On the Impact of Phase Noise on Beamforming Performance for mmWave Massive MIMO Systems

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- Contributions
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### Research context

Study of the hardware impairment effects on MU-MIMO systems :

- At the Base Station level : Beamforming Gain, Array Factor
- Focus on the Phase Noise in our study
  - Created in the RF chains : more particularly in the PLL/LO.
  - Different MIMO BS configurations : Independent or Distributed RF chains (eg. Hybrid Beamforming).



# Contributions

- New analytical bounds for the asymptotic Array Factor (AF) MSE under Gaussian Phase Noise (PN) and asymptotic Gain Loss (GL) under Gaussian PN.
- Statistical study for the underlying probability distributions of the GL and effective beam steering direction.

# System model



Figure: RF chains distribution scenarios

**ILOA** : Independent Local Oscillator Architecture **DLOA** : Distributed Local Oscillator Architecture

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- Many PN models exist : Wiener process, Ornstein-Uhlenbeck process, Gaussian process.
- It has been shown that the Wiener process could be approximated by a Gaussian model for sub-THz bands :<sup>1</sup> and<sup>2</sup>
- Different model amongst the ILOA and DLOA scenarios

<sup>1</sup>Simon Bicais and Jean-Baptiste Dore. "Phase Noise Model Selection for Sub-THz Communications". In: 2019 IEEE Global Communications Conference (GLOBECOM). 2019, pp. 1–6.

<sup>2</sup>Majed Saad et al. "MIMO techniques for wireless terabits systems under Sub-THz channel with RF impairments". In: 2020 IEEE International Conference on Communications Workshops, ICC Workshops 2020 - Proceedings=(2020).

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# System model

- MIMO scenario with  $M = \tilde{N}_b M_a$  BS antennas :  $\tilde{N}_b$  blocks of  $M_a$  antennas.
- ILOA : The phase shift associated to the  $k^{th}$  antenna of the BS antenna array is defined as :

$$\phi_k \sim \mathcal{N}\left(0, \sigma_{\phi}^2\right), \forall k \in \llbracket 1, M \rrbracket$$
(1)

• DLOA : The phase shift associated to the  $n^{th}$  block of antennas is defined as :

$$\phi_n \sim \mathcal{N}\left(0, \sigma_{\phi}^2\right), \forall n \in \llbracket 1, \tilde{N}_b \rrbracket$$
 (2)

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- Study of the PN impact on the AF.
- AF without PN ( $\lambda/2$  inter-element spacing, ULA) :

$$AF(\theta) = \sum_{k=0}^{M-1} e^{jk\pi(\cos(\theta) - \cos(\phi_0))}$$
(3)

• AF in the ILOA scenario :

$$AF(\theta)_{\phi} = \sum_{k=0}^{M-1} e^{j[k\pi(\cos(\theta) - \cos(\phi_0)) + \phi_k]}$$
(4)

• AF in the DLOA scenario :

$$AF(\theta)_{\phi} = \sum_{n=0}^{\tilde{N}_{b}-1} e^{j\phi_{n}} \sum_{k=nM_{a}}^{(n+1)M_{a}-1} e^{jk\pi(\cos(\theta)-\cos(\phi_{0}))}$$
(5)

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• Beamforming gain (without noise) :

$$G = \max_{\theta} \left\{ |AF(\theta)| \right\} = M \tag{6}$$

• Beamforming gain (ILOA scenario) :

$$G_{\phi} = \max_{\theta} \left\{ \left| \sum_{k=0}^{M-1} e^{j[k\pi(\cos(\theta) - \cos(\phi_0)) + \phi_k]} \right| \right\}$$
(7)

• Beamforming gain (DLOA scenario) :

$$G_{\phi} = \max_{\theta} \left\{ \left| \sum_{n=0}^{\tilde{N}_{b}-1} e^{j\phi_{n}} \sum_{k=nM_{a}}^{(n+1)M_{a}-1} e^{jk\pi(\cos(\theta) - \cos(\phi_{0}))} \right| \right\}$$
(8)

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Figure: PN impact on the AF

Two main effects : Gain Loss and Beam Squint

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- Different metrics : AF MSE, GL, and effective beam steering direction  $\phi_{eff}.$
- AF MSE :

$$MSE = \frac{1}{2\pi} \int_{\theta=0}^{2\pi} |AF(\theta)_{\phi} - AF(\theta)|^2 \,\mathrm{d}\theta \tag{9}$$

• GL :

$$\Delta G = \left| \frac{AF(\phi_0)_{\phi}}{AF(\phi_0)} \right| \tag{10}$$

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• Effective beam steering direction :

$$\phi_{eff} = \arg \max_{\theta} \left\{ |AF(\theta)_{\phi}| \right\}$$

$$= \arg \max_{\theta} \left\{ \left| \sum_{k=0}^{M-1} e^{j[k\pi(\cos(\theta) - \cos(\phi_0)) + \phi_k]} \right| \right\}$$
(12)

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AF MSE bounds:

• ILOA AF MSE bound :

$$MSE \le 2M \left( 1 - \frac{1}{M} \sum_{k=0}^{M-1} \cos\left(\phi_k\right) \right)$$
(13)

• ILOA AF MSE asymptotic bound :

$$MSE \xrightarrow[M \to +\infty]{a.s.} 2M \left( 1 - \exp\left(-\frac{\sigma_{\phi}^2}{2}\right) \right)$$
(14)

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#### Figure: ILOA AF MSE

• Good convergence of the ILOA/DLOA AF MSE to the asymptotic bound :  $M \ge 8$  for the ILOA/DLOA.

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#### $\mathsf{PN}\xspace$ impact on the $\mathsf{GL}\xspace$ :

• ILOA GL

$$\Delta G = \left| \frac{1}{M} \sum_{k=0}^{M-1} e^{j\phi_k} \right| \tag{15}$$

• DLOA GL $\Delta G = \left| \frac{1}{\tilde{N}_b} \sum_{n=0}^{\tilde{N}_b - 1} e^{j\phi_n} \right|$ (16)

• ILOA/DLOA asymptotic GL in dB :

$$\Delta G_{dB} \xrightarrow[M \to +\infty]{a.s.} \Delta G_{dB}^{as} = \frac{5\sigma_{\phi}^2}{\ln(10)}$$
(17)

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#### Figure: ILOA/DLOA GL

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- Stochastic modelling of the GL and the effective beam steering direction
- GL :

$$\Delta G = \left| \frac{AF(\phi_0)_{\phi}}{AF(\phi_0)} \right| \tag{18}$$

• Effective beam steering direction :

$$\phi_{eff} = \arg \max_{\theta} \left\{ |AF(\theta)_{\phi}| \right\}$$

$$= \arg \max_{\theta} \left\{ \left| \sum_{k=0}^{M-1} e^{j[k\pi(\cos(\theta) - \cos(\phi_0)) + \phi_k]} \right| \right\}$$
(20)

 Theoretical derivation of the pdfs. : Extremely hard and cumbersome because of the absolute value (not bijective) ⇒ Use of statistical tests.

#### • Chosen models :

$$\Delta G_{dB} \sim \Gamma \left( k_{\Delta G_{dB}}(M), \theta_{\Delta G_{dB}}(M) \right)$$

$$\phi_{eff} \sim \mathcal{N} \left( \mu_{\phi_{eff}}(M), \sigma_{\phi_{eff}}^2(M) \right)$$
(21)
(22)





Figure: 100.000  $\phi_{eff}$  realisations,

Figure: 100.000  $\Delta G_{dB}$  realisations, (M = 32)

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• Asymptotic behaviours of the distribution models :

$$\left(\mathbb{E}\left[\Delta G_{dB}\right] = k\theta, \mathbb{V}\left[\Delta G_{dB}\right] = k\theta^2\right) \underset{M \to +\infty}{\longrightarrow} (\Delta G_{dB}^{as}, 0)$$
(23)

and

$$\left(\mathbb{E}\left[\phi_{eff}\right] = \mu_{\phi_{eff}}, \mathbb{V}\left[\phi_{eff}\right] = \sigma_{\phi_{eff}}^2\right) \xrightarrow[M \to +\infty]{} (\phi_0, 0)$$
(24)

- In other words, we show in simulation that the distributions asymptotically converge to Dirac distributions.
- Dirac distribution means that the metrics (effective beam steering direction and GL) become deterministic.

- $M \ge 32$  is a good approximation for  $\phi_{eff}$  distribution convergence.
- $M \ge 256$  is a good approximation for  $\Delta G_{dB}$  distribution convergence



Figure: Normal distribution asymptotic convergence



Figure: Gamma distribution asymptotic convergence

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# Conclusion and future work

- Physical implications :
  - $\bullet\,$  Asymptotic convergence of the effective beam steering direction to  $\phi_0$ 
    - Cancellation of the beam squint : Due to an averaging phenomenon.
    - Application to MU-MIMO systems : Inter-User interferences reduction.
- Easily transposable to the DLOA and UPA scenarios.
- Contributions :
  - New analytical bounds for the asymptotic AF MSE under Gaussian PN and asymptotic GL under Gaussian PN.
  - Statistical study for the underlying probability distributions of the GL and effective beam steering direction.
- Future work : Establish analytical bounds for the generic AF definition and Gaussian PN.

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# Have you got any question ?

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