

# Ray tracing channel simulation for millimeter wave indoor localization system

## Research thesis



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- Millimeter wave indoor localization system based on active radar sensing of local passive reference points [1]

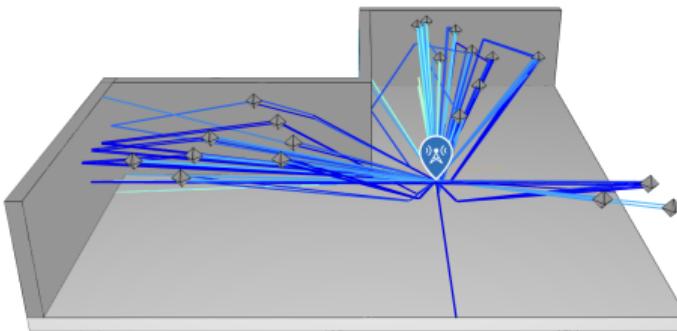


Figure 0.1. The conceptual view of the millimeter wave indoor localization system

- Ray tracing channel simulation
- Large and realistic environment

- Frequency-modulated continuous wave (FMCW) radar

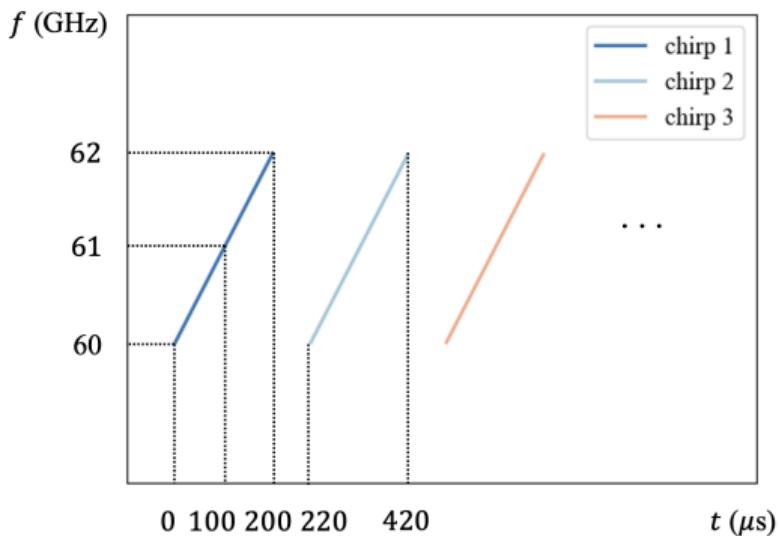


Figure 0.2. The principle of the FMCW radar

- The signal flow

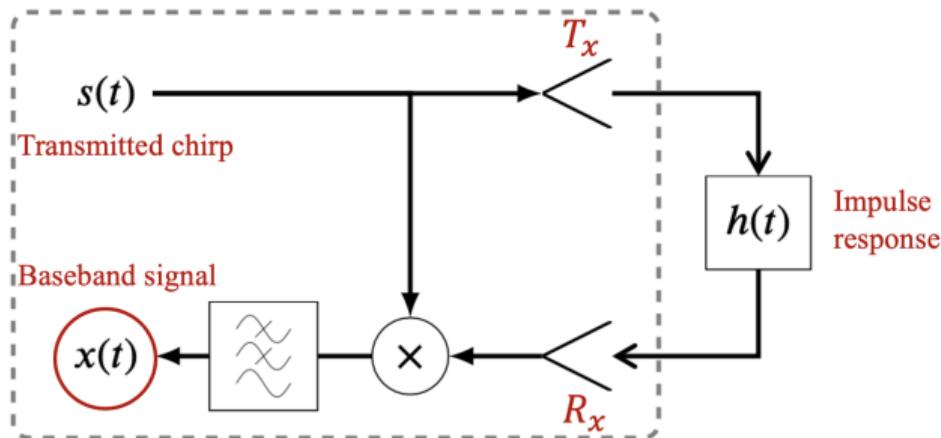


Figure 0.3. The view of the signal flow [2]

- Range-Doppler (RD) map and constant false alarm rate (CFAR) detection

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## Modeling of the channel simulation

Modeling of the room and raytracing

LOS rays between the reflectors and radar

Signal processing

## Antenna radiation pattern

Antenna designer

Results

## Reflector radar cross section

Radar cross section

Results

## Motion of the robot

Trajectory generation

Orientation

## Evaluation

## Summary and outlook

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- Modeling of the reflectors

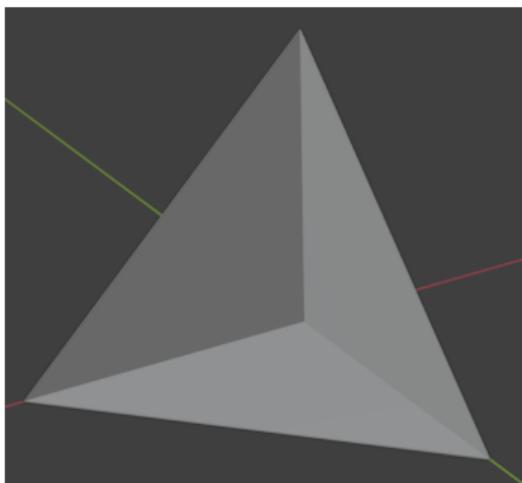


Figure 1.1. Trihedral corner reflector



Figure 1.2. Octahedral reflector

- Modeling of the room model

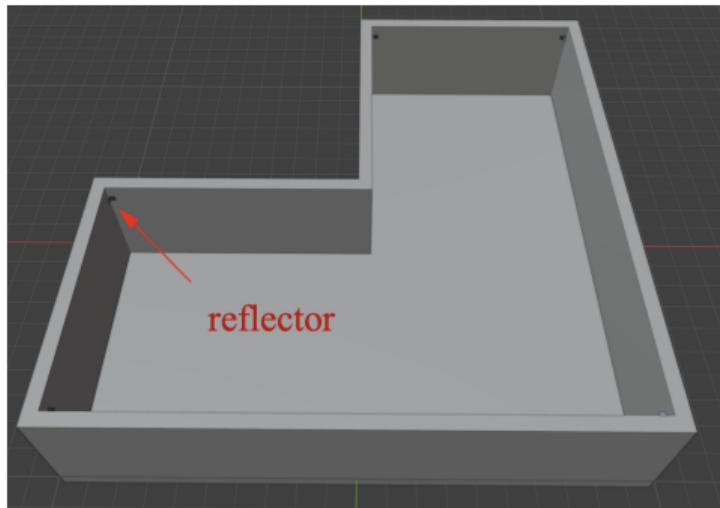


Figure 1.3. Room model with reflectors

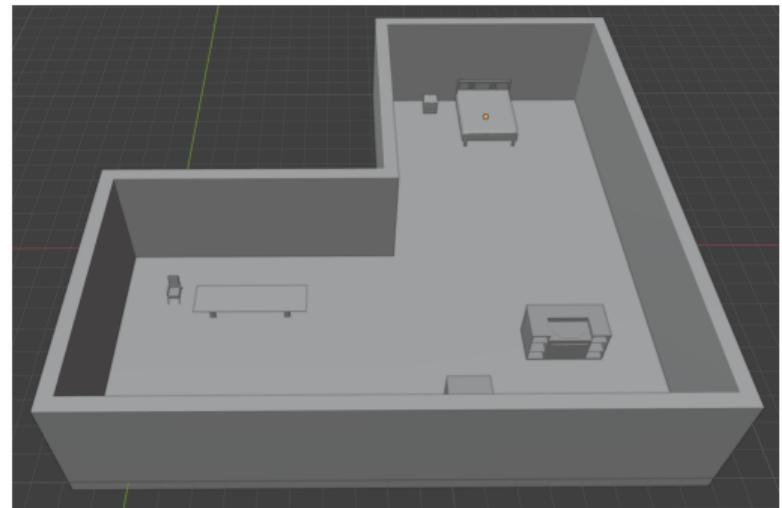


Figure 1.4. Room model with furniture [3]

- Setup of the raytracing (MaxNumreflections, MaxAbsolutePathLoss, Method, etc.)
- The shooting and bouncing ray (SBR) method

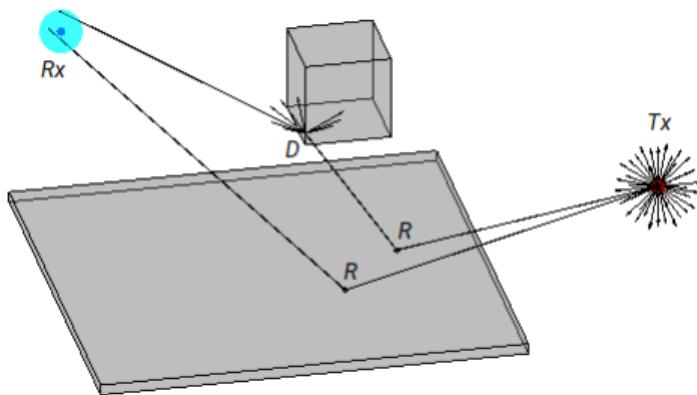


Figure 1.5. The view of the SBR method [4]

- The view of raytracing in the empty room model and room model with furniture

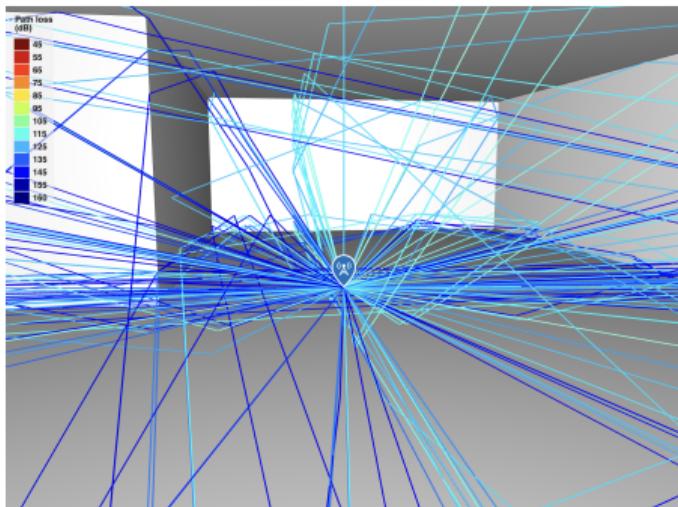


Figure 1.6. In empty room model

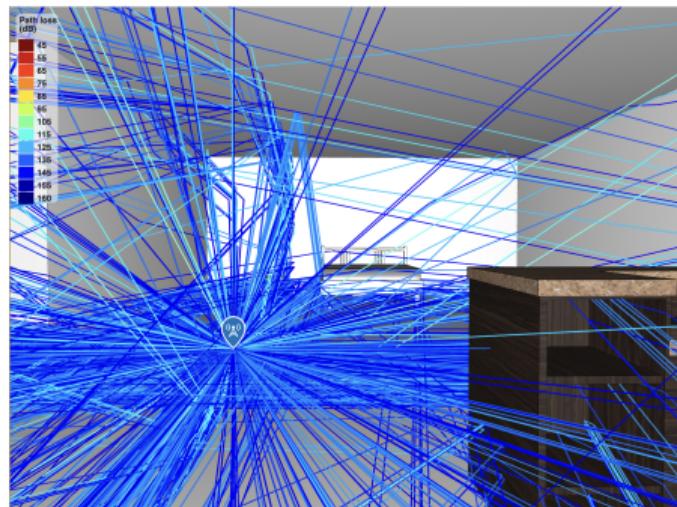


Figure 1.7. In room with furniture

- The view of raytracing in the room model with reflectors and inside the reflector

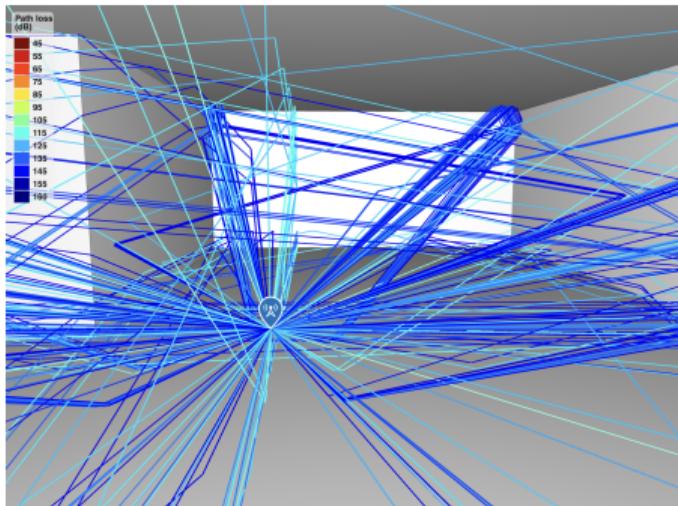


Figure 1.8. In room with reflectors

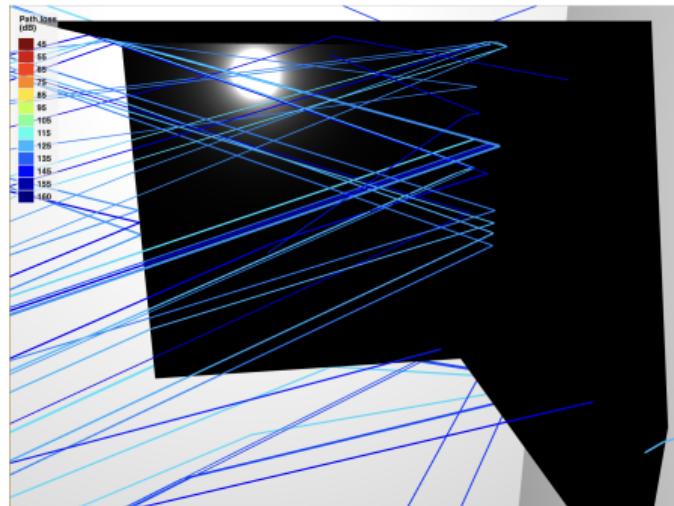


Figure 1.9. The view inside the reflector

# Line-of-sight (LOS) rays

- Setting the receivers at the positions of reflectors to obtain LOS rays

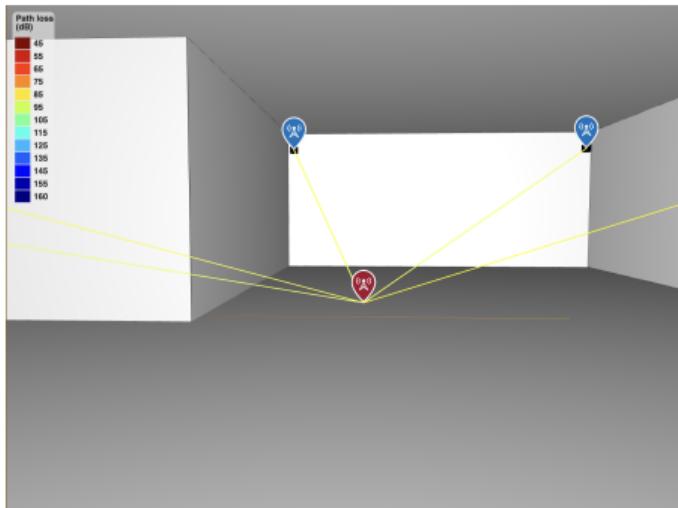


Figure 1.10. LOS rays from five trihedral corner reflectors

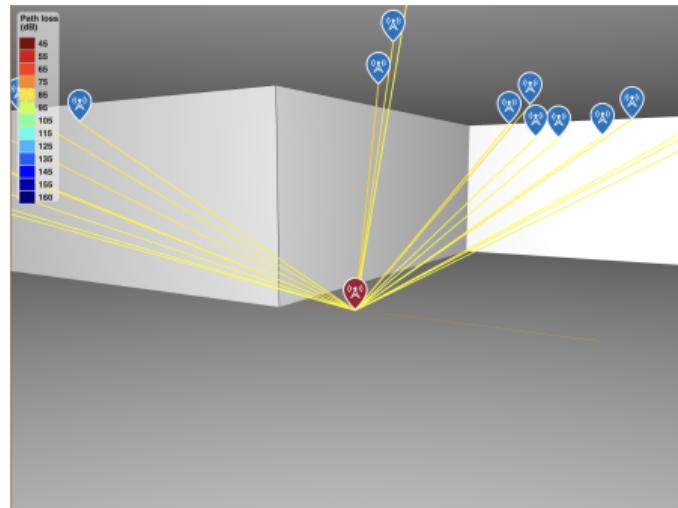


Figure 1.11. LOS rays from multiple octahedral reflectors

$$PL = 10 \cdot \log_{10} \left( \frac{G_T G_R \lambda^2 \cdot \sigma}{(4\pi)^3 r^4} \right) [5], \quad (1)$$

where

- $G_T$  and  $G_R$  are the gain values of transmitter and receiver respectively.
- $\lambda$  is the wavelength of the ray.
- $\sigma$  is the radar cross section.
- $r$  represents the propagation distance of LOS rays.

$$x(n_s, n_p) = \sum_m A_m \exp \left( 2\pi j \left( \frac{2Br_m}{T_c c} T_s n_s + \frac{2fv_m}{c} T_p n_p \right) \right) + n(n_s, n_p) [6], \quad (2)$$

where

- $x(n_s, n_p)$  is an element of a 2D matrix  $\mathbf{X}$ , i.e. baseband signal,
- $n_s = 1 \dots 256$  is the fast time samples,
- $n_p = 1 \dots 32$  is the slow time samples,
- $m$  represents each ray in the channel simulation,
- $A_m = \sqrt{P_T \cdot 10^{-PL_m/10} \cdot R}$ ,
- the first term for the delay and the second term for the Doppler effect,
- $n(n_s, n_p)$  is the Gaussian noise  $n \sim \mathcal{CN}(0, V_{noise})$ .

# Range-Doppler map

- The view of 2D fast Fourier transform (FFT) and range-Doppler map

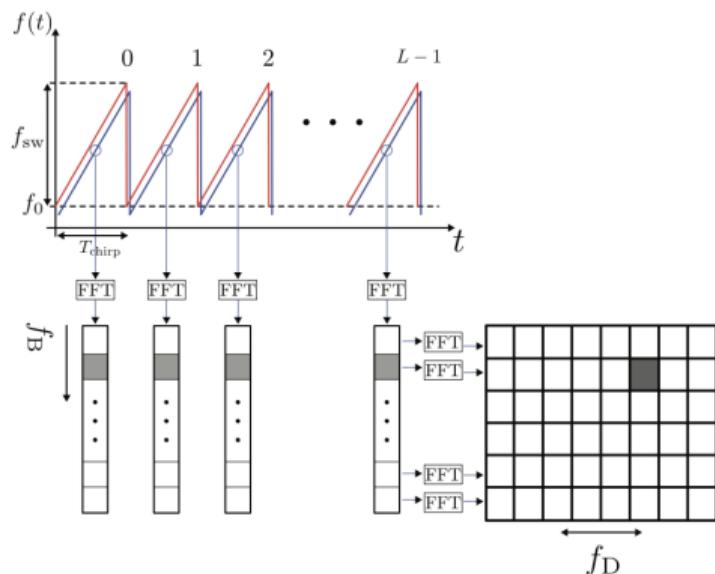


Figure 1.12. The view of 2D FFT [7]

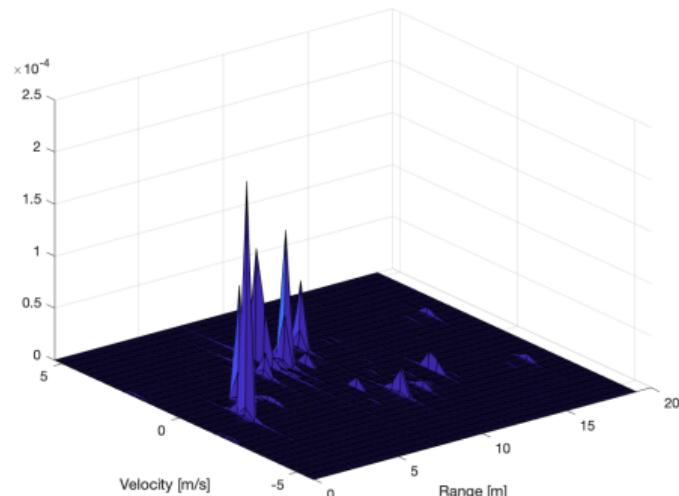


Figure 1.13. Range-Doppler map

# Constant false alarm rate (CFAR) detection

- The CFAR plots for the empty room model and room model with reflectors

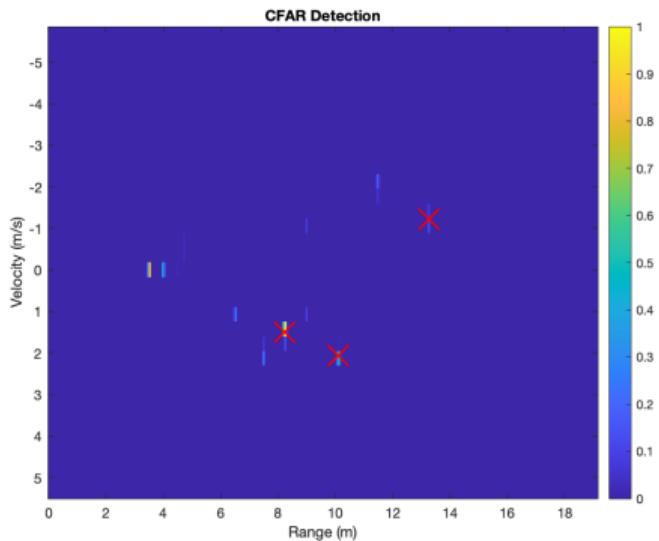


Figure 1.14. In the empty room

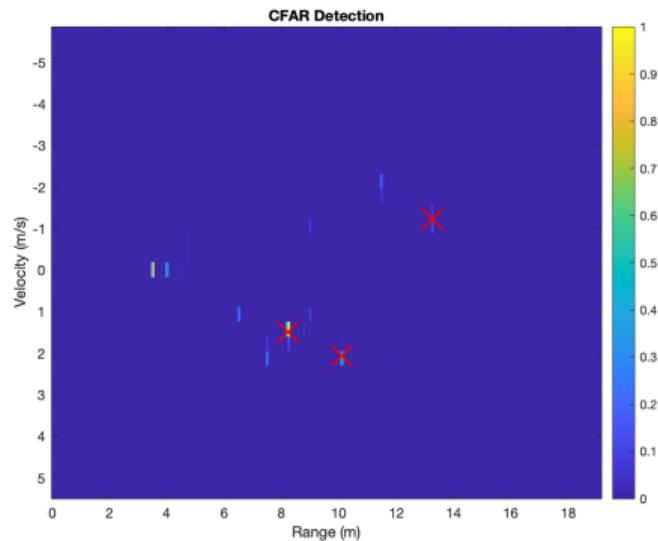


Figure 1.15. In the room with reflectors

# Constant false alarm rate (CFAR) detection

- The CFAR plots for the room model with reflectors and with furniture

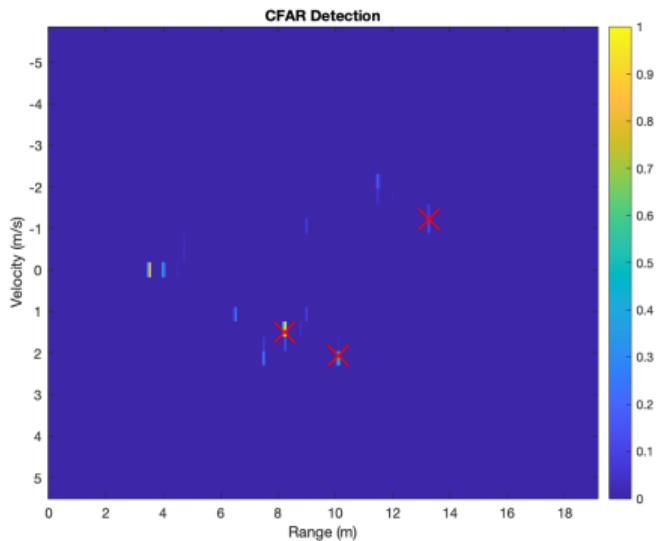


Figure 1.16. In the room with reflectors

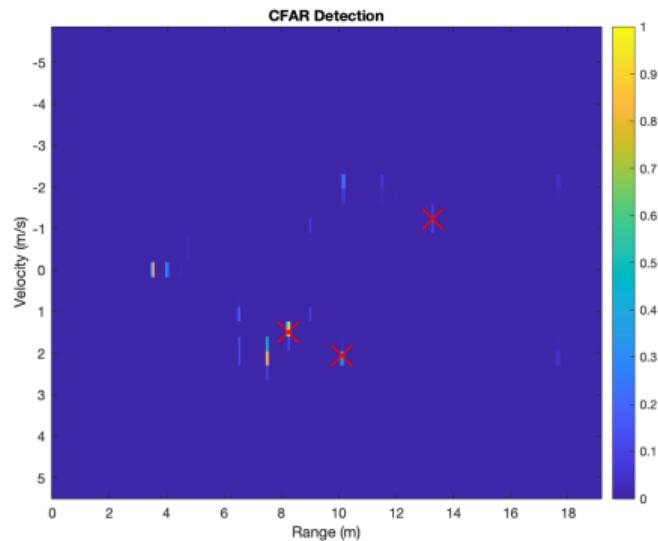


Figure 1.17. In the room with furniture

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- "Optimization" function to obtain maximum gain value

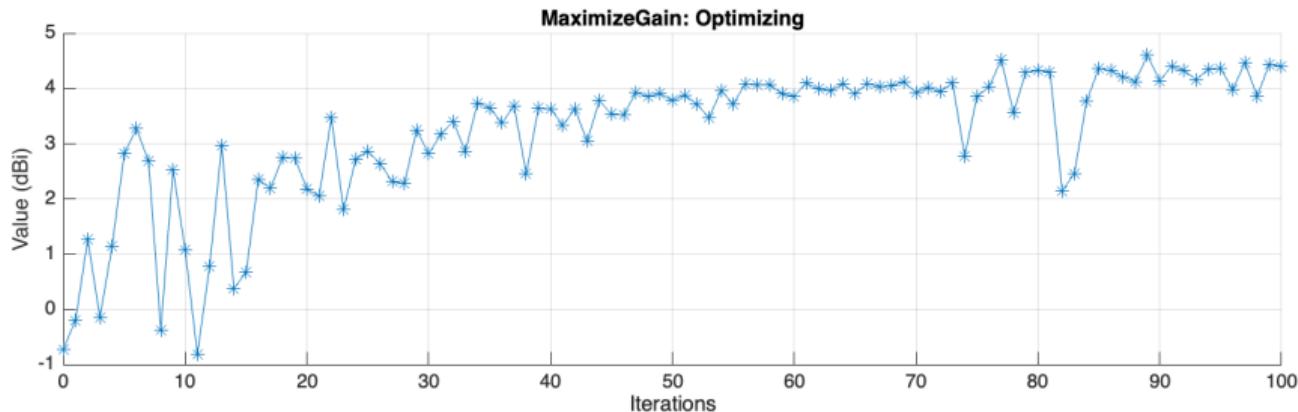


Figure 2.1. The view of the maximum gain

- The gain as  $az = 0^\circ$  between the first version and after tuning

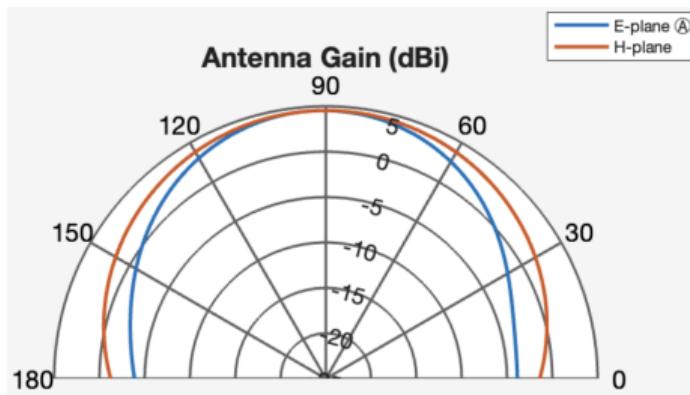


Figure 2.2. The gain of the first version

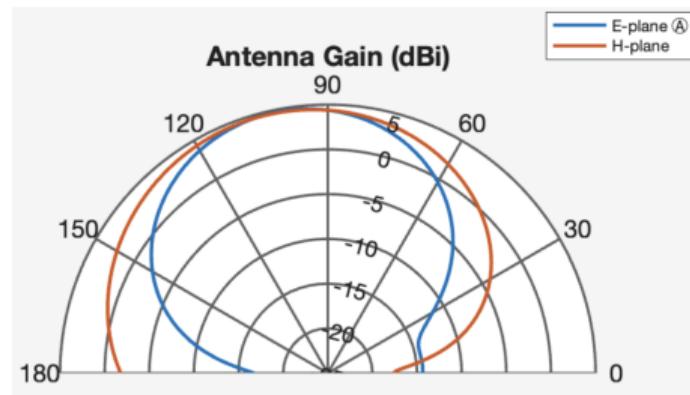


Figure 2.3. The gain after tuning

# Antenna designer

- The view and radiation pattern of the final antenna

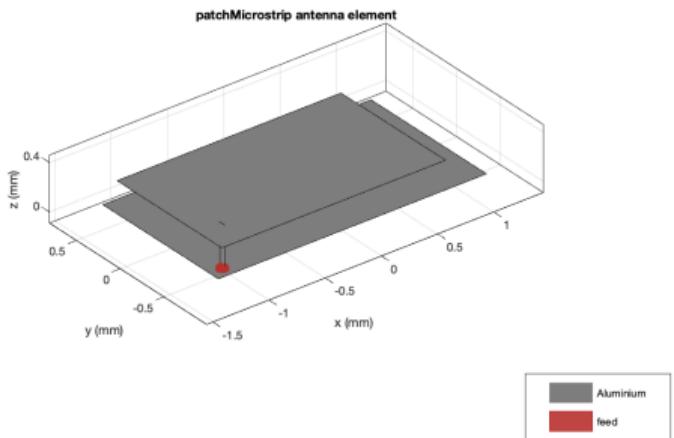


Figure 2.4. View of the final antenna

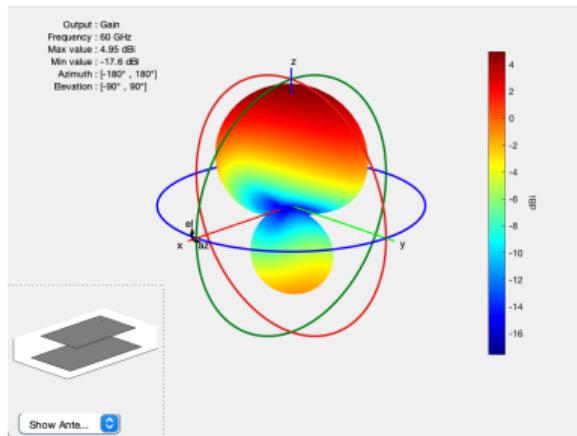


Figure 2.5. 3D radiation pattern

- The constant false alarm rate (CFAR) plots about the radiation pattern

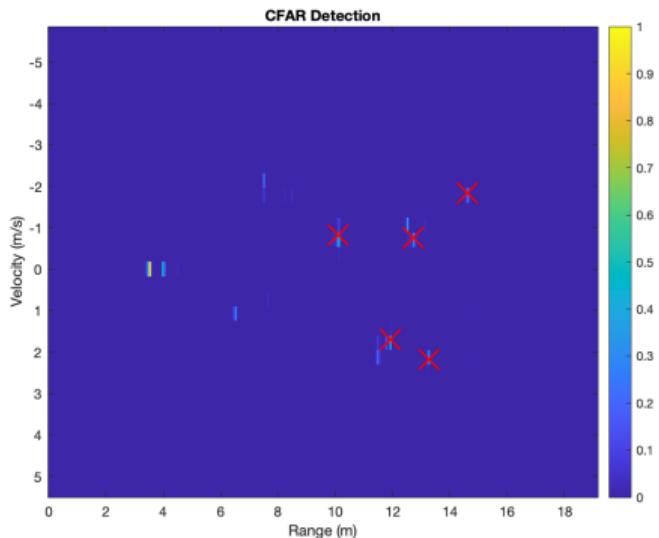


Figure 2.6. CFAR without radiation pattern

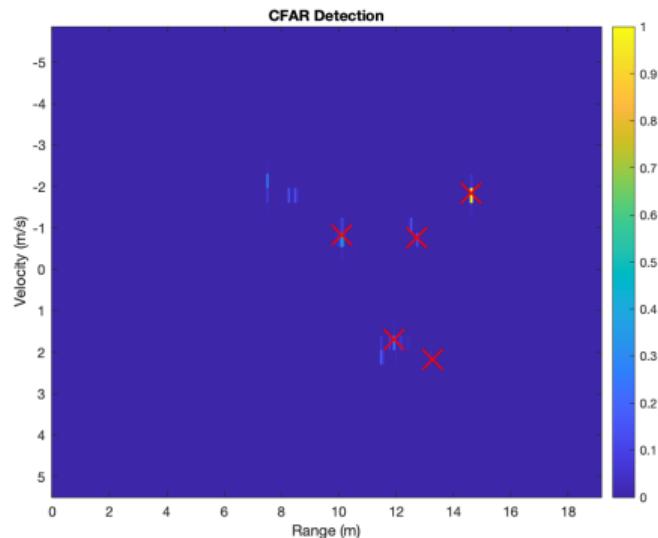


Figure 2.7. CFAR with radiation pattern

- The view of the asymmetric radiation pattern in the room

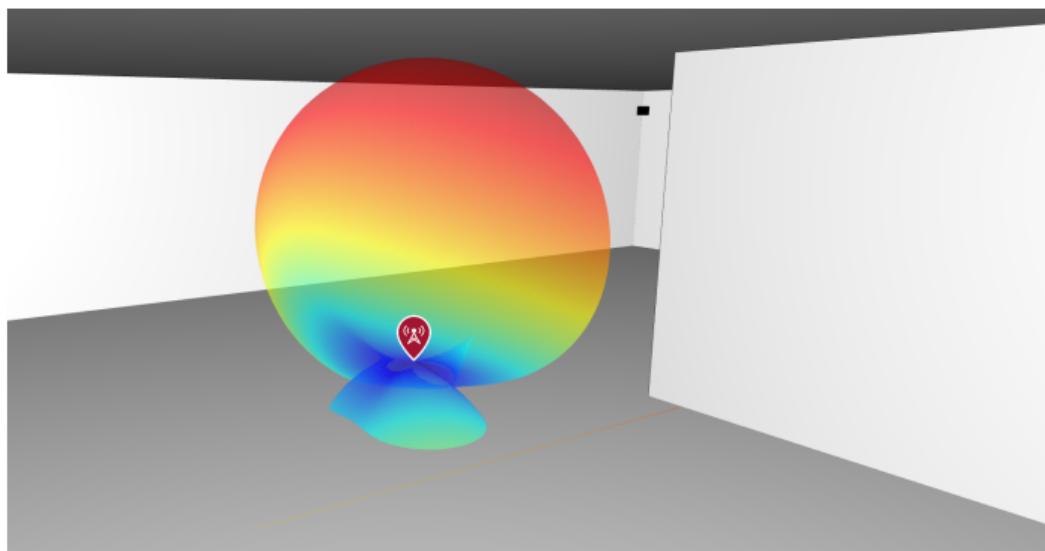


Figure 2.8. The view of the asymmetric pattern

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# Radar cross section (RCS)

- View of the RCS for the tetrahedral object with default parameters

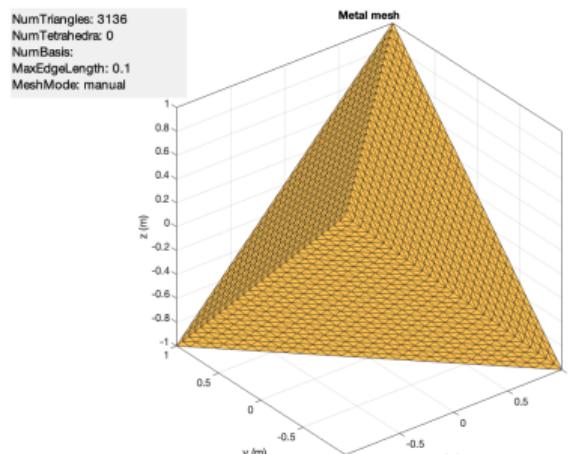


Figure 3.1. Mesh of the tetrahedral object

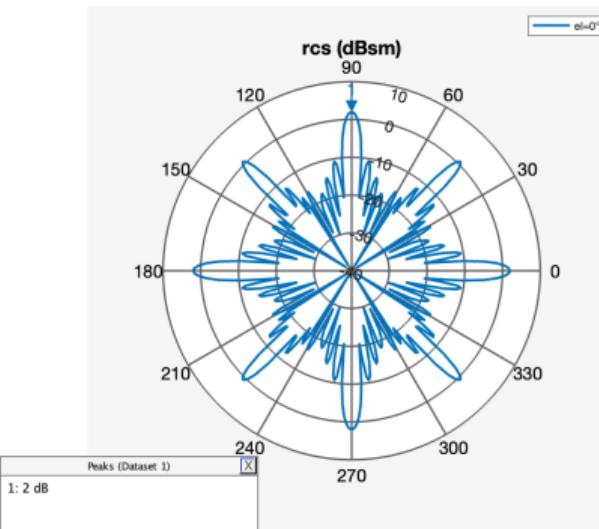


Figure 3.2. 2D RCS of the tetrahedral object

# Radar cross section (RCS)

- View of the RCS for the tetrahedral object with scaled parameters

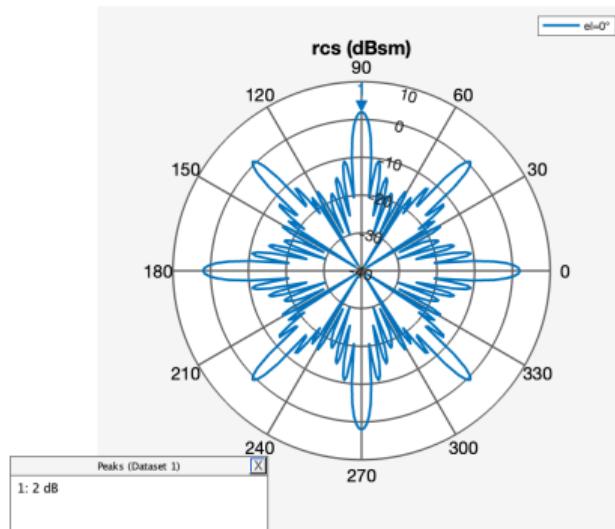


Figure 3.3. 2D RCS without scaling

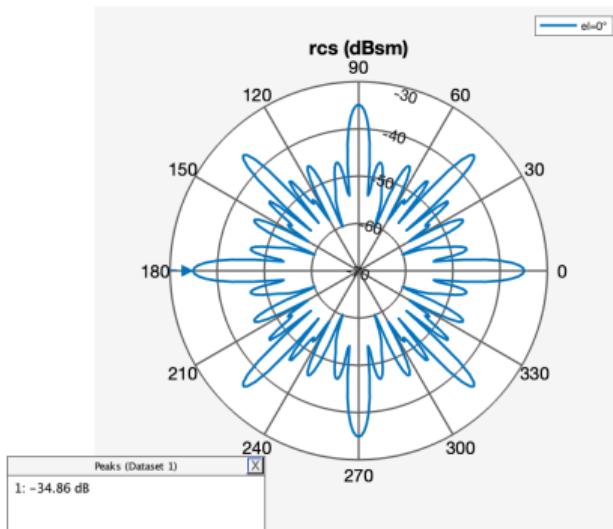


Figure 3.4. 2D RCS with scaling

# Radar cross section (RCS)

- View of the RCS for the trihedral corner reflector

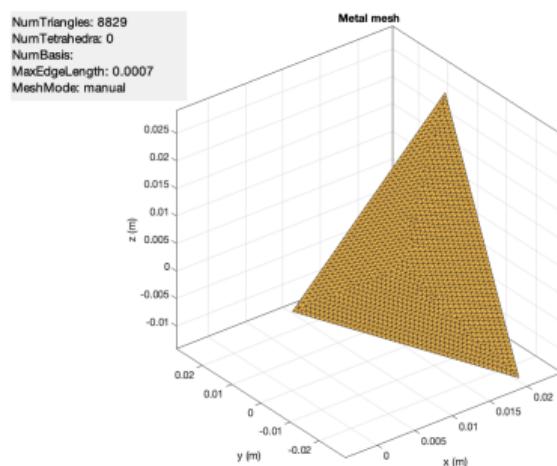


Figure 3.5. Mesh of trihedral corner reflector

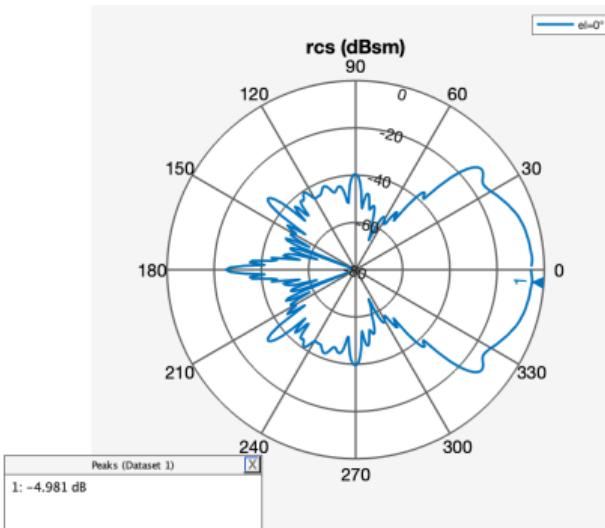


Figure 3.6. 2D RCS of trihedral reflector

# Radar cross section (RCS)

- 3D RCS views for both reflectors

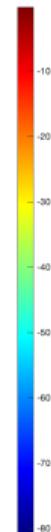
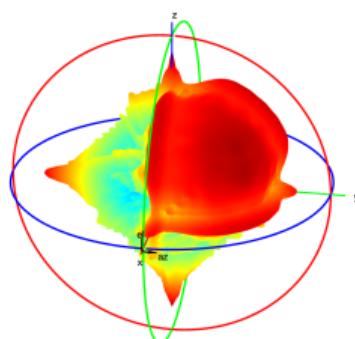


Figure 3.7. 3D RCS of trihedral reflector

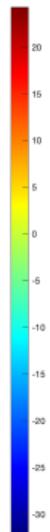
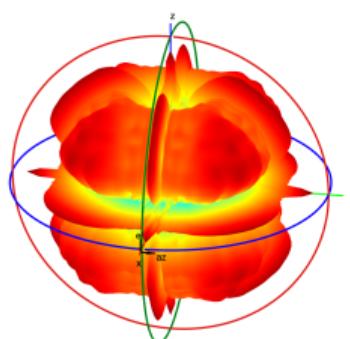


Figure 3.8. 3D RCS of octahedral reflector

- The CFAR plots about the RCS pattern

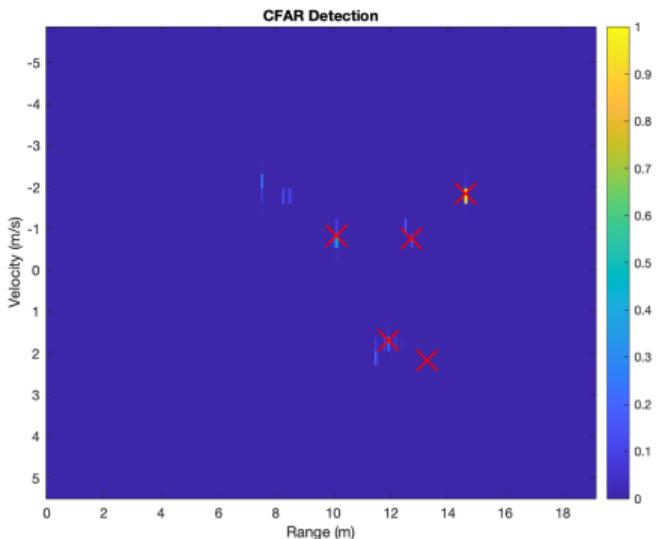


Figure 3.9. With isotropic RCS pattern

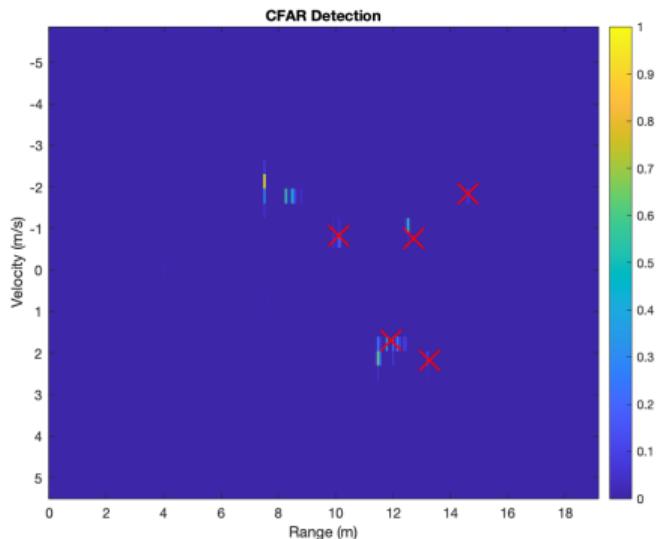


Figure 3.10. With anisotropic RCS pattern

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# Trajectory generation

- The trajectory generation for the robot along the wall and furniture

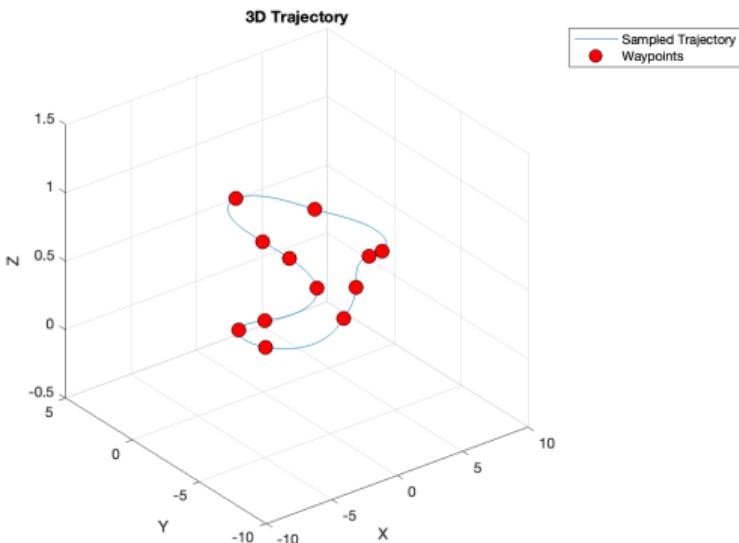


Figure 4.1. The trajectory of the robot

# Orientation

- The orientation of the antenna during motion

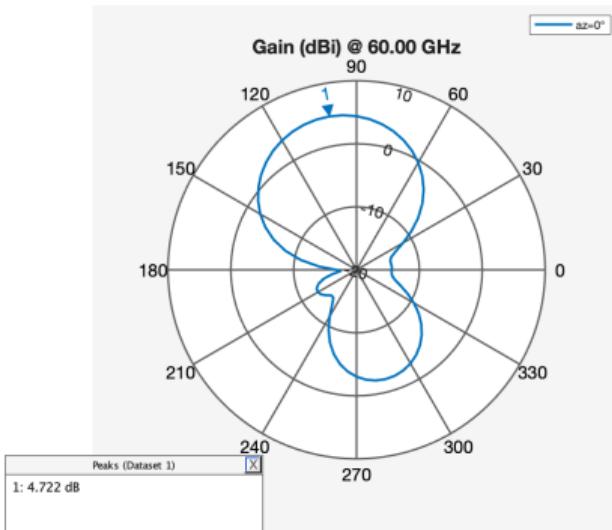


Figure 4.2. Radiation pattern before rotation

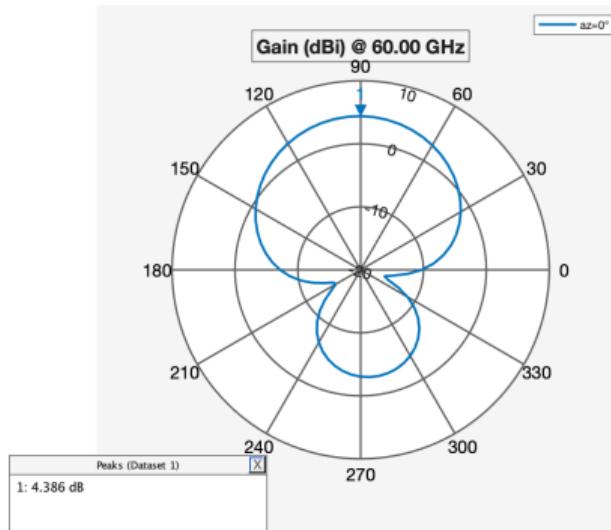


Figure 4.3. Radiation pattern after rotation

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- The CFAR plots difference in units watt (W) and decibel watt (dBW)

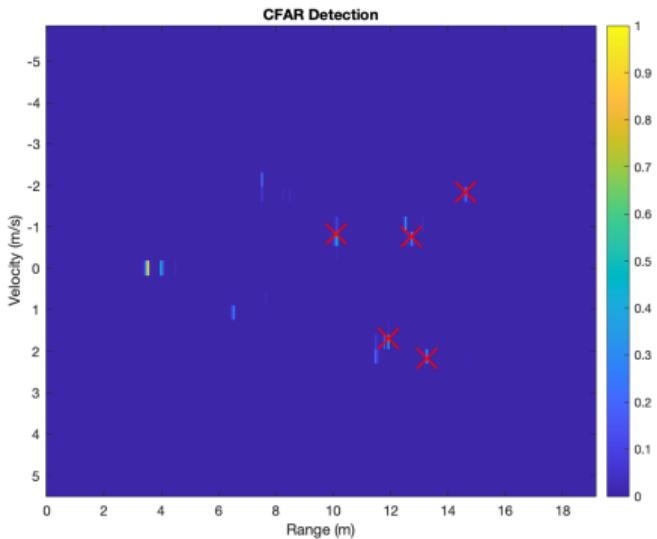


Figure 5.1. CFAR plot in unit W

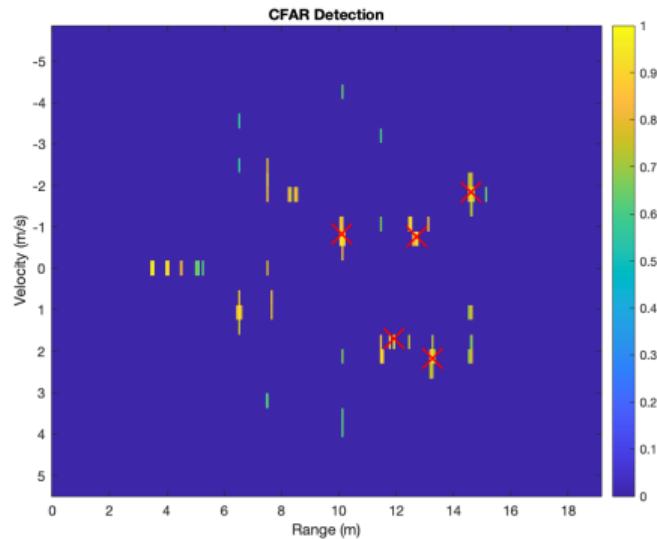


Figure 5.2. CFAR plot in unit dBW

- The CFAR plots with various positions and amount of reflectors in unit W

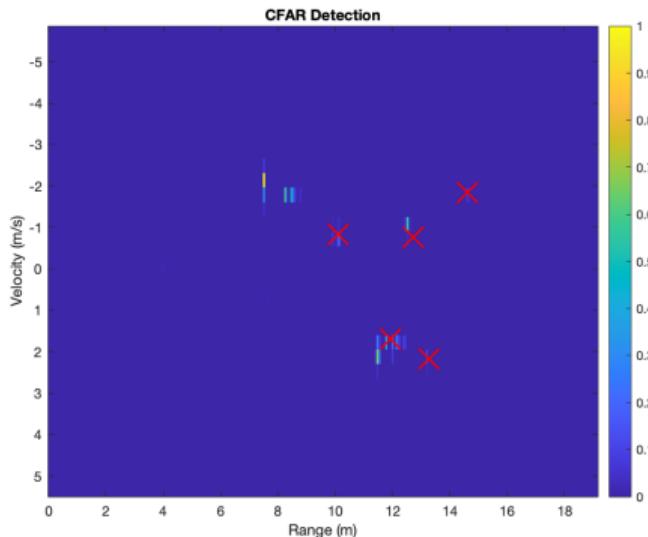


Figure 5.3. CFAR plots with five trihedral corner reflectors

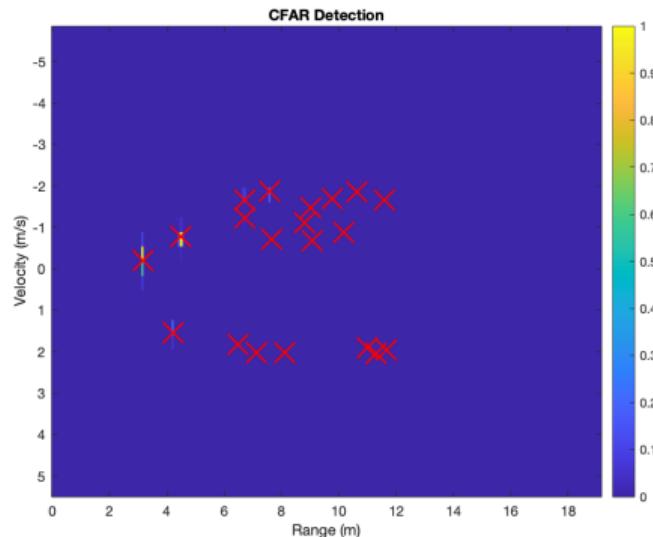


Figure 5.4. CFAR plots with multiple octahedral reflectors

- The meaning of the unit in the case of the multiple reflectors

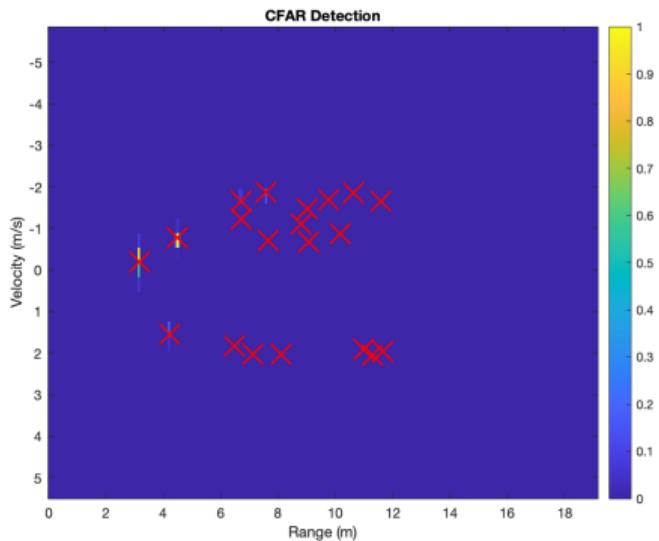


Figure 5.5. CFAR plots in the unit W

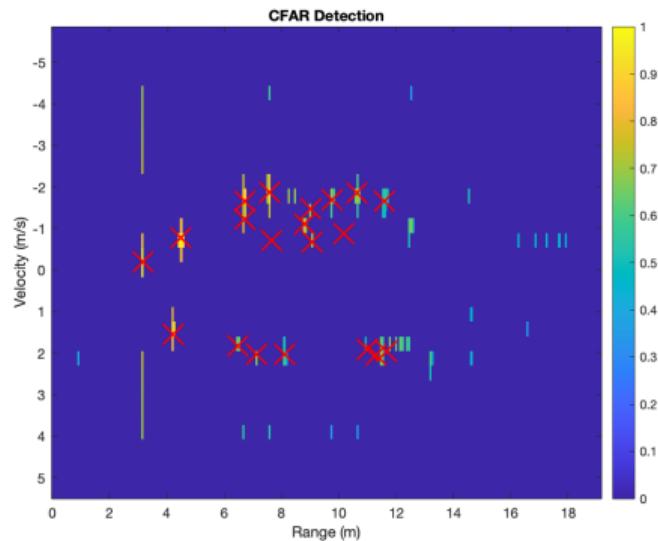


Figure 5.6. CFAR plots in the unit dBW

- The CFAR plots along the trajectory generated in GIF format

Figure 5.7. CFAR plots along the trajectory

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- Summary: The ray tracing channel model works well and meets the goal.
- Outlook:
  - Ray tracing with the surface diffraction
  - Antenna designer
  - RCS pattern simulation without scaling
  - Parallelizable computation of the simulation on GPU
  - Optimization of the number and arrangement of the reflectors
  - Combining with the deep learning for indoor localization system

- [1] Pascal Schlachter et al. *Indoor Positioning based on Active Radar Sensing and Passive Reflectors: Concepts & Initial Results*. 2024. URL: <http://arxiv.org/abs/2310.04231>.
- [2] Stephan Haefner. "Parameter estimation for broadband mm-wave FMCW MIMO radars - a model-based system identification perspective". PhD thesis. TU Ilmenau, 2021, pp. 51–56.
- [3] Furniture Free 3D Models Blender - .blend download - Free3D. URL: <https://free3d.com/3d-models/blender-furniture>.
- [4] K.R. Schaubach, N.J. Davis, and T.S. Rappaport. "A ray tracing method for predicting path loss and delay spread in microcellular environments". In: Denver, CO, USA: IEEE, 1992, pp. 932–935.
- [5] M. A. Richards et al., eds. *Principles of modern radar*. SciTech Pub, 2010, pp. 59–66.
- [6] Monika Ouza, Michael Ulrich, and Bin Yang. "A simple radar simulation tool for 3D objects based on blender". In: *2017 18th International Radar Symposium (IRS)*. IEEE, 2017, pp. 2–3.
- [7] Matthias Kronauge and Hermann Rohling. "New chirp sequence radar waveform". In: *IEEE Transactions on Aerospace and Electronic Systems* 50 (2014), pp. 2870–2877.

# Thank you for your attention