

Robust Standalone GNSS Navigation

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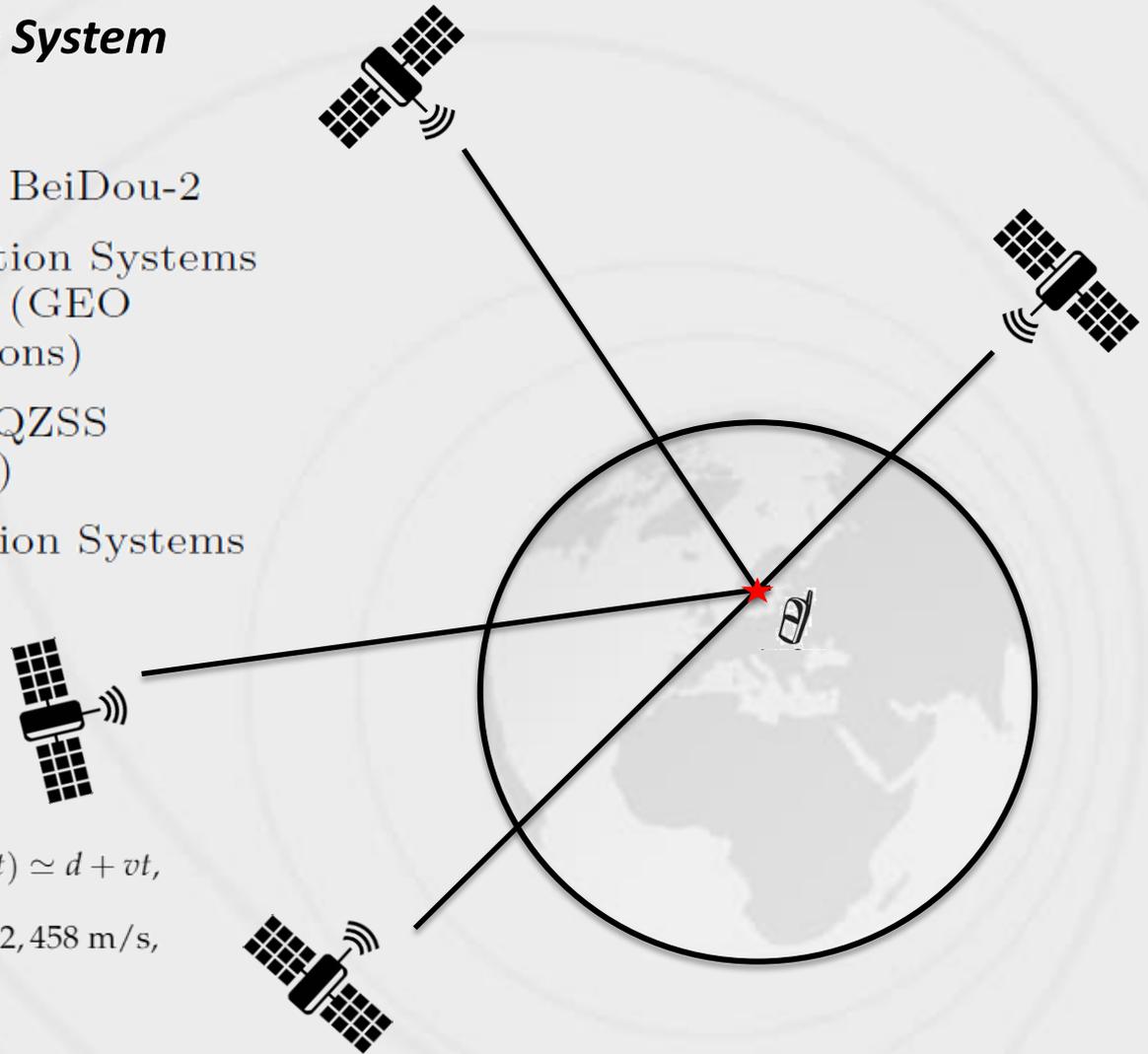
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1-Introduction to the GNSS

Global Navigation Satellite System

- Galileo, GPS, GLONASS, BeiDou-2
- Satellite Based Augmentation Systems (SBAS) : WAAS, EGNOS (GEO satellites and ground stations)
- Regional NAVIC (India), QZSS (Japan), BeiDou-1 (China)
- Ground Based Augmentation Systems (GBAS)

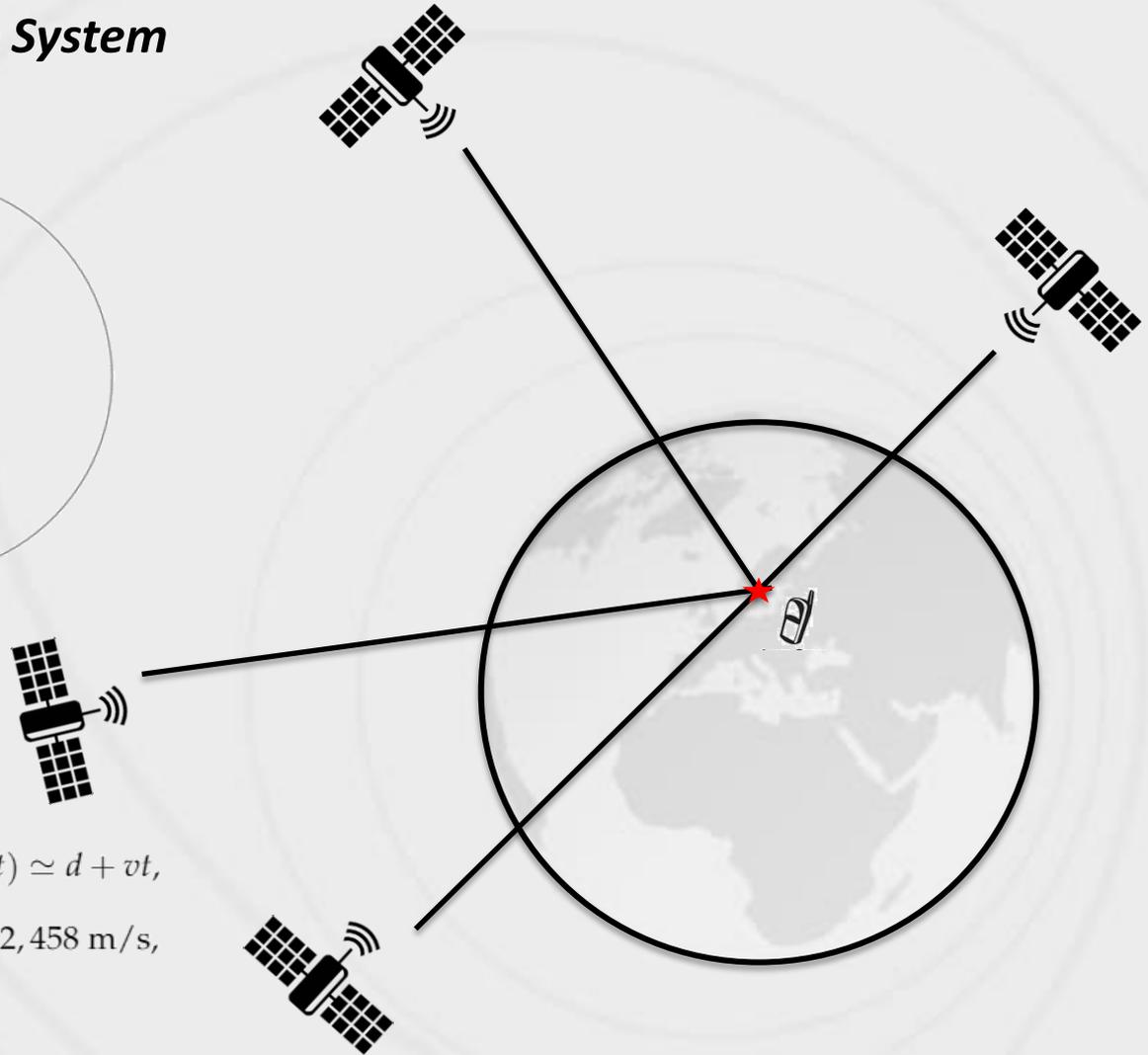
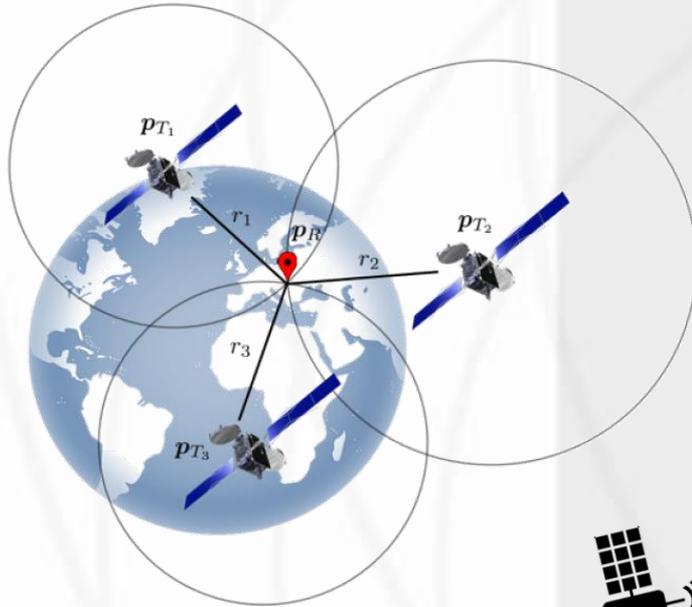


$$\|\mathbf{p}_{TR}(t)\| \triangleq \|\mathbf{p}_R(t) - \mathbf{p}_T(t - \tau(t))\| = c\tau(t) \simeq d + vt,$$

$$\tau(t) \simeq \tau + bt, \quad \tau = \frac{d}{c}, \quad b = \frac{v}{c}, \quad c = 299,792,458 \text{ m/s},$$

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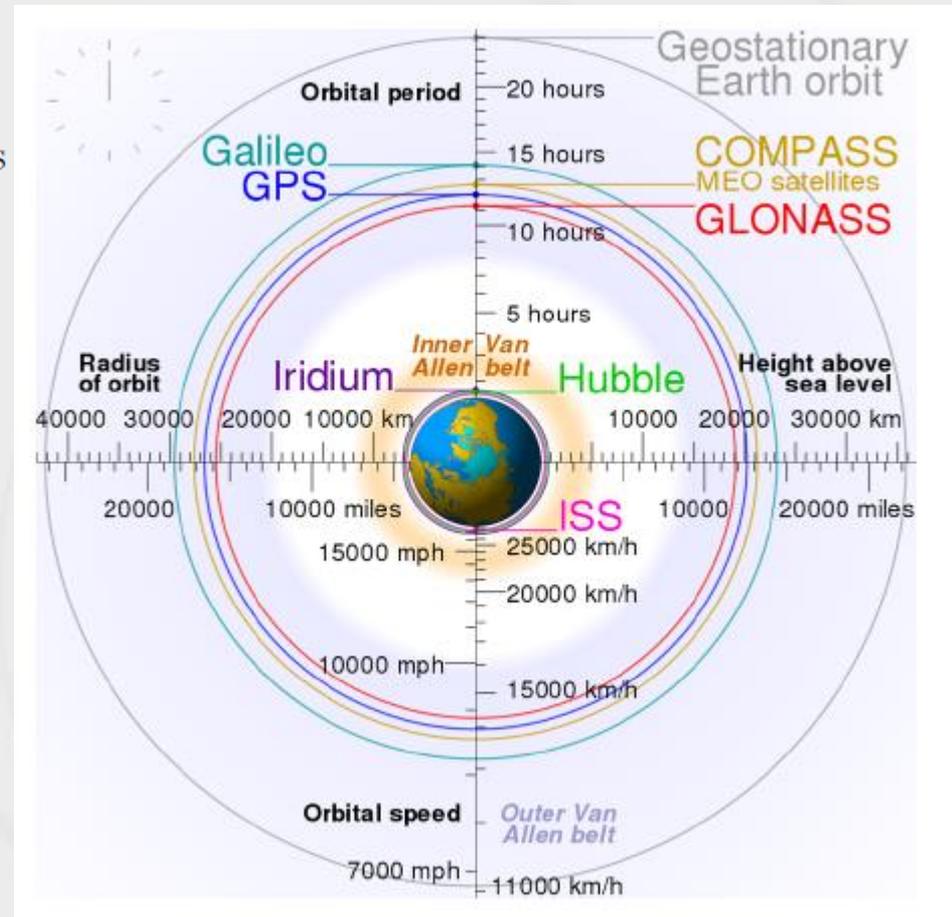
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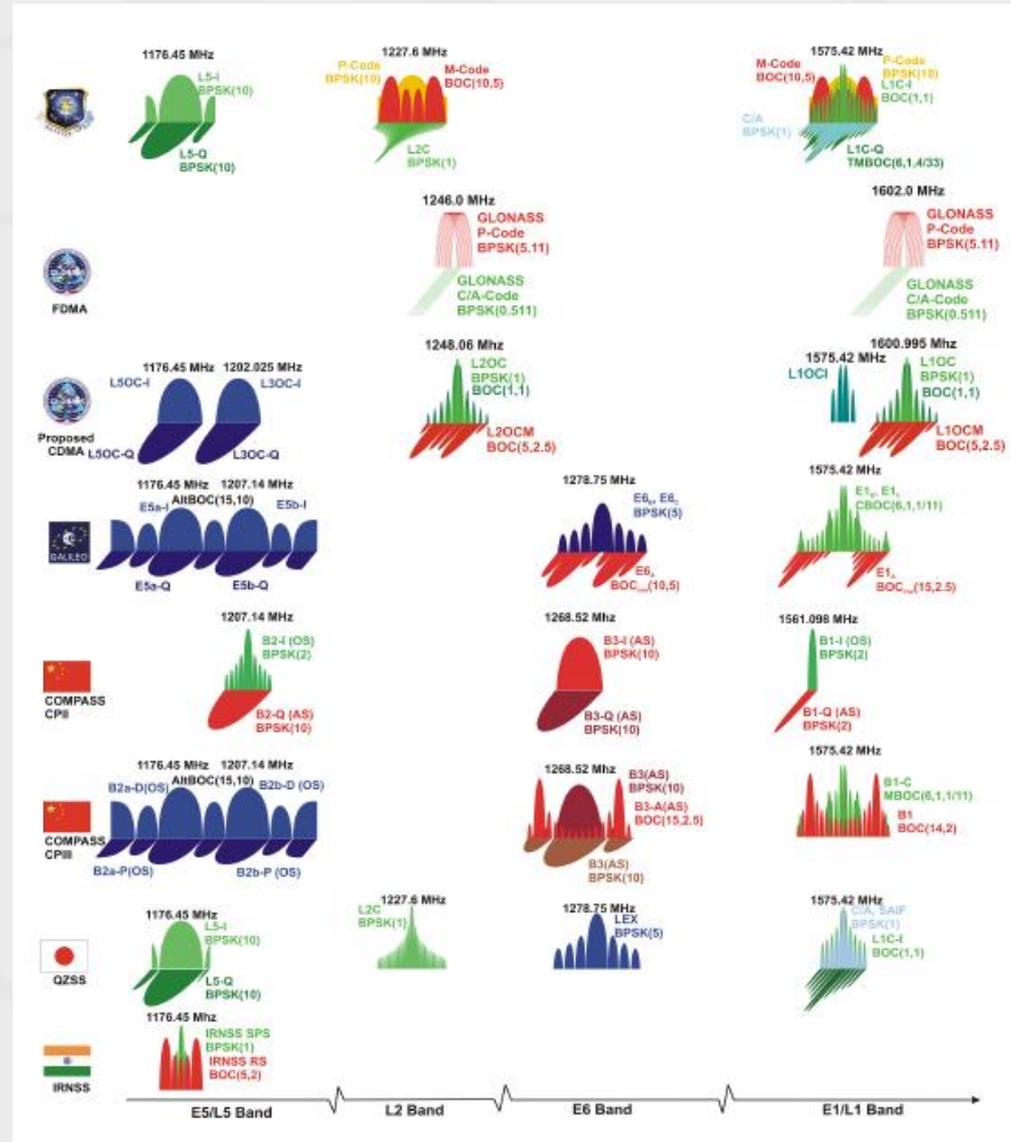
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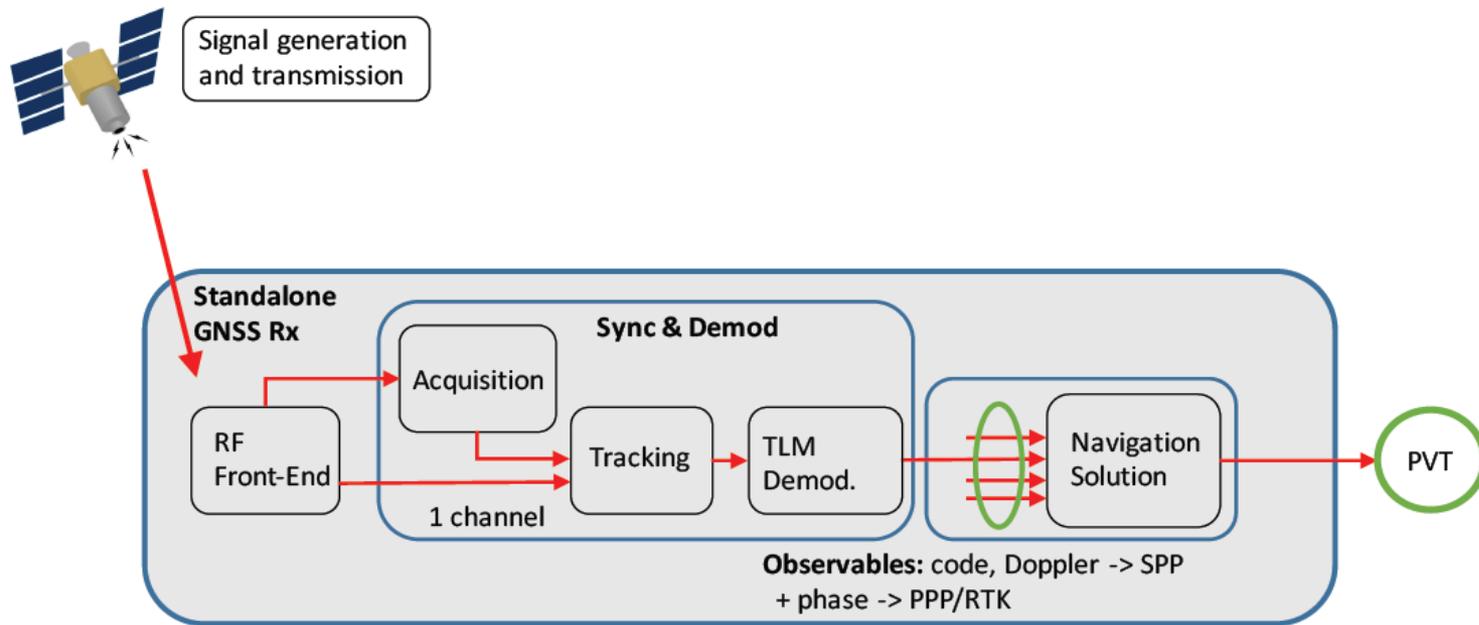
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<http://www.emfrf.com/wp-content/uploads/2014/03/spectrum.jpg> & Navipedia

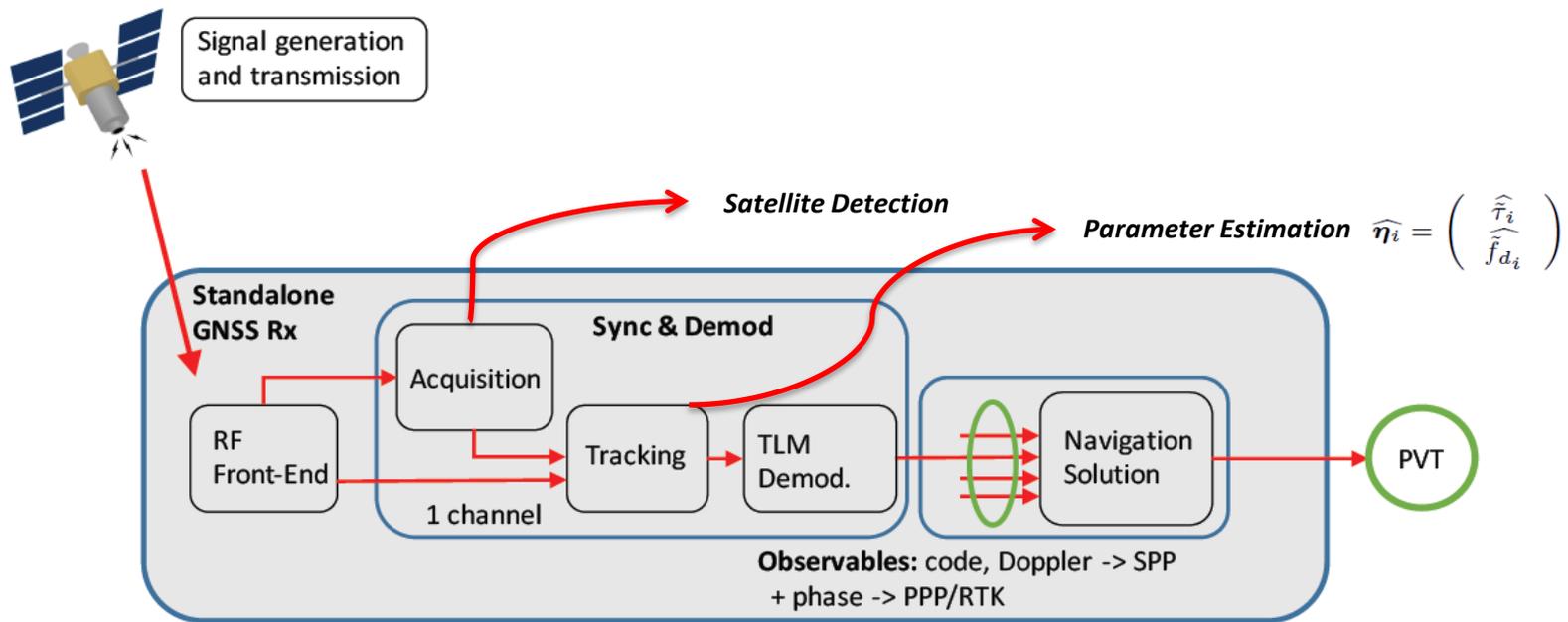
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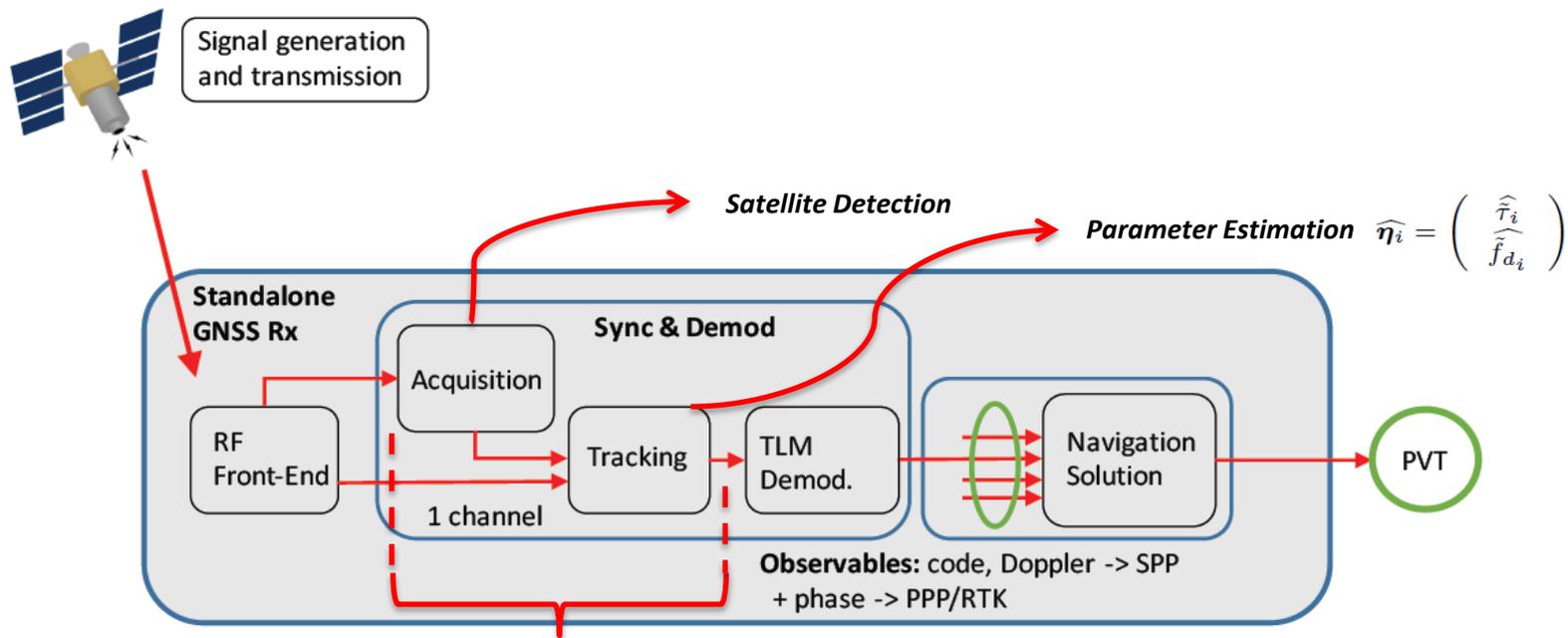
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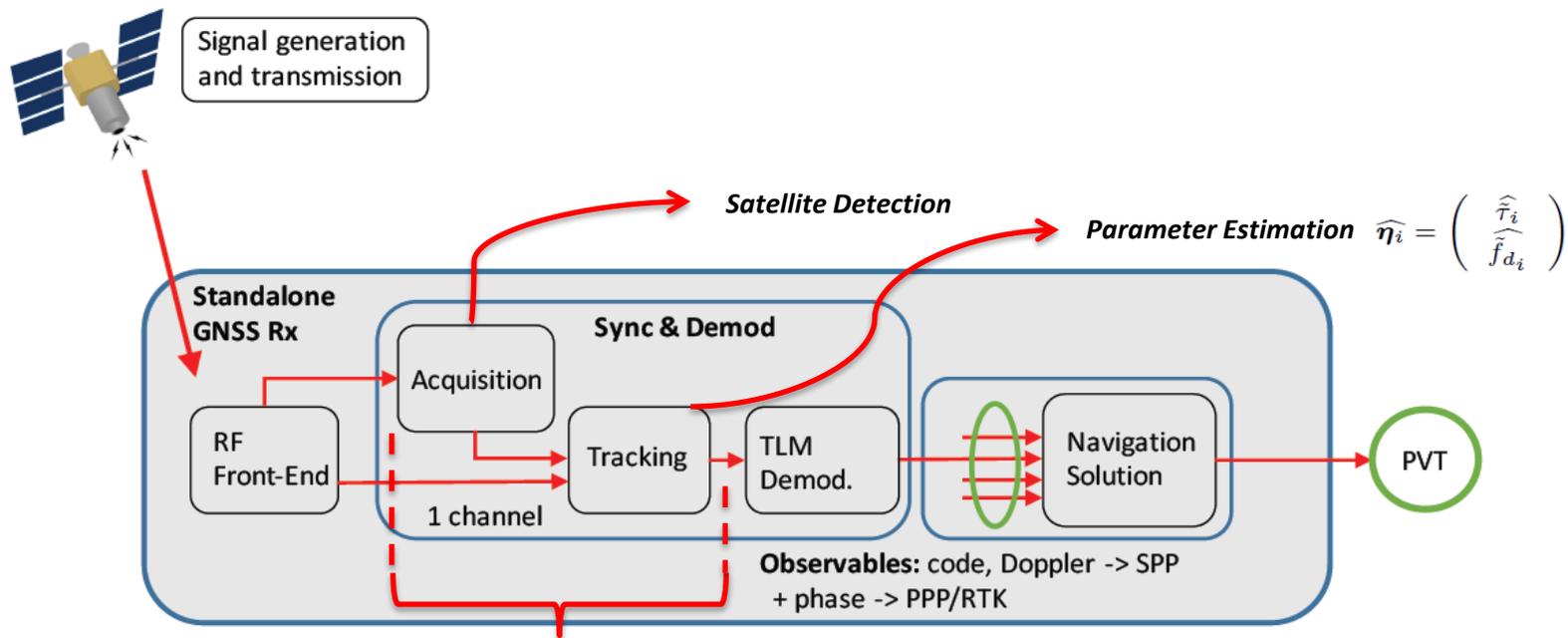
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*Two Steps Estimation Algorithm
to maximize the Autocorrelation function → Maximum Likelihood Approximation*

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Two Steps Estimation Algorithm \rightarrow Maximum Likelihood Approximation

Theoretical Estimation Limits \rightarrow CRB

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Theoretical Estimation Limits → CRB

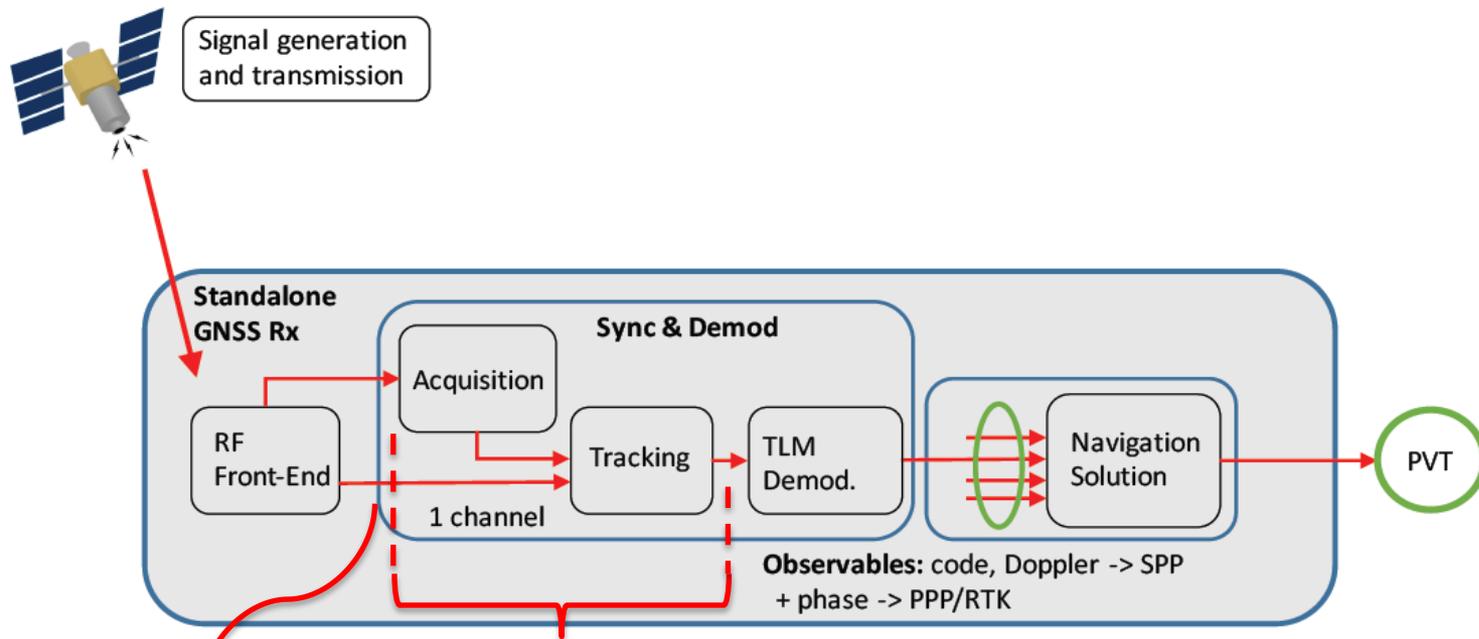
Why??

Some GNSS applications :

- Air navigation (aircrafts & drones), spacecrafts, autonomous cars, boats and ships
- Mining, precise agriculture
- Leisure (sailing, cycling, hiking, climbing), eHealth, search & rescue (SAR)
- Surveying, mapping, geophysics (ground movement, earthquake prediction, tsunami prediction)
- Archaeology, Earth observation (remote sensing - GNSS-R and GNSS-RO)
- Precise timing (synchronisation in power grids, seismology, communications nets)
- IoT, Big Data, augmented reality, smart cities

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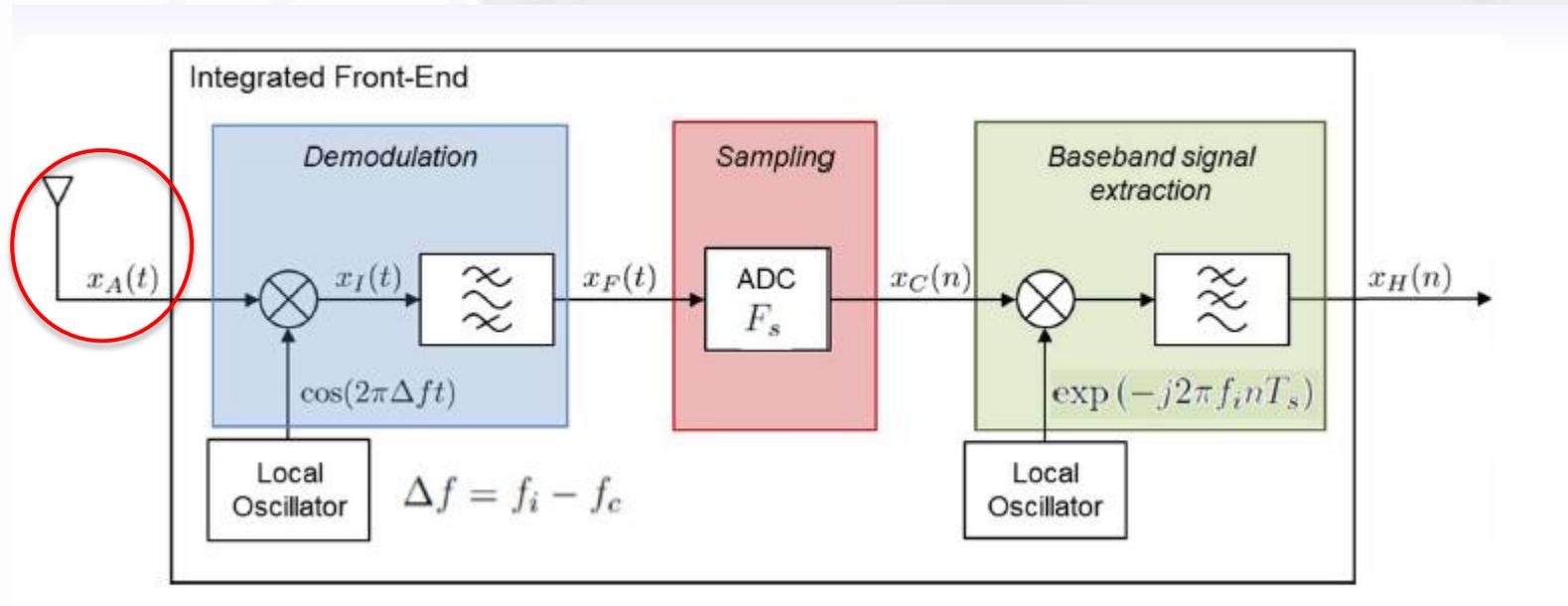
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How is this signal?

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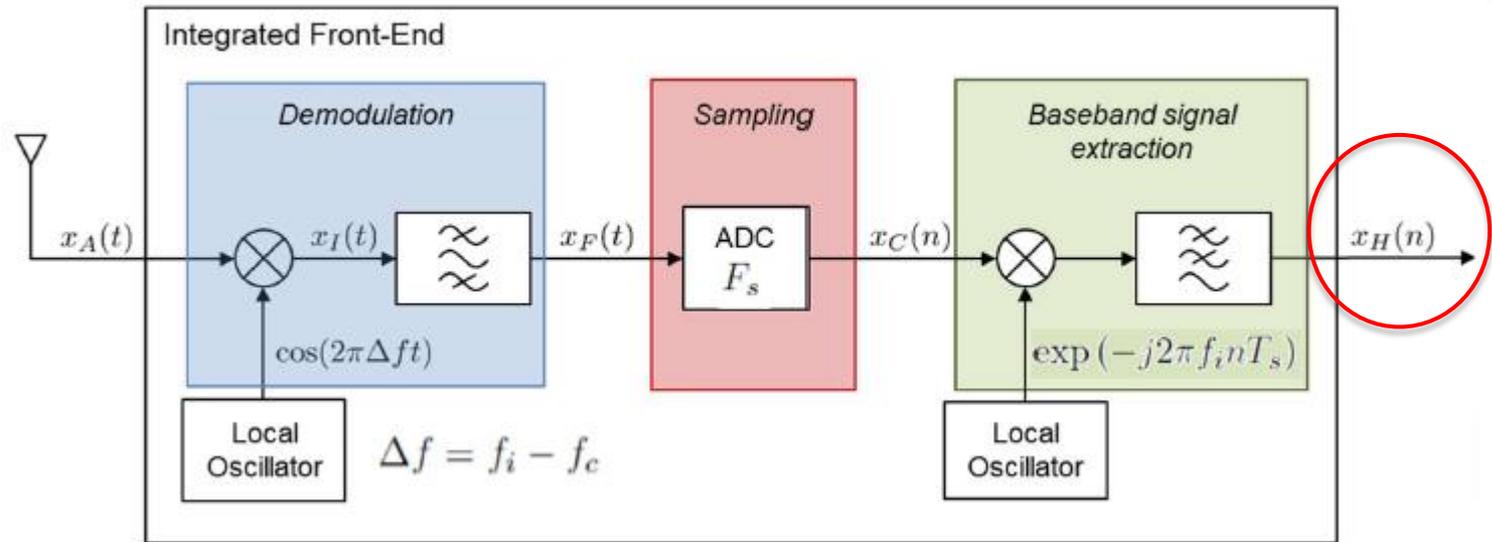
$$s_A(t) = s((1-b)(t-\tau)) e^{j2\pi f_c(1-b)t} e^{-j2\pi f_c \tau}$$

Narrowband assumption

$$s_A(t) = s((1-b)(t-\tau)) e^{j2\pi f_c(1-b)t} e^{-j2\pi f_c \tau}$$

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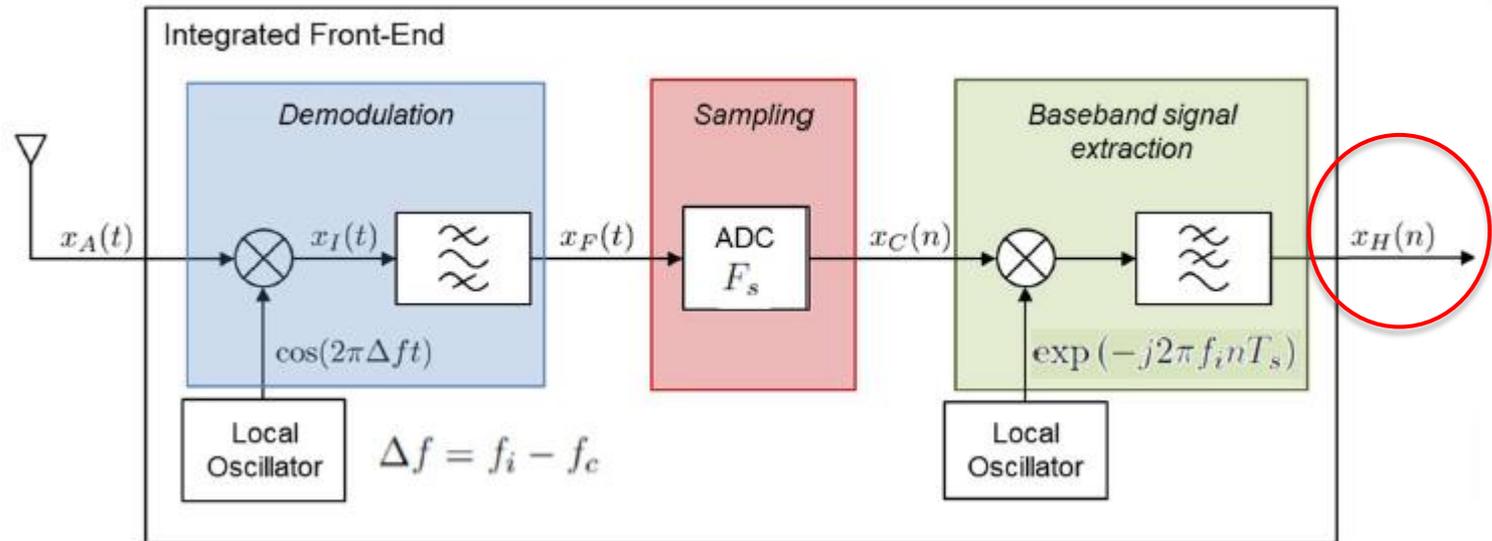
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$$x(t) = \alpha s(t; \eta) e^{-j\omega_{cb}(t-\tau)} + n(t)$$

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$$\mathbf{x} = \alpha \mathbf{a}(\boldsymbol{\eta}) + \mathbf{n},$$

$$\mathbf{x} = (x(N'_1 T_s), \dots, x(N'_2 T_s))^T,$$

$$\mathbf{n} = (n(N'_1 T_s), \dots, n(N'_2 T_s))^T,$$

$$\mathbf{s}(\boldsymbol{\eta}) = (s(N'_1 T_s; \boldsymbol{\eta}), \dots, s(N'_2 T_s; \boldsymbol{\eta}))^T,$$

$$\mathbf{a}(\boldsymbol{\eta}) = ((\mathbf{s}(\boldsymbol{\eta}))_1 e^{-j\omega_{cb}(N'_1 T_s - \tau)}, \dots, (\mathbf{s}(\boldsymbol{\eta}))_{N'} e^{-j\omega_{cb}(N'_2 T_s - \tau)})^T$$

2-Theoretical Limits: Cramér-Rao Bound

$$\mathbf{x} = \mathbf{A}(\boldsymbol{\eta}) \boldsymbol{\alpha} + \mathbf{n}, \quad \mathbf{x}, \mathbf{n} \in \mathbb{C}^N, \quad \mathbf{A}(\boldsymbol{\eta}) \in \mathbb{C}^{N \times Q}, \quad \boldsymbol{\alpha} \in \mathbb{C}^Q$$

Unknown deterministic parameter vector: $\boldsymbol{\eta} \in \mathbb{R}^P$.

Signal Models:

- *Conditional signal model (CSM)*
- *Unconditional signal model (USM)*

Single Source CSM

$$\mathbf{x} = \mathbf{a}(\boldsymbol{\eta}) \alpha + \mathbf{n}, \quad \mathbf{x}, \mathbf{n} \in \mathbb{C}^N, \quad \mathbf{a}(\boldsymbol{\eta}) \in \mathbb{C}^N, \quad \alpha \in \mathbb{C}.$$

2-Theoretical Limits: Cramér-Rao Bound

Single Source CSM

$$\mathbf{x} = \mathbf{a}(\boldsymbol{\eta}) \alpha + \mathbf{n}, \quad \mathbf{x}, \mathbf{n} \in \mathbb{C}^N, \quad \mathbf{a}(\boldsymbol{\eta}) \in \mathbb{C}^N, \quad \alpha \in \mathbb{C}.$$

Re-parametrization

$$\mathbf{x} = \mathbf{a}(\boldsymbol{\eta}) \rho e^{j\varphi} + \mathbf{w}, \quad \mathbf{x}, \mathbf{w} \in \mathbb{C}^N, \quad \mathbf{a}(\boldsymbol{\eta}) \in \mathbb{C}^N, \quad \rho \in \mathbb{R}^+$$

Goal: compact CRB formula for the joint estimation

$$\boldsymbol{\epsilon}^\top = (\sigma_w^2, \rho, \varphi, \boldsymbol{\eta}^\top)$$

2-Theoretical Limits: Cramér-Rao Bound

$$\mathbf{x} = \mathbf{a}'(\boldsymbol{\theta}) \rho + \mathbf{n}, \quad \mathbf{a}'(\boldsymbol{\theta}) = \mathbf{a}(\boldsymbol{\eta}) e^{j\varphi}, \quad \boldsymbol{\theta}^T = (\varphi, \boldsymbol{\eta}^T),$$

$$CRB_{\rho} = \frac{\sigma_n^2}{2 \|\mathbf{a}(\boldsymbol{\eta})\|^2} + \rho^2 \frac{\operatorname{Re} \left\{ \mathbf{a}^H(\boldsymbol{\eta}) \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\} CRB_{\boldsymbol{\eta}} \operatorname{Re} \left\{ \mathbf{a}^H(\boldsymbol{\eta}) \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\}^T}{\|\mathbf{a}(\boldsymbol{\eta})\|^4},$$

$$CRB_{\boldsymbol{\theta}} = \begin{bmatrix} CRB_{\varphi} & CRB_{\boldsymbol{\eta}, \varphi}^T \\ CRB_{\boldsymbol{\eta}, \varphi} & CRB_{\boldsymbol{\eta}} \end{bmatrix}, \quad \boldsymbol{\theta}^T = (\varphi, \boldsymbol{\eta}^T),$$

$$CRB_{\varphi} = \frac{\sigma_n^2}{2\rho^2} \frac{1}{\|\mathbf{a}(\boldsymbol{\eta})\|^2} + \frac{\operatorname{Im} \left\{ \mathbf{a}^H(\boldsymbol{\eta}) \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\} CRB_{\boldsymbol{\eta}} \operatorname{Im} \left\{ \mathbf{a}^H(\boldsymbol{\eta}) \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\}^T}{\|\mathbf{a}(\boldsymbol{\eta})\|^4},$$

$$CRB_{\boldsymbol{\eta}, \varphi} = -CRB_{\boldsymbol{\eta}} \frac{\operatorname{Im} \left\{ \mathbf{a}^H(\boldsymbol{\eta}) \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\}^T}{\|\mathbf{a}(\boldsymbol{\eta})\|^2}.$$

$$CRB_{\boldsymbol{\eta}} = \frac{\sigma_n^2}{2\rho^2} \operatorname{Re} \left\{ \left(\frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right)^H \boldsymbol{\Pi}_{\mathbf{a}(\boldsymbol{\eta})}^{\perp} \frac{\partial \mathbf{a}(\boldsymbol{\eta})}{\partial \boldsymbol{\eta}^T} \right\}^{-1},$$

“Compact CRB for Delay, Doppler and Phase Estimation – Application to GNSS SPP & RTK Performance Characterization”, **IET Radar, Sonar & Navigation**, vol. 14, no. 10, pp. 1537-1549, September 2020.

2-Theoretical Limits: Cramér-Rao Bound

Cramér-Rao Bound for Band-limited Signals/ Narrowband approx

$$s(t) = c(t)$$

$$c(t) = \sum_{n=N_1}^{N_2} c(nT_s) \text{sinc}(\pi F_s (t - nT_s)) \Leftrightarrow$$

$$c(f) = \left(T_s \sum_{n=N_1}^{N_2} c(nT_s) e^{-j2\pi nT_s f} \right) 1_{[-\frac{B}{2}, \frac{B}{2}]}(f),$$

$$\text{CRB}_\eta = \frac{1}{2\text{SNR}_{\text{out}}} \Delta_\eta^{-1},$$

$$[\Delta_\eta]_{1,1} = F_s^2 \left(\frac{\mathbf{c}^H \mathbf{V} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} - \left| \frac{\mathbf{c}^H \boldsymbol{\Lambda} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \right|^2 \right)$$

$$[\Delta_\eta]_{2,2} = \frac{\omega_c^2}{F_s^2} \left(\frac{\mathbf{c}^H \mathbf{D}^2 \mathbf{c}}{\mathbf{c}^H \mathbf{c}} - \left(\frac{\mathbf{c}^H \mathbf{D} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \right)^2 \right)$$

$$[\Delta_\eta]_{1,2} = [\Delta_\eta]_{2,1} = \omega_c \text{Im} \left\{ \frac{\mathbf{c}^H \mathbf{D} \boldsymbol{\Lambda} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} - \frac{\mathbf{c}^H \mathbf{D} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \frac{\mathbf{c}^H \boldsymbol{\Lambda} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \right\}$$

$$\left. \begin{aligned} \text{CRB}_\varphi &= \frac{1}{2\text{SNR}_{\text{out}}} + \left(F_s \text{Im} \left\{ \frac{\mathbf{c}^H \boldsymbol{\Lambda} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \right\} - b\omega_c \right)^T \\ &\quad \times \text{CRB}_\eta \left(F_s \text{Im} \left\{ \frac{\mathbf{c}^H \boldsymbol{\Lambda} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \right\} - b\omega_c \right), \\ &\quad \frac{\omega_c}{F_s} \frac{\mathbf{c}^H \mathbf{D} \mathbf{c}}{\mathbf{c}^H \mathbf{c}} \end{aligned} \right)$$

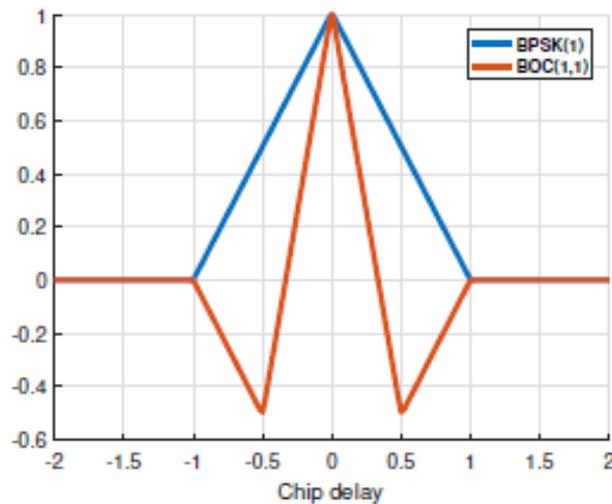
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2-Theoretical Limits: GPS C/A signal

Time-Delay Estimation of the GPS C/A signal

$$ACF(t) = \int_{-\frac{B_r}{2}}^{\frac{B_r}{2}} G_s(f) e^{-j2\pi ft} df.$$

$$G_{BPSK}(f_c) = f_c \frac{\sin^2\left(\frac{\pi f}{f_c}\right)}{(\pi f)^2}.$$



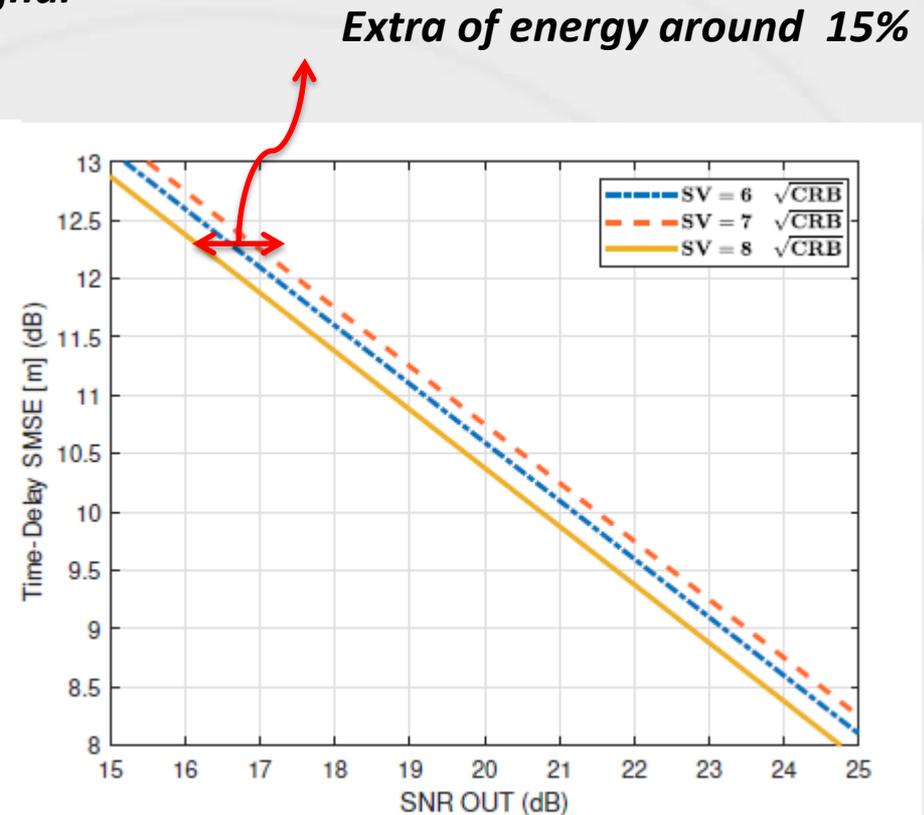
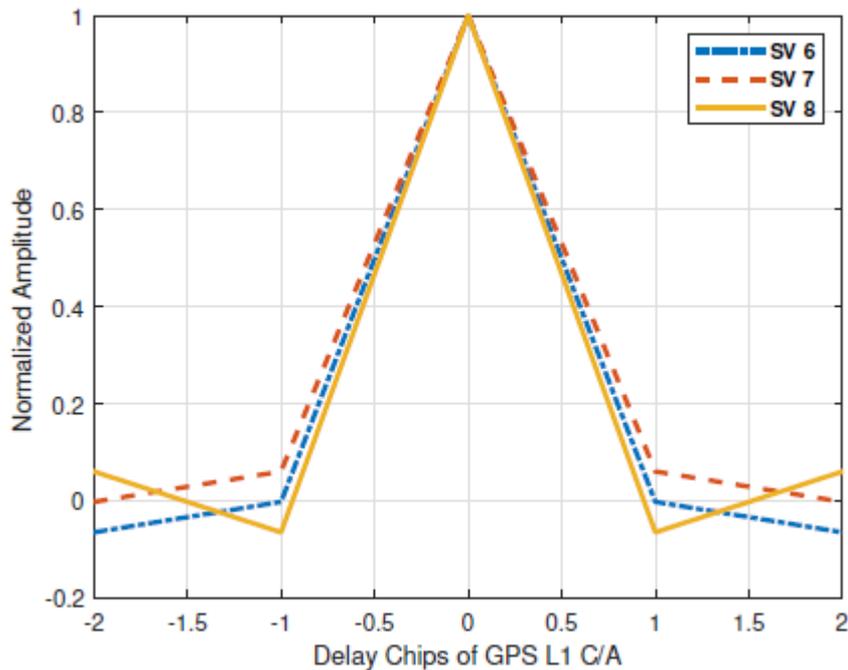
The PRN correlation is assume ideal !!

$$R_{c_i} \approx \delta(m).$$

$$B_{Gabor} = \sqrt{\int_{-\frac{B_r}{2}}^{\frac{B_r}{2}} f^2 G_s(f) df}.$$

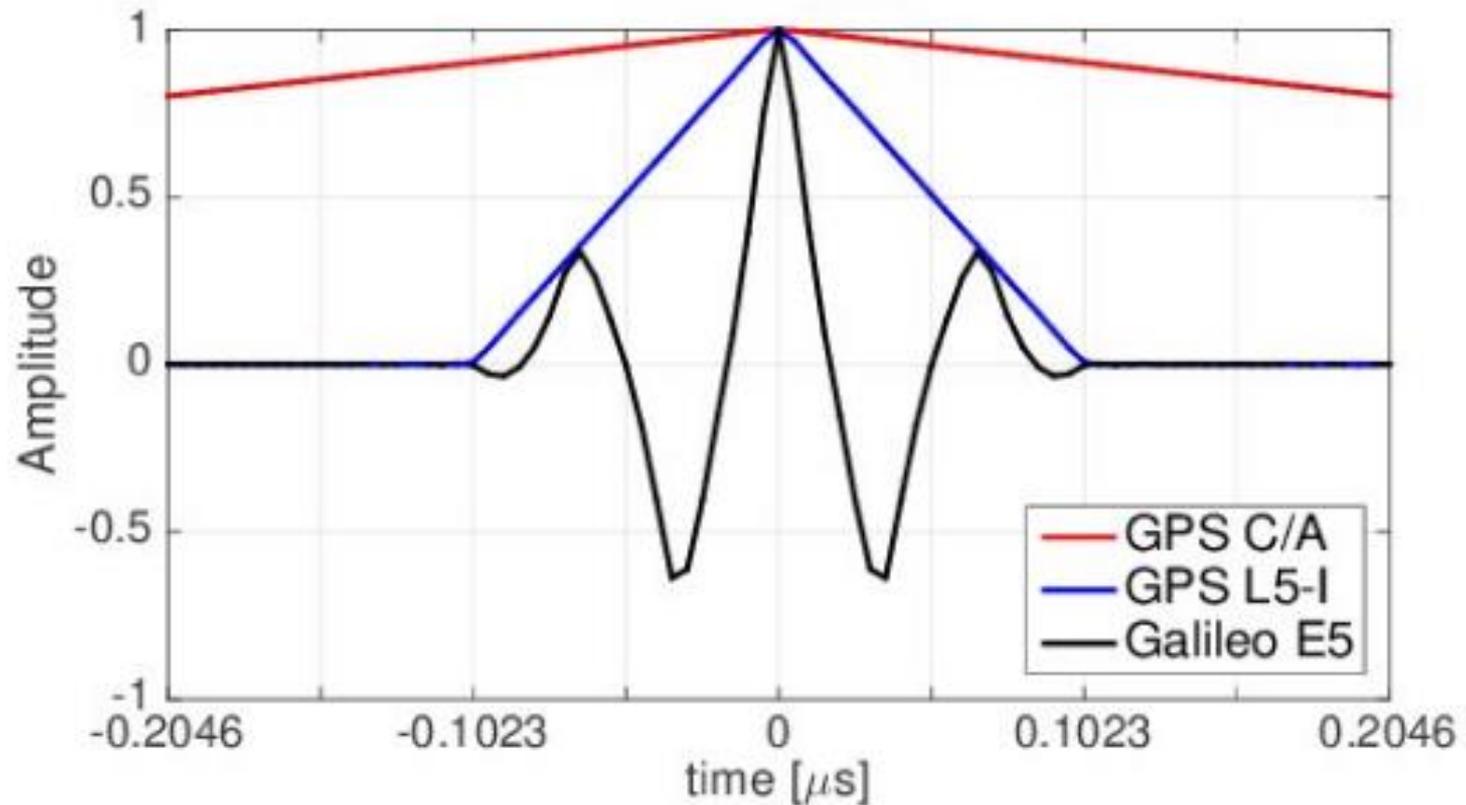
2-Theoretical Limits: GPS C/A signal

Time-Delay Estimation of the GPS C/A signal



“On the Time-Delay Estimation Performance Limit of New GNSS Acquisition Codes”, in the Proceedings of the International Conference on Localization and GNSS (ICL-GNSS '20), 2-4 June 2020, Tampere, Finland

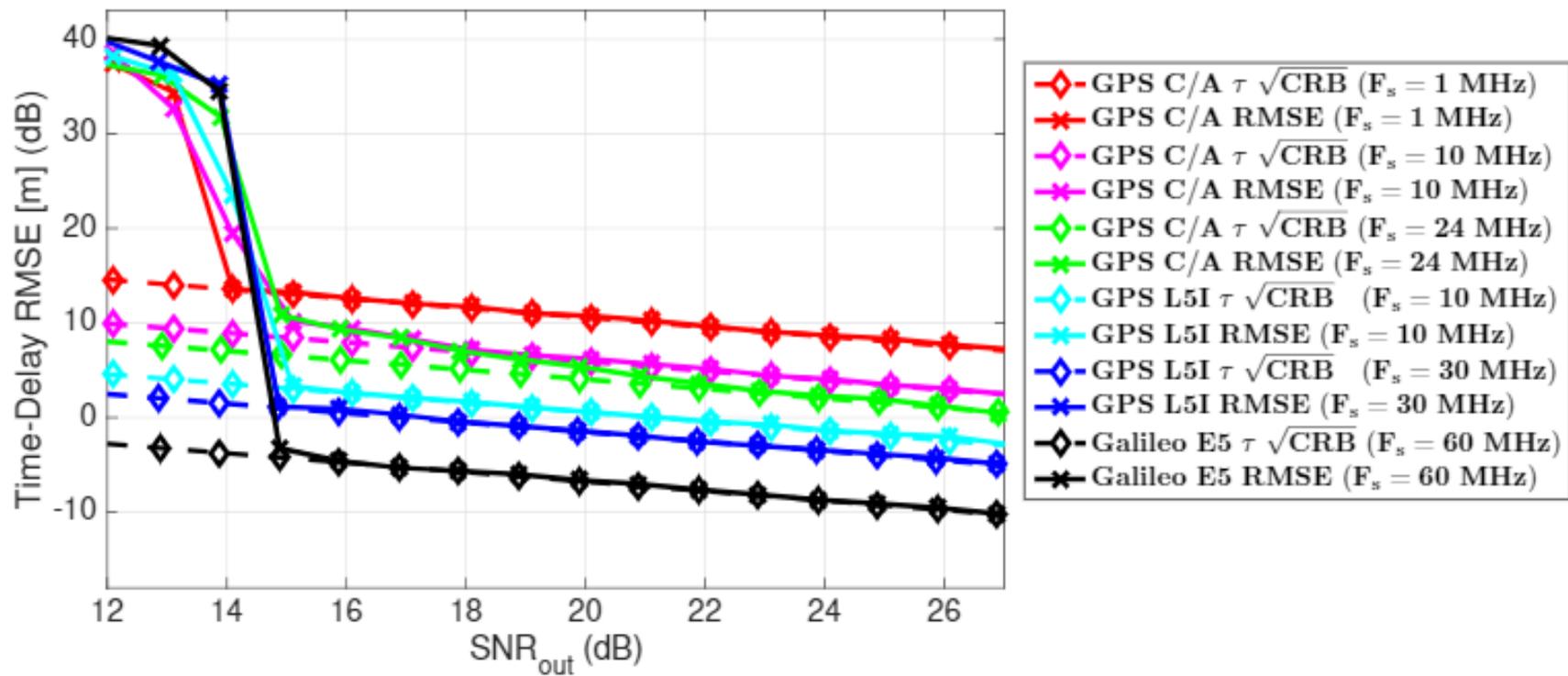
2-Theoretical Limits: GNSS Signals



2-Theoretical Limits: GNSS Signals

Maximum Likelihood Estimation

$$\hat{\tau} = \arg \max_{\tau} \left\{ \left| \left(\mathbf{c}(\tau)^H \mathbf{c}(\tau) \right)^{-1} \mathbf{c}(\tau)^H \mathbf{x} \right|^2 \right\},$$

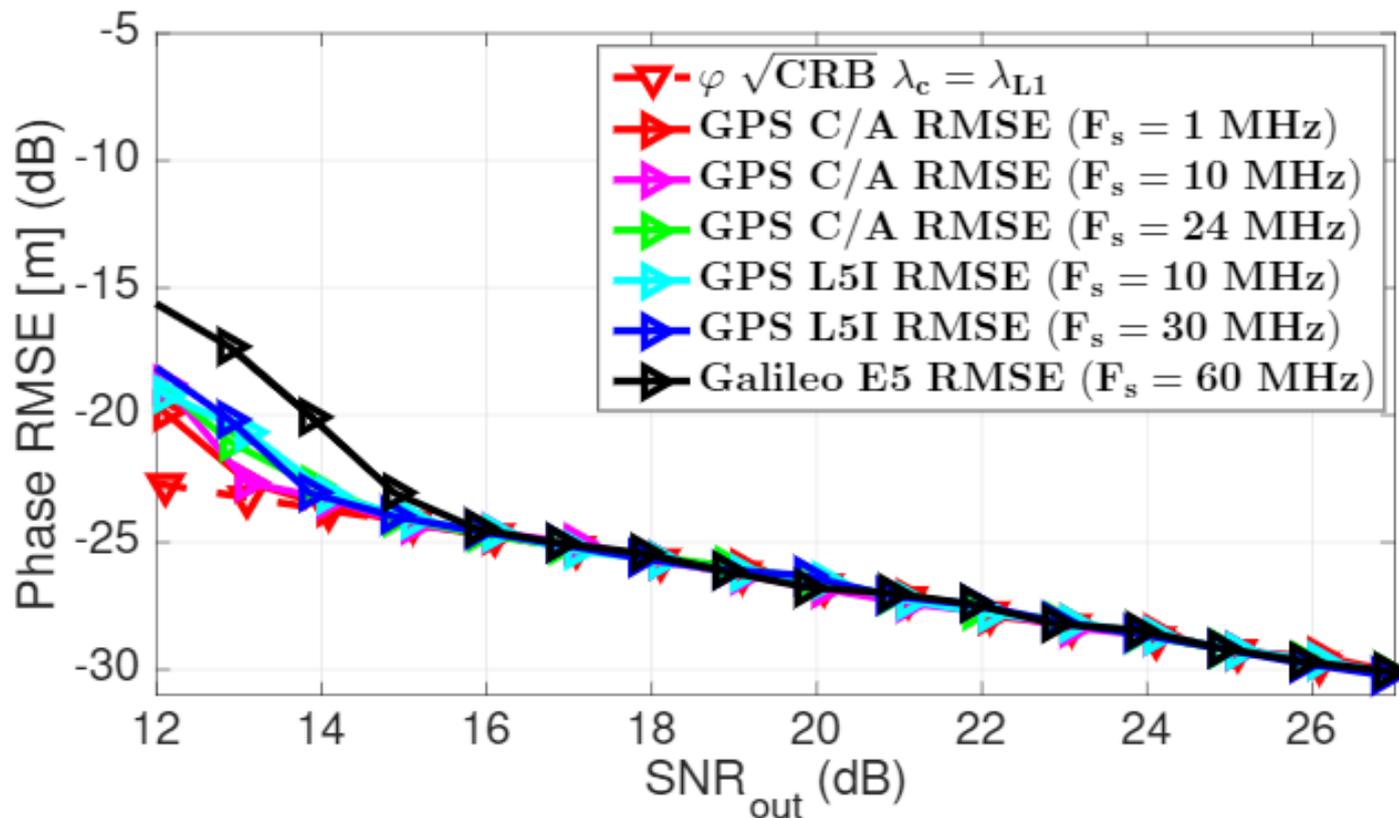


“Performance Limits of GNSS Code-based Precise Positioning : GPS, Galileo & Meta-Signals”, **Sensors**, 20 (8), 2196, April 2020.

2-Theoretical Limits: GNSS Signals

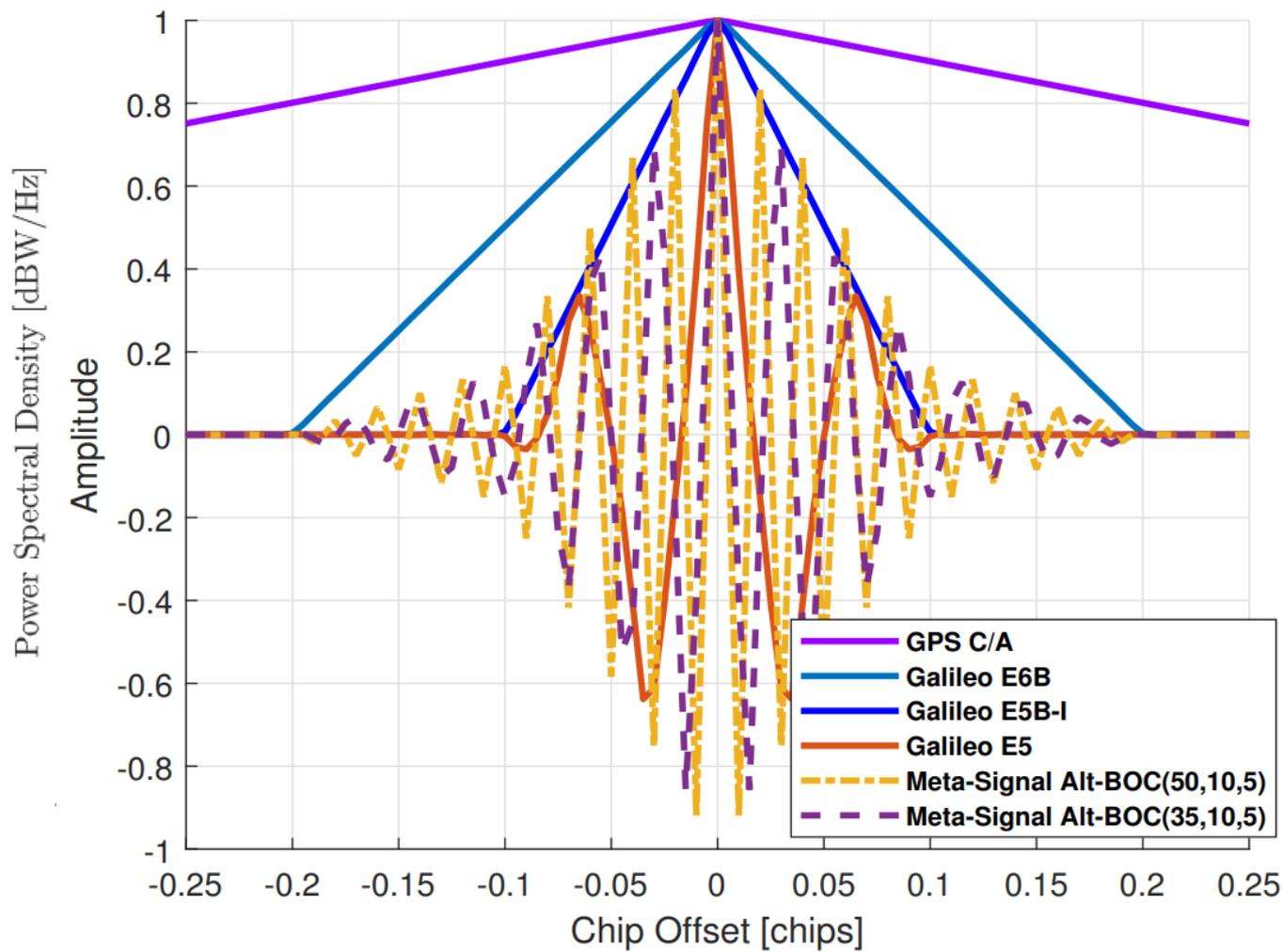
Maximum Likelihood Estimation

$$\hat{\varphi}(\hat{\tau}) = \arg \left\{ \left(\mathbf{c}(\hat{\tau})^H \mathbf{c}(\hat{\tau}) \right)^{-1} \mathbf{c}(\hat{\tau})^H \mathbf{x} \right\},$$



“Compact CRB for Delay, Doppler and Phase Estimation – Application to GNSS SPP & RTK Performance Characterization”, **IET Radar, Sonar & Navigation**, vol. 14, no. 10, pp. 1537-1549, September 2020.

2-Theoretical Limits: GNSS to GNSS Meta-Signals



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2-Theoretical Limits: GNSS Meta-Signals

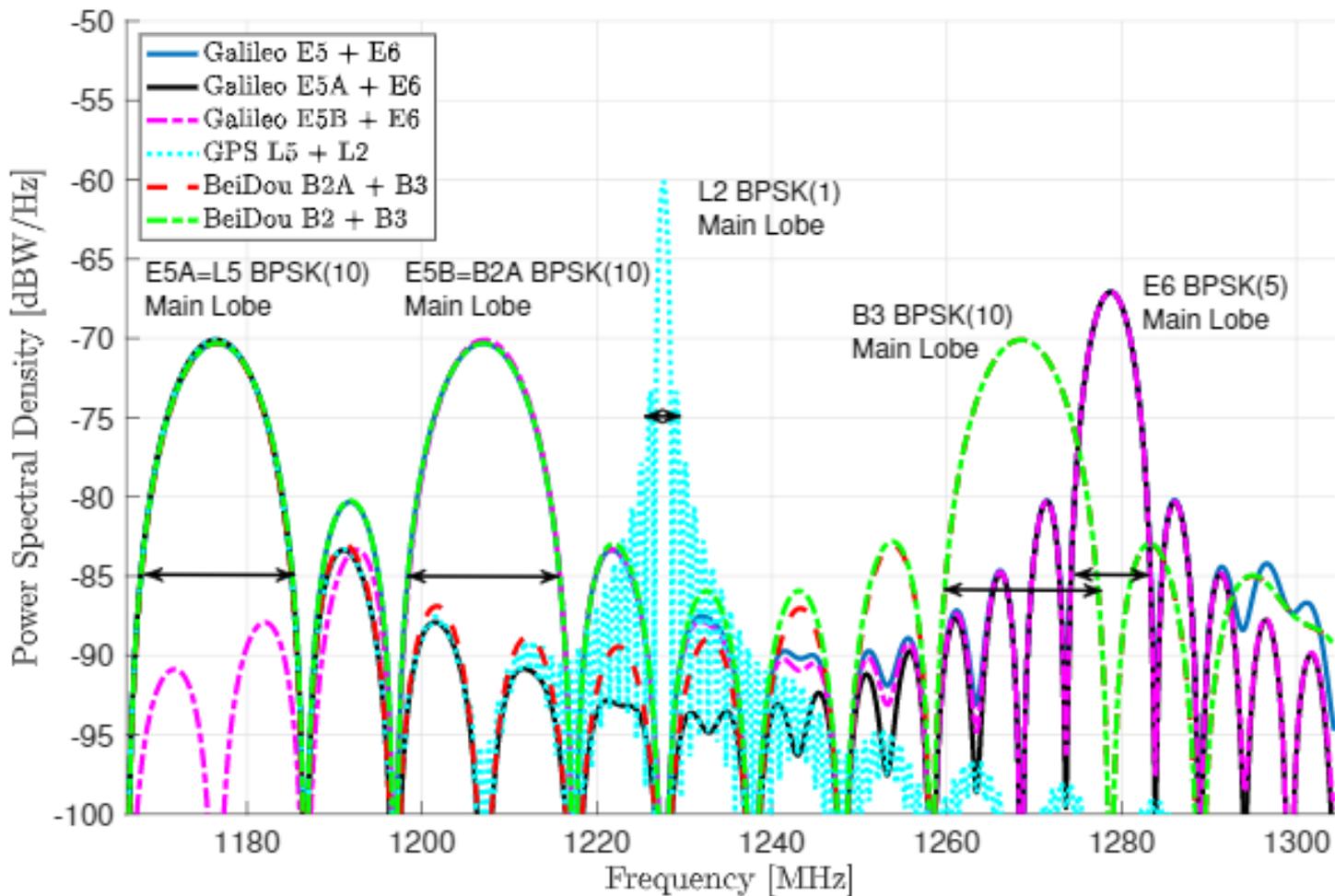
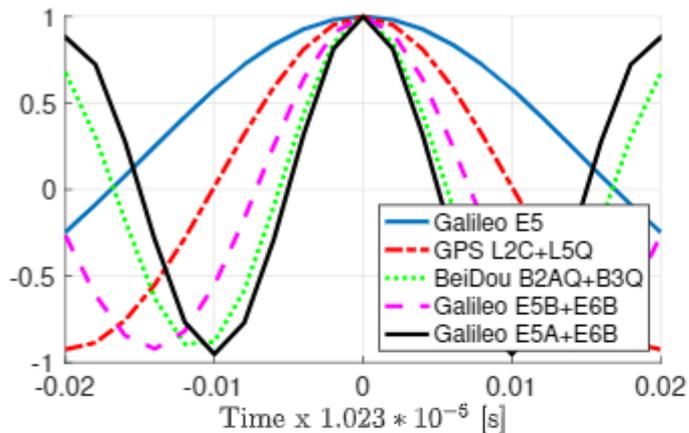
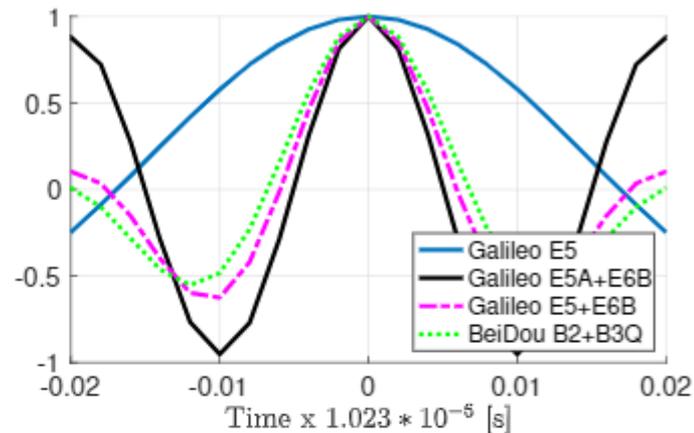


Figure 1. PSD for the different GNSS meta-signals.

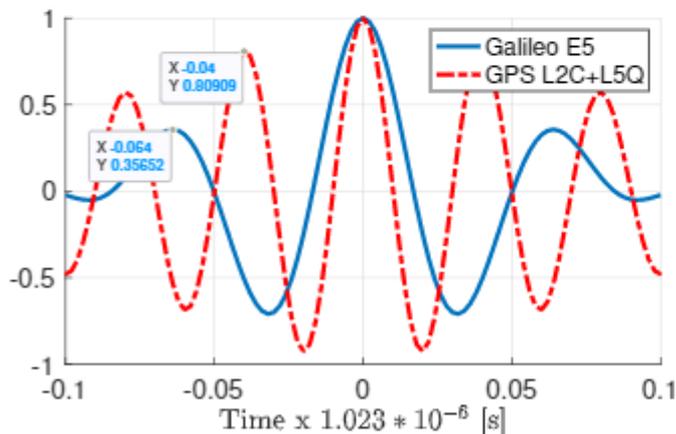
2-Theoretical Limits: GNSS Meta-Signals



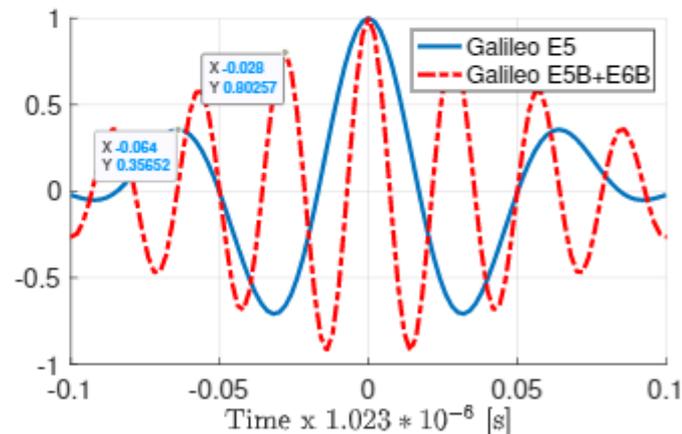
(a)



(b)



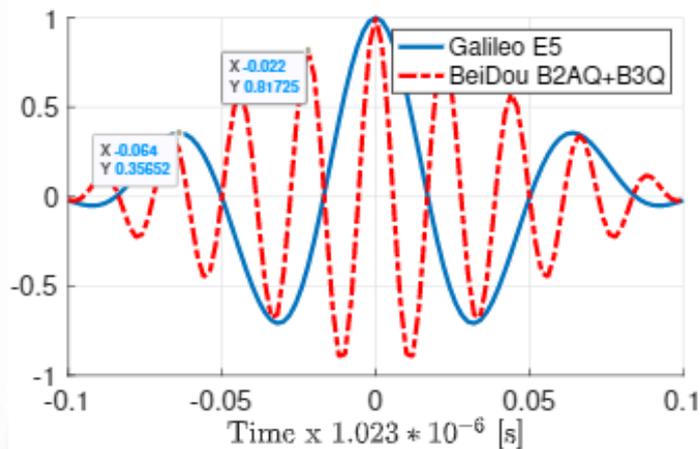
(c)



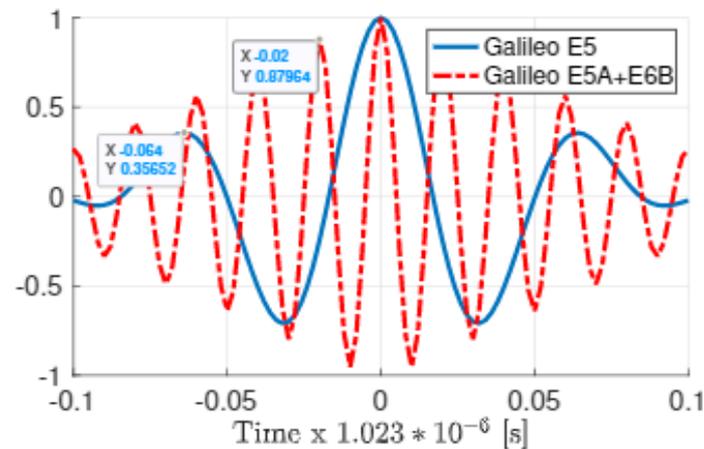
(d)

“Positioning Performance Limits of GNSS Meta-Signals and HO-BOC Signals”, **Sensors**, 20 (12), 3586, June 2020.

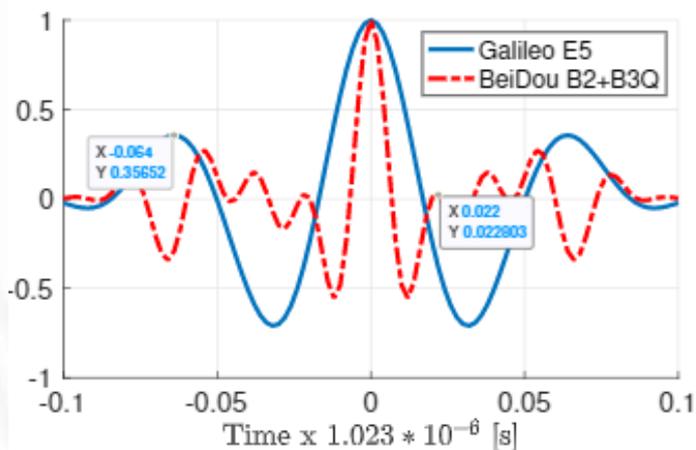
2-Theoretical Limits: GNSS Meta-Signals



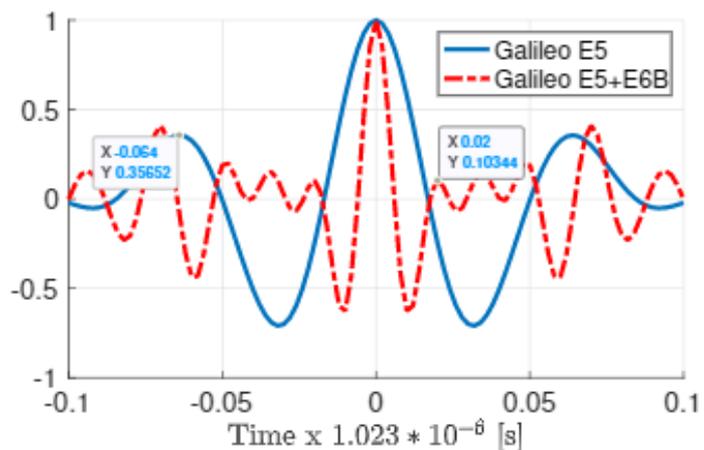
(e)



(f)

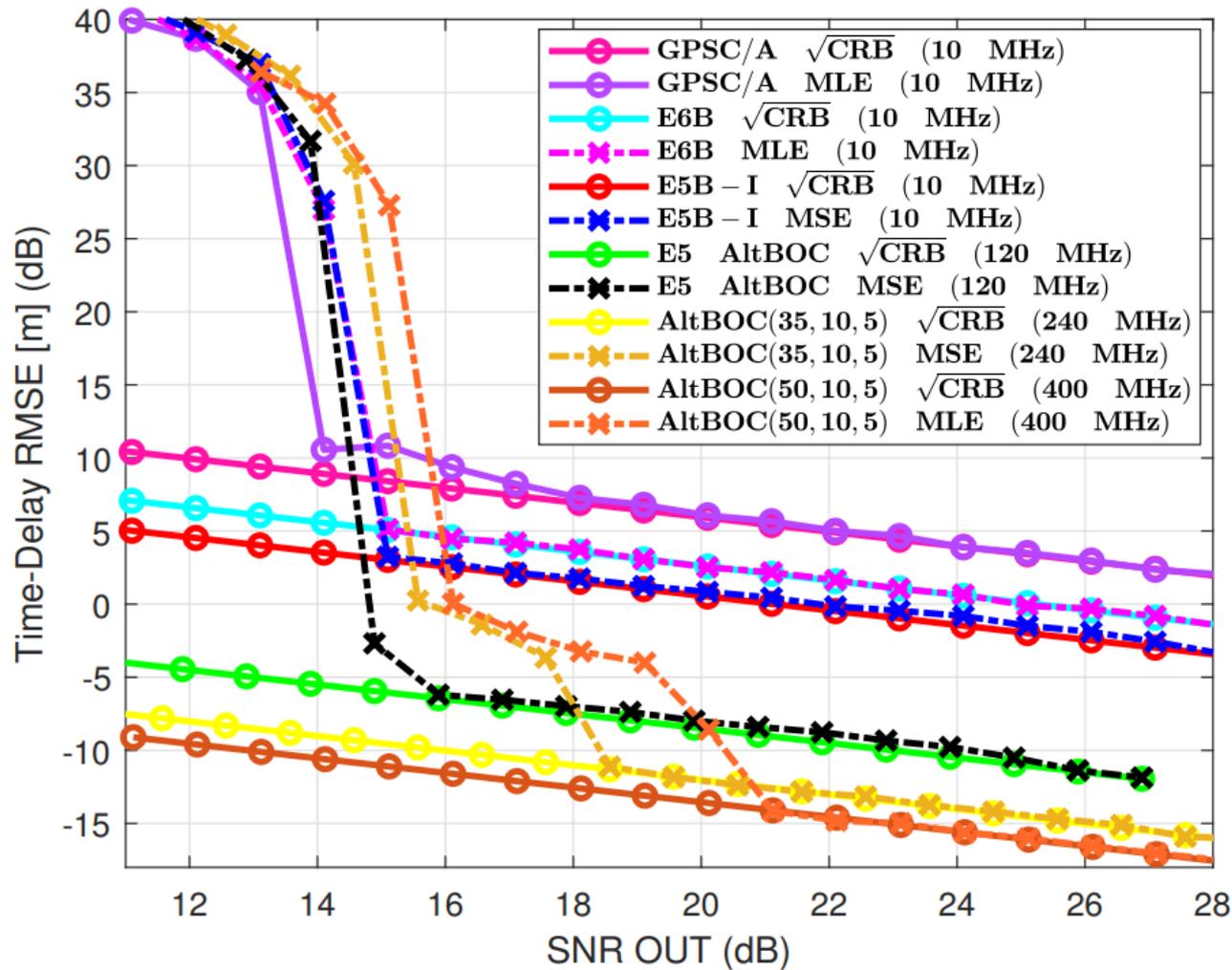


(g)



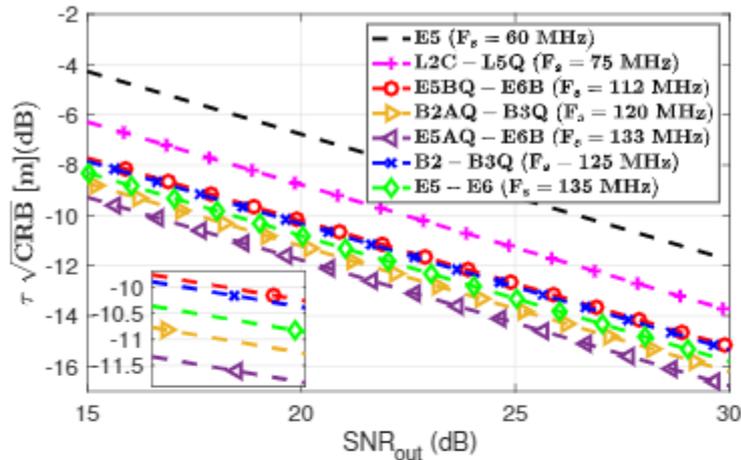
(h)

2-Theoretical Limits: GNSS Meta-Signals

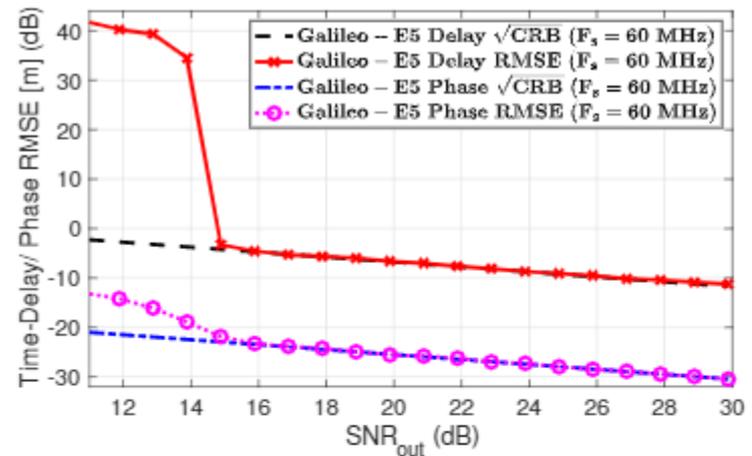


“Performance Limits of GNSS Code-based Precise Positioning : GPS, Galileo & Meta-Signals”, **Sensors**, 20 (8), 2196, April 2020.

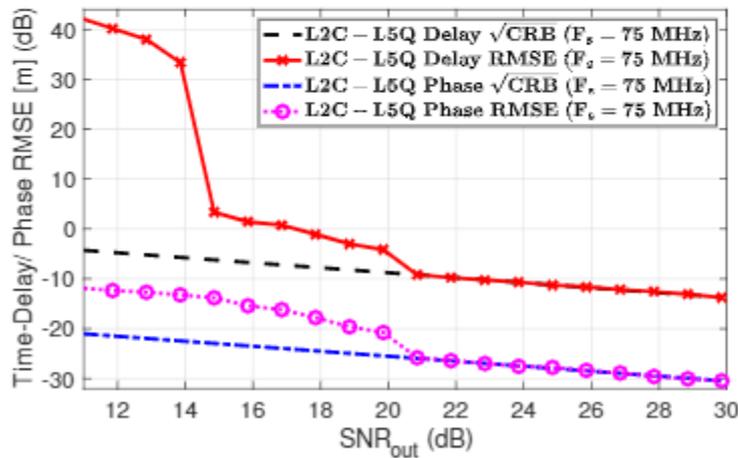
2-Theoretical Limits: GNSS Meta-Signals



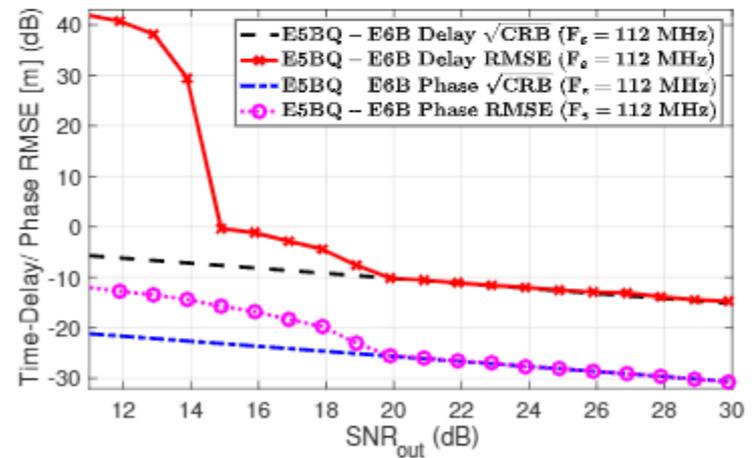
(a)



(b)



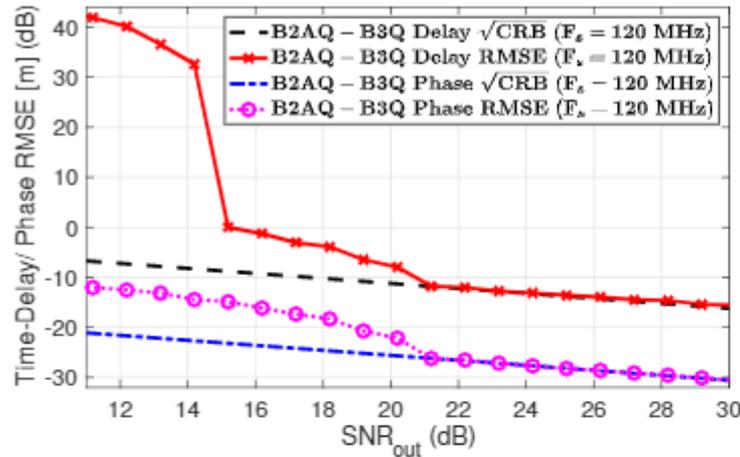
(c)



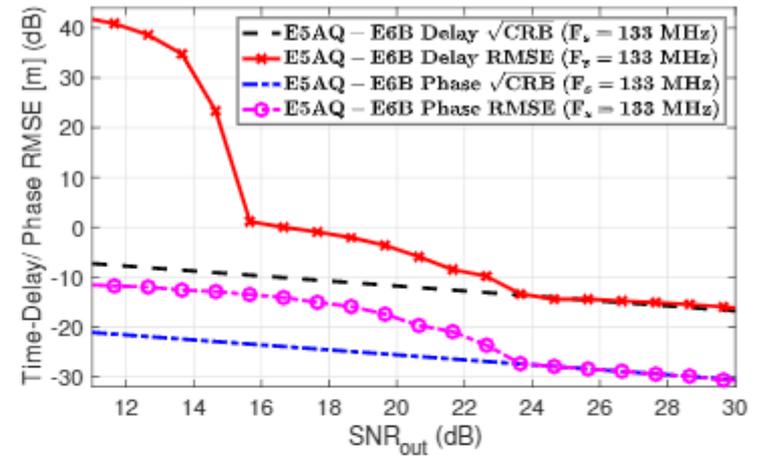
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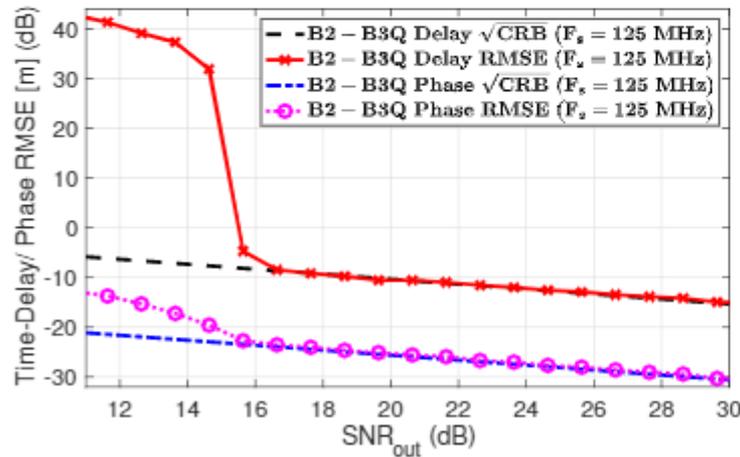
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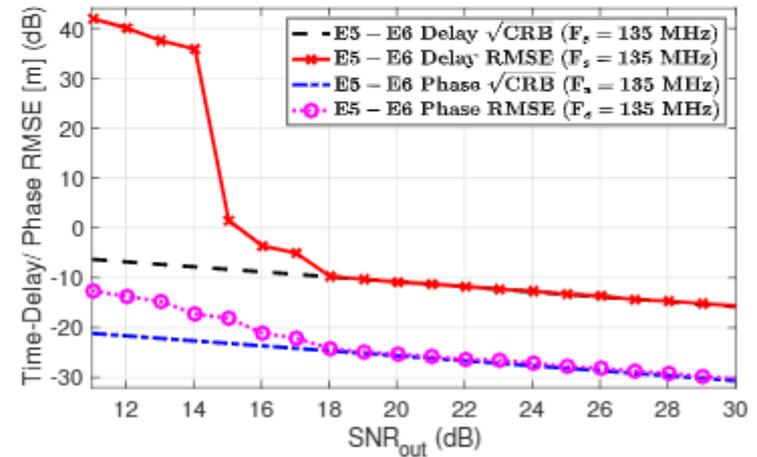
(e)



(f)



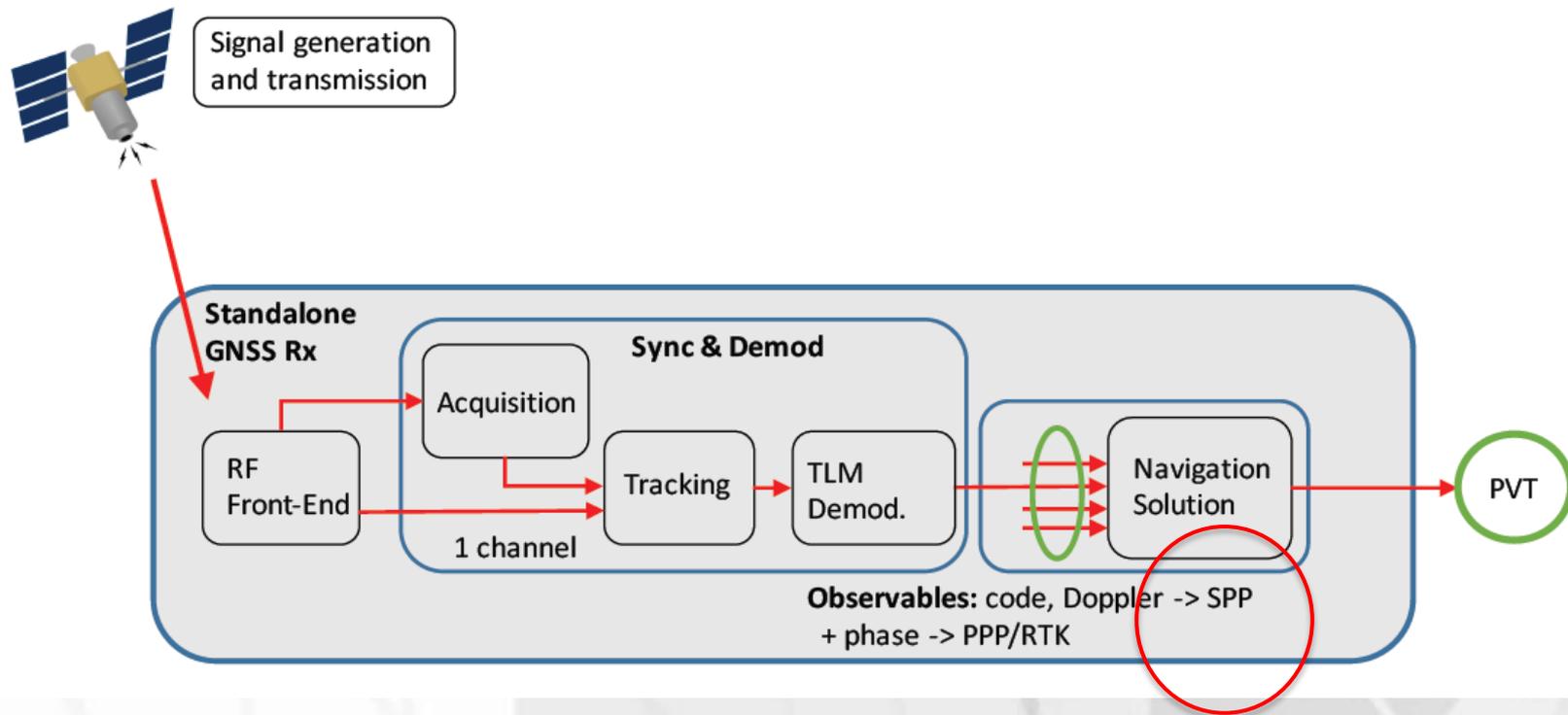
(g)



(h)

“Positioning Performance Limits of GNSS Meta-Signals and HO-BOC Signals”, *Sensors*, 20 (12), 3586, June 2020.

2-Theoretical Limits: GNSS SPP Solution



$$\hat{\rho}_i = c\hat{\tau}_i = \rho_i(\mathbf{p}_R) + c(\delta t_r - \delta t_i) + \epsilon_i$$

2-Theoretical Limits: GNSS SPP Solution

$$\hat{\rho}_i = c\hat{\tau}_i = \rho_i(\mathbf{p}_R) + c(\delta t_r - \delta t_i) + \epsilon_i$$

$$y_i = \hat{\rho}_i + c\delta t_i - \epsilon_i^{iono} - \epsilon_i^{tropo} = \|\mathbf{p}_{T_i} - \mathbf{p}_R\| + c\delta t_r$$

$$\hat{\rho}_i + c\delta t_i - \epsilon_i^{iono} - \epsilon_i^{tropo} \approx \rho_i(\mathbf{p}^0) - \mathbf{u}_i(\mathbf{p}^0)\delta_p + \epsilon_i$$

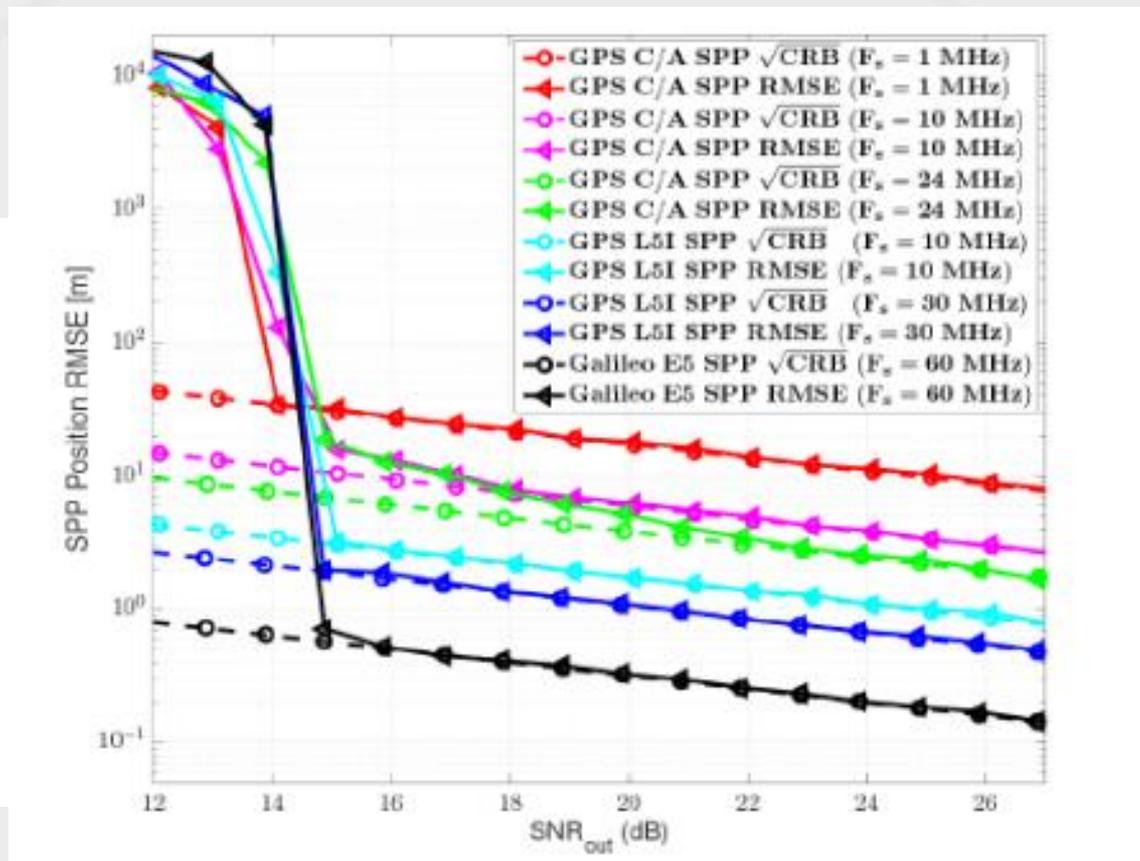
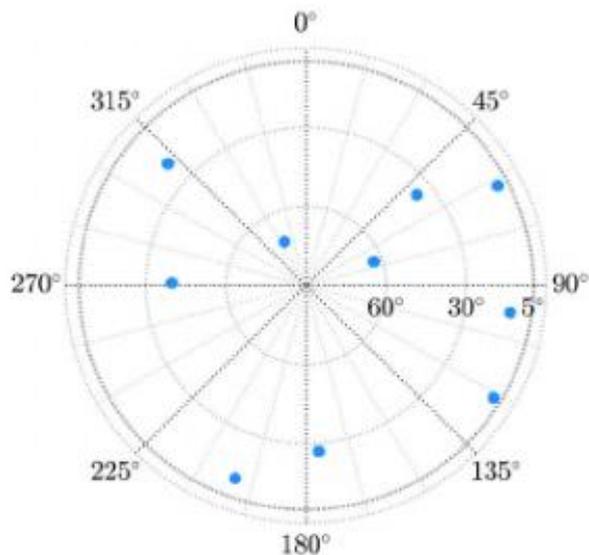
$$\mathbf{y} = \mathbf{H}\delta + \boldsymbol{\epsilon}$$

Weighted LS (WLS) problem :

$$\hat{\boldsymbol{\delta}}_{WLS} = \arg \min_{\boldsymbol{\delta}} \{\|\mathbf{y} - \mathbf{H}\boldsymbol{\delta}\|_{\mathbf{W}}^2\} = \arg \min_{\boldsymbol{\delta}} \{(\mathbf{y} - \mathbf{H}\boldsymbol{\delta})^T \mathbf{W}(\mathbf{y} - \mathbf{H}\boldsymbol{\delta})\}$$

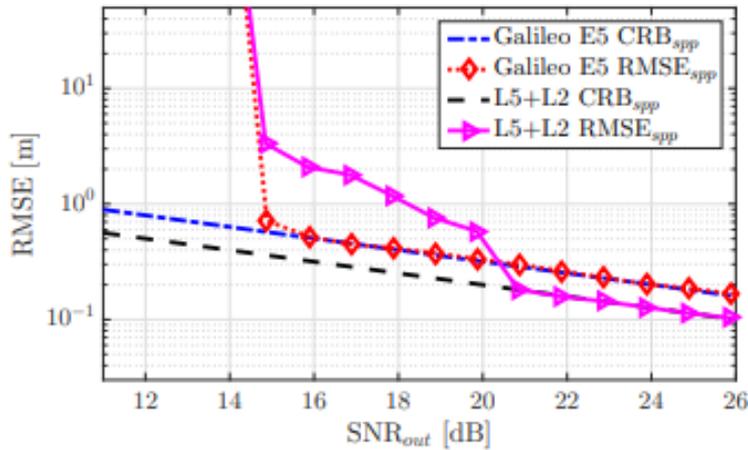
$$\begin{pmatrix} \hat{\mathbf{p}}_R \\ \widehat{c\delta t_r} \end{pmatrix} = \begin{pmatrix} \mathbf{p}^j \\ 0 \end{pmatrix} + (\mathbf{H}^T \mathbf{W} \mathbf{H})^{-1} \mathbf{H}^T \mathbf{W} \mathbf{y}$$

2-Theoretical Limits: GNSS SPP Solution

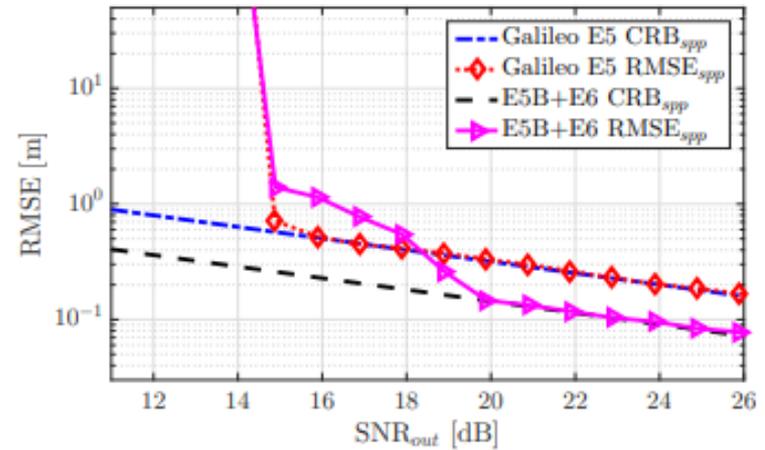


“Compact CRB for Delay, Doppler and Phase Estimation – Application to GNSS SPP & RTK Performance Characterization”, **IET Radar, Sonar & Navigation**, vol. 14, no. 10, pp. 1537-1549, September 2020.

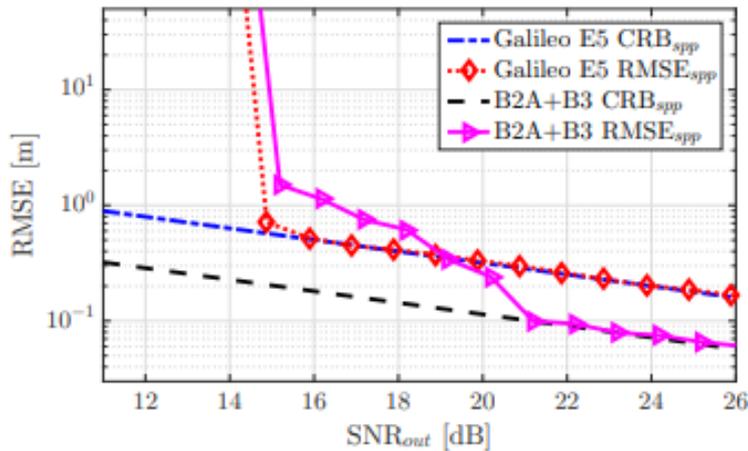
2-Theoretical Limits: GNSS SPP Solution



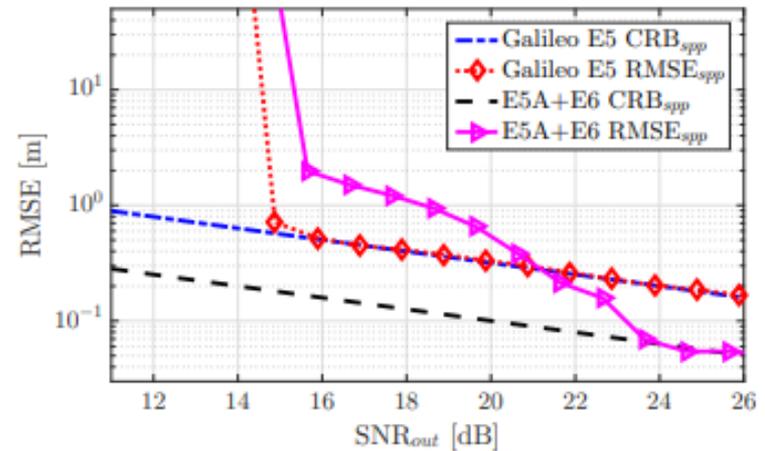
(b)



(c)

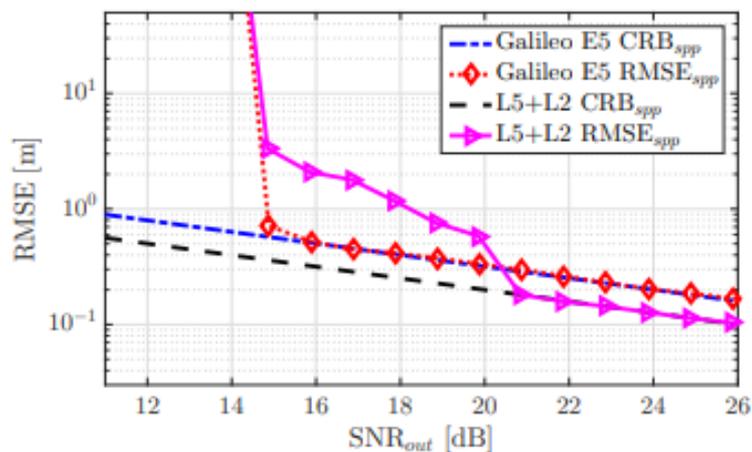


(d)

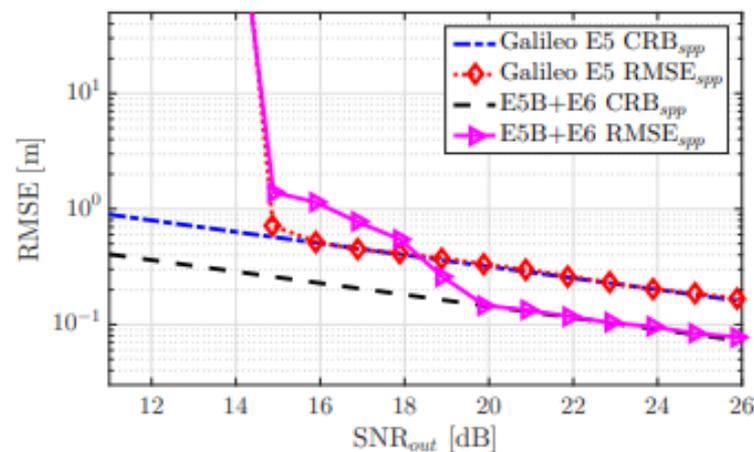


(e)

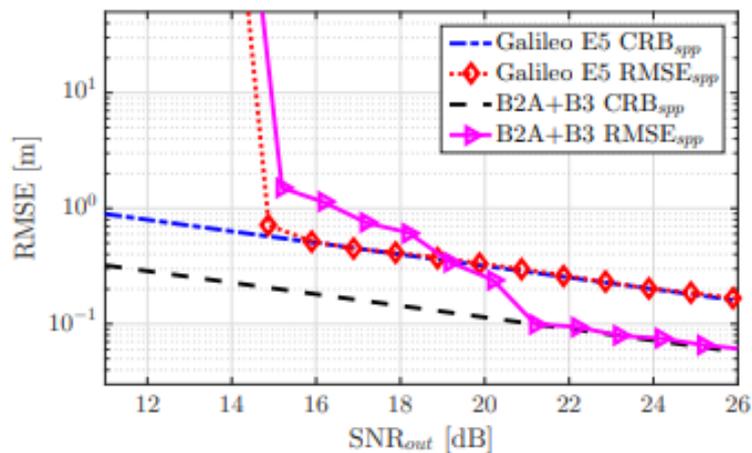
2-Theoretical Limits: GNSS SPP Solution



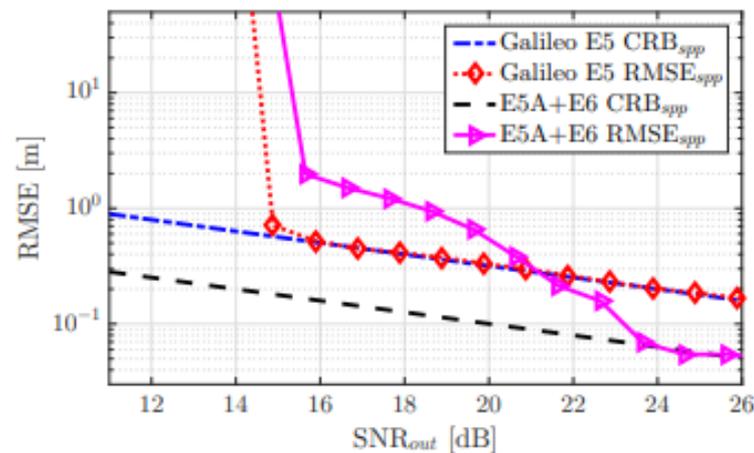
(b)



(c)



(d)



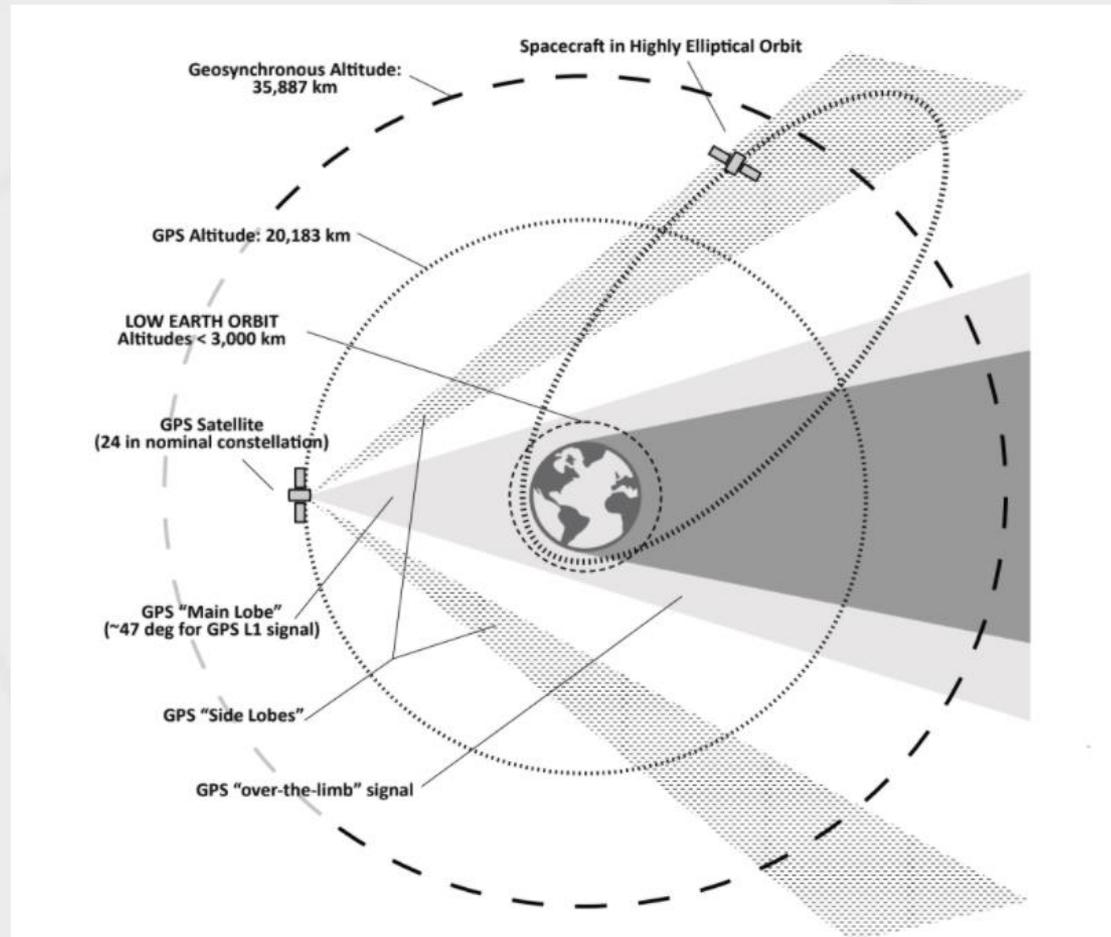
(e)

Conclusions of Section 2.

- **Derivation of CRB for Band limited signals. The latter CRB is particularly useful because it is expressed only from the signal samples.**
- **Evaluation of the time-delay and phases estimation of the GNSS Signals and GNSS Meta-signals.**
- **Evaluation of the SPP solution of the GNSS Signals and GNSS Meta-signals.**
- **Large Bandwidth GNSS Meta-Signals can have possible false locks due to high secondary correlation peaks. This issue can degraded the time-delay estimation performance. Evaluate the threshold through the MLE is required.**
- **RTK Theoretical Limits – Collaboration with the DLR (Daniel Medina)**
 - **“Compact CRB for Delay, Doppler and Phase Estimation – Application to GNSS SPP & RTK Performance Characterization”, IET Radar, Sonar & Navigation, vol. 14, no. 10, pp. 1537-1549, September 2020.**
 - **“Positioning Performance Limits of GNSS Meta-Signals and HO-BOC Signals”, Sensors, 20 (12), 3586, June 2020.**

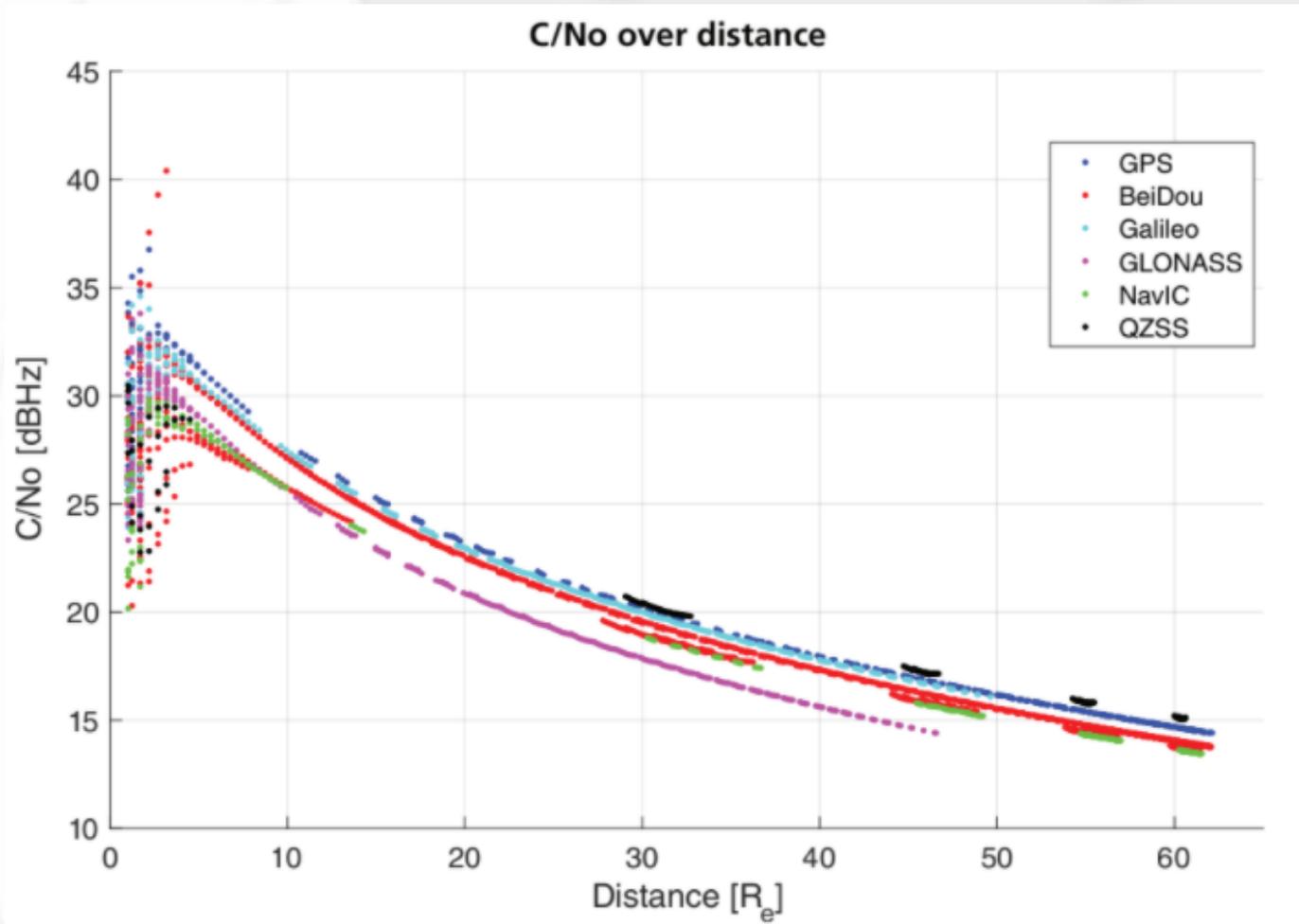
3-Theoretical Limits: Space Applications

- Space missions:
Launch, orbits
- Orbits: LEO, GEO, HEO, LTO
- Orbital parameters:
Acceleration!
- Receivers require a
**minimum Carrier-noise
density ratio C/N_0**



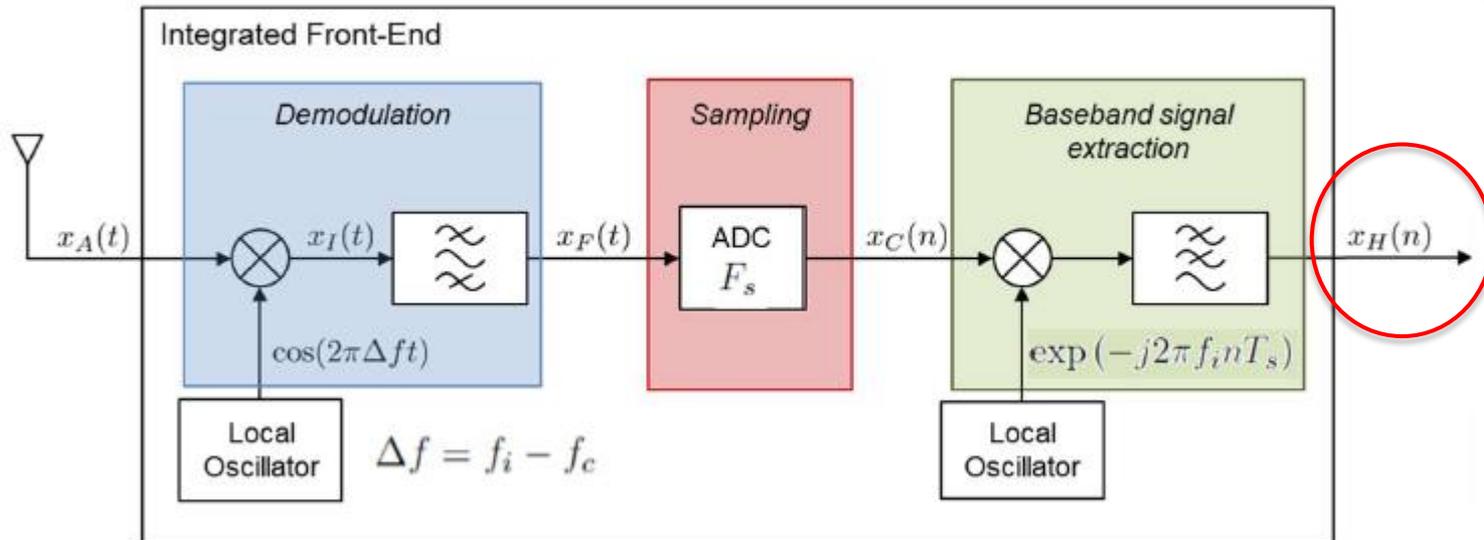
W. Enderle et al. Space Service Volume Booklet: The Interoperable Global Navigation Satellite Systems Space Service Volume. 2018

3-Theoretical Limits: Space Applications



Distance of 60 R_E is approximately in Lunar orbit / This gives most restricting case: 15 dB-Hz

3-Theoretical Limits: Space Applications



$$x(t) = x_A(t) e^{-j2\pi f_c t} = \alpha a(t; \eta) + n(t),$$

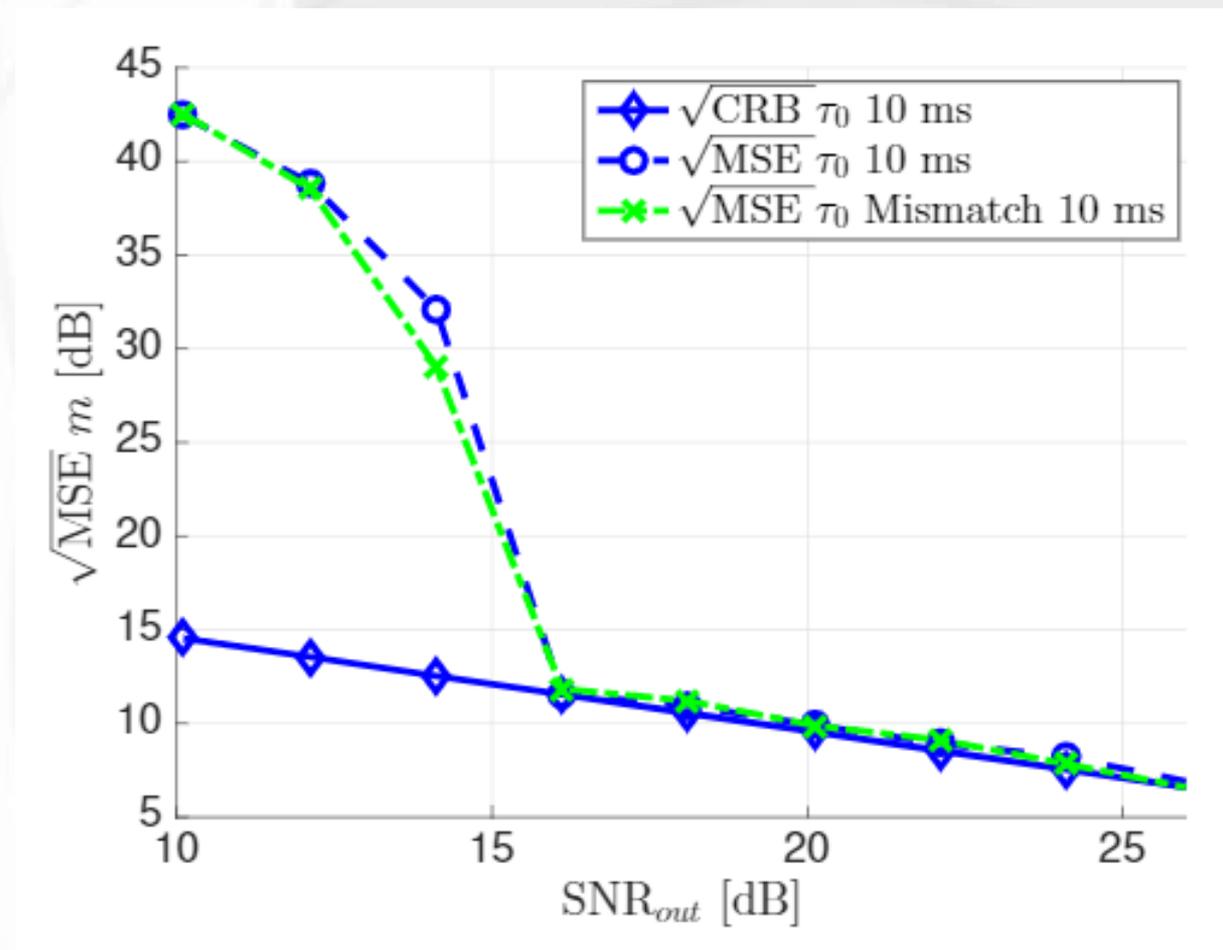
$$a(t; \eta) = e^{-j2\pi f_c (b(t-\tau) + d(t-\tau)^2)} s((1-b)(t-\tau))$$

$$\eta = [\tau, b, d]$$

$$d = a/2c$$

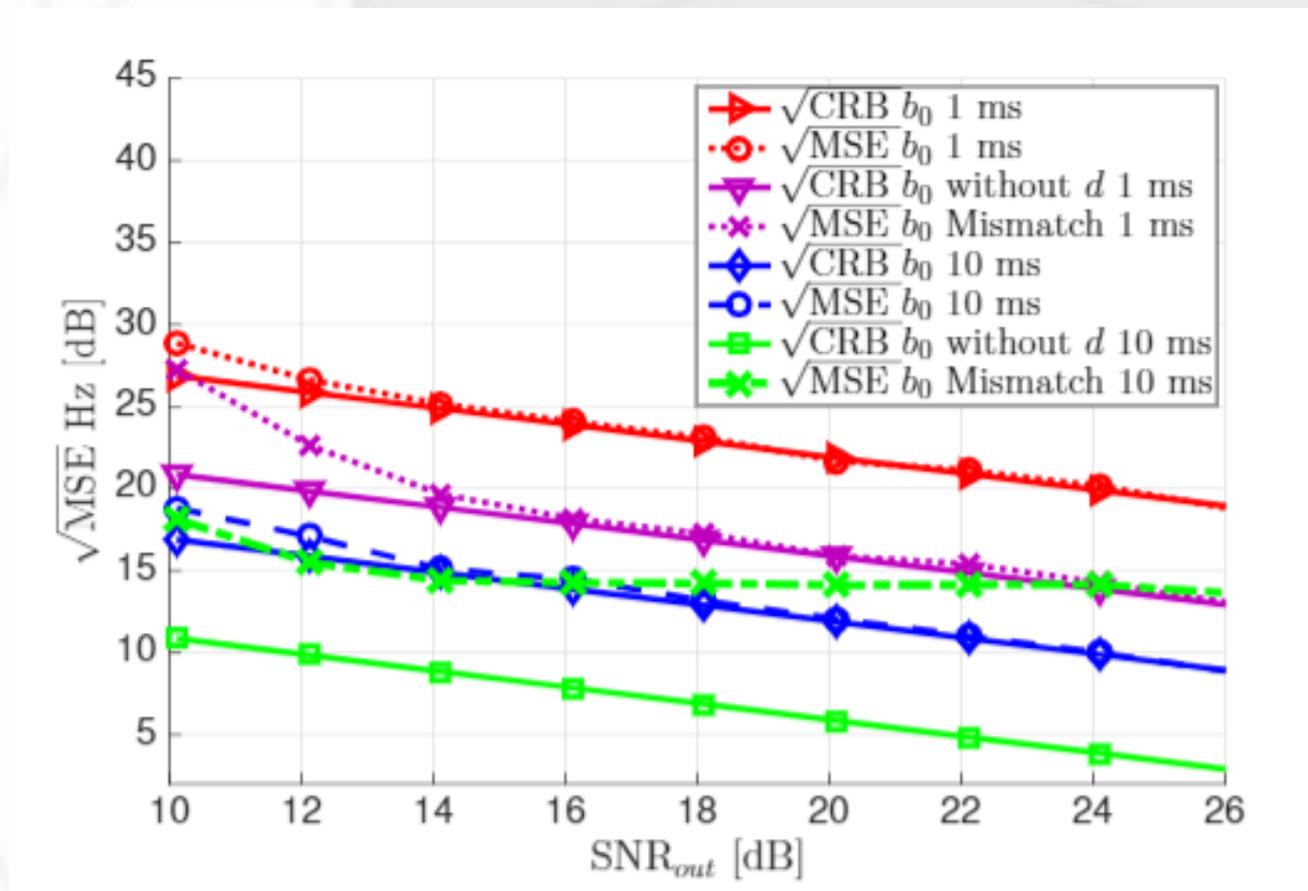
3-Theoretical Limits: Space Applications

Delay Estimation



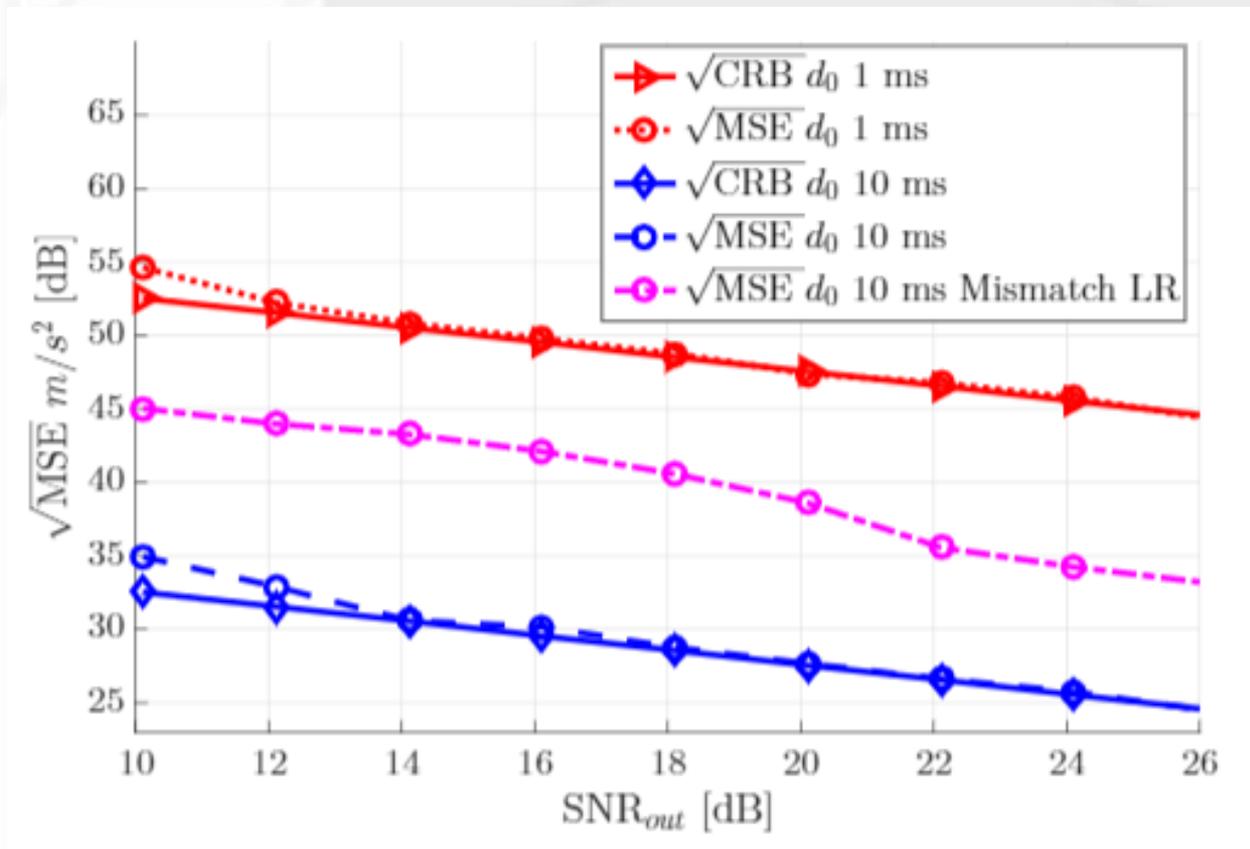
3-Theoretical Limits: Space Applications

Doppler Estimation

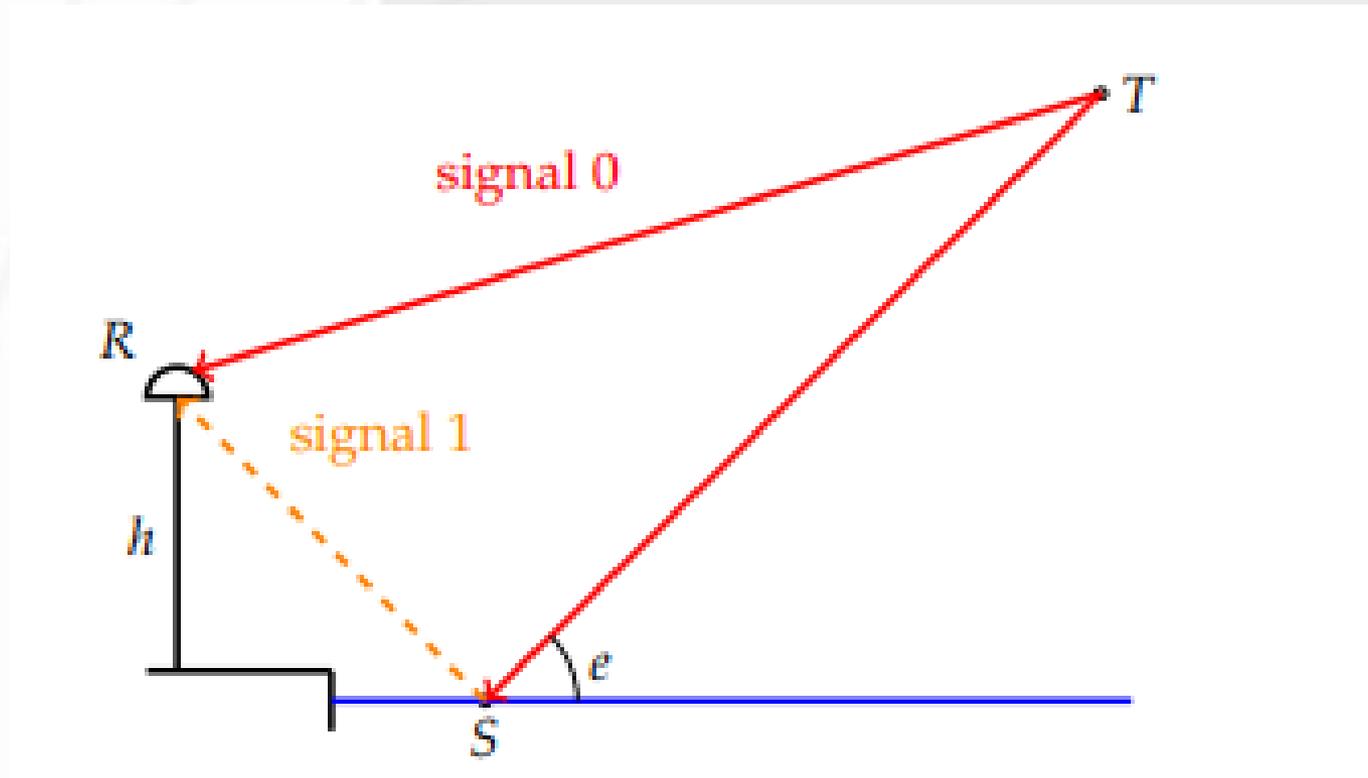


3-Theoretical Limits: Space Applications

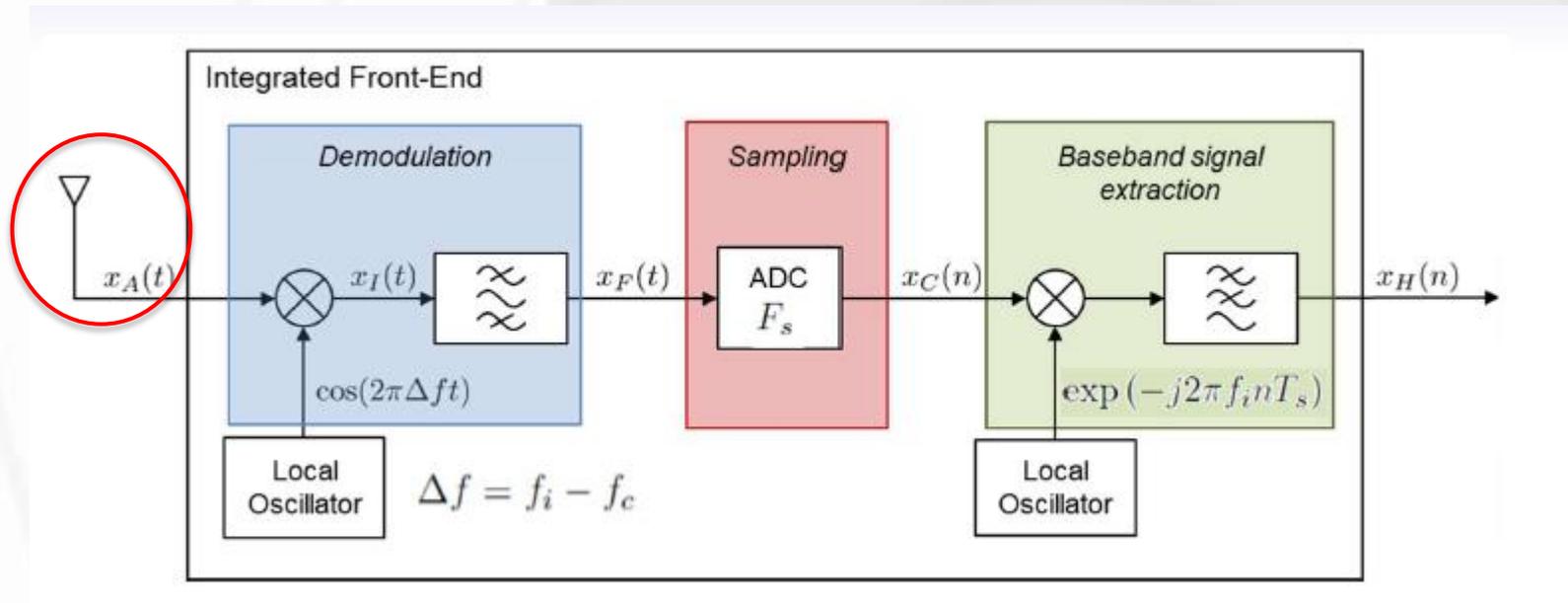
Acceleration Estimation



4-Theoretical Limits: Multipath



4-Theoretical Limits: Multipath

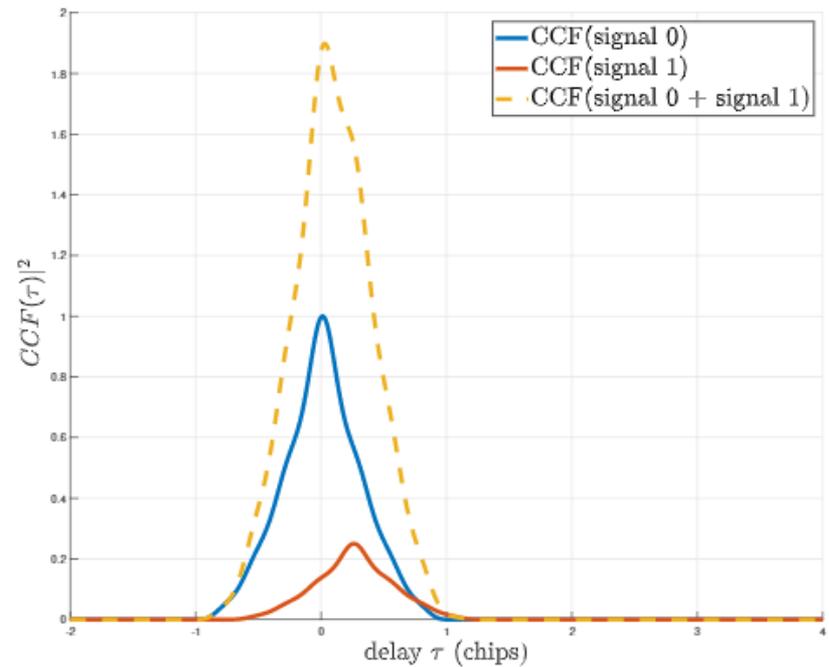
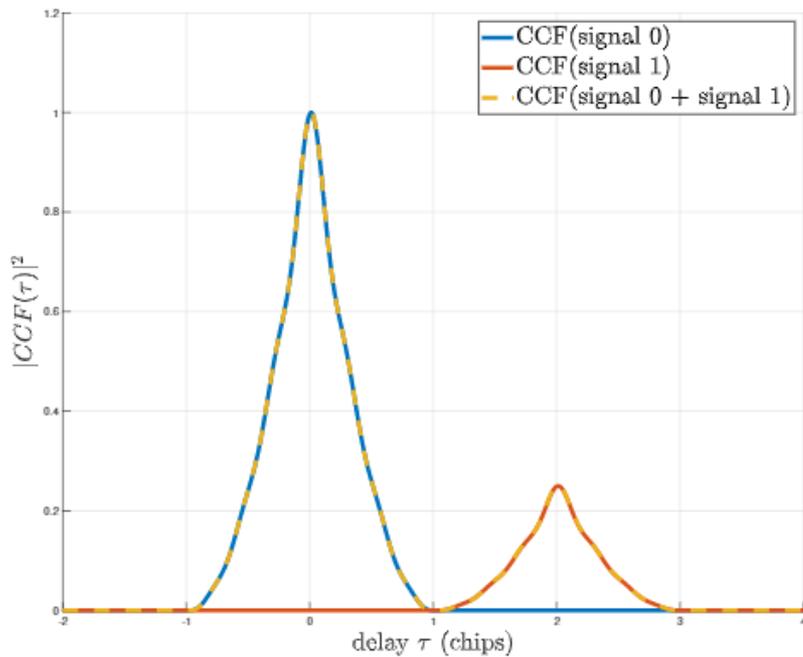


$$x_R(t) = d_R(t; \eta_0, \rho_0, \phi_{R,0}) + d_R(t; \eta_1, \rho_1, \phi_{R,1}) + w_R(t),$$

$$d_R(t; \eta_i, \rho_i, \phi_{R,i}) = \rho_i e^{j\phi_{R,i}} s((1 - b_i)(t - \tau_i)) e^{j\omega_c(1-b_i)t} e^{-j\omega_c\tau_i},$$

$$\mathbf{x} = \mathbf{A}(\eta_0, \eta_1) \boldsymbol{\alpha} + \mathbf{w}, \quad \mathbf{w} \sim \mathcal{CN}(0, \sigma_n^2 \mathbf{I}_N),$$

4-Theoretical Limits: Multipath



4-Theoretical Limits: Multipath

