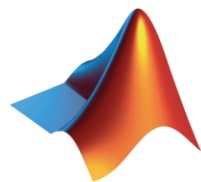




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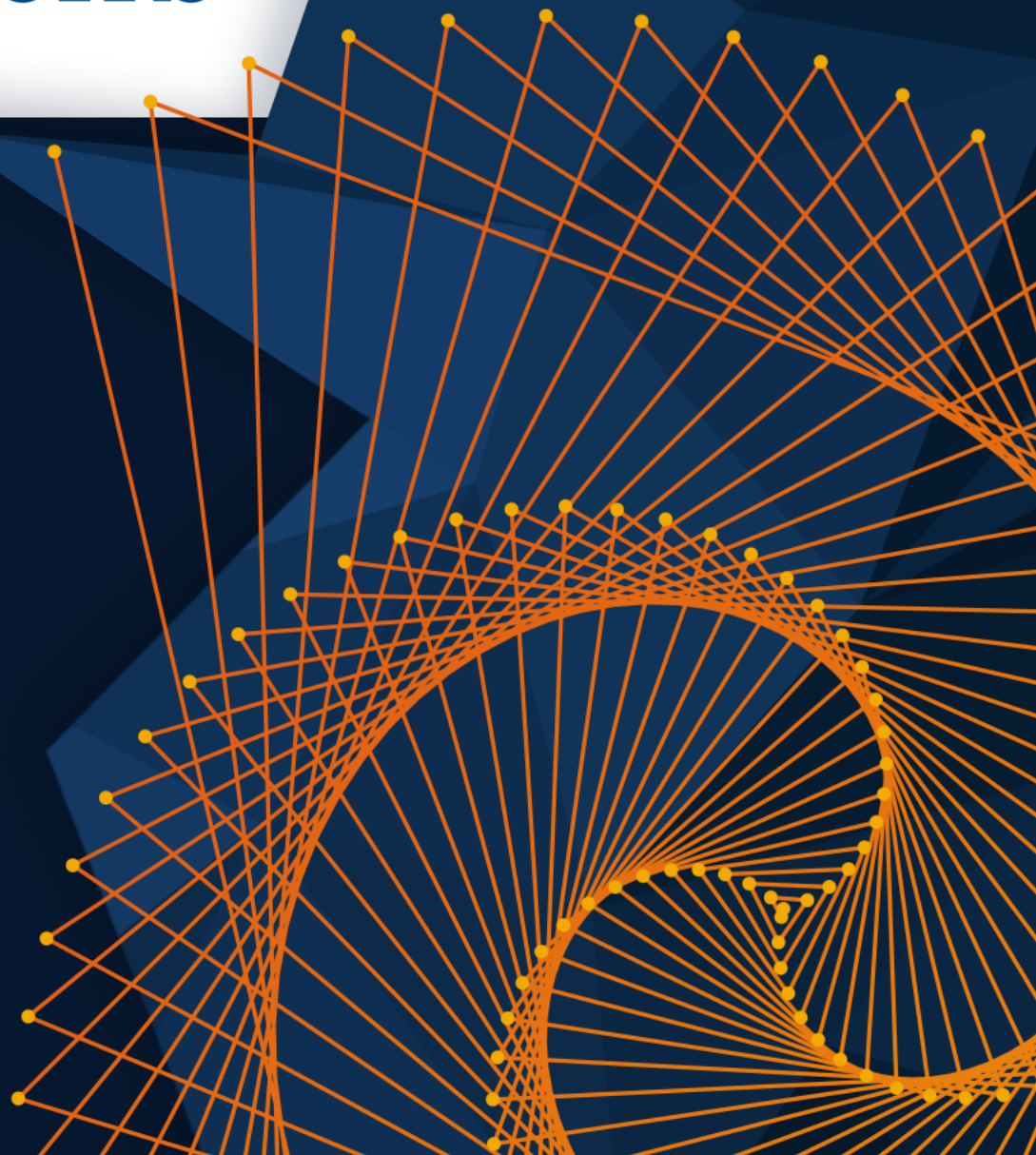
May, 2024 | Beijing, China

MATLAB赋能通信感知一体化设计

Prof. Fan Liu, Southern University of Science and Technology



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Outline

- Introduction
- 5G NR Sensing-Assisted Communications: Ray-Tracing based V2I Scenario
- Frame Structures and Case Studies in NR FR2 V2I Networks
 - 1) Initial Access
 - 2) Connected Mode
 - 3) Beam Failure Detection and Recovery

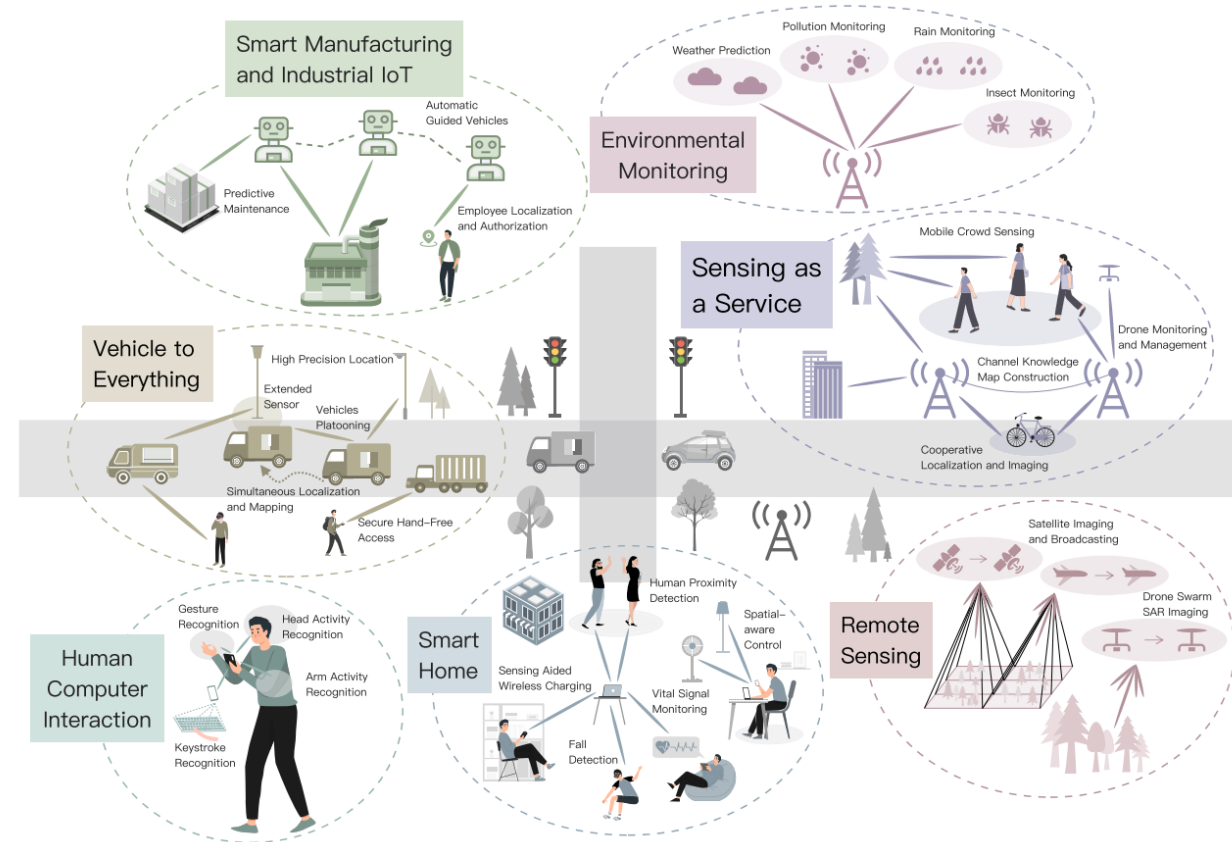
I. Introduction

■ Integrated Sensing and Communication (ISAC) for 6G and Beyond






Sensing & Communication (S&C) Systems:

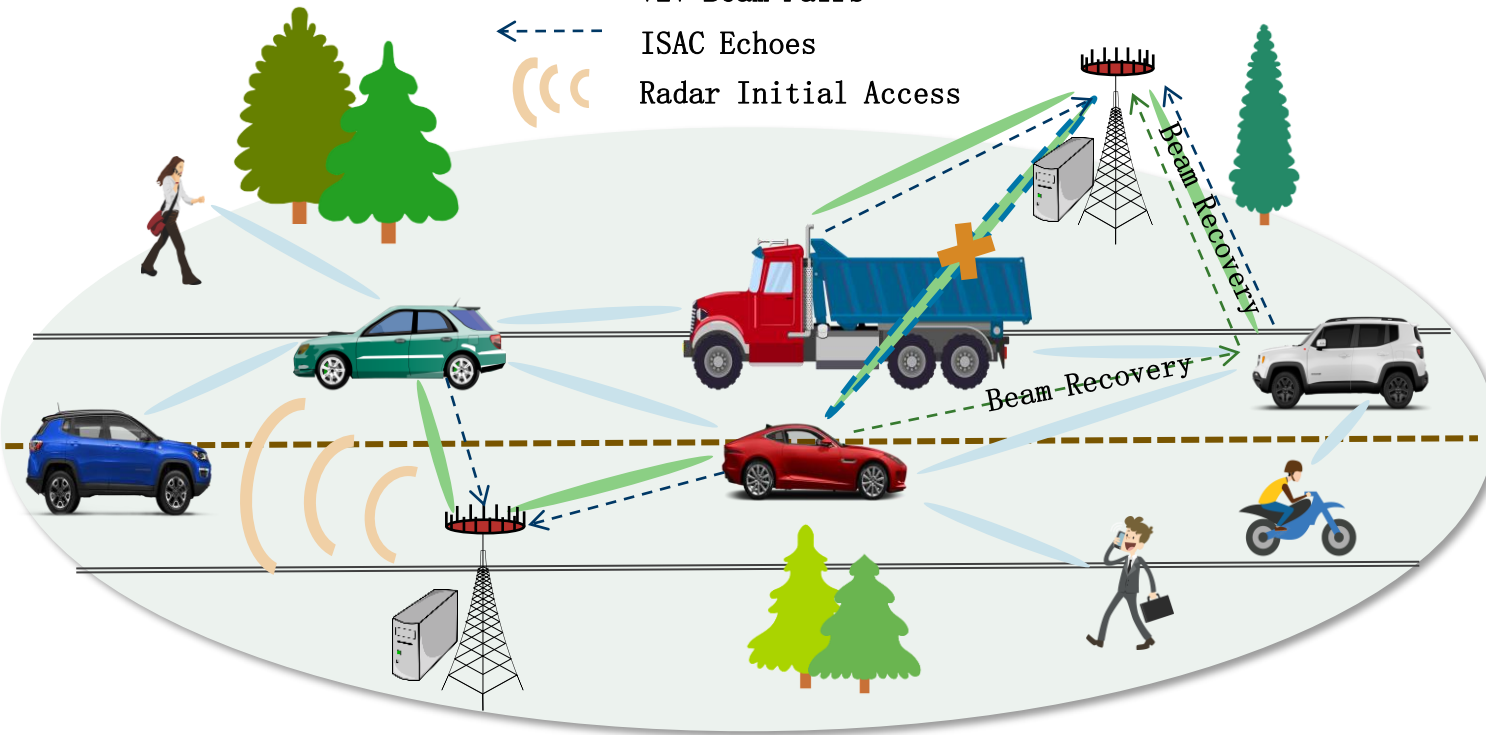
- ✓ Integration gain: joint exploitation of limited hardware and spectral resources
- ✓ Coordination gain: mutual assistance between sensing and communications (sensing centric or communication centric)

■ Applications:



I. Introduction

-  V2I Beam Pairs
-  Beam Failure
-  V2V Beam Pairs
-  ISAC Echoes
-  Radar Initial Access



ISAC in V2X Network

- **Conventional Communication in NR:**
 - Pilots + Reference signals
- **ISAC in NR:**
 - Sensing with data payload signals
 - *Angles, range* and *velocity* of the target, locations of scatterers ...

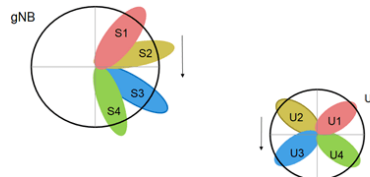


- **Overhead reduction**
- **Accurate tracking**
- **Efficient beam failure detection and recovery**
- **Supported by MATLAB-Enabled Efficient End-to-End Simulation**

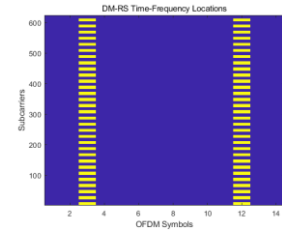
I. Introduction

- Major Toolbox Utilization in Simulation :

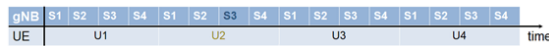
- 5G Toolbox:** Standard-compliant functions to simulate 5G NR end-to-end wireless communications links.



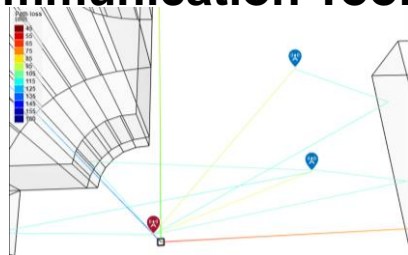
Beam Sweeping



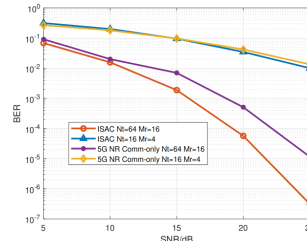
NR Frame Structure Design



- Communication Toolbox:** Facilities modeling communications links from antenna to RF chain to bit processing.

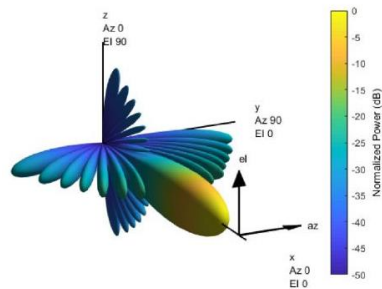


Site Viewer and Ray Tracing

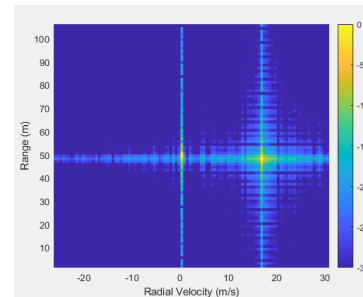


BER Calculation

- Phased Array System Toolbox:** Designs phased array and beamforming in wireless communication and radars.

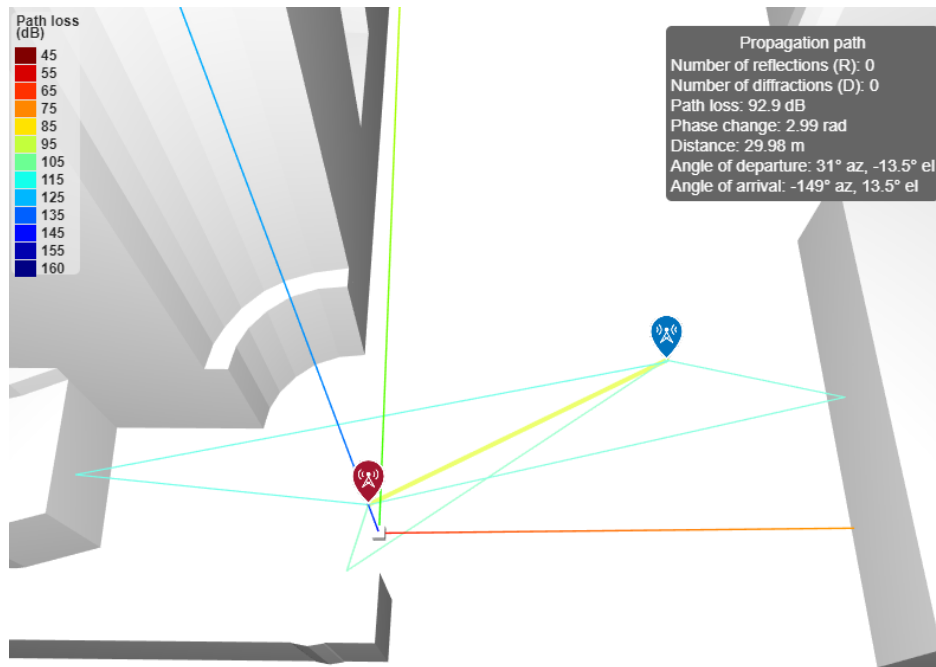


Steering and Beamforming

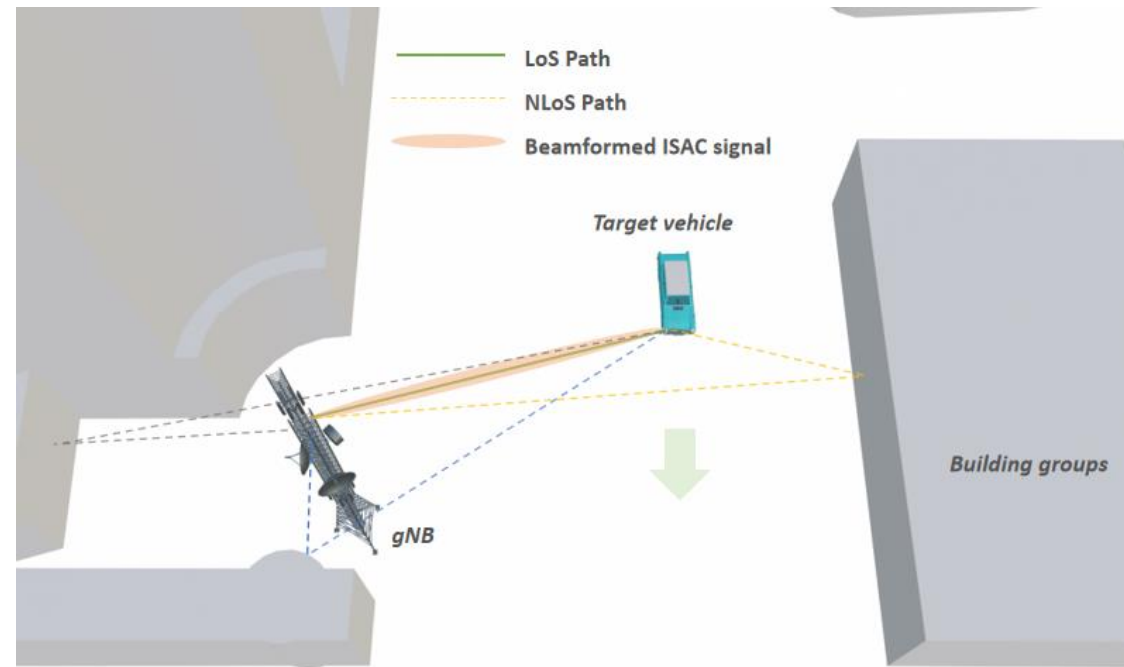


Range and Doppler Estimation in Radar

II. 5G NR Sensing Assisted Communications: Ray-Tracing based V2I Scenario



Ray tracing propagation model
visualized in Siteviewer



Simulated ISAC V2I Network
Scenario

Site Viewer: using Communication toolbox

- `viewer = siteviewer(SceneModel = '.stl')`: import and view the stl file using siteviewer.

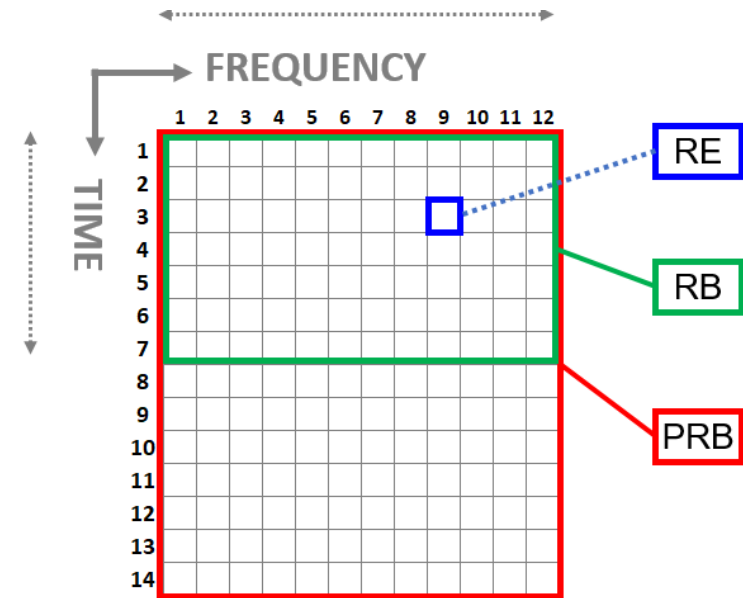
Ray trace: using Communication toolbox

- `r = raytrace(tx, rx)`: displays the propagation paths from the transmitter site tx to the receiver site rx in the current Site Viewer.

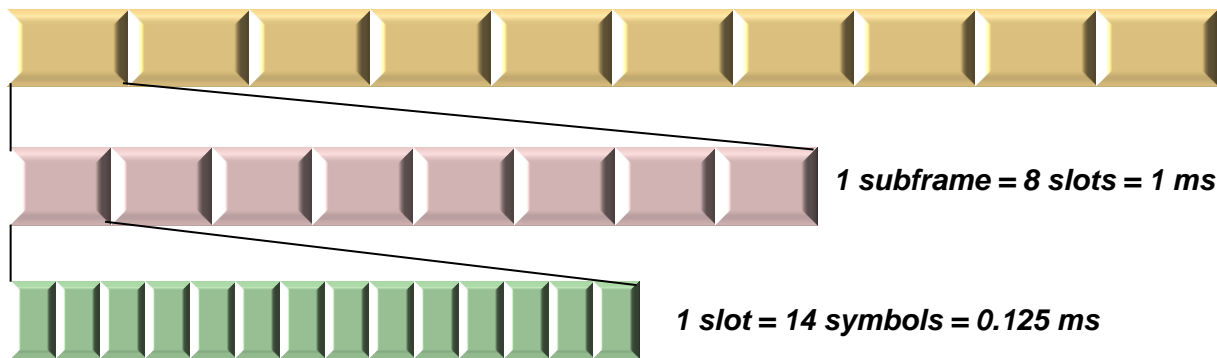
III. Frame Structures and Case Studies in NR V2I Network: OFDM General Frame Structure

- NR Numerology**

μ	$\Delta f = 2^{\mu} \cdot 15$ [kHz]	Cyclic Prefix	Frequency Band	Supported for Data (PDSCH, PUSCH etc)	Supported for Sync (PSS, SSS, PBCH)
0	15	Normal	FR1 (sub-6G)	Yes	Yes
1	30	Normal	FR1	Yes	Yes
2	60	Normal, Extended	FR1, FR2	Yes	No
3	120	Normal	FR2 (mmWave)	Yes	Yes
4	240	Normal	FR2	No	Yes
5	480	Normal	FR2	Yes	Yes
6	960	Normal	FR2	Yes	Yes



$\mu = 3$: 1 radio frame = 10 subframes = 80 slots = 10 ms



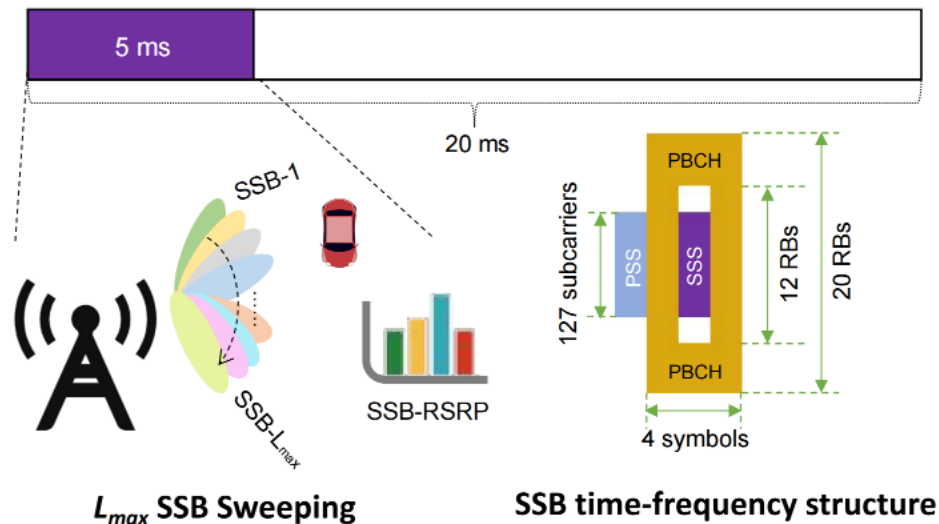
Get OFDM Information: using 5G Toolbox

- `info = nrOFDMInfo(numRB, SCS)`: Input the number of resource blocks and subcarrier spacing to get OFDM Information.

III. Frame Structures and Case Studies in NR V2I Network: Initial Access (IA)

- IA in conventional NR**

Conventional Initial Access Frame Structure:



- Beam sweeping:** L_{max} SSBs (64) in first 5ms of 20ms period
- Beam measurement and determination:** SS reference signal received power (SS-RSRP)

$$SS-RSRP \text{ (in dBm)} = 10 \log_{10} \left(\frac{1}{N} \sum_{n=1}^N |\mathbf{X}[n]|^2 \right) + 30$$

- Beam reporting:** SSB beam index feedback in RACH

Array configuration: *Phased Array System Toolbox*

- `arrayTx = phased.URA([8 8], 0.5*lamda):` Assign the array size and the element spacing for uniform rectangular array (URA).

SS burst waveform: *5G Toolbox*

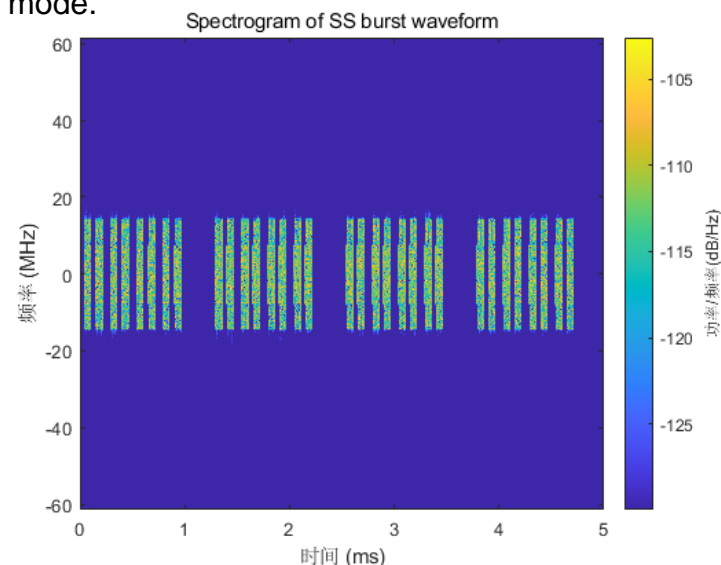
- `burstWaveform = nrWaveformGenerator():` Create the SS burst waveform by using `nrWaveformGenerator` function.

Beamforming: *Phased Array System Toolbox*

- `SteerVecTx = phased.SteeringVector('SensorArray', arrayTx, 'PropagationSpeed', c);` `wT = SteerVecTx(CenterFreq, BeamAng):` Generate weights for steering direction.

Synchronization and RSRP measurement: *5G Toolbox*

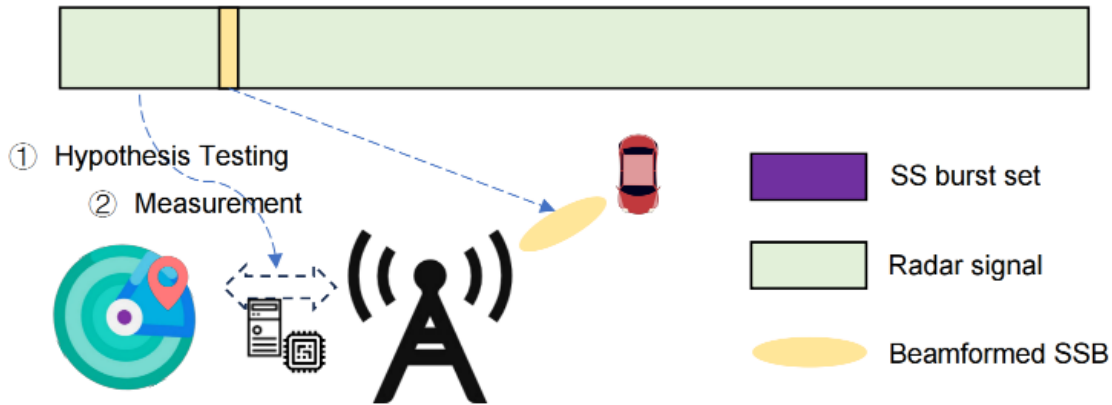
- `offset = nrTimingEstimate():` Performs practical timing estimation by cross-correlating.
- `meas = nrSSBMeasurements():` Measuring the RSRP based on the specified measurement mode.



III. Frame Structures and Case Studies in NR V2I Network: Initial Access (IA)

- IA in ISAC NR

Proposed ISAC Initial Access Frame Structure:



Radar-based localization and beamformed SSB

- Binary hypothesis testing:

$$\begin{cases} \mathcal{H}_0 : \Re(\mathbf{Y}_{i,m,l}) \sim \mathcal{N}(0, \tilde{\sigma}^2/2) \\ \mathcal{H}_1 : \Re(\mathbf{Y}_{i,m,l}) \sim \mathcal{N}(\mu, \tilde{\sigma}^2/2) \end{cases}$$

For a certain false alarm rate P_{FA} :

$$|\Re(\mathbf{Y}_{i,m,l})| \underset{\mathcal{H}_0}{\overset{\mathcal{H}_1}{\geq}} \sqrt{\frac{\tilde{\sigma}^2}{2}} Q^{-1}(P_{FA})$$

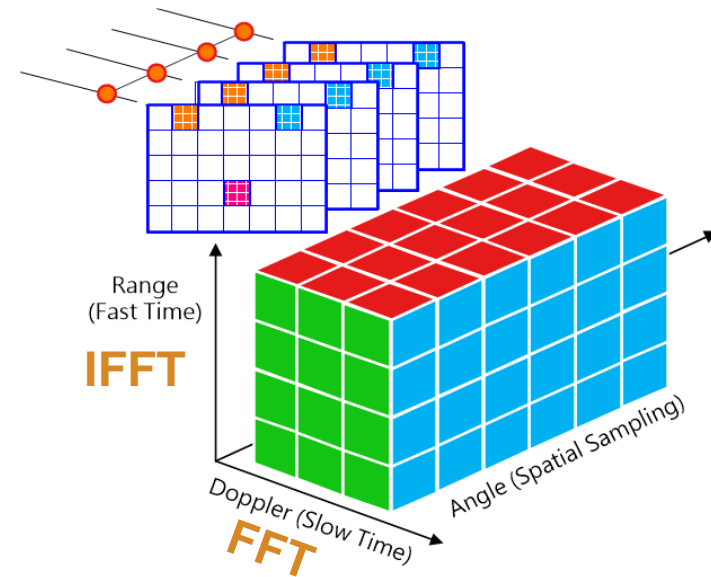
- Beamformed SSB with only synchronization purpose

- OFDM Radar Signal Channel: Phased Array System Toolbox

- `rdchannel = phased.FreeSpace(OperatingFrequency, SampleRate, TwoWayPropagation)`: Design two-way propagation free-space radar channel.

- OFDM Radar Signal Processing:

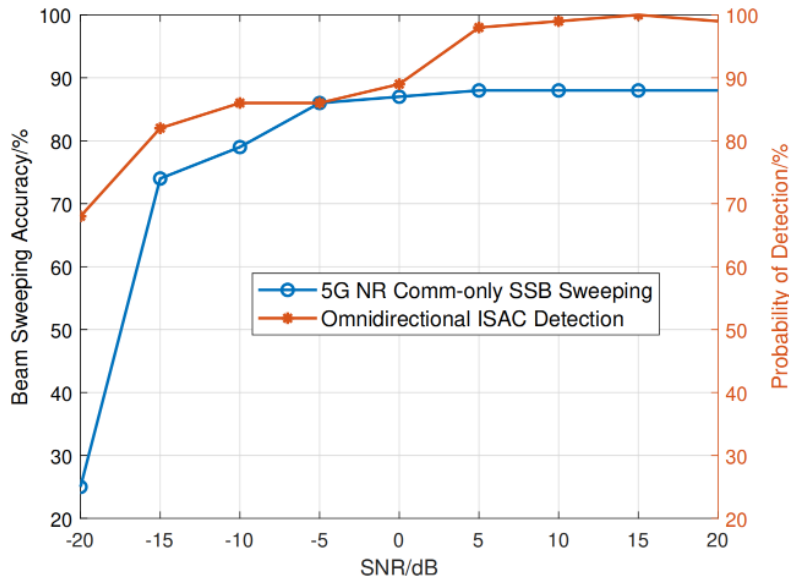
- 2D-DFT Processing: FFT in slow time domain and IFFT in fast time domain



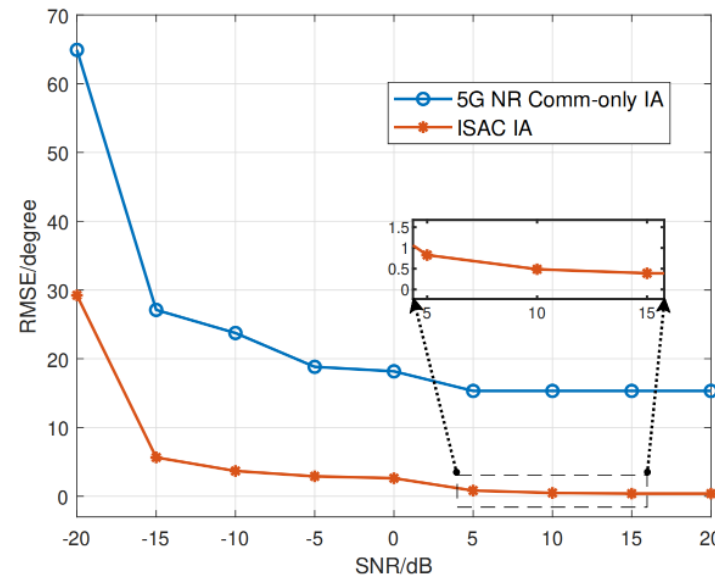
$$d = \frac{\tau c}{2}, v = \frac{\mu c}{2f_c}$$

III. Frame Structures and Case Studies in NR V2I Network: Initial Access (IA)

- Accuracy Comparison



- RMSE Comparison



- Access Time Delay Comparison

Detection Accuracy and Access Delay Comparison between Conventional IA and ISAC IA

IA Scheme	Number of Slots in Aggregation	Detection Accuracy (%)	Expected Access Delay (ms)
Comm	\	86.3	15
	10	88.8	1.25
ISAC	15	93.1	1.875
	20	95.0	2.5

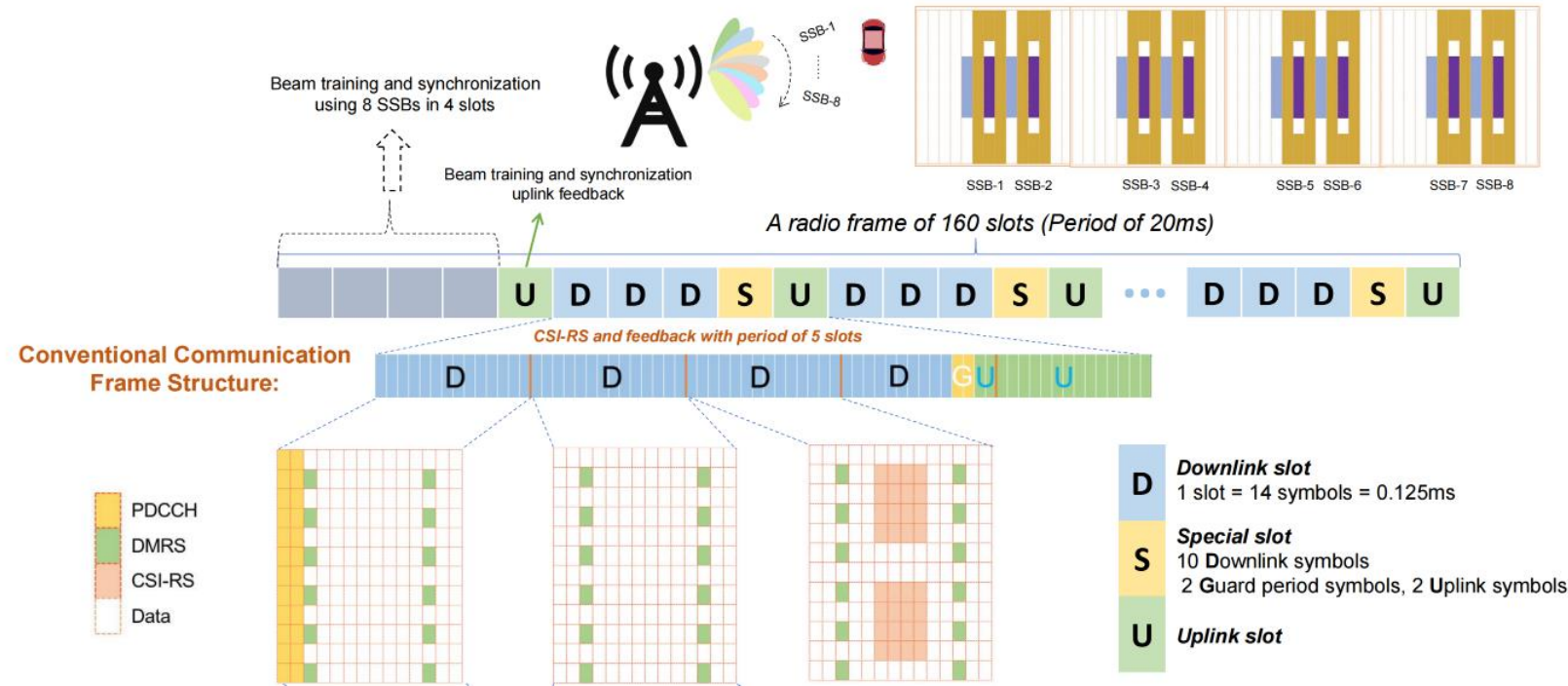
Conventional NR: RSRP-based and codebook-based;

ISAC NR: Omnidirectional-radar and beamforming SSB;

Improvement in **higher accuracy**, **smaller RMSE** and **shorter access time delay**.

III. Frame Structures and Case Studies in NR V2I Network: Connected Mode

- Conventional NR Frame Structure**



SSB Sweeping:

Beam training and synchronization

Common Frame Structure in NR:

DDDSU with period = 5 slots

D: downlink slot, S: special slot, U: uplink slot

NR Reference Signals:

- CSI-RS:** Channel estimation, up to 32 ports are supported, feedback parameters include rank indicator (RI), precoding matrix indicator (PMI) ...
- DMRS:** Coherent demodulation, additional DMRS are supported for high mobility scenario

Frame Structure Design: using 5G Toolbox

- pdsch = nrPDSCHConfig:** Configure the physical downlink shared channel parameters
- nrPDSCHDMRS, nrCSIRSConfig:** Generate DMRS and CSI-RS symbols, assign antenna ports for CSI-RS

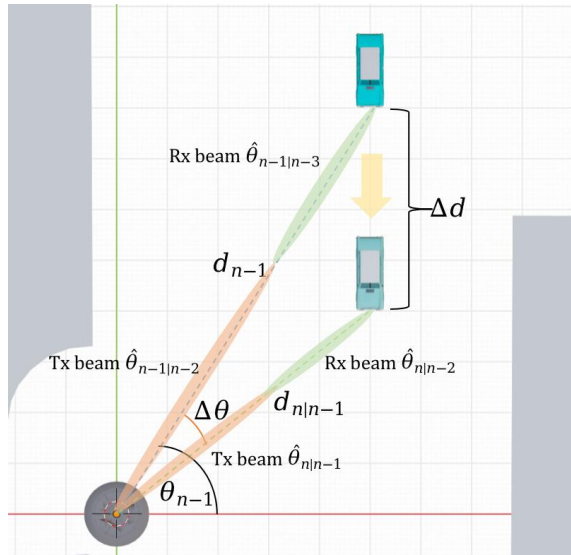
OFDM Modulation, Channel Configuration and Estimation: using 5G Toolbox

- nrOFDMModulate, nrOFDMDemodulate:** Generate OFDM modulated waveform and demodulate
- nrCDLChannel, nrChannelEstimate:** Configure the physical downlink channel using parameters in ray-tracing and do channel estimation using CSIRS

III. Frame Structures and Case Studies in NR V2I Network: Connected Mode

- ISAC tracking on straight road using Extended Kalman Filter

State Evolution Model



- State Evolution Model:

$$\begin{cases} \theta_n = \theta_{n-1} - d_{n-1}^{-1} v_{n-1} \Delta T \cos \theta_{n-1} + \omega_\theta \\ d_n = d_{n-1} - v_{n-1} \Delta T \sin \theta_{n-1} + \omega_d \\ v_n = v_{n-1} + \omega_v \\ \beta_n = \beta_{n-1} \left(1 - d_{n-1}^{-1} v_{n-1} \Delta T \sin \theta_{n-1}\right)^2 + \omega_\beta \end{cases}$$

- Compact Forms:

$$\begin{cases} \text{State Evolution Model: } \mathbf{x}_n = \mathbf{g}(\mathbf{x}_{n-1}) + \boldsymbol{\omega}_n \\ \text{Measurement Model: } \mathbf{y}_n = \mathbf{x}_n + \mathbf{z}_n \end{cases}$$

- Linearization of State Evolution Model:

$$\frac{\partial \mathbf{g}}{\partial \mathbf{x}} = \begin{bmatrix} 1 + \frac{v \Delta T \sin \theta}{d} & \frac{v \Delta T \cos \theta}{d^2} & -\frac{\Delta T \cos \theta}{d} & 0 \\ -v \Delta T \cos \theta & 1 & -\Delta T \sin \theta & 0 \\ 0 & 0 & 1 & 0 \\ -\frac{2\beta v \Delta T \cos \theta}{d} \iota & \frac{2\beta v \Delta T \sin \theta}{d^2} \iota & -\frac{2\beta \Delta T \sin \theta}{d} \iota & \iota^2 \end{bmatrix} \quad \iota = \left(1 - \frac{v \Delta T \sin \theta}{d}\right)$$

- Extended Kalman Filter (EKF):

1) State Prediction: $\hat{\mathbf{x}}_{n|n-1} = \mathbf{g}(\hat{\mathbf{x}}_{n-1}), \hat{\mathbf{x}}_{n+1|n-1} = \mathbf{g}(\hat{\mathbf{x}}_{n|n-1})$

2) Linearization: $\mathbf{G}_{n-1} = \left. \frac{\partial \mathbf{g}}{\partial \mathbf{x}} \right|_{\mathbf{x}=\hat{\mathbf{x}}_{n-1}}, \mathbf{H}_n = \mathbf{I}_4$

3) MSE Matrix Prediction: $\mathbf{M}_{n|n-1} = \mathbf{G}_{n-1} \mathbf{M}_{n-1} \mathbf{G}_{n-1}^H + \mathbf{Q}_s$

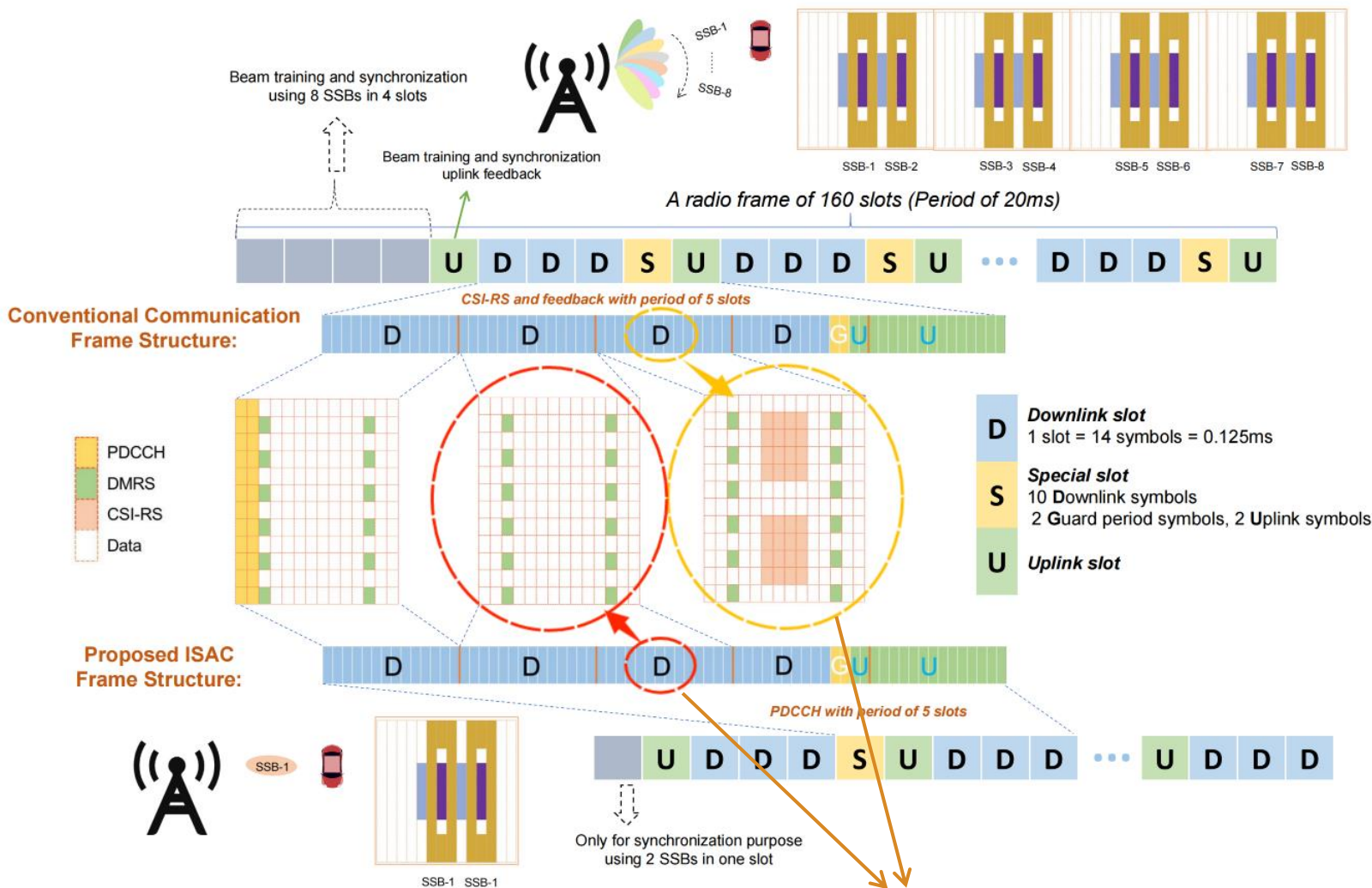
4) Kalman Gain Calculation: $\mathbf{K}_n = \mathbf{M}_{n|n-1} \mathbf{H}_n^H (\mathbf{Q}_m + \mathbf{H}_n \mathbf{M}_{n|n-1} \mathbf{H}_n^H)^{-1}$

5) State Tracking: $\hat{\mathbf{x}}_n = \hat{\mathbf{x}}_{n|n-1} + \mathbf{K}_n (\mathbf{y}_n - \hat{\mathbf{x}}_{n|n-1})$

6) MSE Matrix Update: $\mathbf{M}_n = (\mathbf{I} - \mathbf{K}_n \mathbf{H}_n) \mathbf{M}_{n|n-1}$

III. Frame Structures and Case Studies in NR V2I Network: Connected Mode

- ISAC and Conventional NR Frame Structure Comparison



SSB Reduction:

Efficient tracking, dedicated SSB for synchronization purpose

NR Reference Signals:

- CSI-RS:** In **SU-MIMO V2I** network, with the efficient tracking using EKF in ISAC scheme, CSI-RS and its feedback (PMI, RI...) are reduced, replaced with useful downlink data.
- DMRS:** DMRS are kept for coherent demodulation

Overhead:

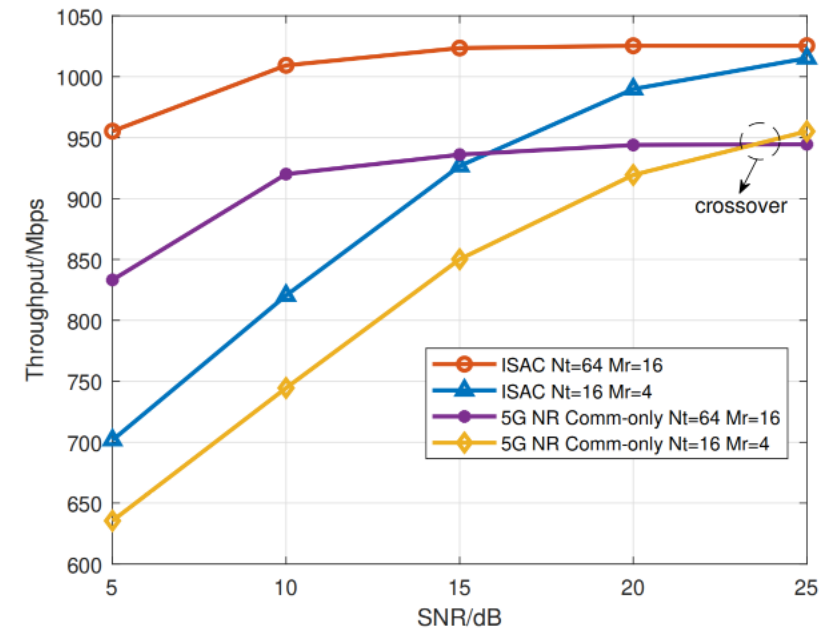
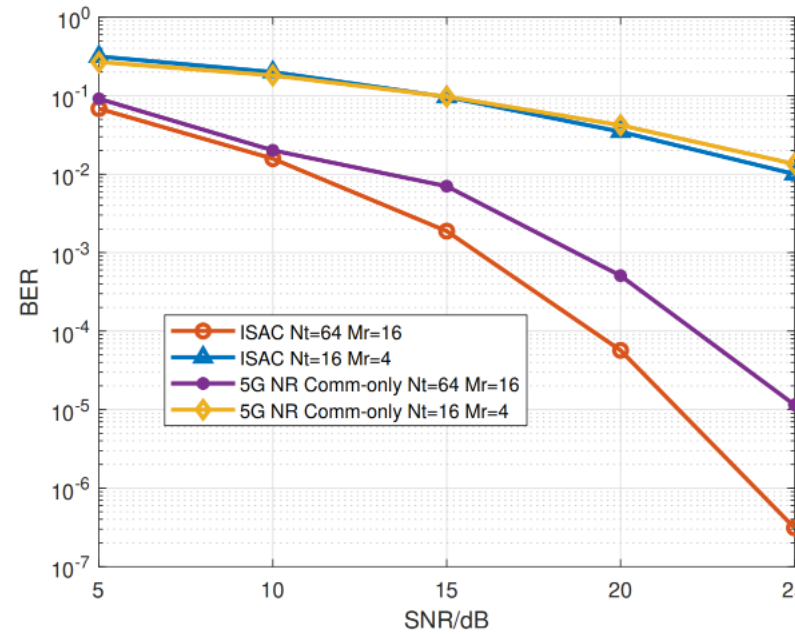
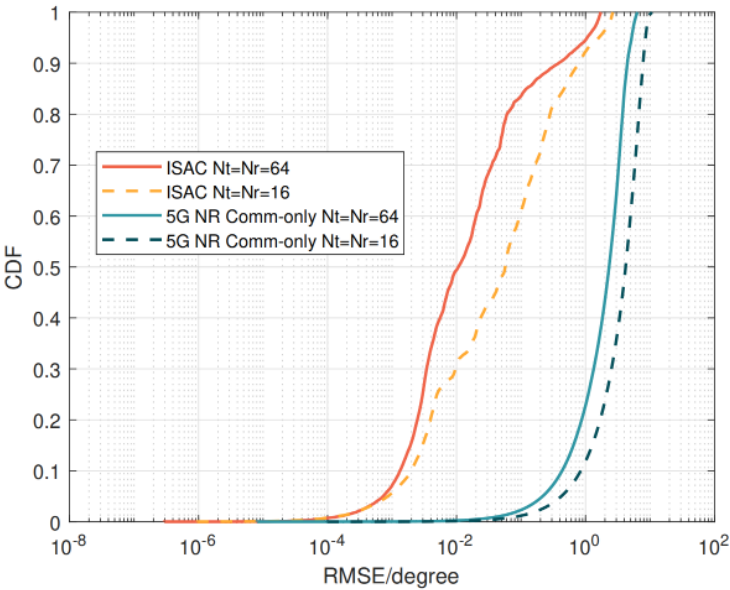
In a period of 5 time slots:
 DMRS: 42 REs CSI-RS: 32 REs
 Overhead could be reduced by up to **43.24%**

The third downlink slot in ISAC scheme compared that with conventional scheme only contains DMRS, where CSI-RS is omitted

III. Frame Structures and Case Studies in NR V2I Network: Connected Mode

- Tracking RMSE

- Communication Performance Comparison



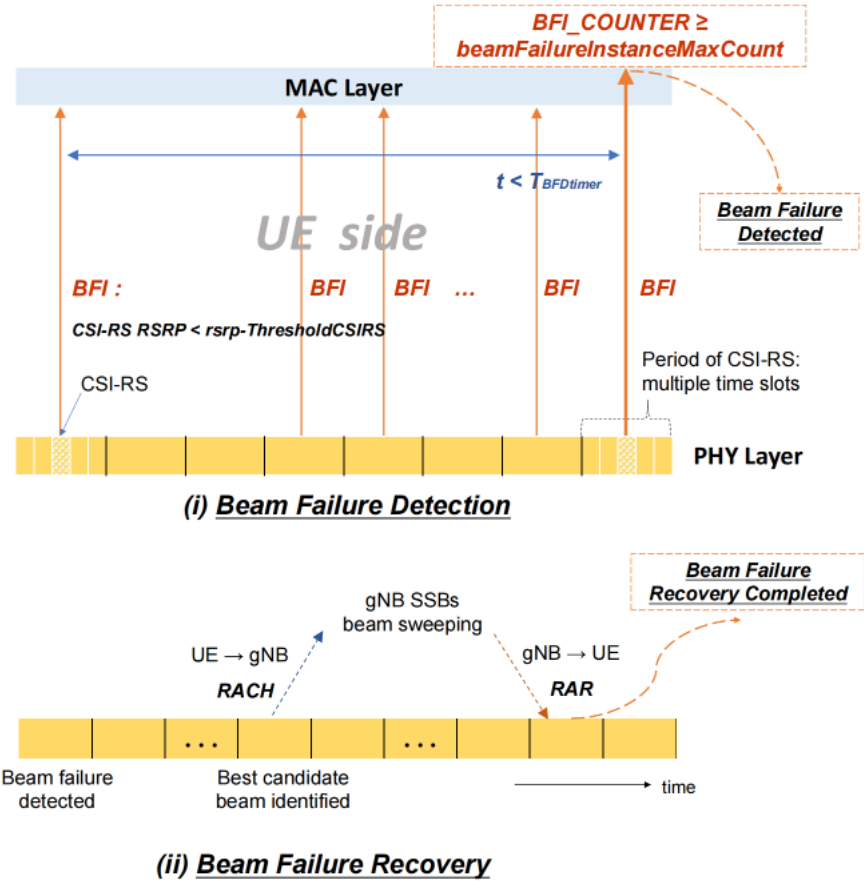
BER and throughput calculation: using Communications Toolbox

- numerrs = biterr():** Calculate the bit error rate (BER)

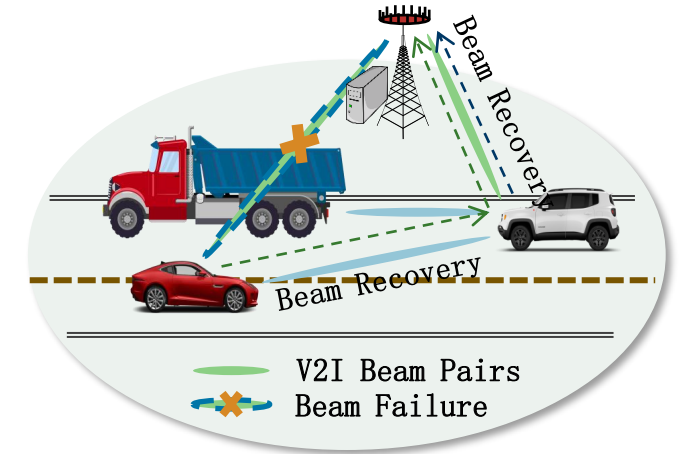
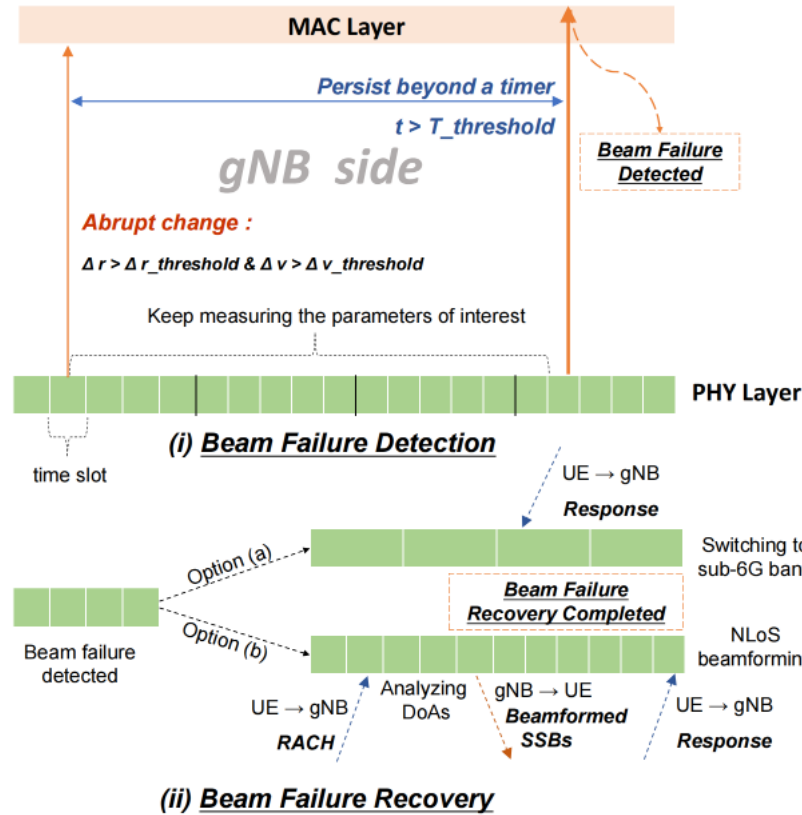
- Throughput calculation:** Throughput (in Mbps) = $10^{-6} \cdot \sum_{j=1}^J \left(N_{\text{Layers}}^{(j)} \cdot Q_M^{(j)} \cdot \frac{N_{\text{PRB}}^{\text{BW}(j), \mu} \cdot 12}{T_s^\mu} \cdot \left(1 - \text{BER}^{(j)} - \text{OH}^{(j)} \right) \right)$

III. Frame Structures and Case Studies in NR V2I Network: Beam Failure Detection and Recovery

BFR in conventional NR



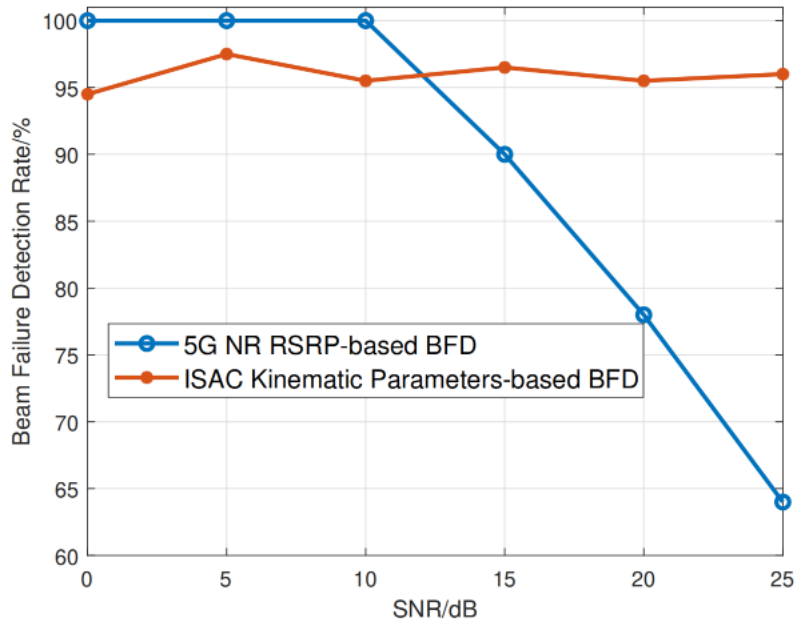
BFR in ISAC NR



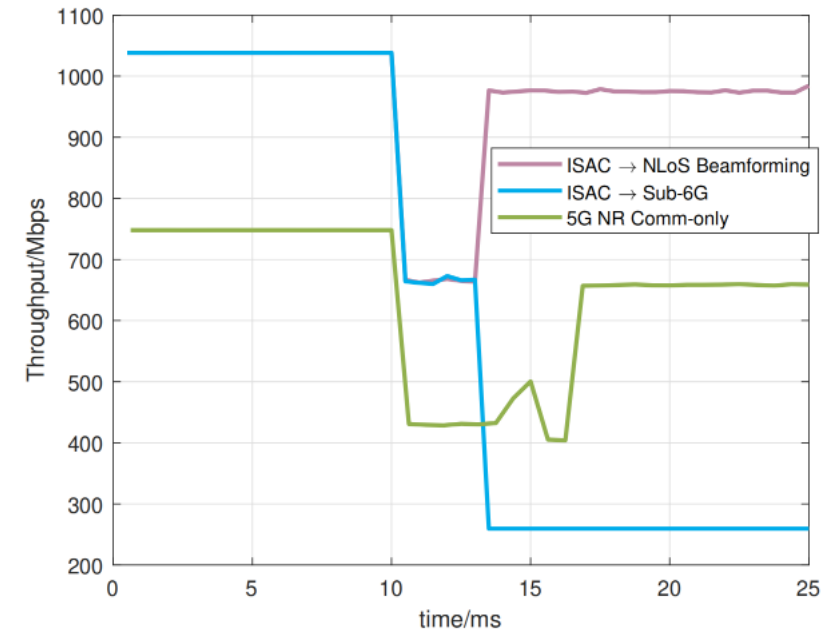
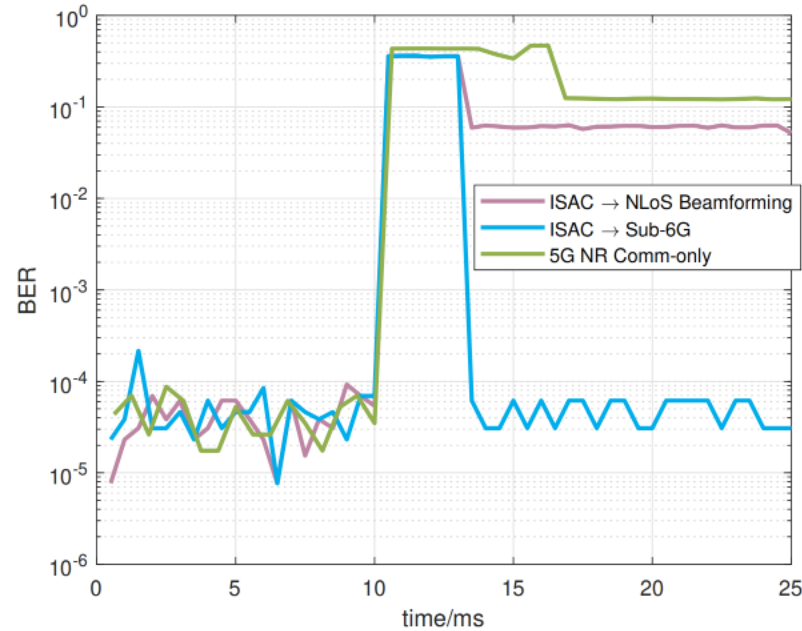
- Conventional Beam failure detection:** Beam failure instance > threshold
- Conventional Beam failure recovery:** Candidate beam or beam sweeping
- ISAC Beam failure detection:** Abrupt change in motion parameters $\Delta r > r_{thre} \ \& \ \Delta v > v_{thre}$
- ISAC Beam failure recovery:**
 - 1) Switch to sub-6G band
 - 2) Beamforming through NLoS

III. Frame Structures and Case Studies in NR V2I Network : Beam Failure Detection and Recovery

- Accuracy Comparison



- Communication Performance Comparison



Fast beam failure detection and recovery and higher accuracy

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- [1] **F. Liu**, W. Yuan, C. Masouros and J. Yuan, "Radar-assisted Predictive Beamforming for Vehicular Links: Communication Served by Sensing", *IEEE Transactions on Wireless Communications*, vol. 19, no. 11, pp. 7704-7719, Nov. 2020. (**IEEE ComSoc Best Readings**)
- [2] **F. Liu*** and C. Masouros, "A Tutorial on Joint Radar and Communication Transmission for Vehicular Networks - Part III: Predictive Beamforming without State Models", *IEEE Communications Letters*, vol. 25, no. 2, pp. 332-336, 2021. (**IEEE ComSoc Best Readings**)
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