

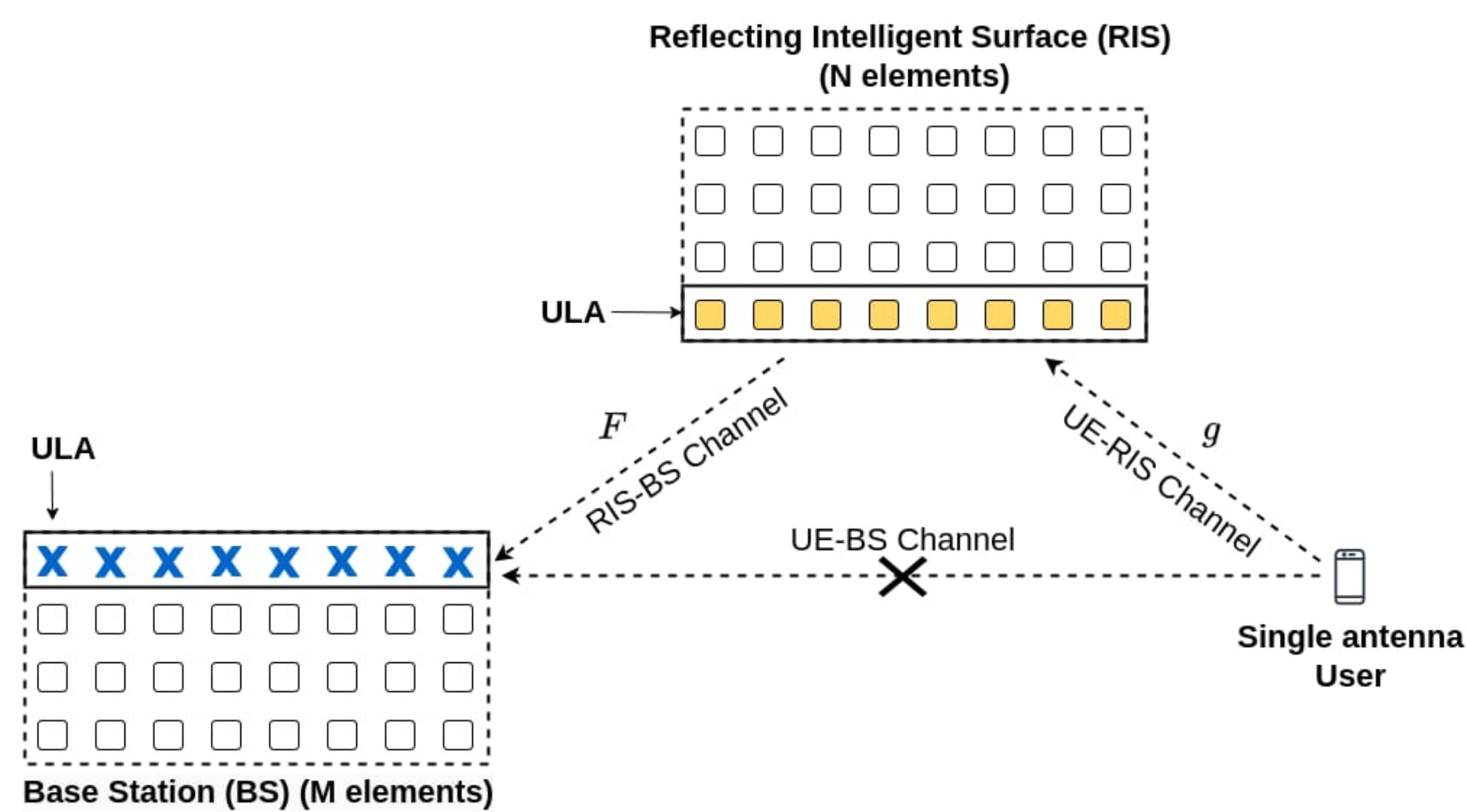
## Abstract

- **Objective:** Propose an effective approach for **cascaded channel estimation (CE) of RIS assisted mmWave** communication system
- **Our Efficient approach and benefits:** By assuming a uniform linear array (ULA) structure for RIS and BS, we show that the RIS elements and BS antenna elements together can be visualized as a 2-D virtual array, and which we refer to as **RIS-BS virtual array**
- Leveraging the **RIS-BS virtual array**, and taking the advantage of the sparsity offered by mmWave channel, we propose i) **RIBCE-CS**, a CS based solution and ii) **RIBCE-ESPRIT**, an ESPRIT based approach to estimate the AoA's and AoD's jointly
- We provide a lower bound for the proposed algorithms and show that **the number of pilots required for CE reduces by  $\mathcal{O}(M)$**  where  $M$  is the number of antenna elements at base station (BS)

## Motivation

- Reconfigurable intelligent surface (RIS) has the ability to **intelligently steer the incident beam** and will be a key component in next generation communication systems
- Accurate channel state information (CSI) is required to induce desired phase-shift
- Cascaded CE is challenging and usually requires more pilot overhead
- **Problem addressed:** Effective cascaded CE with reduced pilot overhead

## System Model



<sup>1</sup>Qingqing Wu and Rui Zhang, "Beamforming Optimization for Intelligent Reflecting Surface with Discrete Phase Shifts". In: IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP). 2019.  
<sup>2</sup>Song Noh et al. "Joint Direct and Indirect Channel Estimation for RIS-Assisted mm-Wave Systems Based on Array Signal Processing". In: IEEE Trans. Commun. (2023)

## System Model

- RIS-BS channel matrix,  $\mathbf{F}$  and UE-RIS channel,  $\mathbf{g}$

$$\mathbf{F} = \sum_{r=1}^{L_f} \alpha_{f,r} \mathbf{u}_M(\psi_{f,r}) \mathbf{u}_N^H(\theta_{f,r})$$

$$\mathbf{g} = \sum_{s=1}^{L_g} \alpha_{g,s} \mathbf{u}_N(\theta_{g,s})$$

- Complex path gain:  $\alpha$
- AoA at RIS:  $\theta_{g,s}$ , AoD at RIS:  $\theta_{f,r}$  and AoA at BS:  $\psi_{f,r}$
- Array response vector of ULA for any angle  $\delta \in [0, \pi]$  is  $\mathbf{u}_P(\delta) = [1, e^{j\pi \cos(\delta)}, \dots, e^{j\pi \cos(\delta)(P-1)}]^T$
- When pilot symbol  $x_k$  is transmitted by the user in slot  $k$ , the BS receives

$$\mathbf{y}_k = (\mathbf{F} \cdot \text{diag}(\mathbf{w}_k) \cdot \mathbf{g}) x_k + \mathbf{n}_k$$

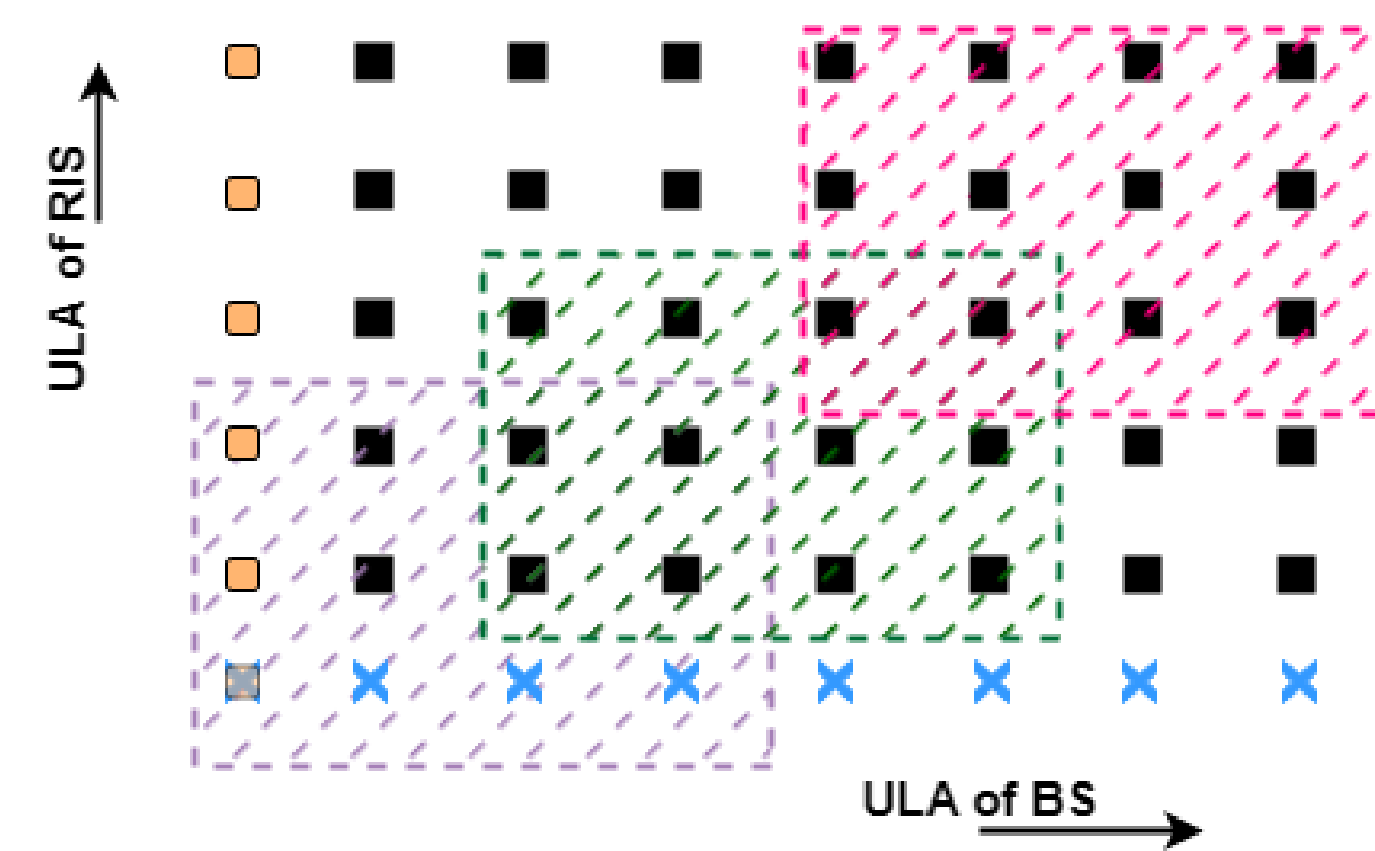
- RIS reflection coefficients:  $\mathbf{w}_k$
  - Received signal at BS over  $K$  slots,
- $$\mathbf{Y} = \left( \sum_{r=1}^{L_f} \alpha_{f,r} \mathbf{u}_M(\psi_{f,r}) \mathbf{u}_N^H(\theta_{f,r}) \right) \times \text{diag} \left( \sum_{s=1}^{L_g} \alpha_{g,s} \mathbf{u}_N(\theta_{g,s}) \right) \mathbf{W} \mathbf{X} + \mathbf{N}$$
- $$= \left( \sum_{l=1}^L \alpha_l \mathbf{u}_M(\psi_l) \mathbf{u}_N^H(\theta_l) \right) \mathbf{W} \mathbf{X} + \mathbf{N}$$
- Here,  $L = L_f L_g$  with  $l = (r-1)L_g + s$
  - $\alpha_l = \alpha_{f,r} \alpha_{g,s}$ ,  $\theta_l = \theta_{f,r} - \theta_{g,s}$  and  $\psi_l = \psi_{f,r}$

## Contribution: RIS-BS virtual array

- mm-Wave channels are sparse  $\implies K < \max\{M, N\}$
- Consider RIS reflection co-efficient matrix as <sup>†</sup>

$$\mathbf{W} = \begin{bmatrix} \mathbf{I}_K \\ \mathbf{0}_{N-K} \mathbf{0}_K^T \end{bmatrix}$$

- Now,
- $$\mathbf{Y} = \mathbf{U}_M(\psi) \text{diag}(\alpha) \mathbf{U}_K^H(\theta) \mathbf{X} + \mathbf{N}$$
- With  $\mathbf{X} = \mathbf{I}_K$  and using  $\text{vec}\{\mathbf{P} \text{diag}(\mathbf{s}) \mathbf{Q}^H\} = (\mathbf{Q} \odot \mathbf{P}) \mathbf{s}$
- $$\mathbf{y} = \text{vec}(\mathbf{Y}) = (\mathbf{U}_K(\theta) \odot \mathbf{U}_M(\psi)) \alpha + \mathbf{n} \quad (1)$$

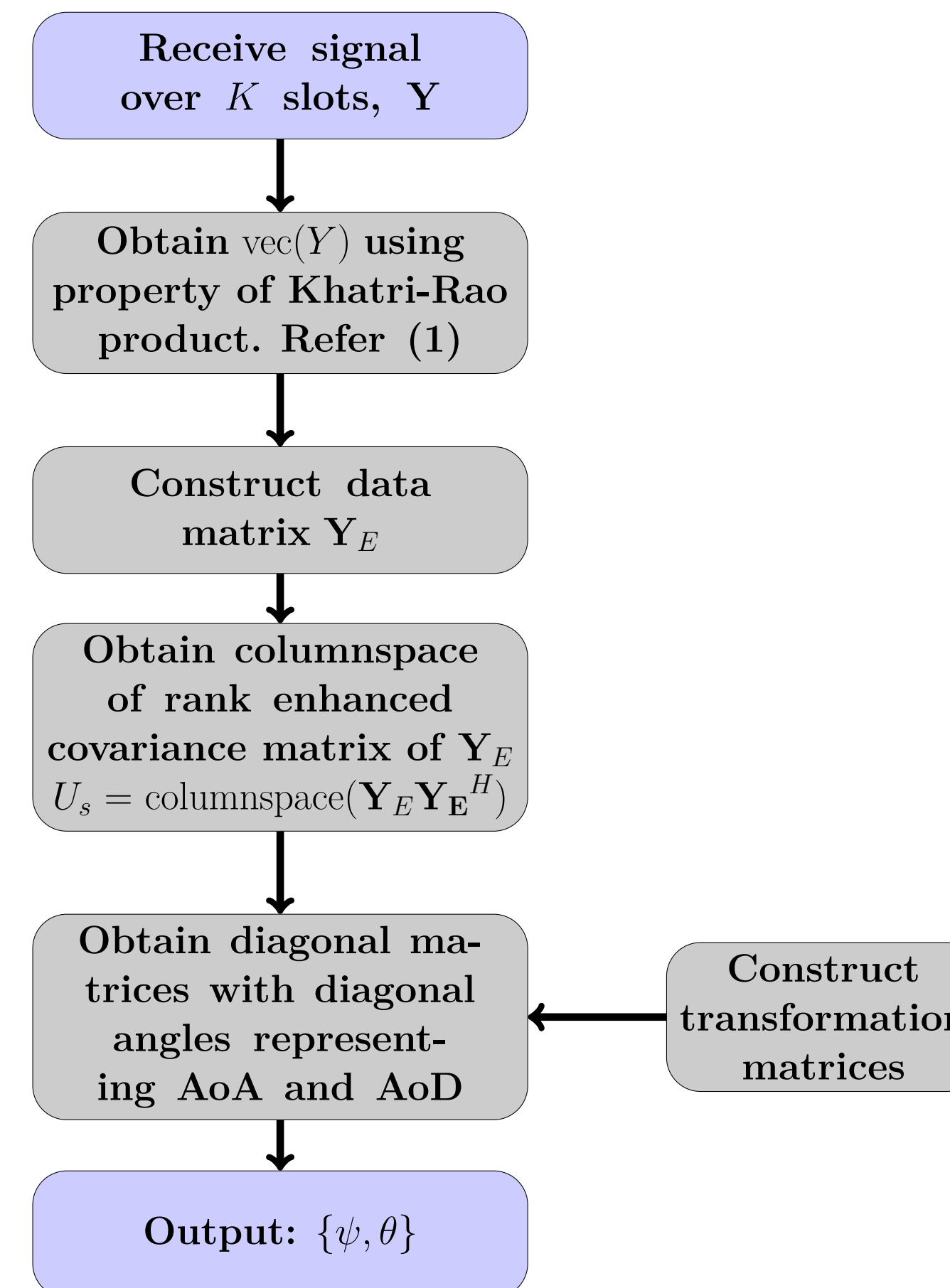


- The Khatri-Rao product can be visualized as 2D array response of UPA and is referred as **RIS-BS virtual array**
- Proposed algorithms exploit the virtual array structure to **estimate the AoA and AoD pairs jointly**

## RIBCE-Compressive Sensing Algorithm

- Utilizes dictionary matrices constructed for an angular resolution to estimate AoA's and AoD's
  - For angular resolution of  $\theta_{\text{res}} = \frac{\pi}{D_1}$  and  $\psi_{\text{res}} = \frac{\pi}{D_2}$ ,
- $$\mathbf{y} = (\mathbf{U}_K^{D_1}(\tilde{\theta}) \otimes \mathbf{U}_M^{D_2}(\tilde{\psi})) \alpha_s + \mathbf{n}$$
- $\alpha_s$ : Sparse channel vector with  $\|\alpha_s\|_0 = L$
  - Find the support of  $\alpha_s$  and estimate the  $\{\psi, \theta\}$  angle pairs corresponding to the non-zero indices of  $\alpha_s$
  - Formulate the optimization problem:
- $$\min \|\alpha_s\|_1 \text{ s.t. } \|\mathbf{y} - (\mathbf{U}_K^{D_1}(\tilde{\theta}) \otimes \mathbf{U}_M^{D_2}(\tilde{\psi})) \alpha_s\|_2 < \epsilon$$
- Solve using compressive sensing algorithms such as Orthogonal Matching Pursuit (OMP)

## RIBCE-ESPRIT Algorithm



- Each column of  $\mathbf{Y}_E$  corresponds to 2D sub-array response of size  $(K/2 \times M/2)$  and move the sub-array response over the entire RIS-BS virtual array to obtain  $\mathbf{Y}_E$

## Numerical Results

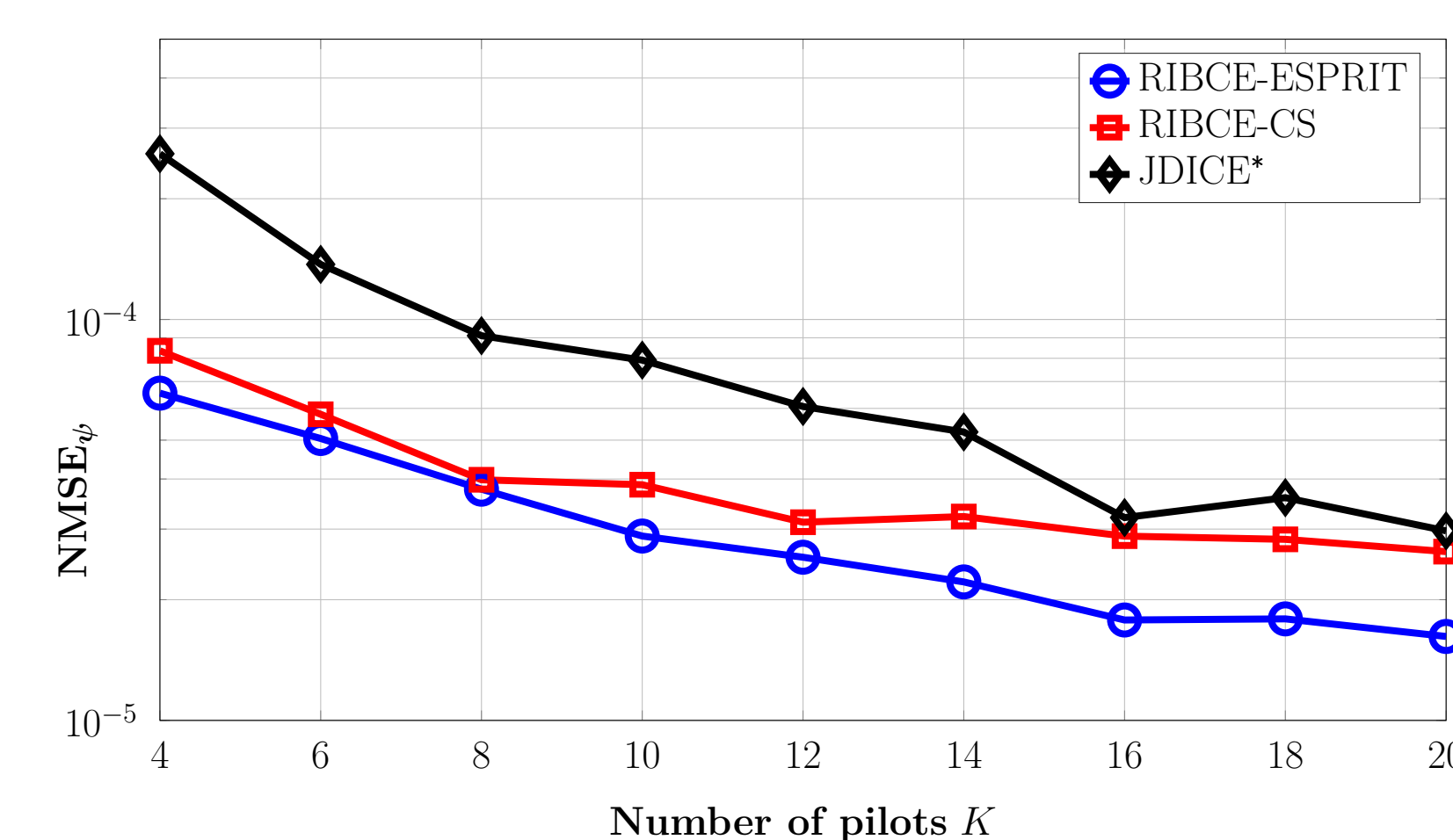


Figure 1: Performance of the proposed solutions in estimating  $\psi$

## Numerical Results

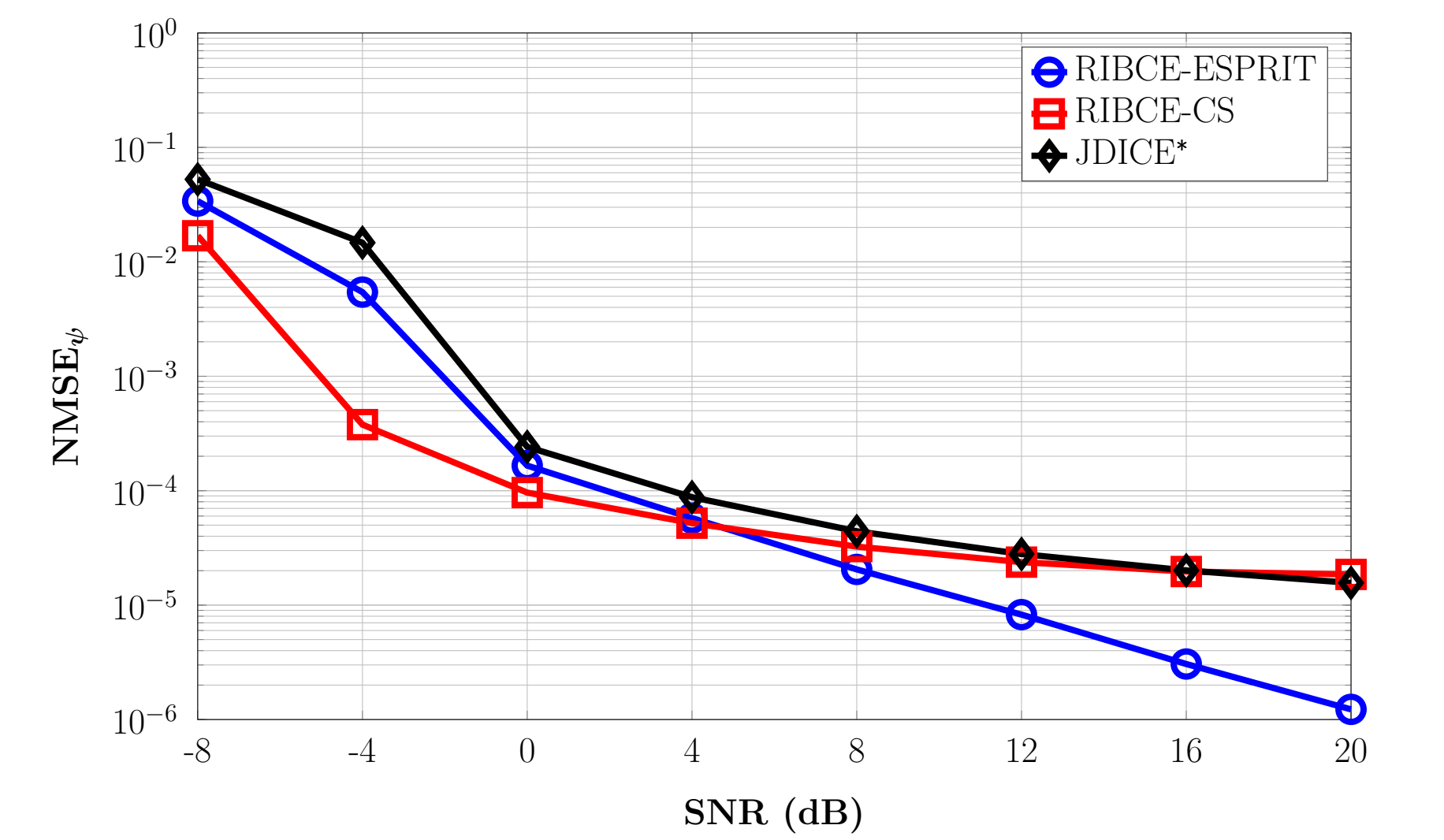


Figure 2: Performance of the proposed solutions in estimating  $\psi$

- Observe plateauing at high SNR by RIBCE-CS algorithm
- Due to the angular resolution  $(\theta_{\text{res}}, \psi_{\text{res}})$  considered for dictionary matrices

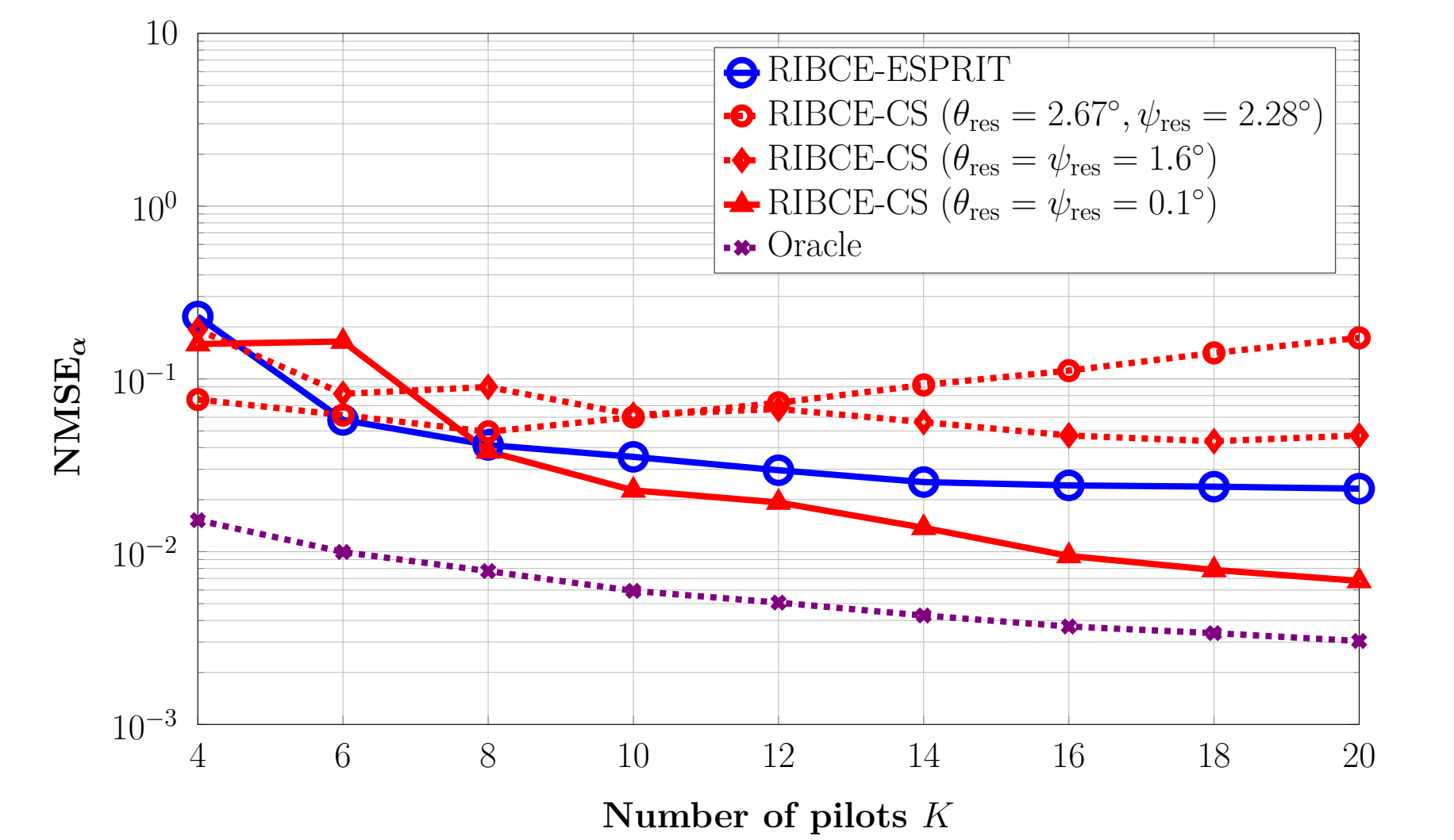


Figure 3: Performance of the proposed solutions in estimating the gains  $\alpha$

- The estimation accuracy of angle pairs depends on the angle resolution
- Trade-off provides flexibility to choose between accuracy and computational complexity

## Conclusion & Future Work

- The proposed channel estimation algorithms exploits the RIS-BS virtual array
- Using the proposed algorithms results in reduced pilot overhead for CE by  $\mathcal{O}(\# \text{ of antenna elements at BS})$

Algorithms	Computational Complexity	Accuracy
RIBCE-CS	Tunable	High
RIBCE-ESPRIT		

- **Future Work:** Extend to the scenario with RIS and BS as uniform planar arrays