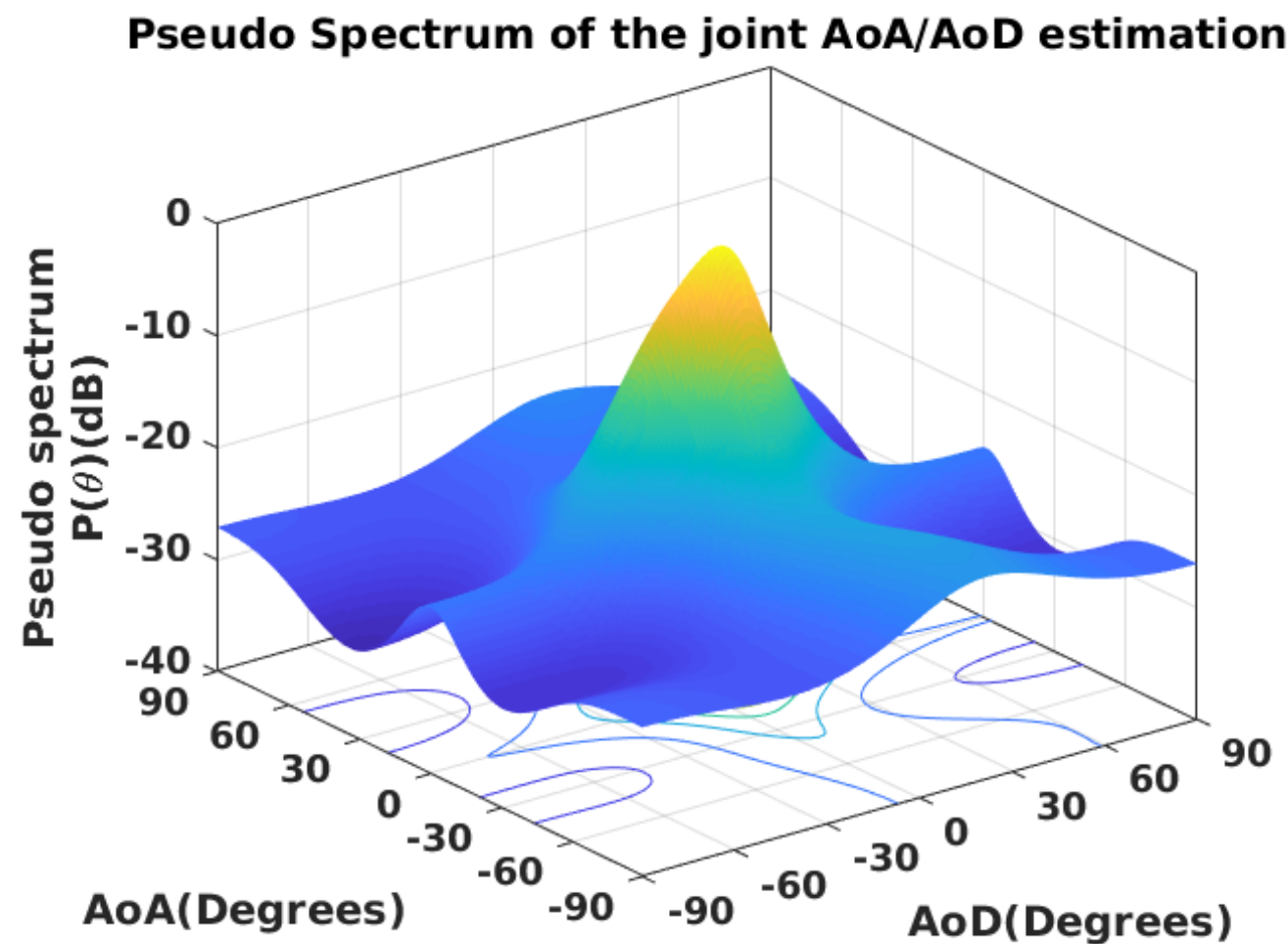
$$\mathbf{R}_{xx} = \mathbf{Q} \mathbf{D} \mathbf{Q}^H = \begin{bmatrix} \mathbf{Q}_s & \mathbf{Q}_n \end{bmatrix} \begin{bmatrix} \mathbf{D}_s & 0 \\ 0 & \sigma^2 \mathbf{I} \end{bmatrix} \begin{bmatrix} \mathbf{Q}_s & \mathbf{Q}_n \end{bmatrix}^H.$$

We define a quadratic function with steering vectors that span on several angles.

$$\mathbf{P}(\theta_i, \phi_i) = \frac{1}{(\mathbf{a}_r(\theta_i) \otimes \mathbf{a}_t(\phi_i))^H \mathbf{Q}_n \mathbf{Q}_n^H (\mathbf{a}_r(\theta_i) \otimes \mathbf{a}_t(\phi_i))}$$

# 2D-MUSIC (Multiple Signal Classification)

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# Channel State Information (CSI)

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## Channel State Information :

- Matrix with complex Channel gain for each antenna at the reception.
- Used for computing precoding matrices (beamforming).

The phase difference between the CSI of adjacent antennas is related to an angle (departure or arrival).

- Intel 5300 AGN <sup>[8]</sup> Provides CSI



[6] D. Halperin et al. Tool Release: Gathering 802.11n Traces with Channel State Information. *ACM CCR*, 41(1):53–53, Jan 2011.

# ORION: Challenges using COTS Hardware

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- Channel state information (CSI), i.e., the output matrix used for antenna array signal processing, suffers from phase shifts.
- Estimating a signal's AoD relies on the measurement of the phase difference between transmitted synchronized signals.
- Tracking orientation requires a series of AoAs and AoDs estimations. These measurements usually suffer from statistical noise and could translate in a jerky observation of actual monitored orientation.

# Using R2lab for calibration: Testbed presentation

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- 90m<sup>2</sup> insulated anechoic chamber at INRIA, Sophia Antipolis.
- 37 Wi-Fi nodes on the ceiling.
- 24 nodes feature an SDR board.





# Using R2lab for calibration: Testbed presentation

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- 2 Wi-Fi MIMO cards (Atheros 802.11 93xx a/b/g/n ,Intel NIC 5300 AGN <sup>[6]</sup>)
- Each card is has 3 dual-band 5dBi antennas, operating on both 2.4GHz and 5GHz.
- Antennas are spaced of 2.8cm



[6] D. Halperin et al. Tool Release: Gathering 802.11n Traces with Channel State Information. *ACM CCR*, 41(1):53–53, Jan 2011.

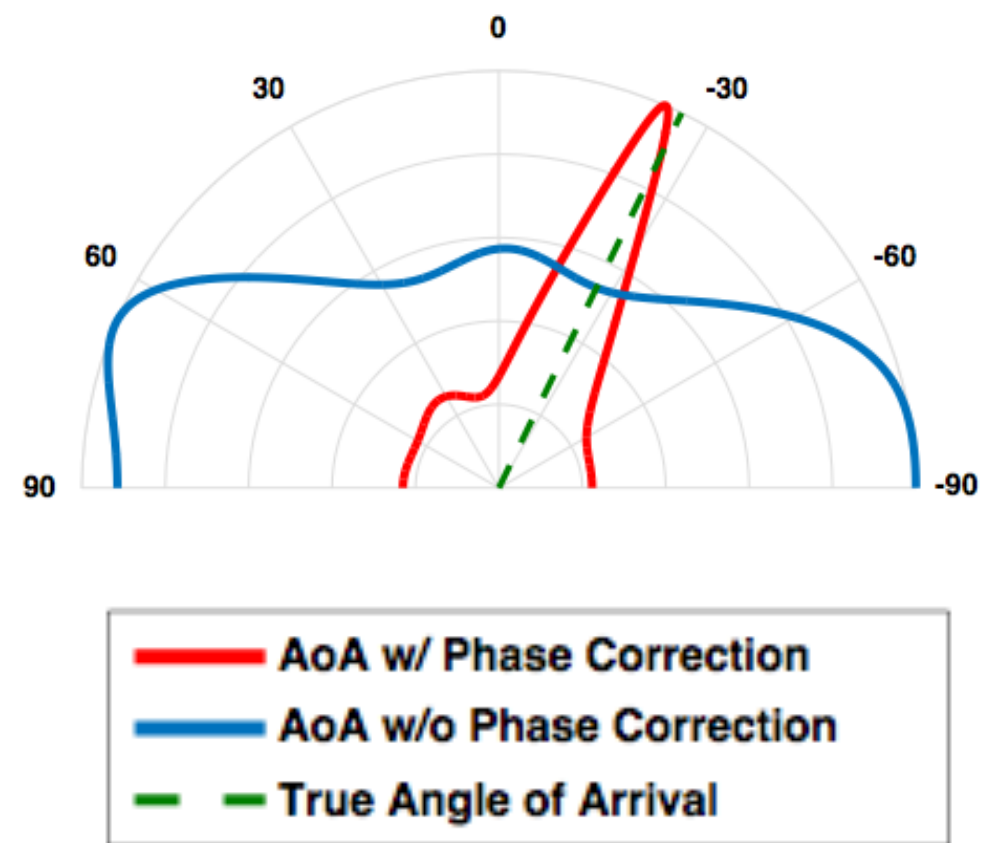


# Using R2lab for calibration: Angle of Arrival Estimation

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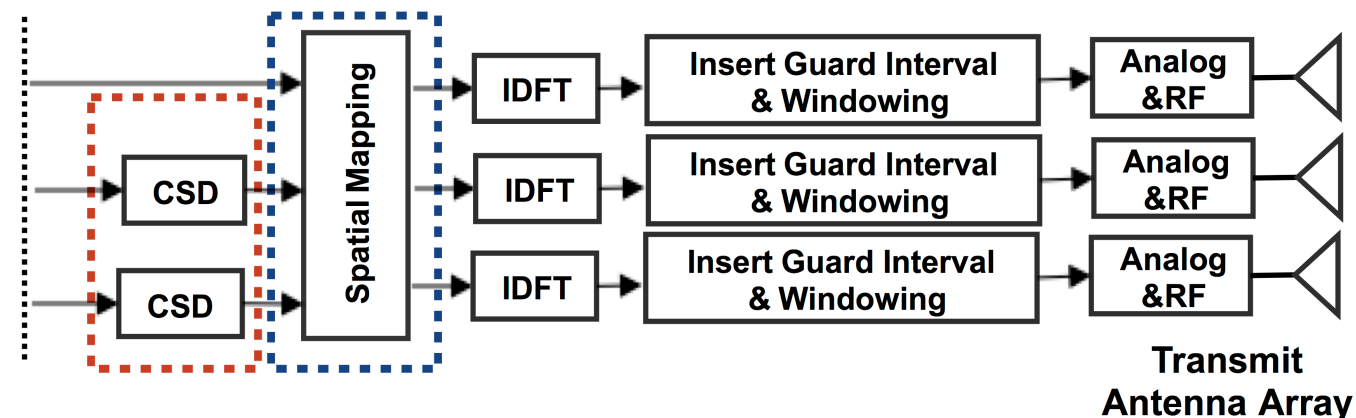
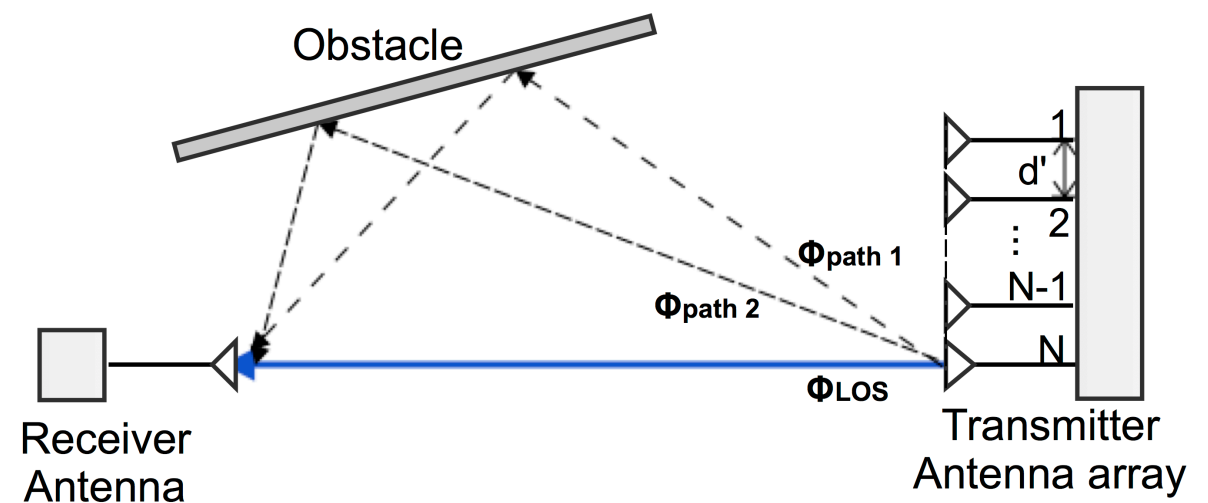
Phase inconsistency due to RF  
oscillator offset:

- Random but fixed phase shift throughout a session. Changes at each restart or recalibration.
- Correction by applying a phase rotation according to a reference signal.



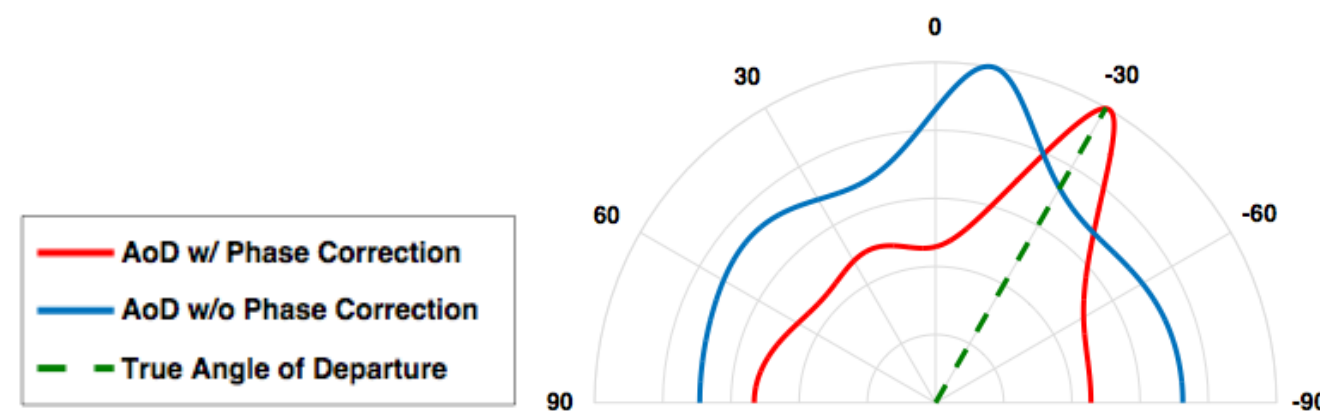
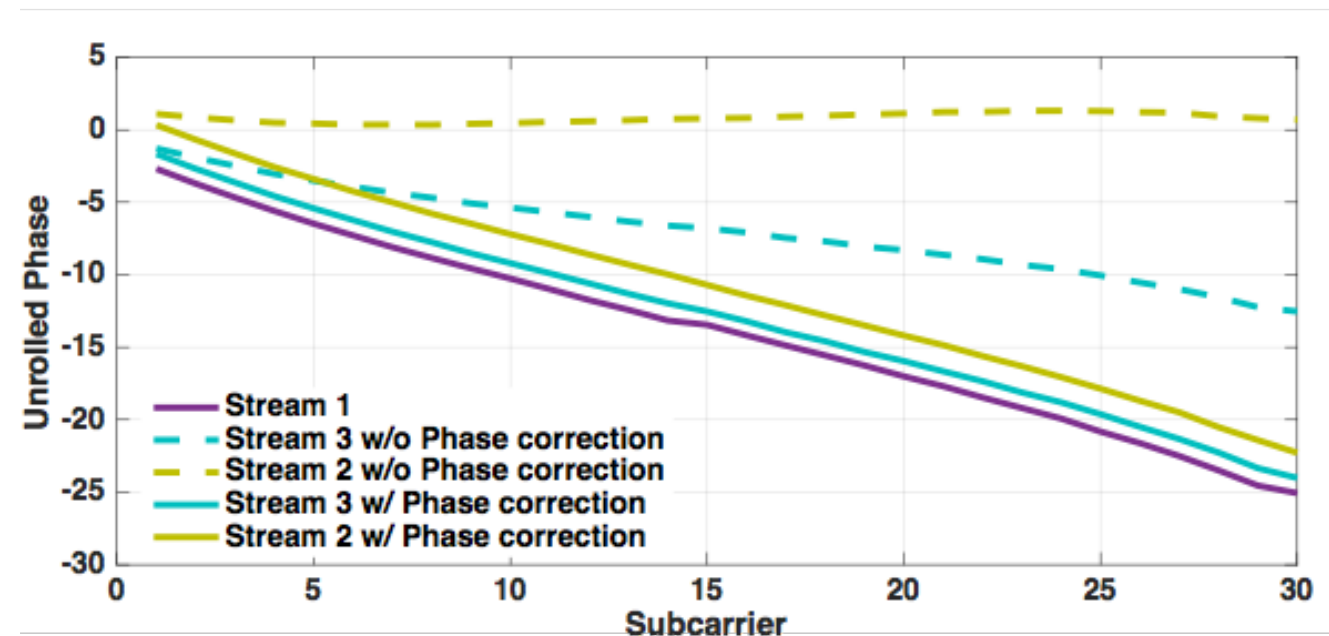
# Using R2lab for calibration: Angle of Departure Estimation

- Send a Stream on each of the Tx RF chain.
- Measure CSI from each Rx antenna for Each (Stream) Tx antenna.
- Compute the phase difference b/w the signals.

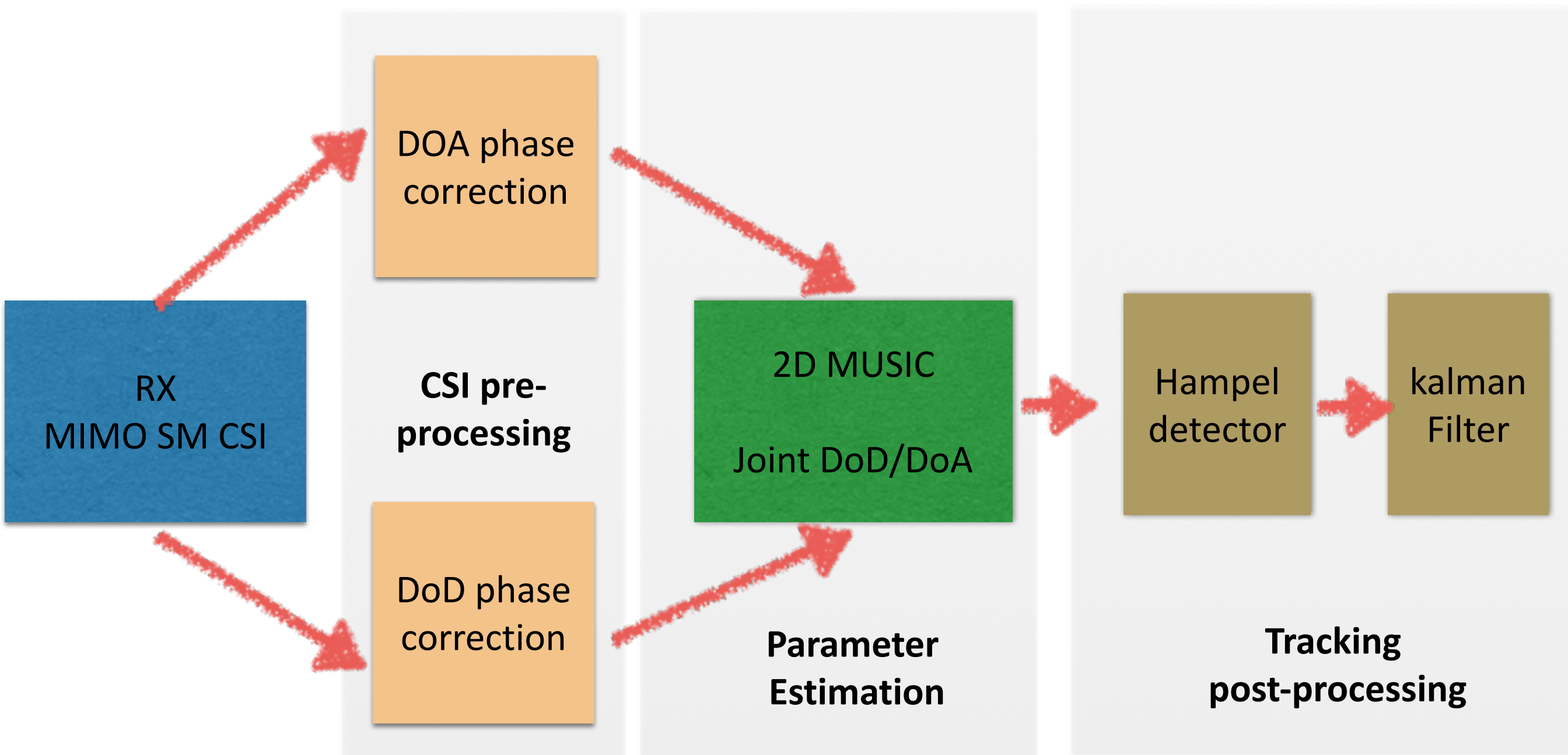


# Using R2lab for calibration: Angle of Departure Estimation

- Cyclic shift delay: delay between signal streams.
- Spatial mapping: multiplication by a specific matrix for assigning a stream to a transmission RF chain. Introduces a phase shift.



# System Design for Orientation Tracking



# Method Validation : nepi-ng

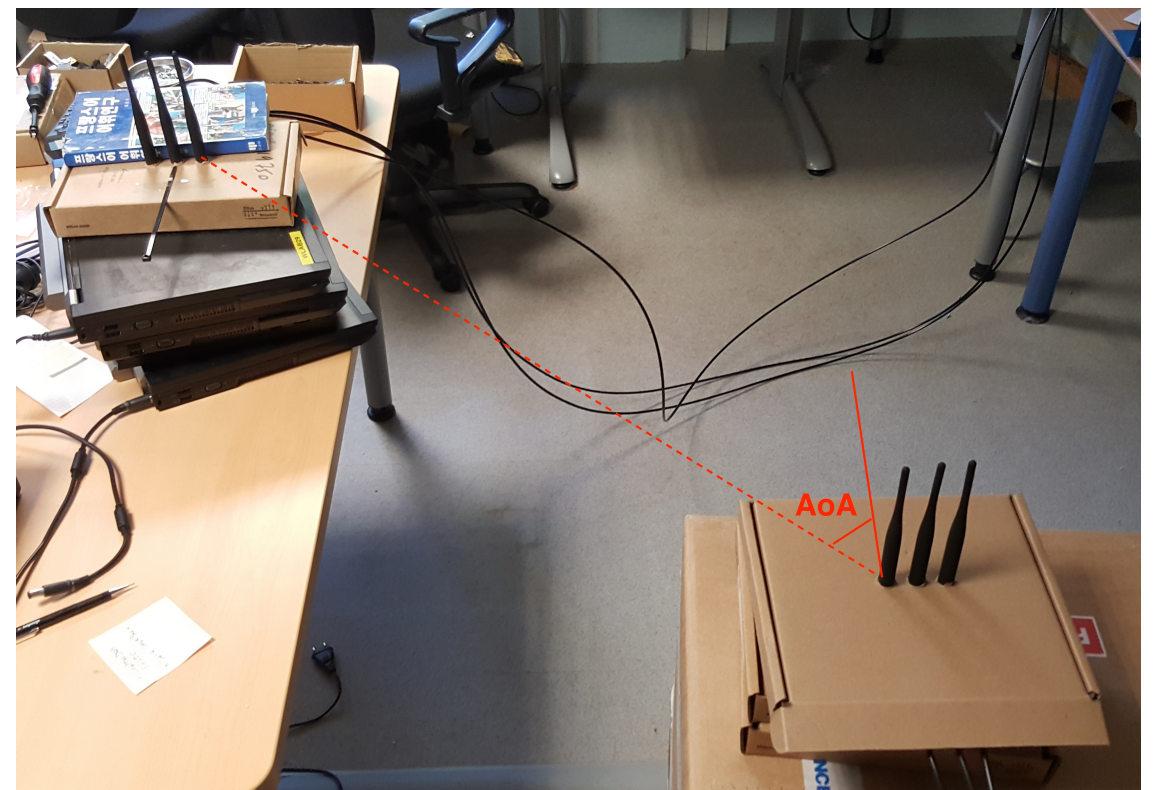
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- Used for running and orchestrating network experiments that involve several tens of target hosts.
- Used to efficiently automate and control our experiment scenario.

# Running in a different environment

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- Test system in an open, realistic, and non-controlled wireless environment.
- Reproduce the same experiment in an office room (Several multipath clusters).
- Use the same type hardware as in R2lab, including antennas cables and antennas spacing.





# Experimental material in a git repository

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- Detailed description of the system setup and of the hardware involved, with illustrations\*.
- Avoid any licensing problems related MATLAB by a python version of our code for data post-processing.\*\*
- Jupyter notebook that allows running all the steps of our angle estimation technique.

\*Description: <https://www-sop.inria.fr/teams/diana/orion/>

\*\* Code : <https://github.com/naoufal51/Orion>



# Discussion

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- R2lab allowed the Design and Validation of our System Design by:
  - Acquiring an extensive knowledge and greater understanding of COTS hardware along with a thorough understanding of its capabilities and limitations
  - Controlling the experiment environment and scenario (avoid interference, ...)
  - Automate experiments to have fine-grained control over the design of experiments (napi-ng)



# Conclusion

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- Reproducibility is tied to information accessibility
- Reproducibility should be accounted as a part of the research project's activities