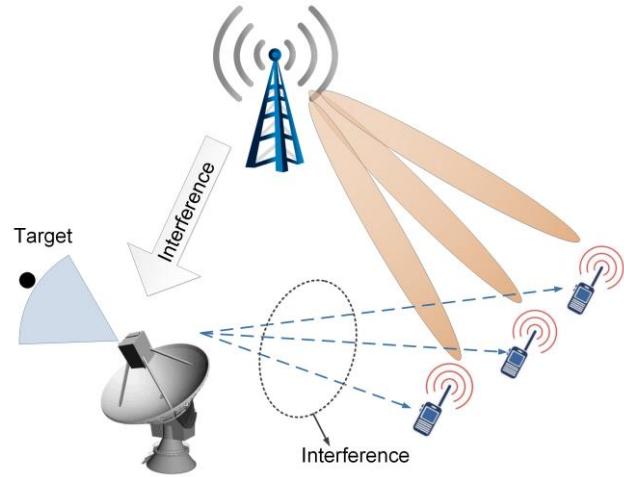


Integrated Sensing and Communications: Signalling, Applications and Trade-offs

Christos Masouros

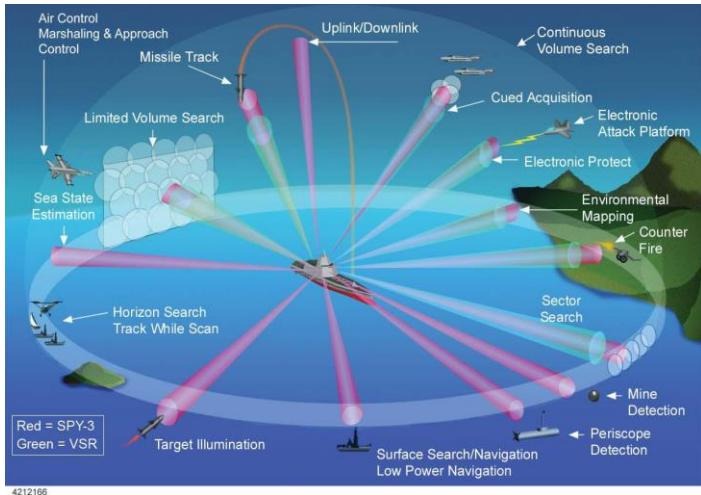
Professor of Wireless Communications and Signal Processing
Dept. of Electronic & Electrical Engineering
University College London
c.masouros@ucl.ac.uk





Spectral Coexistence

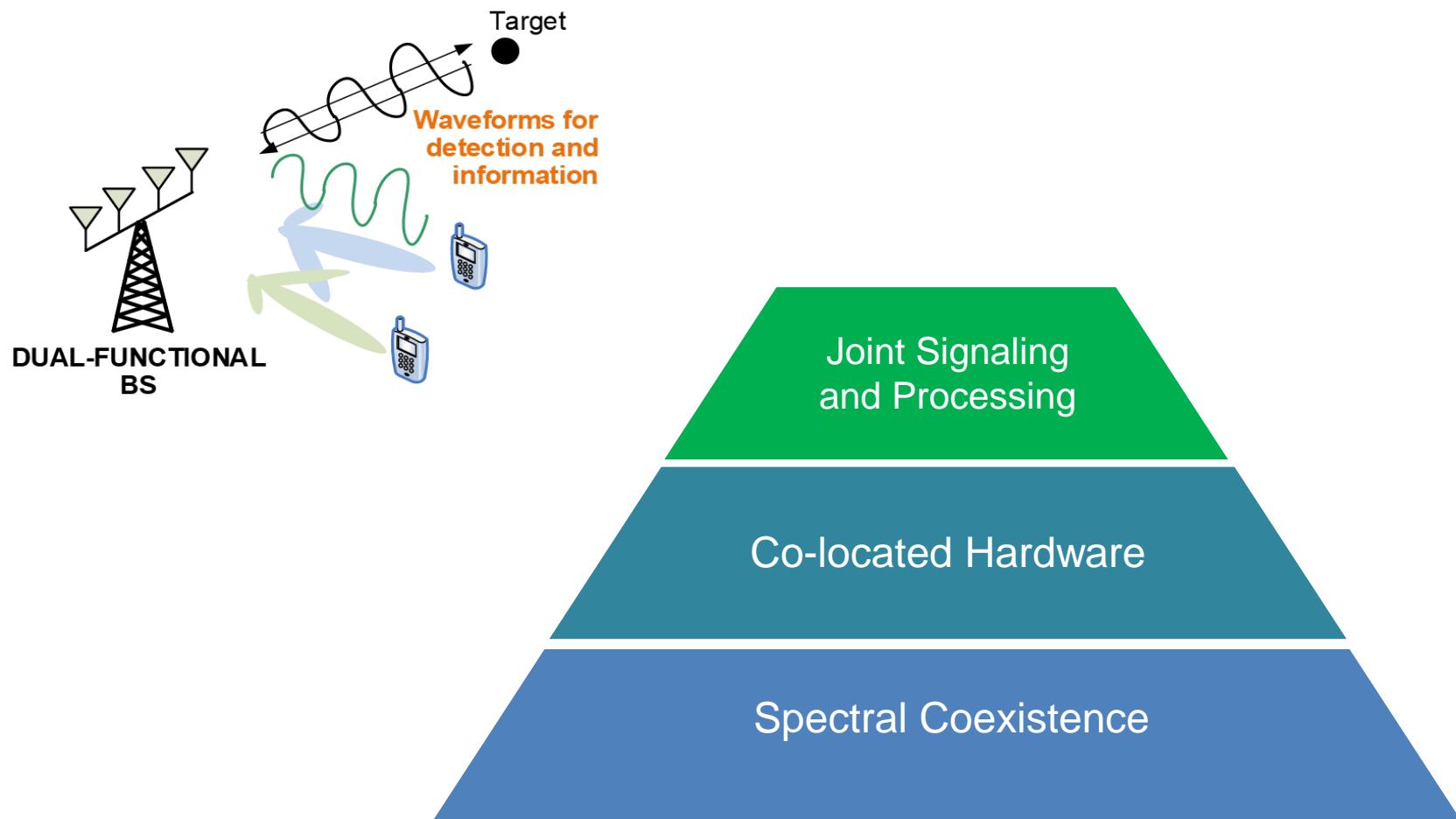
ISAC Vision and Evolution Path



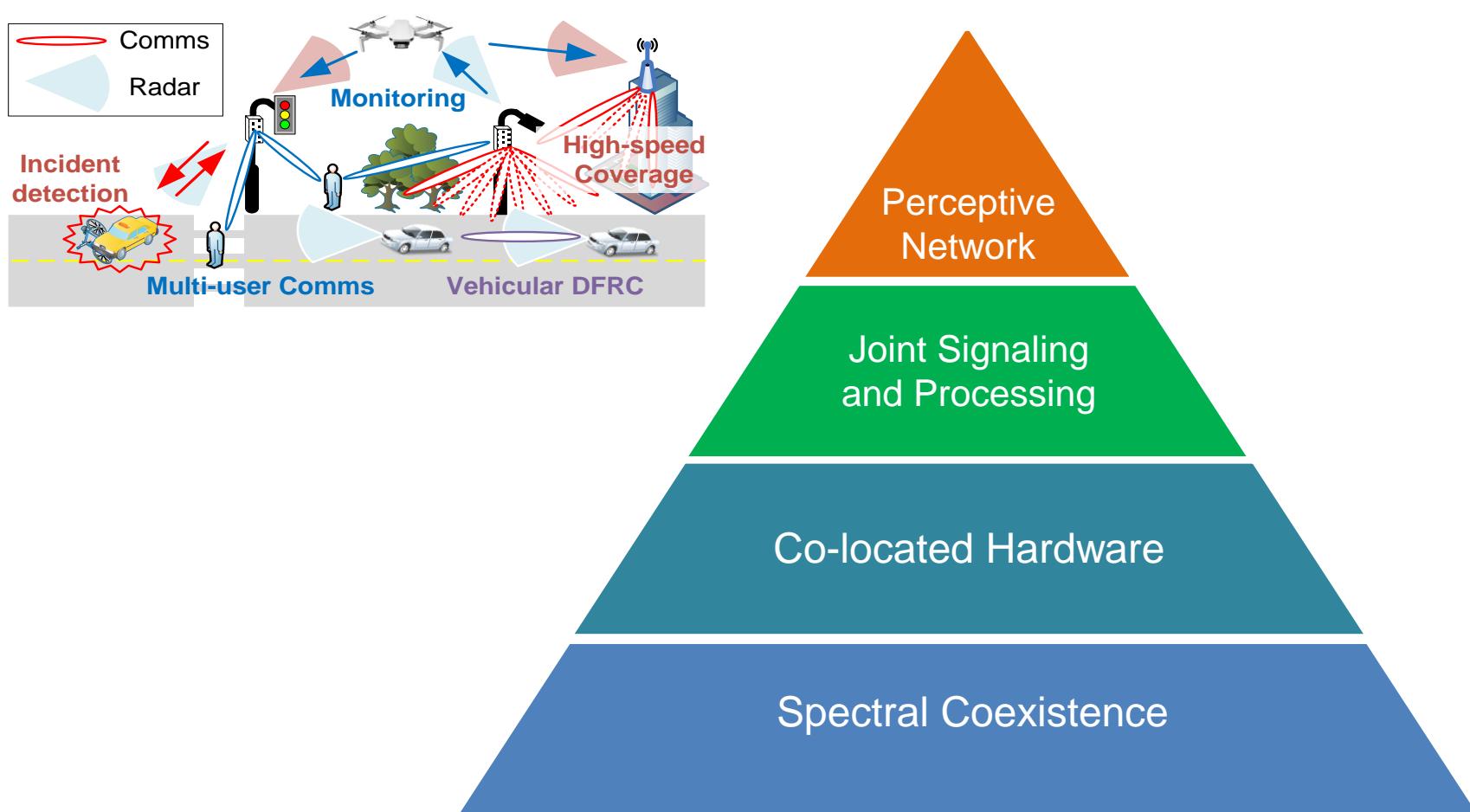
Co-located Hardware

Spectral Coexistence

ISAC Vision and Evolution Path

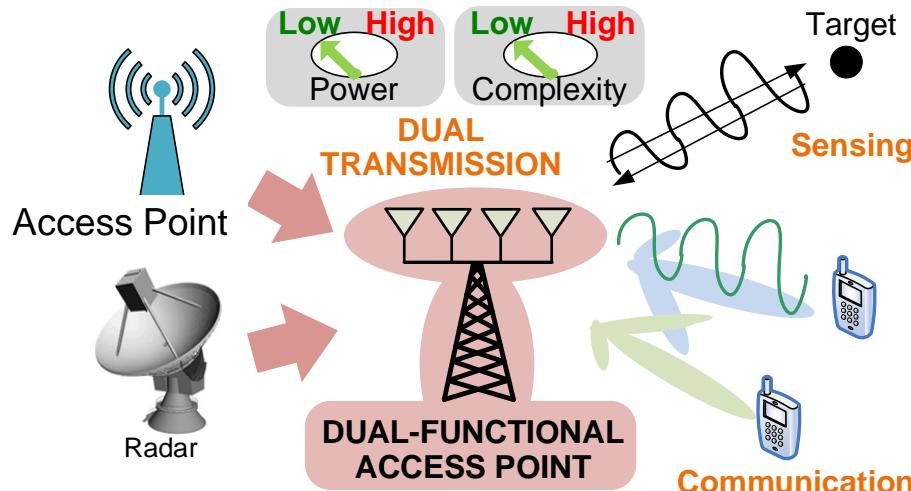


ISAC Vision and Evolution Path

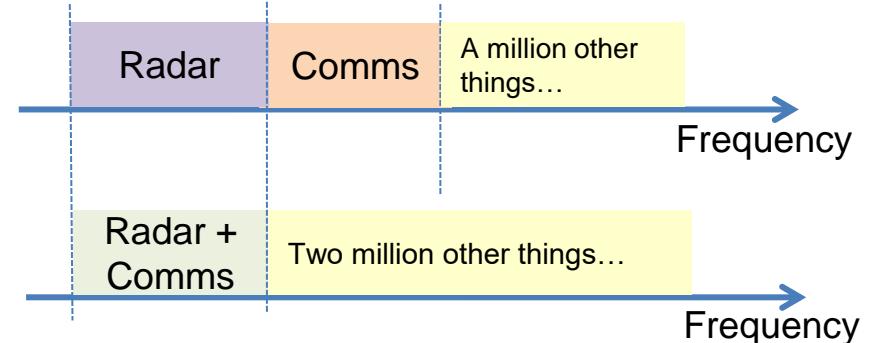


The DFRC gains

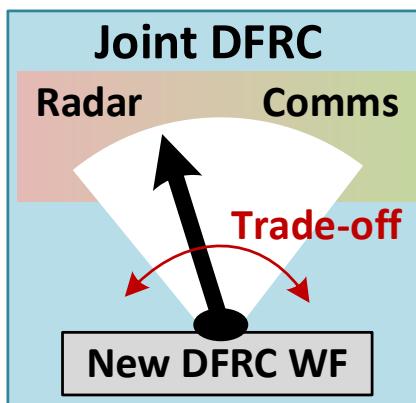
Hardware Gain



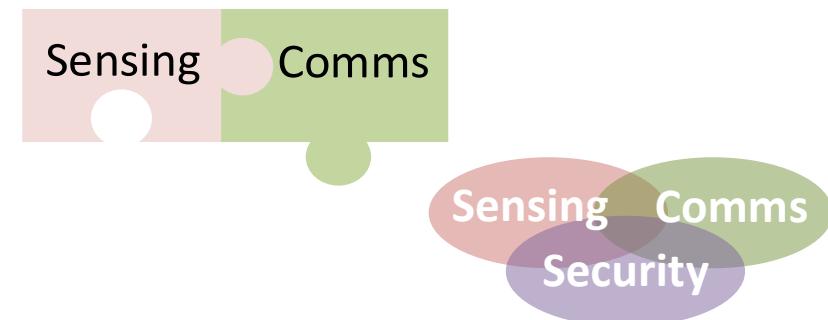
Spectrum Gain



Scalable Trade-offs

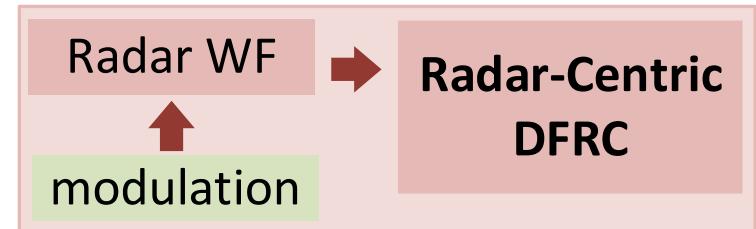


Synergies – Mutual Benefits

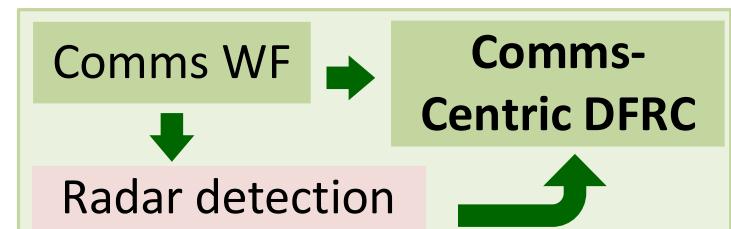


DFRC Technologies

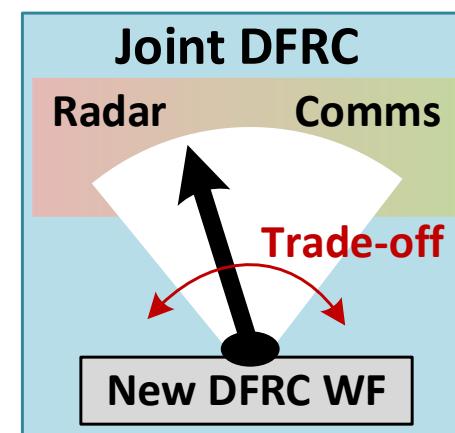
- Radar-centric design
 - Pulse Interval Modulation (PIM)
 - Radar beampattern sidelobe signalling
 - Index Modulation (IM) using radar waveforms
 - ...



- Comms-centric design
 - OFDM based DFRC
 - IEEE 802.11ad based DFRC
 - ...



- Jointly optimized design
 - Radar-centric joint design
 - Weighted Comms-Radar optimization
 - ...

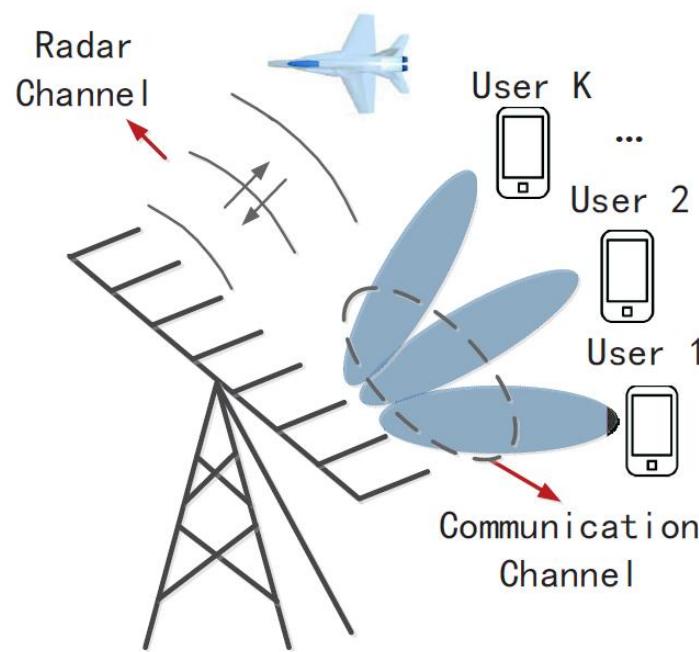


Outline

- Motivation
- Technical highlights
 - Weighted-optimization based DFRC
 - Security for DFRC
 - Sensing-Assisted Communications

Weighted optimization

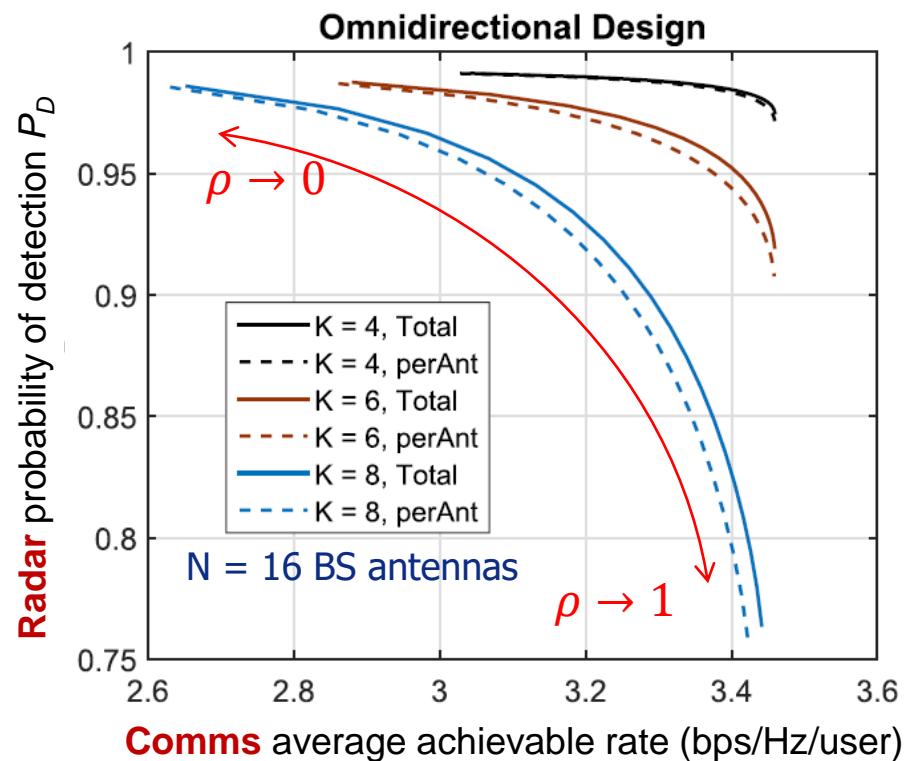
$$\mathbf{Y} = \mathbf{H}\mathbf{X} + \mathbf{Z} = \mathbf{S} + \underbrace{(\mathbf{H}\mathbf{X} - \mathbf{S})}_{\text{MUI}} + \mathbf{Z}$$



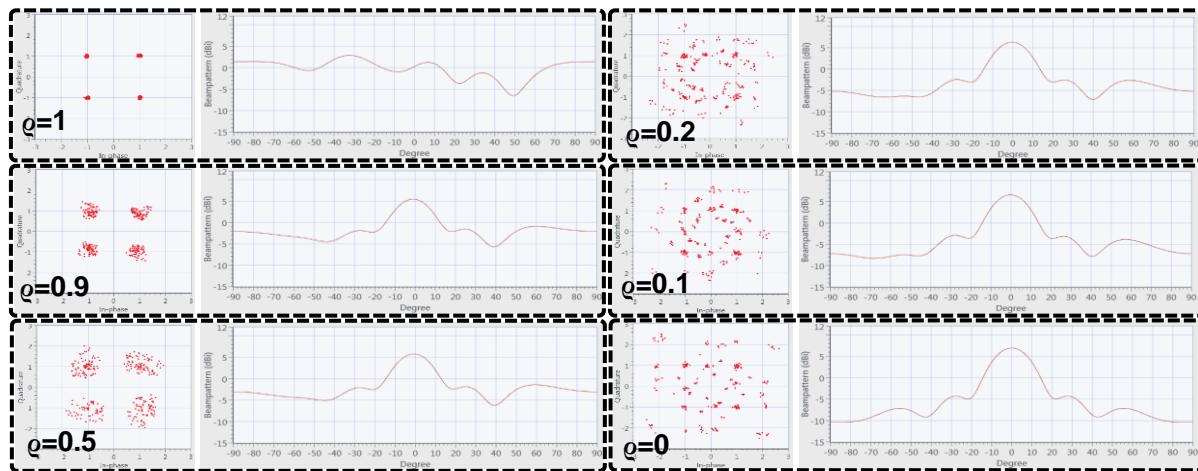
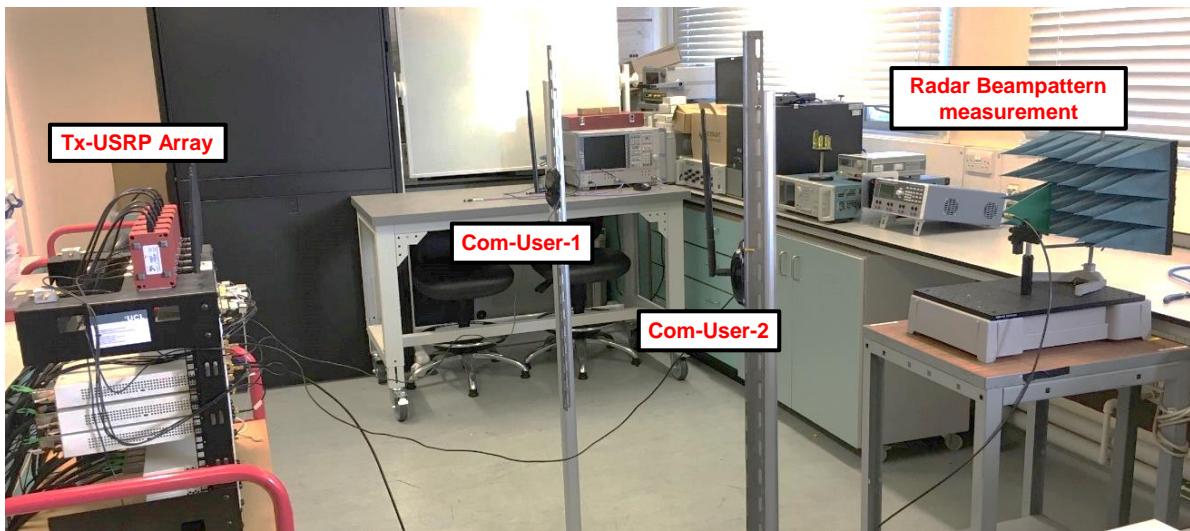
↑ ρ - Comms priority
↓ ρ - Radar priority

$$\begin{aligned} & \min_{\mathbf{X}} \rho \|\mathbf{H}\mathbf{X} - \mathbf{S}\|_F^2 + (1 - \rho) \|\mathbf{X} - \underline{\mathbf{X}_0}\|_F^2 \\ \text{s.t. } & \frac{1}{L} \|\mathbf{X}\|_F^2 = P_T, \end{aligned}$$

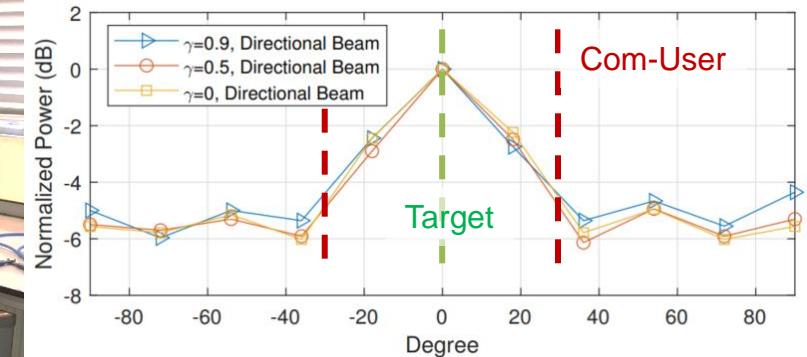
Ideal radar waveform



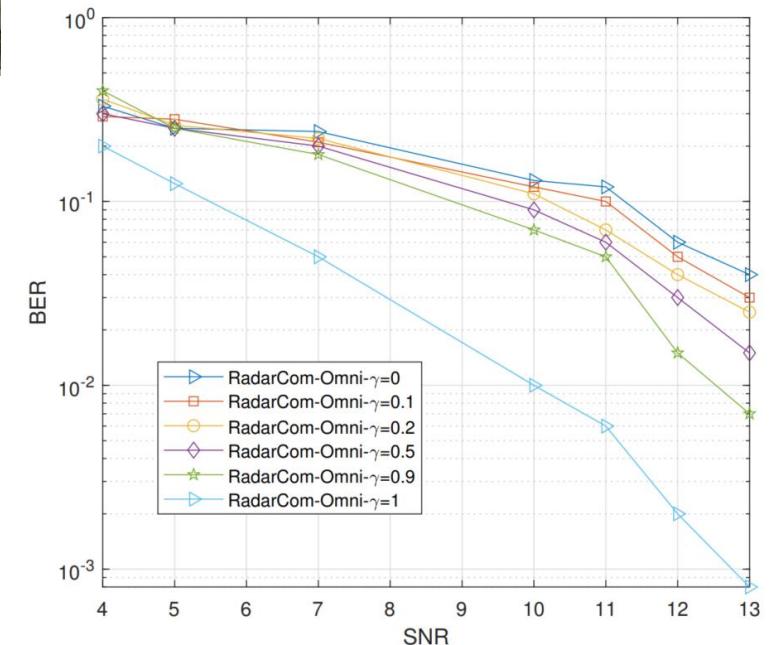
Joint DFRC – Over-the-air Proof of concept



Measured Radar beampattern



Comms BER



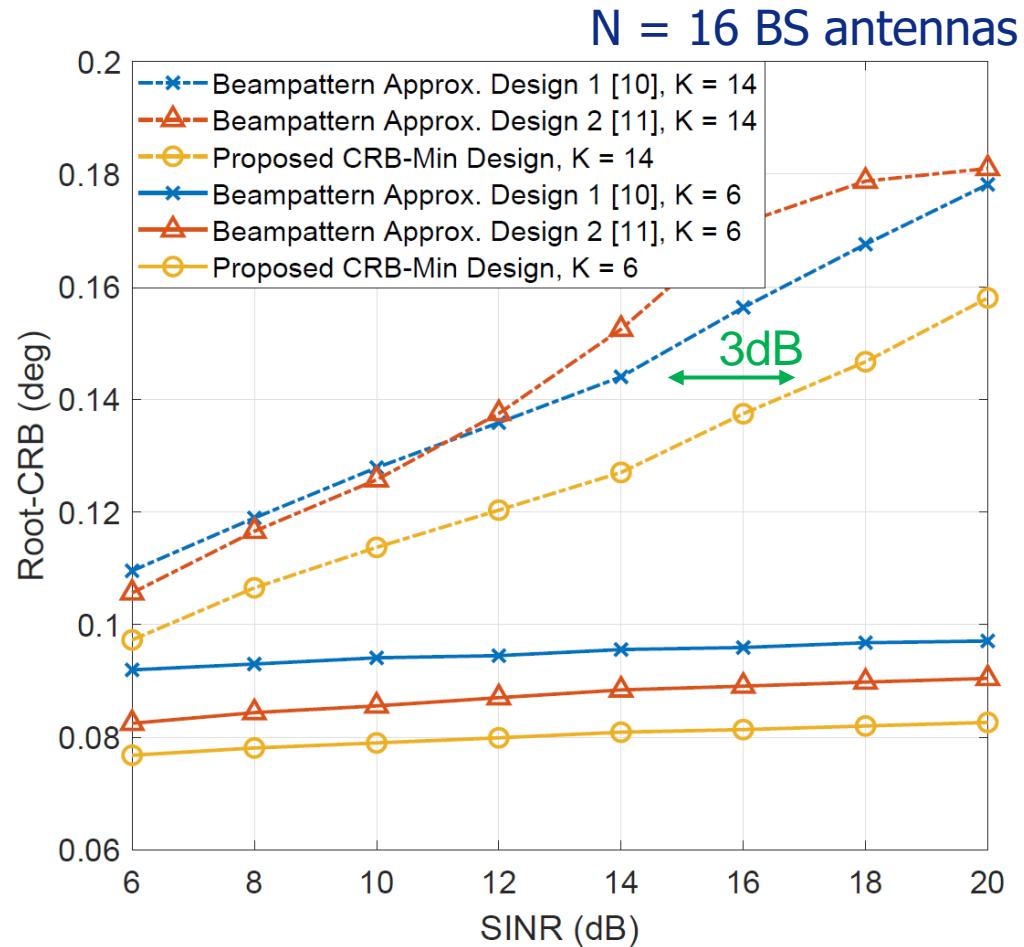
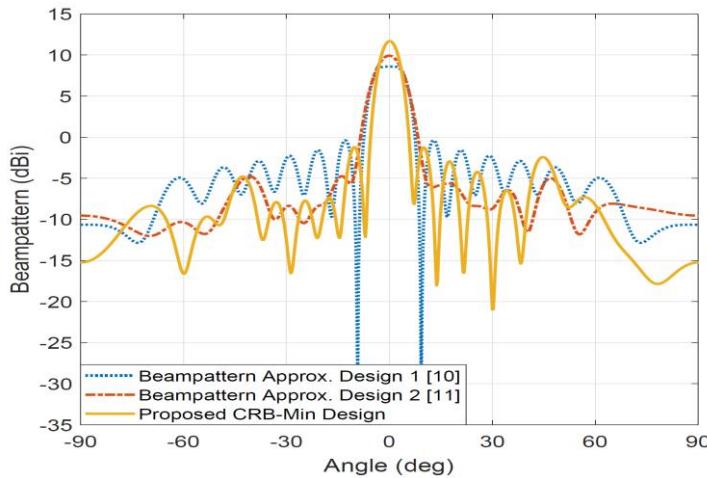
We can do better than Radar waveform approximation

Minimize CRB directly:

$$\min_{\mathbf{W}_D} \text{CRB}(\theta)$$

$$\text{s.t. } \gamma_k \geq \Gamma_k, \forall k,$$

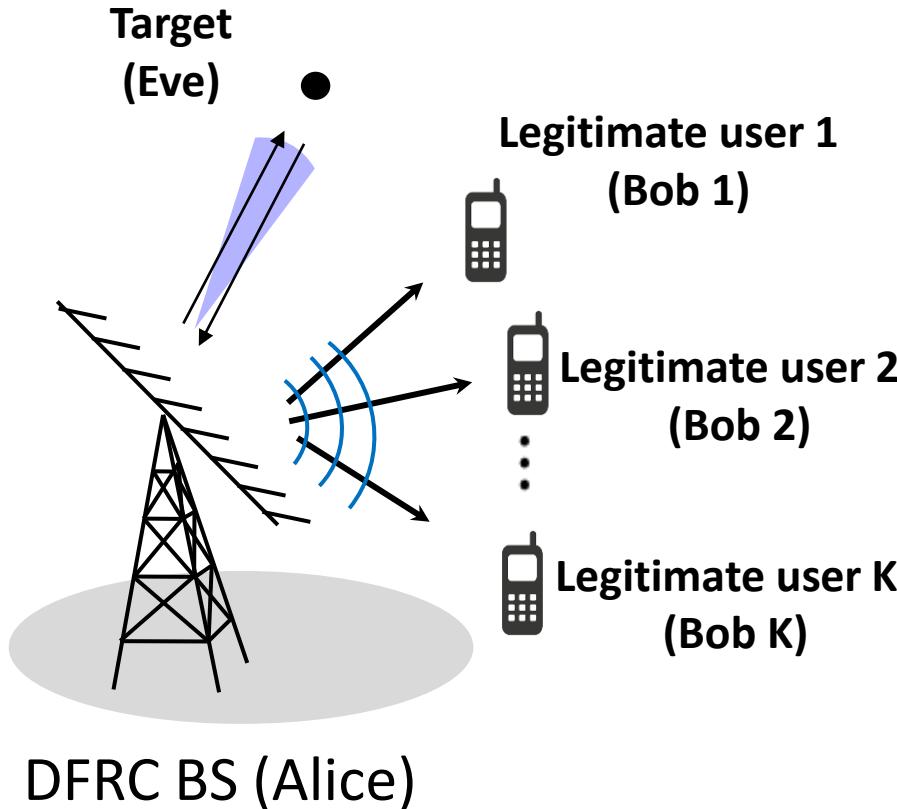
$$\|\mathbf{W}_D\|_F^2 \leq P_T,$$



~3-4dB gains in bottom-line CRB performance

Dual-functional Radar-Communication Subject to Security threats?

Radar + Information: Subject to Security Threats



Target can be:

- Enemy aircraft
- Malicious UAV
- Non-cooperative car
- ...

Malicious target can:

- Detect Data intended for LUs
 - unique to DFRC
- Infer critical radar info (location, ID, ..., ...)

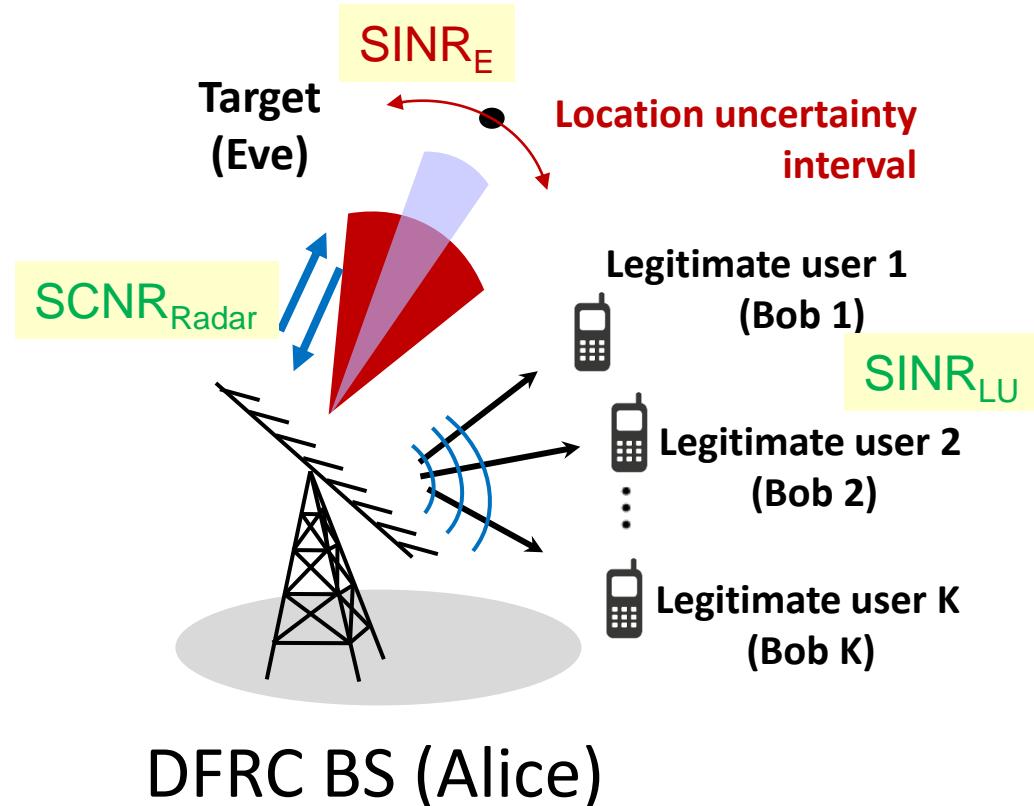
- Need for PHY security guarantees over the Radar beamwidth
- Secure Beamforming / Artificial Noise

Unique Sensing Performance vs Security Trade-offs

- ↑ Power towards the direction of target
- ↓ Useful signal power (SINR_E) towards the target
- ↑ SINR_{LU} towards the users

Apply PHY Sec approaches

- Secure BF
- AN, Jamming
- Cooperative Security
- ...



Secure DFRC BF - Perfect CSI, Target Uncertainty

Secure Beamformer

$$\min_{\mathbf{W}_i, \mathbf{R}_X} \sum_{\theta_m \in \Phi} \frac{|\alpha|^2 \mathbf{a}^H(\theta_m) \sum_{i=1}^K \mathbf{W}_i \mathbf{a}(\theta_m)}{|\alpha|^2 \mathbf{a}^H(\theta_m) \mathbf{R}_N \mathbf{a}(\theta_m) + \sigma^2}$$

$$s.t. \quad \mathbf{a}^H(\theta_0) \mathbf{R}_X \mathbf{a}(\theta_0) - \mathbf{a}^H(\theta_m) \mathbf{R}_X \mathbf{a}(\theta_m) \geq \gamma_s, \quad \forall \theta_m \in \Omega$$

$$\mathbf{a}^H(\theta_k) \mathbf{R}_X \mathbf{a}(\theta_k) \leq (1 + \alpha) \mathbf{a}^H(\theta_0) \mathbf{R}_X \mathbf{a}(\theta_0), \quad \forall \theta_k \in \Phi$$

$$(1 - \alpha) \mathbf{a}^H(\theta_0) \mathbf{R}_X \mathbf{a}(\theta_0) \leq \mathbf{a}^H(\theta_k) \mathbf{R}_X \mathbf{a}(\theta_k). \quad \forall \theta_k \in \Phi$$

$$\text{SINR}_i \geq \gamma_b, \forall i,$$

$$\text{tr}(\mathbf{R}_X) = P_0,$$

$$\mathbf{W}_i = \mathbf{W}_i^H, \mathbf{W}_i \succeq 0, \forall i,$$

$$\text{rank}(\mathbf{W}_i) = 1, \forall i,$$

$$\mathbf{R}_N = \mathbf{R}_N^H, \mathbf{R}_N \succeq 0,$$

Fractional Programming + SDR

Tx signal

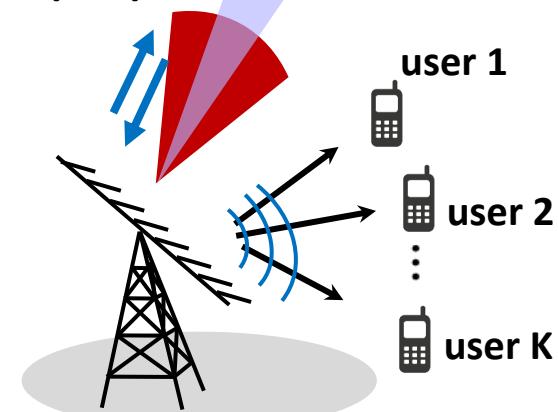
$$\mathbf{x} = \mathbf{W}\mathbf{s} + \mathbf{n}$$

$$\mathbf{R}_X = \mathbb{E}[\mathbf{x}\mathbf{x}^H] = \sum_{i=1}^K \mathbf{W}_i + \mathbf{R}_N$$

PSRL greater than γ_s

Main beam region within angle spread ϕ , within $\pm\alpha$ of θ_0

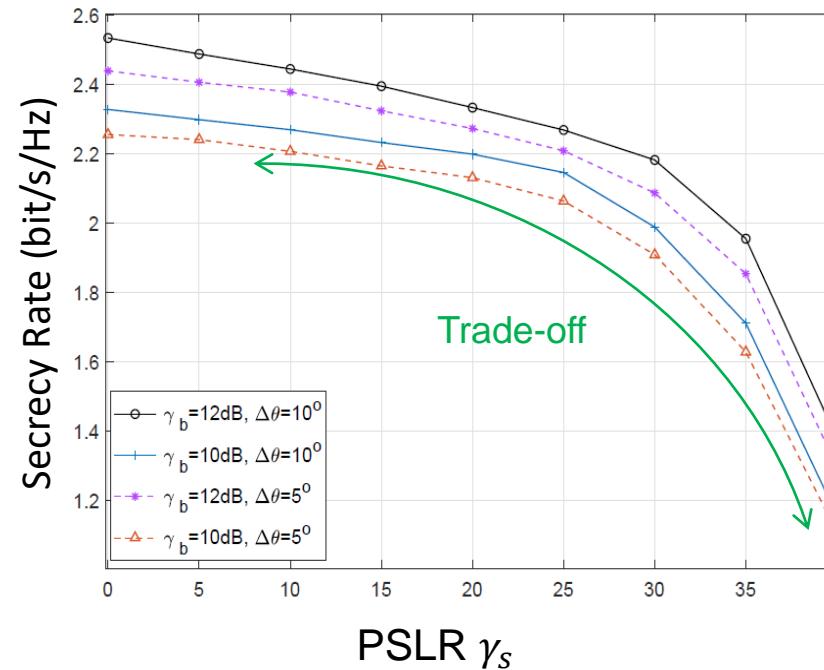
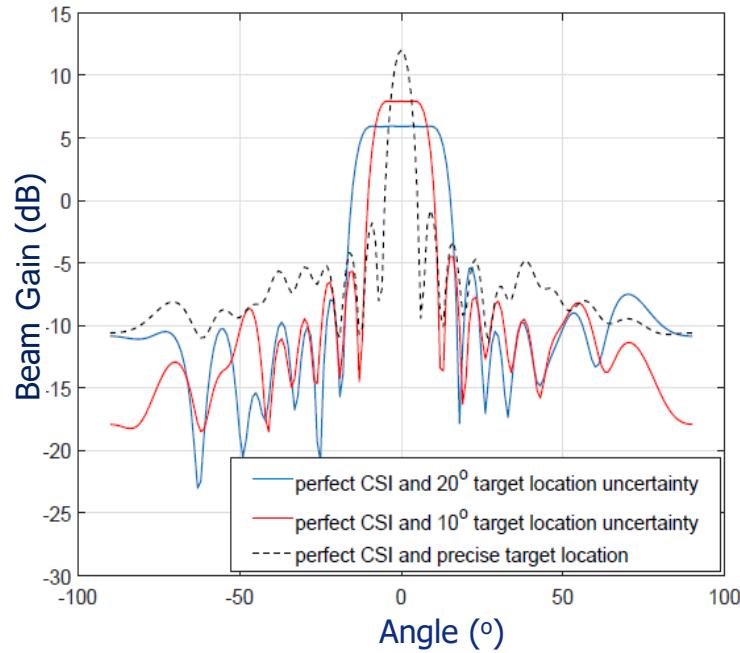
Target (Eve) **Location uncertainty interval**



DFRC BS (Alice)

Numerical Results

$N = 18$ antennas, $K = 4$ legitimate users, one target – LU SNR $\gamma_b = 10\text{dB}$.

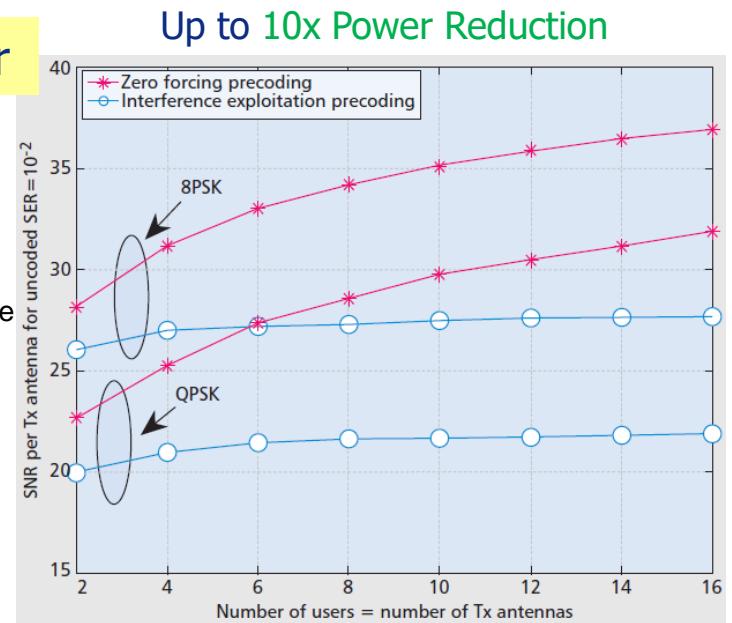
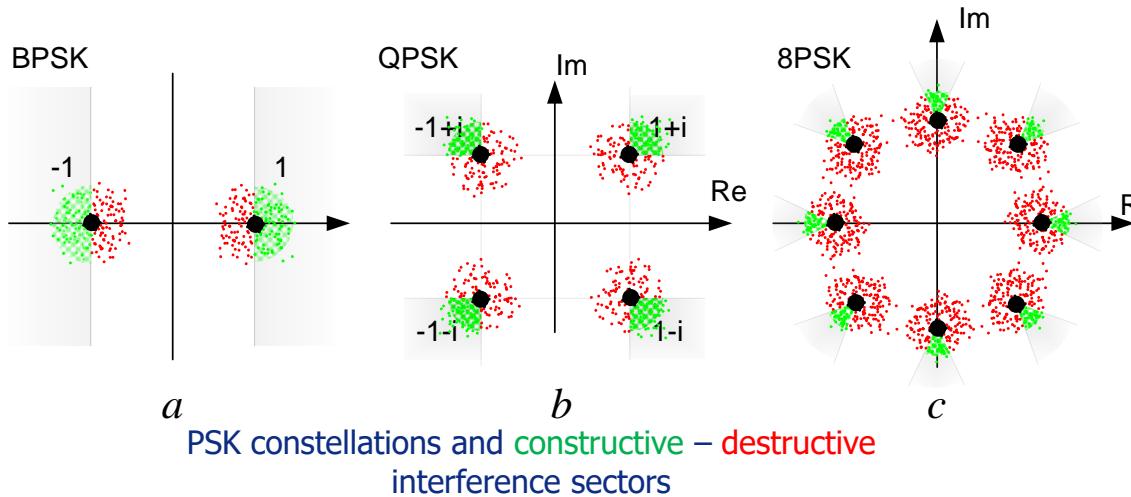


- ↑ location uncertainty angular interval → ↓ power gain of mainbeam.
- CSI imperfections deteriorate the radar PSLR
- ↑ PSLR → ↓ Secrecy Rate (more power spent on radar PSLR fulfilment)

Secure Dual-functional Radar-Communication Exploiting Constructive / Destructive Interference

Basics of Constructive Interference (CI)

Key Concept: Exploitation of green interference power



Early Works:

C. Masouros and E. Alsusa, "A Novel Transmitter-Based Selective-Precoding Technique for DS/CDMA systems", IEEE Signal Processing letters, vol. 14, no. 9, pp. 637-640, Sept. 2007

C. Masouros, "Correlation Rotation Linear Precoding for MIMO Broadcast Communications", IEEE Trans. on Sig. Proc., vol 59, issue 1, pp. 252-262, Jan 2011

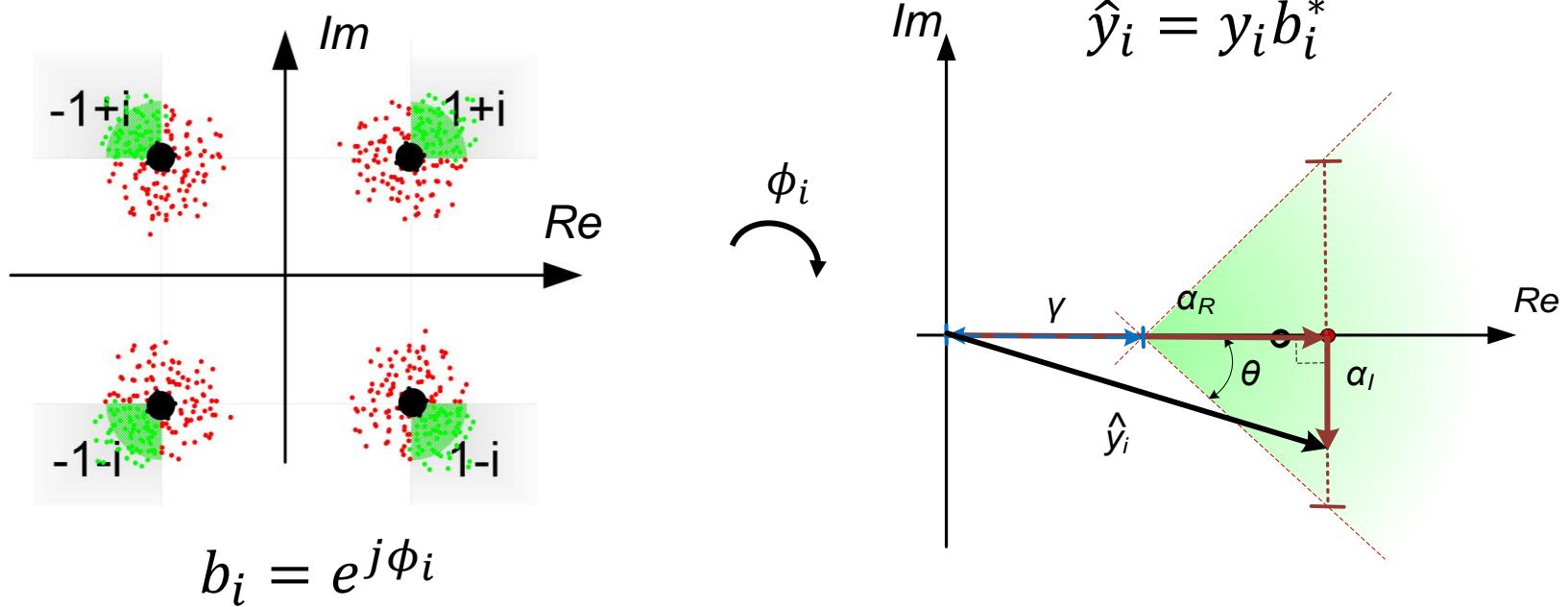
C. Masouros, T. Ratnarajah, M. Sellathurai, C. Papadias, A. Shukla, "Known Interference in Wireless Communications: A Limiting factor or a Potential Source of Green Signal Power?", IEEE Comms. Mag., vol. 51, no. 10, pp. 162-171, Oct. 2013

C. Masouros, M. Sellathurai, T. Ratnarajah, "Interference Optimization for Transmit Power Reduction in Tomlinson-Harashima Precoded MIMO Downlinks", IEEE Trans. Sig. Proc., vol. 60, no. 5, pp. 2470-2481, May 2012

Optimization based Interference Exploitation first introduced in the context of Vector Perturbation:

C. Masouros, M. Sellathurai, T. Ratnarajah, "Vector Perturbation Based on Symbol Scaling for Limited Feedback MIMO Downlinks", IEEE Trans. Sig. Proc., vol. 62, no. 3, pp. 562-571, Feb. 1, 2014

Constructive Interference for M-PSK



Constructive Interference:

1. $\alpha_R \geq \gamma$

2. $|\alpha_I| \leq (\alpha_R - \gamma) \tan \theta$

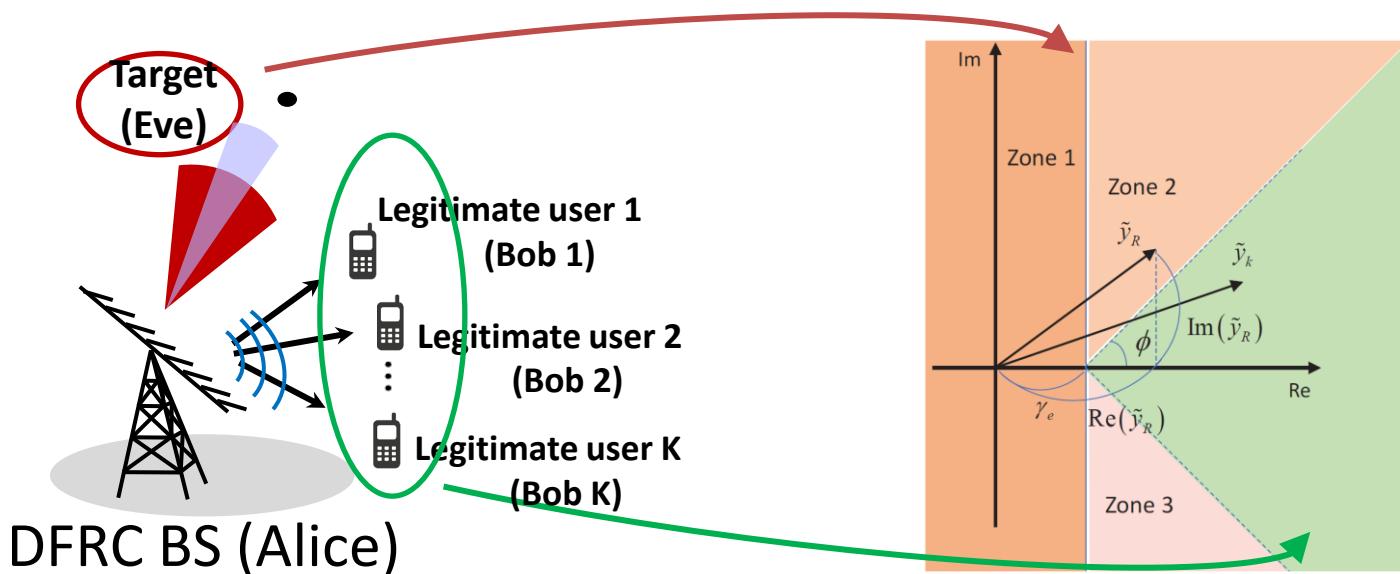
$$\alpha_R = \text{Re}(\hat{y}_i), \alpha_I = \text{Im}(\hat{y}_i)$$

$$\theta = \frac{\pi}{M}, \gamma = \sqrt{\Gamma_i N_0}$$

C. Masouros and G. Zheng, "Exploiting Known Interference as Green Signal Power for Downlink Beamforming Optimization", IEEE Trans. Sig. Proc., vol.63, no.14, pp.3668-3680, July, 2015

A. Li, *et. al*, "A Tutorial on Interference Exploitation via Symbol-Level Precoding: Overview, State-of-the-Art and Future Directions", IEEE Comms. Surveys and tutorials., vol. 22, no. 2, pp. 796-839, 2020

Exploiting Interference for Secure DFRC



$$\max_{\mathbf{x}} \min_{\theta_p \in \text{card}(\Psi)} \frac{\mu |\mathbf{w}^H \mathbf{U}(\theta_p) \mathbf{x}|^2}{\mathbf{w}^H (\Sigma(\mathbf{x}) + \mathbf{I}_{N_R}) \mathbf{w}} \quad (38a)$$

$$\text{s.t. } \|\mathbf{x}\|^2 \leq P_0 \quad (38b)$$

$$|\text{Im}(\tilde{\mathbf{h}}_k^H \mathbf{x})| \leq \left(\text{Re}(\tilde{\mathbf{h}}_k^H \mathbf{x}) - \sqrt{\sigma_{C_k}^2 \Gamma_k} \right) \tan \phi, \forall k \quad (38c)$$

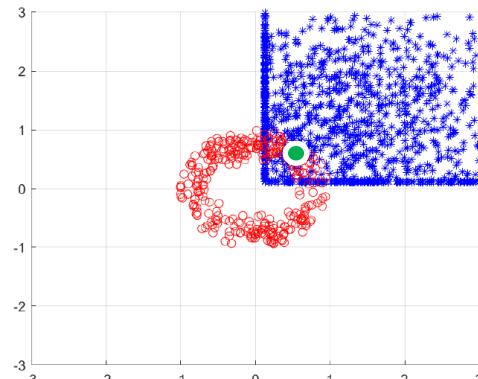
$$|\text{Im}(\alpha_0 \tilde{\mathbf{a}}_t^H (\beta_p) \mathbf{x})| \geq \left(\text{Re}(\alpha_0 \tilde{\mathbf{a}}_t^H (\beta_p) \mathbf{x}) - \sqrt{\sigma_T^2 \Gamma_T} \right) \tan \phi, \forall p, \quad (38d)$$

Results

$N = 10$ antennas, $K = 5$ legitimate users, one target.

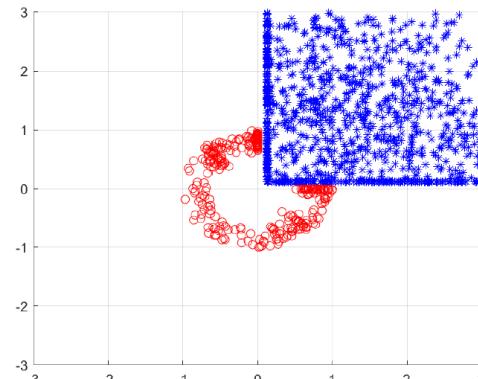
Signal Constellations at users / target

Constructive interference

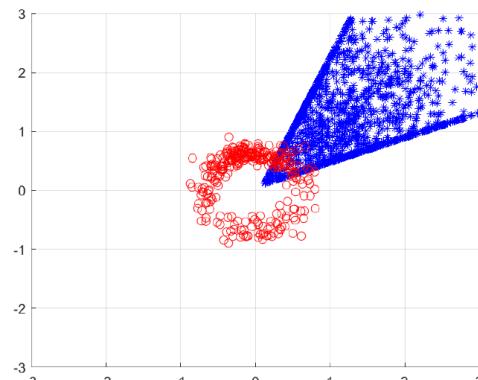


(a) QPSK, CI

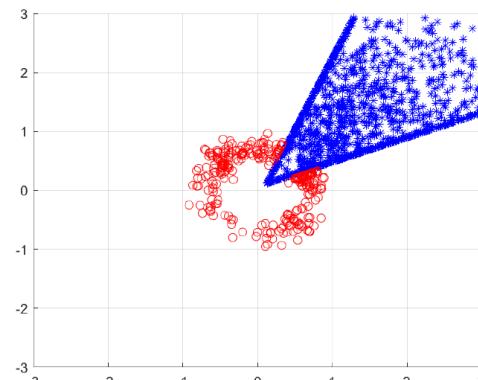
Constructive - Destructive interference



(b) QPSK, CI-DI

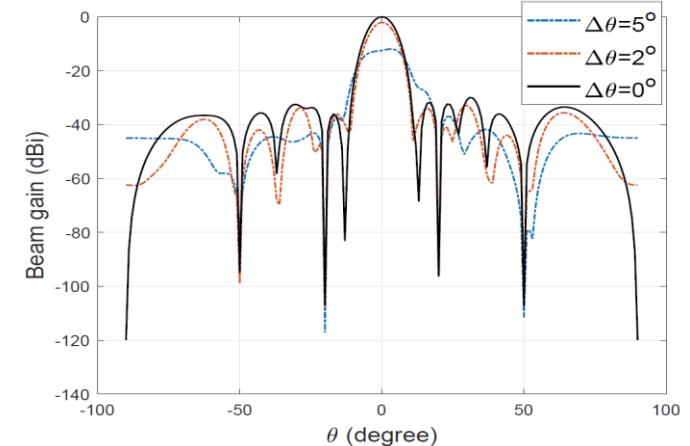


(c) 8PSK, CI

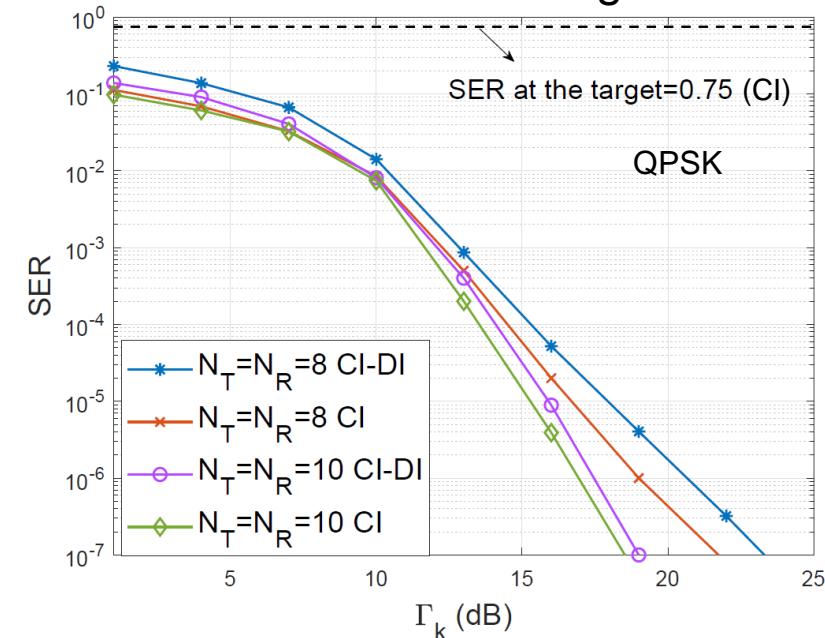


(d) 8PSK, CI-DI

Radar beampattern



SER at users / target

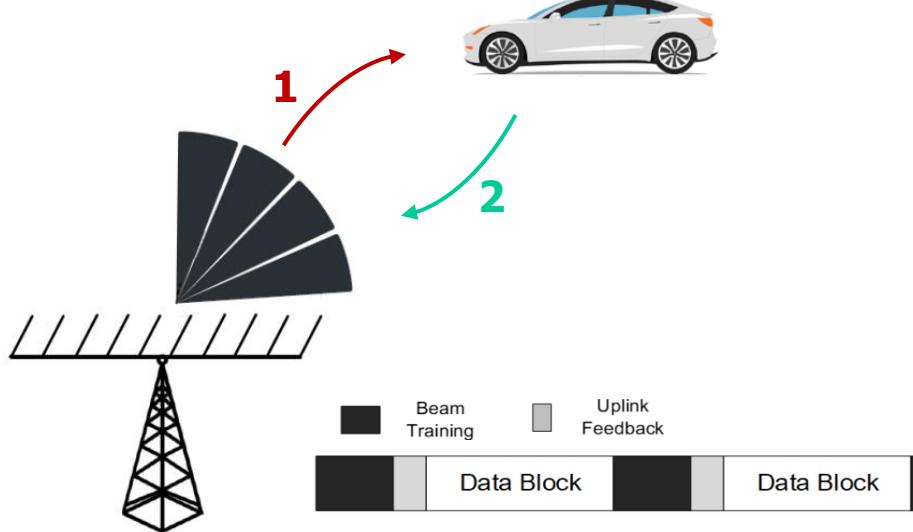


Radar-assisted Vehicular Network

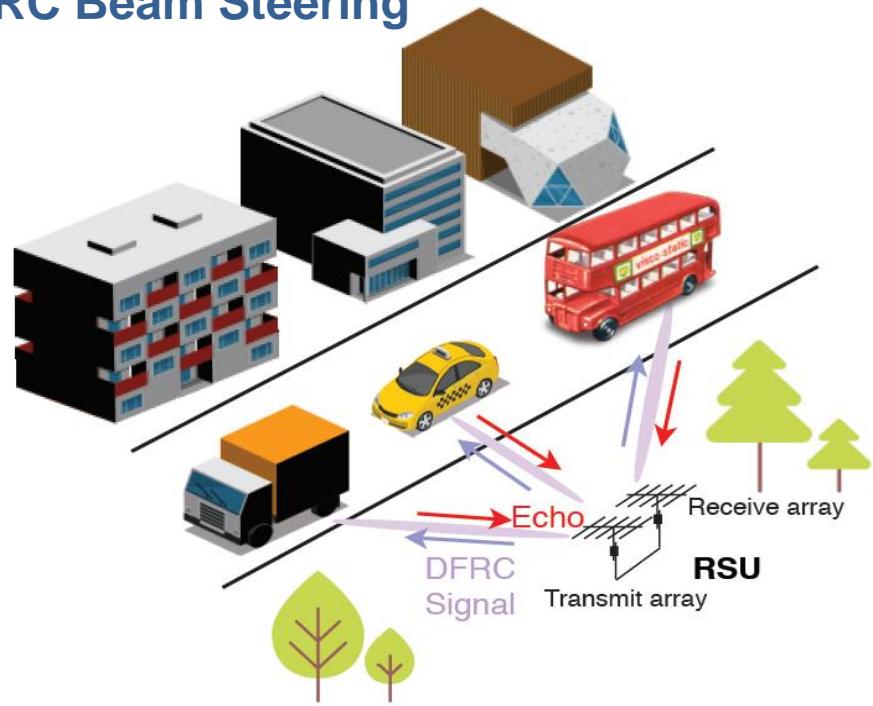
Communication Served by Sensing

Comms served by Sensing: Radar tracking for Comms beam-steering

Comms-based Beam Training

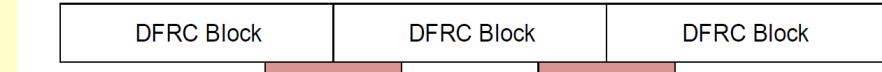


DFRC Beam Steering

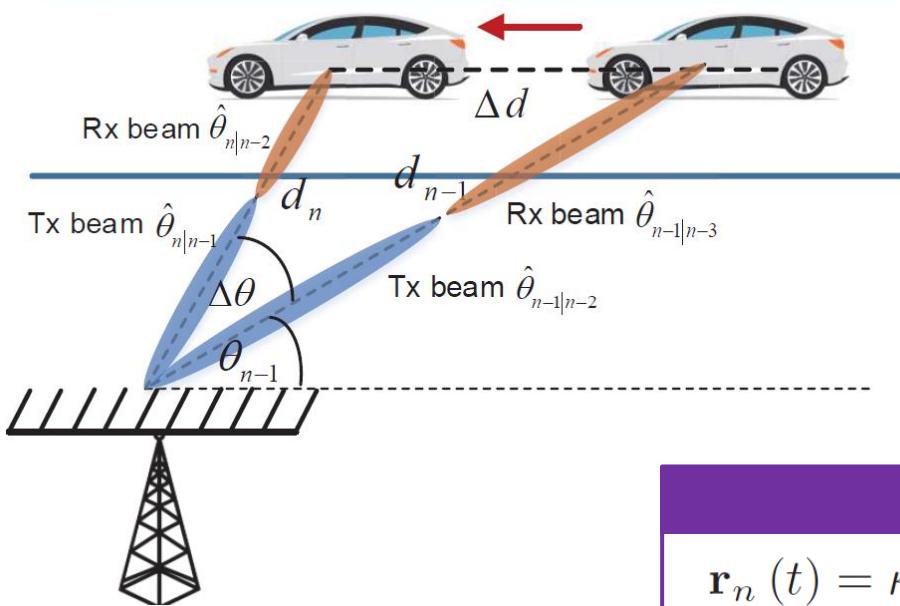


Advantages of DFRC Signalling:

- No dedicated downlink pilots are needed;
- No uplink feedback is needed;
 - No feedback overhead/errors
 - No quantization errors
- The whole downlink frame can be used for tracking → Significant matched-filtering gain



System Model - Signal Model



State transition model

$$\begin{aligned}\mathbf{x}_n &= \mathbf{g}(\mathbf{x}_{n-1}) + \boldsymbol{\omega}_n \\ &= \begin{cases} \theta_n = \theta_{n-1} + d_{n-1}^{-1} v_{n-1} \Delta T \sin \theta_{n-1} + \omega_{\theta,n}, \\ d_n = d_{n-1} - v_{n-1} \Delta T \cos \theta_{n-1} + \omega_{d,n}, \\ v_n = v_{n-1} + \omega_{v,n}, \\ \beta_n = \beta_{n-1} (1 + d_{n-1}^{-1} v_{n-1} \Delta T \cos \theta_{n-1}) + \omega_{\beta,n}, \end{cases}\end{aligned}$$

Radar measurement model

$$\mathbf{r}_n(t) = \kappa \sqrt{p_n} \beta_n e^{j2\pi\mu_n t} \mathbf{b}(\theta_n) \mathbf{a}^H(\theta_n) \mathbf{f}_n s_n(t - \tau_n) + \mathbf{z}_n(t)$$

Communication model

$$c_n(t) = \tilde{\kappa} \sqrt{p_n} \alpha_n \mathbf{w}_n^H \mathbf{u}(\theta_n) \mathbf{a}^H(\theta_n) \mathbf{f}_n s_n(t) + z_c(t),$$

Predictive Beamformers

$$\text{Tx: } \mathbf{f}_n = \mathbf{a}(\hat{\theta}_{n|n-1}) \quad \text{Rx: } \mathbf{w}_n = \mathbf{u}(\hat{\theta}_{n|n-2})$$



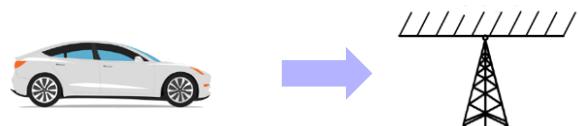
matched filtering

$$\begin{aligned}\mathbf{y}_n &= \mathbf{h}(\mathbf{x}_n) + \tilde{\mathbf{z}}_n \\ &= \begin{cases} \tilde{\mathbf{r}}_n = \beta_n \sqrt{Gp} \kappa \mathbf{b}(\theta_n) \mathbf{a}^H(\theta_n) \mathbf{f}_n + \mathbf{z}_{\theta,n} \\ \hat{\tau}_n = \frac{2d_n}{c} + z_{\tau,n} \\ \hat{f}_{D,n} = \frac{2v_n \cos \theta_n f_c}{c} + z_{f,n} \end{cases}\end{aligned}$$

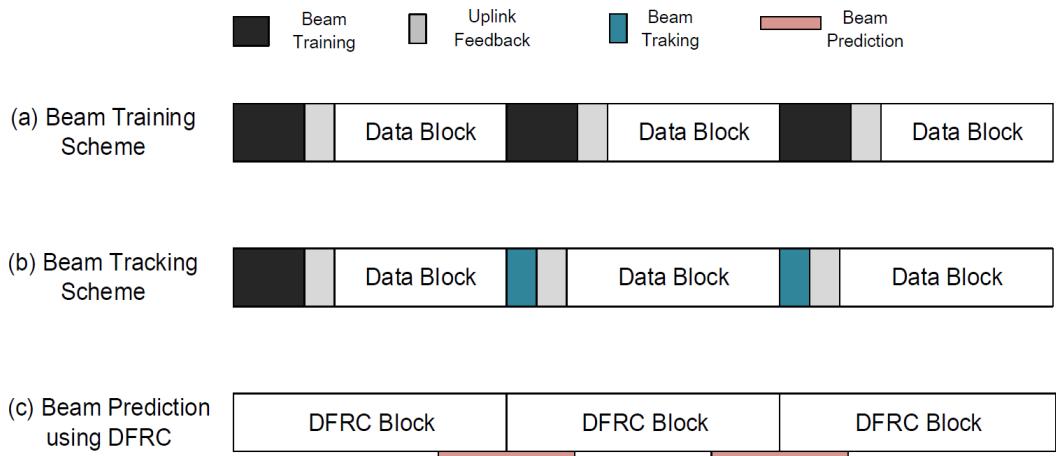
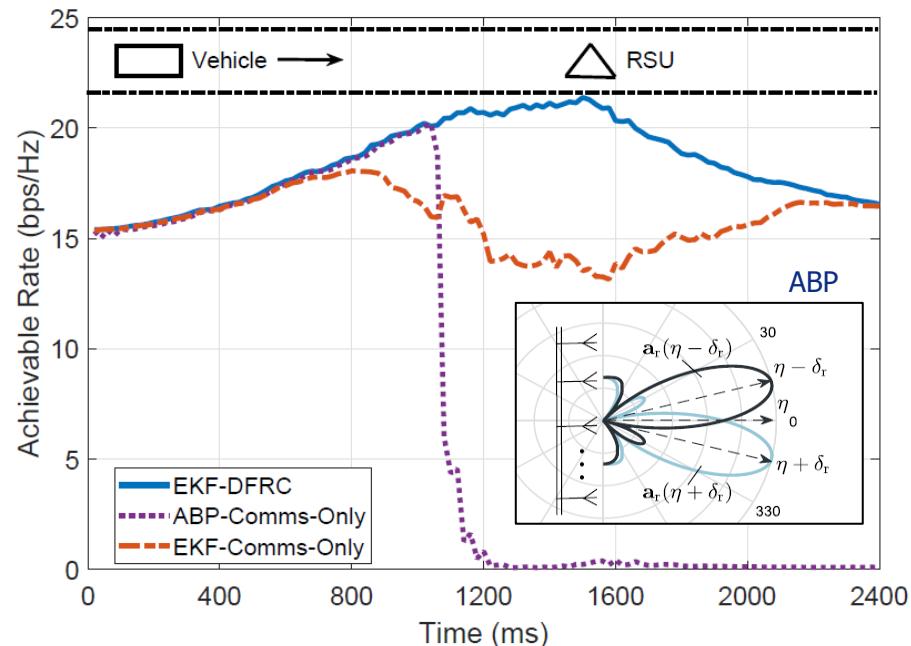
Round-trip delay

Doppler offset

Numerical Results - DFRC vs Comms only



$N = 64, v_0 = 18\text{m/s}$ (65 km/hour), beamwidth: $\pi/64$



- EKF-Comms-only: poor angle estimation at RSU crossing point – suffering data rate
- Auxiliary Beam Pair (ABP) tracking: at RSU crossing point the correct beam will unlikely fall into angle search interval – beam goes beyond the search space and is not recovered
- EKF-DFRC: Minimal disruption in the rate

F. Liu, W. Yuan, C. Masouros and J. Yuan, "Radar-Assisted Predictive Beamforming for Vehicular Links: Communication Served by Sensing", IEEE Trans. Wireless Commun., vol. 19, no 11, pp. 7704-7719, Nov. 2020

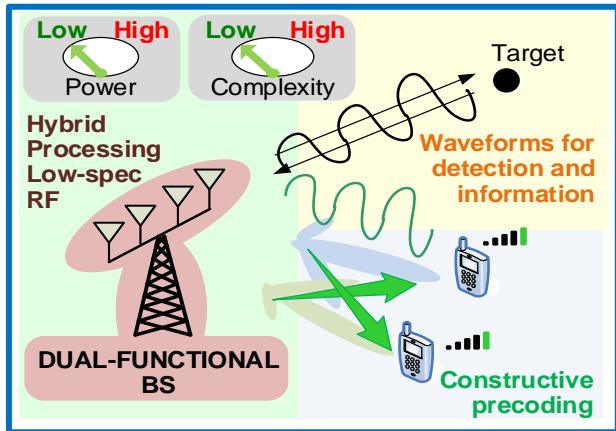
Z. Du, F. Liu, W. Yuan, C. Masouros, Z. Zhang, S. Xia, and G. Caire, "Integrated Sensing and Communications for V2I Networks: Dynamic Predictive Beamforming for Extended Vehicle Targets," IEEE Trans. on Wireless Comms., under review

Future outlook - Cellular as a Sensor

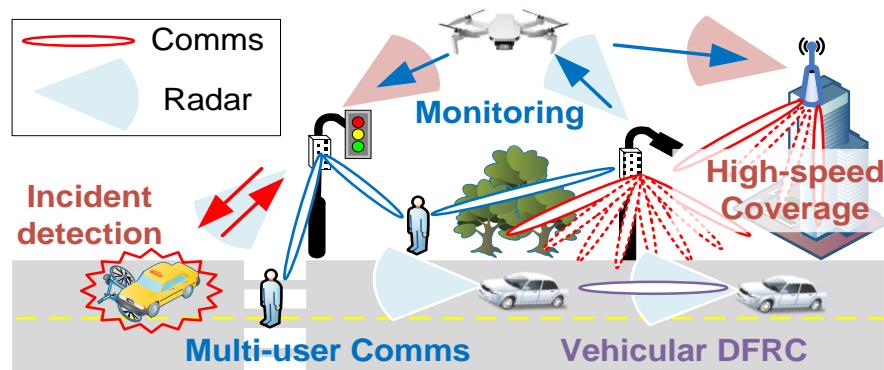
c.masouros@ucl.ac.uk



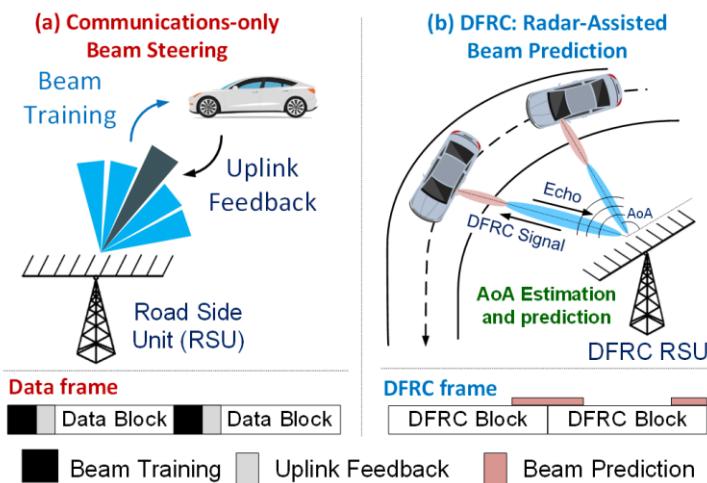
Hardware-Efficient DFRC



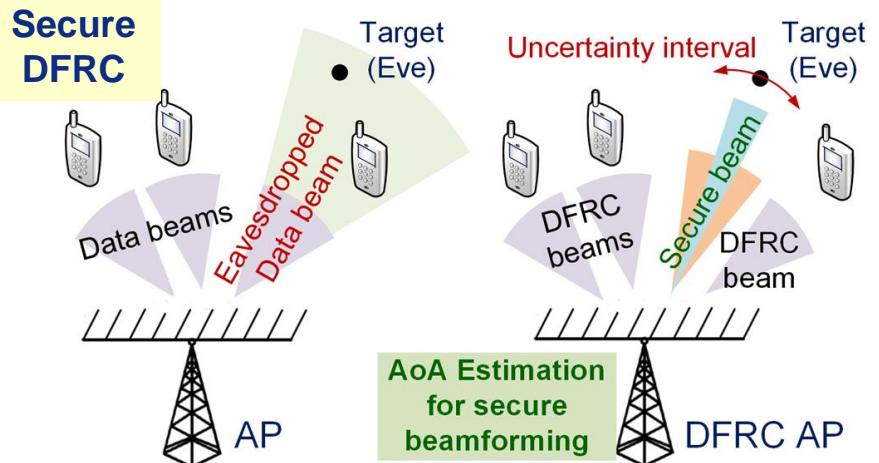
Pervasive sensing through dense cellular infrastructure



Sensing-Assisted Comms



Multicell / multi-static DFRC



Thank you



Fan Liu



Iman
Vailulahi



Xiaoye
Jing



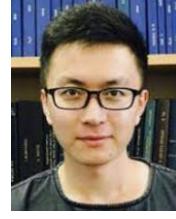
Abdel
Salem



Xiaoyan Hu



Nanchi Su



Tongyang Xu



Ang Li



Murat Temiz



Nial Peters



UDRC Project
Mar 2019 – Dec 2021 (£1m)



Marie Curie Fellowship
Nov 2018 – Oct 2020 (£160k)



MoD DASA Project
Jul 2021 – Mar 2022 (£100k)



CI-PHY Project
Apr 2018 – Jul 2021 (£1.1m)



LeanCom Project
Oct 2019 – Nov 2023 (£860k)



PAINLESS Project
Oct 2018 – Sep 2022 (€4.2m)

References

Overviews

1. F. Liu, Y. Cui, C. Masouros, J. Xu, T. X. Han, A. Hassanien, Y. Eldar, S. Buzzi, "Integrated Sensing and Communications: Towards Future Dual-functional Wireless Networks", IEEE Journal on Sel. Areas Comms., in press
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