

# Joint User and Receive Antenna Selection Algorithms for MU-MIMO Systems with Reduced Complexity

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## Aims/Objectives

- ❑ The aim is to show that a joint user and receive antenna selection (**JURAS**) scheme potentially provides **significant sum capacity over a user selection (US) scheme.**
- ❑ **Two sub-optimal joint user and antenna selection algorithms** with dynamic data stream allocation are also going to be analysed.

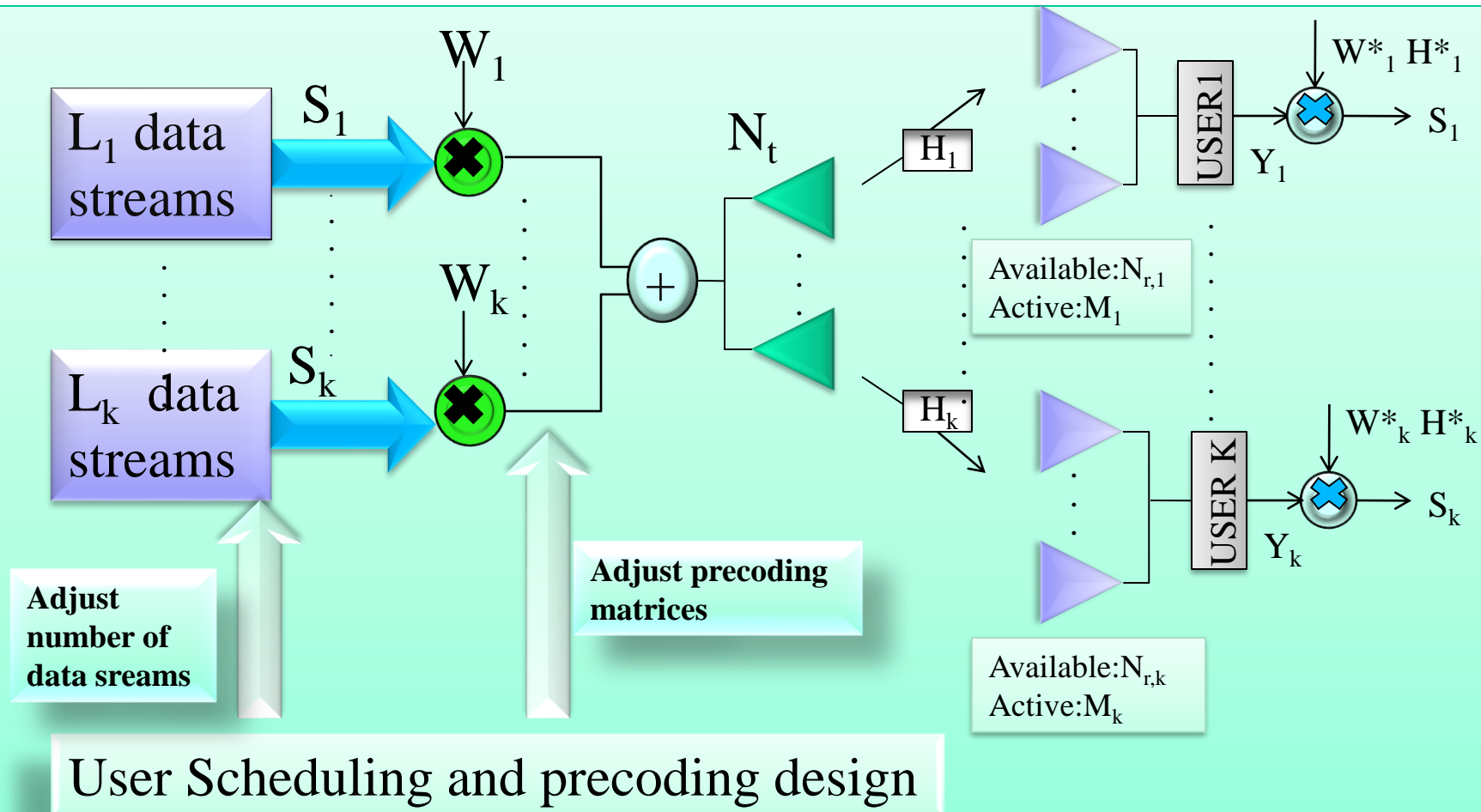
## Introduction

- ❑ MU-MIMO schemes have recently attracted attention due to their capability of offering significant gain in **system capacity**.
- ❑ **When users are equipped with multiple antennas**, joint user and receive antenna selection may be performed and it potentially provide **superior performance**.
- ❑ There are some techniques which provide theoretical sum capacity are DPC (**Dirty Paper Coding**), ZF (**Zero Forcing**), BD (**Block Diagonalization**) but they suffer due to high complexity.

## Introduction

- ❑ JURAS is used to achieve **high sum capacity** at high SNR.
- ❑ **sub optimal algorithms** are used to provide near theoretical sum capacity having **reduced complexity**.
- ❑ These algorithms will find the best combination of user and their receive antennas which will provide **maximum possible data rates or sum capacity** thereby increasing the data transfer rates.
- ❑ Although they are suboptimal but they are very useful when **number of receive antennas and users increase**.

# System Model



## System Model

- ❑ The model consists of a **single cell downlink MU MIMO** network.
- ❑ The Base Station has  $N_t$  number of transmitting antennas whereas there are **K users** having  $N_r$  **receiving antennas** with them where  **$M_k$  receiving antennas will be active at a time** for a particular user where  $M_k \leq N_r$ .

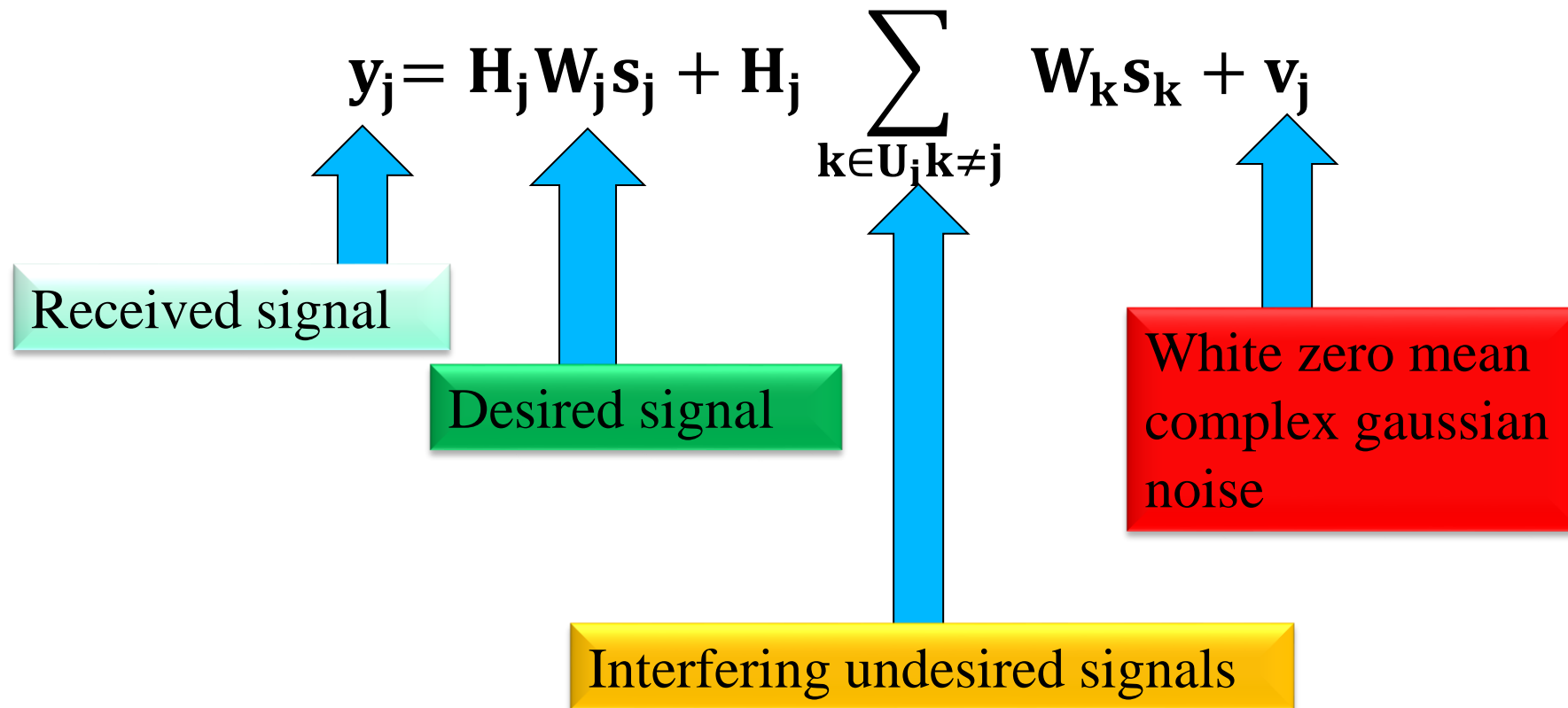
## System Model

- ❑ Our **objective function i.e. sum capacity** is dependent on the SINR based precoding matrix which has been given in next slides.
- ❑ We will assume **equal power per data stream power scheme** while calculating the **SINR** for the system (**EPS** ).



## System Model

- ❑ The **received signal** at the mobile station is given as,



## JURAS Scheme for MU-MIMO

- ❑ **JURAS** means the **joint user and receive antenna selection scheme** which is being implemented in this project using two suboptimal algorithms.
- ❑ **Suboptimal algorithm-1** works by updating the user's precoding matrices and evaluate sum capacity(**time complexity is somewhat more**).
- ❑ **Suboptimal algorithm-2** works by considering each receiving antenna as a single user during user selection process and then computes the precoding matrices used for data transmission (**time complexity is reduced** ) .

# Suboptimal Algorithms

## 1. Suboptimal algorithm 1

- ❑ This suboptimal algorithm can be divided into two phases. The **first phase** extends the ideas of the **capacity-based iterative user selection algorithm**.
- ❑ It selects a receive antenna with the highest capacity. Then, from the remaining unselected antennas, it finds the next receive antenna providing the largest sum capacity.

## Suboptimal Algorithms

- ❑ This phase terminates when the **sum capacity would reduce as a result of adding one more receive antenna** (equivalent to one more data stream).
- ❑ In the **second phase**, the algorithm researches the remaining unselected antennas of the selected users without increasing the number of allocated data streams.
- ❑ The algorithm terminates when no extra sum capacity is achieved by the receive beamforming.

## Suboptimal Algorithms

- This suboptimal algorithm selects receive antenna of user having highest capacity and so on and use the below formula to calculate the sum capacity,

$$C_{\text{sum}} = \sum_{j \in U} \sum_{l=1}^{L_j} \log_2 \left( 1 + \frac{[D_j D_j^*]_{ll}}{[(L\sigma_j^2/E_{BS})D_j + Q_j \widetilde{W}_j \widetilde{W}_j^* Q_j^*]_{ll}} \right)$$

- The complexity of the suboptimal algorithm 1 is more .

# Suboptimal Algorithms

## □ SA-1 PSEUDOCODE

### 1. Initialization:

2.  $UsrId$  = mapping between  $rx$  antenna id and user id

3.  $\mathcal{R} = \{1, \dots, N_r\}, \delta = \emptyset, u = \emptyset, l = 0, \tilde{H} = \emptyset$

4.  $C_{\max} = 0$ , flag = 1, phase = 1

### 5. Do while flag = 1

#### a. for every $r \in \mathcal{R}$

i. Let  $\delta_{\text{tmp}} = \delta + \{r\}, W = \emptyset, H = \tilde{H}, l_{\text{tmp}} = l$

#### ii. Find the candidate user:

$$u = UsrId(r), u_{\text{tmp}} = u \cup \{u\}, H_u = H[u] = [H[u]; h_r]$$

#### iii. If phase = 1,

$$l_{\text{tmp}}(u) += 1;$$

#### iv. End

# Suboptimal Algorithms

v.  $L_{\text{tmp}} = \text{sum}(l_{\text{tmp}})$

vi. Find precoding  $W_j$  for every user  $j \in U_{\text{tmp}}$

$$M_j = \text{size}(H_j, 1), E_j = L_j \cdot E_{BS} / L_{\text{tmp}}$$

$$W_j \propto \text{eigvec}_{L_j} \left( H_j^* H_j, \left( \frac{M_j \sigma_j^2}{E_j} \right) \mathbf{I} + \tilde{H}_j^* \tilde{H}_j \right), \text{Tr}(W_j^* W_j) = L_j$$

$$W\{j\} = W_j$$

vii. Calculate sum capacity, denoted as  $C_r$

$$C_r = \sum_{j \in U_{\text{tmp}}} \sum_{i=1}^{M_j} \log_2 \left( 1 + \frac{[D_j D_j^*]_{ll}}{[(L_{\text{tmp}} \sigma_j^2 / E_{BS}) D_j + Q_j \bar{W}_j \bar{W}_j^* Q_j^*]_{ll}} \right)$$

b. End

c.  $\bar{r} = \text{argmax}_{r \in R} C_r$

d. if  $C_{\bar{r}} > C_{\text{max}}$

i. if phase = 1

$$l(\bar{u}) += 1;$$

ii. End

## Suboptimal Algorithms

e. **elseif** phase = 1

i.  $\mathcal{R}$  = remaining antennas of users in  $\mathcal{U}$ ,  
not been selected in  $\delta$  phase = 2

f. **Else**

i. flag = 0

g. **End**

h. **End**

**Output:**  $\mathcal{S}, \mathcal{U}, l$



# Suboptimal Algorithms

## 2. Suboptimal algorithm 2

- ❑ It is seen that the **main computational burden of SA1** focuses on **updating users' precoding matrices and evaluating the sum capacity.**
- ❑ Thus, the algorithm is only required to compute the beamforming vector of **the candidate antenna without updating the precoding matrices of the selected ones.**

## Suboptimal Algorithms

- ❑ Treating each receive antenna as an individual user provides **more robustness to the errors** from outdated precoding matrices than considering multiple antennas at each user.
- ❑ By treating each antenna as a separate user, no receive beamforming can be exploited. Thus, procedures in the second phase are excluded from SA2 and **the number of data streams is always equal to the number of selected antennas.**

## Suboptimal Algorithms

- ❑ This suboptimal algorithm selects receive antenna of user having highest capacity and so on and use the below formula to calculate the sum capacity,

$$C_{sum} = \sum_{r=Stmp} \log_2 \left( 1 + \frac{\|h_r w_r\|^2}{\left(\frac{L\sigma_r^2}{E_{BS}}\right) + \sum_{q \in \delta, q \neq r} \|h_r w_q\|^2} \right)$$

- ❑ The complexity of the suboptimal algorithm 2 is less.

# Suboptimal Algorithms

## □ SA-2 PSEUDOCODE

### 1. Initialization:

$$\mathcal{R} = \{1, \dots, N_r\}, \delta = \emptyset, L = 0, \mathbf{H} = \emptyset, \mathbf{W} = \emptyset$$

$$C_{\max} = 0, \text{flag} = 1$$

### 2. Do while flag = 1

#### a. for every $r \in \mathcal{R}$

$$\text{i. Let } \delta_{\text{tmp}} = \delta + \{r\}$$

$$\text{ii. } L_{\text{tmp}} = L + 1$$

#### iii. Find precoding only for the candidate antenna

$$\text{iv. } \mathbf{w}_r \propto \text{max. eigenvector} \left( (L_{\text{tmp}} \sigma_r^2 / E_{BS}) \mathbf{I} + \tilde{\mathbf{H}}^* \tilde{\mathbf{H}} \right)^{-1} \mathbf{h}_r^* \mathbf{h}_r$$

$$\text{v. } \text{Tr}(\mathbf{w}_r^* \mathbf{w}_r) = 1$$

$$\text{vi. } \mathbf{W}_{\text{tmp}} = [\mathbf{W}, \mathbf{w}_r]$$

#### vii. Calculate sum capacity, denoted as $C_r$

$$C_r = \sum_{i \in \delta_{\text{tmp}}} \log_2 \left( 1 + \frac{\|\mathbf{h}_i \mathbf{W}_{\text{tmp}}(:, i)\|^2}{(L_{\text{tmp}} \sigma_i^2 / E_{BS}) + \sum_{i \in \delta_{\text{tmp}}, i \neq i} \|\mathbf{h}_i \mathbf{W}_{\text{tmp}}(:, i)\|^2} \right)$$

#### b. End

# Suboptimal Algorithms

c.  $\bar{r} = \operatorname{argmax}_{r \in \mathcal{R}} C_r$

d. if  $C_{fr} > C_{\max}$

$$\begin{aligned} C_{\max} &= C_{\bar{r}}, \delta = \delta + \{\bar{r}\}, \mathcal{R} = \mathcal{R} - \{\bar{r}\} \\ L &= L + 1 \\ W &= [W, w_{\bar{r}}], \tilde{H} = [\tilde{H}; h_{\bar{r}}] \end{aligned}$$

e. else

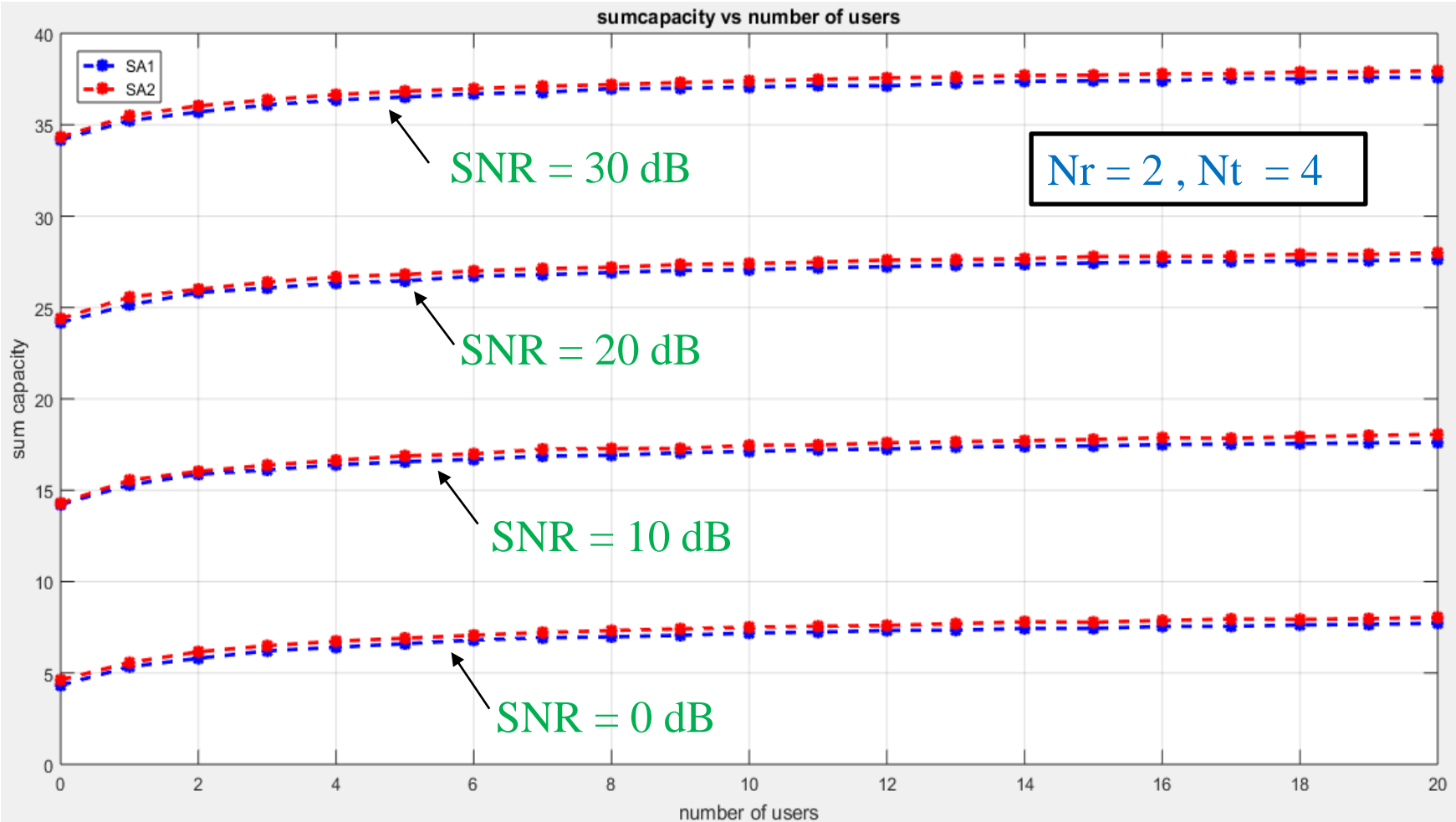
i. flag = 0

f. End

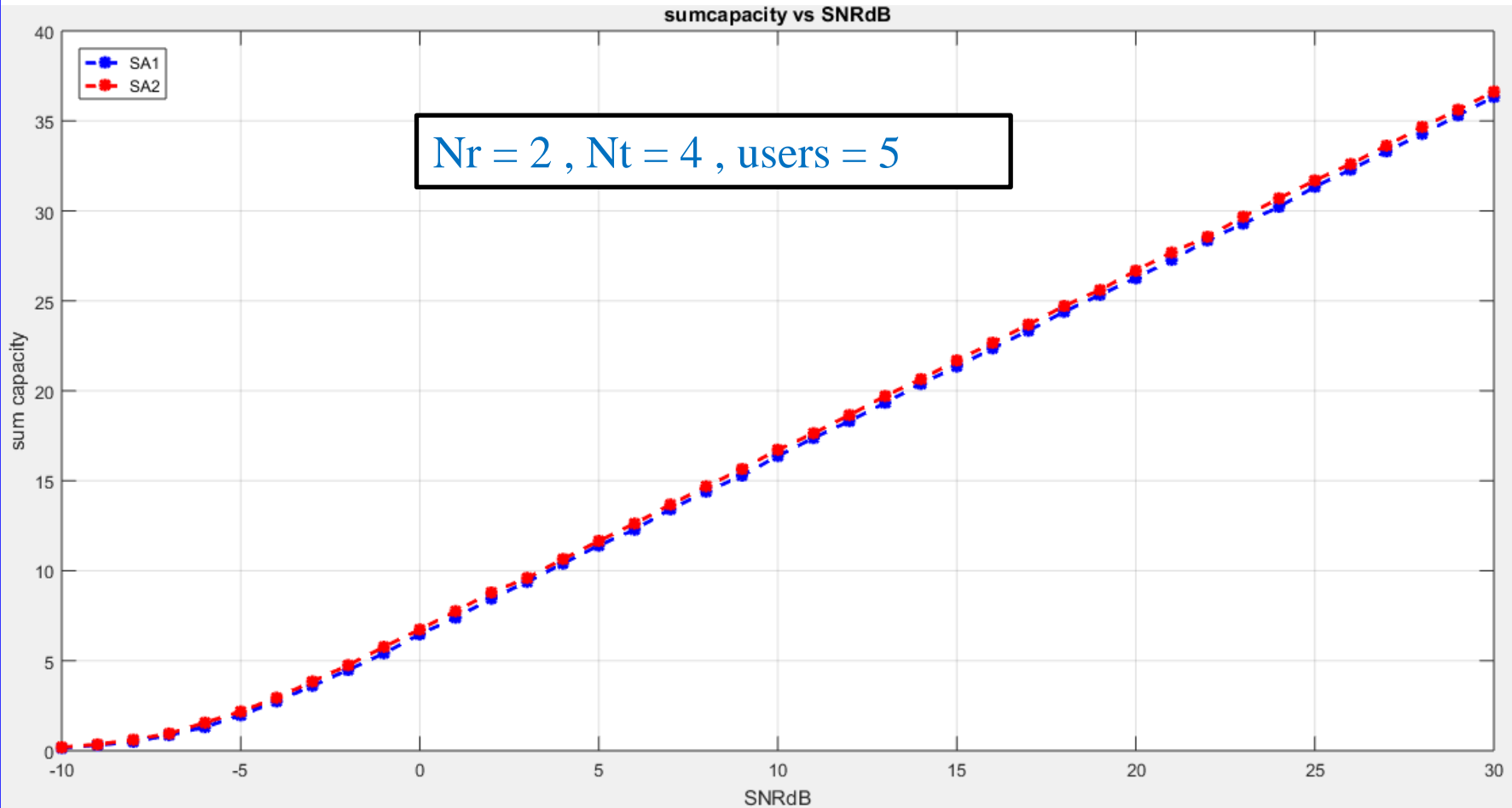
3. End

Output:  $\delta(u, l$  are derived from  $\delta)$

# Outputs



# Outputs

















# Outputs

## Time Complexity Analysis

### Profile Summary

Generated 21-Mar-2021 09:53:28 using performance time.

Function Name	Calls	Total Time	Self Time*	Total Time Plot (dark band = self time)
<a href="#">SuboptimalAlgorithm1Final</a>	125000	2144.908 s	1198.561 s	
<a href="#">SuboptimalAlgorithm2Final</a>	125000	3045.033 s	757.932 s	
<a href="#">unique</a>	14298016	790.469 s	517.341 s	
<a href="#">eigs</a>	4391000	1753.271 s	498.944 s	
<a href="#">eigs&gt;checkInputs</a>	4391000	839.749 s	497.746 s	
<a href="#">eigs&gt;fullEig</a>	4391000	414.579 s	414.579 s	
<a href="#">union</a>	14048015	1399.702 s	358.936 s	
<a href="#">unique&gt;uniqueR2012a</a>	14298016	273.128 s	273.128 s	
<a href="#">eigs&gt;checkInputs/LUfactorB</a>	4391000	269.290 s	269.290 s	
<a href="#">union&gt;unionR2012a</a>	14048015	1040.766 s	265.714 s	
<a href="#">cell.ismember</a>	4391000	61.071 s	61.071 s	
<a href="#">ismember&gt;ismemberR2012a</a>	2383021	37.611 s	29.110 s	
<a href="#">ismember</a>	2383021	50.781 s	13.170 s	
<a href="#">...(arraytoconvert)int64(arraytoconvert)</a>	4391000	11.642 s	11.642 s	
<a href="#">ScriptFileForSAPlotFinal</a>	1	5201.805 s	10.264 s	
<a href="#">ismember&gt;ismemberBuiltinTypes</a>	2383000	8.487 s	8.487 s	
<a href="#">setdiff</a>	250001	38.004 s	7.760 s	



## Conclusions

- ❑ The JURAS scheme enhances the **sum capacity** when the number of users increases.
- ❑ The JURAS scheme **sum capacity** is **significant at high SNR**.
- ❑ The two JURAS suboptimal algorithms **reduced the complexity of computation**.

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# Thank You