

Iterative-Interpolated DFT for Synchronphasor Estimation: a Single Algorithm for P and M-class compliant PMUs

*École Polytechnique Fédérale de Lausanne (EPFL)
Distributed Electrical Systems Laboratory (DESL)
Asja Derviškadić, Paolo Romano and Mario Paolone*



ÉCOLE POLYTECHNIQUE
FÉDÉRALE DE LAUSANNE

Outline

- Motivations
- Problem statement
- The Interpolated DFT for \cos^α windows
- The iterative Interpolated DFT
- Performance assessment
- Computational complexity

Motivations

P and M-class compliant PMU (IEEE Std. C37.118)

- The IEEE Std. C37.118 defines two performance classes to which PMUs must comply with:



P-class

Protection → Latency



M-class

Measurement → Accuracy

- *What if we had a single PMU capable of satisfying both the P and M-class PMU requirements at the same time?*



- **Lower cost:** the same PMU simultaneously supplies monitoring and protection functionalities
- **Higher measurement reliability:** protection and control applications are not degraded by disturbances (interharmonics)

Motivations

The Out-of-band Interference (OOBI) test

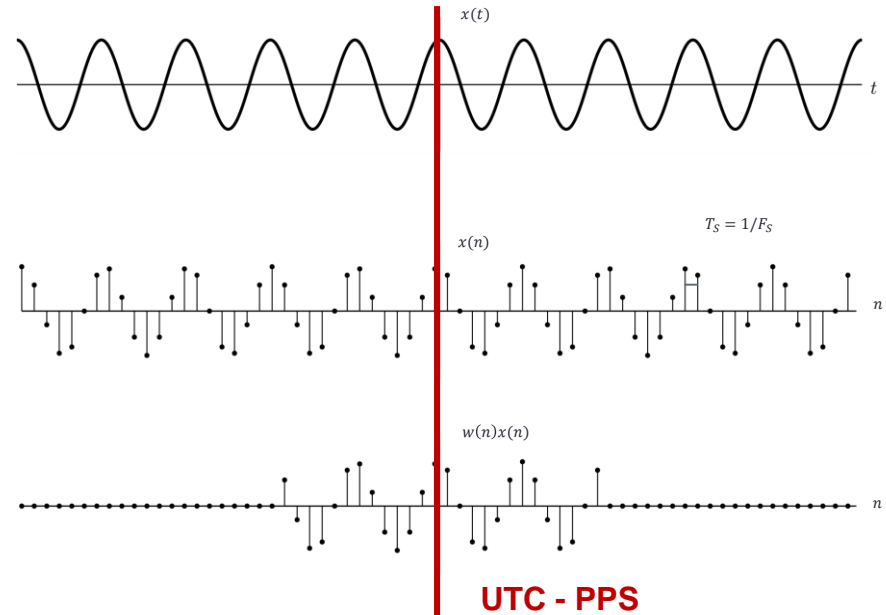
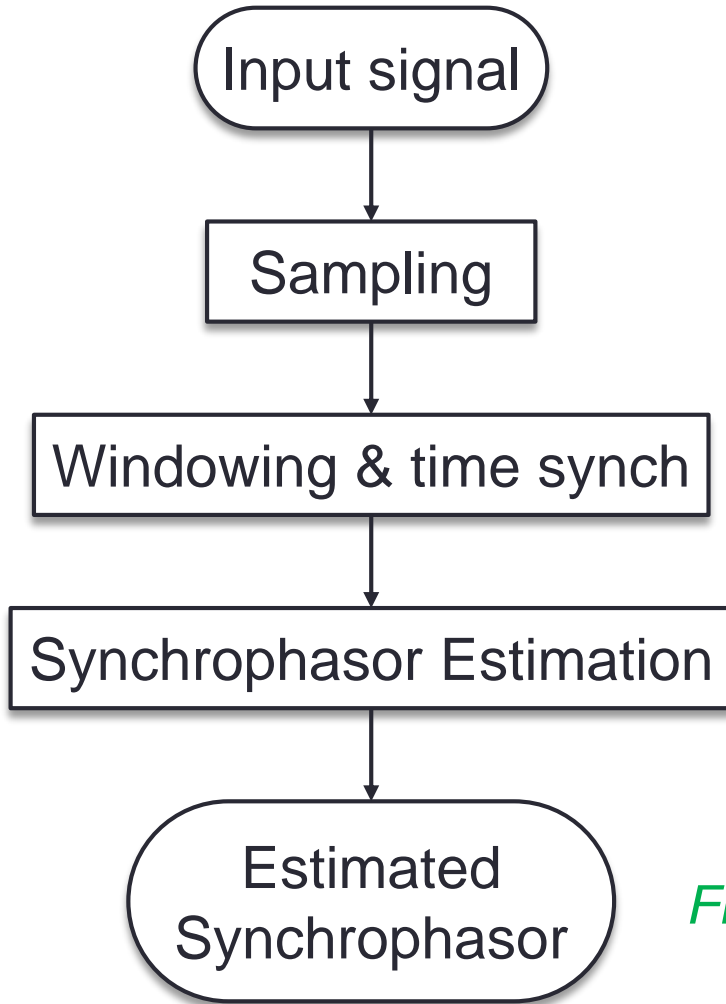
		P-class	M-class
Static conditions	Signal Frequency	✓	✓
	Harmonic Distortion	✓	✓
	Out-Of-Band Interference	✗	✓
Dynamic conditions	Measurement Bandwidth	✓	✓
	Frequency Ramp	✓	✓
	Amplitude Phase Step	✓	✓

PMU capability to reject **interharmonics** close to the main tone:

- $A_i = 10\% \cdot A_0$
- $f_i \in [10 \text{ Hz}, f_N - F_R/2] \cup [f_n + F_R/2, 2 \cdot f_n]$
- $f_0/f_i \notin \mathbb{N}$
- $f_N = 50 \text{ Hz}$ (nominal frequency) $\rightarrow f_0 = [47.5, 50, 52.5] \text{ Hz}$
- $F_R = 50 \text{ fps}$ (PMU reporting rate) $\rightarrow f_i = [10:25 \text{ } 75:100] \text{ Hz}$

Problem statement

DFT-based Synchronphasor Estimation (SE) Algorithms



$$x(n) \rightarrow X(k) \rightarrow ?$$

Frequency f_0 , Amplitude A_0 and Phase φ_0

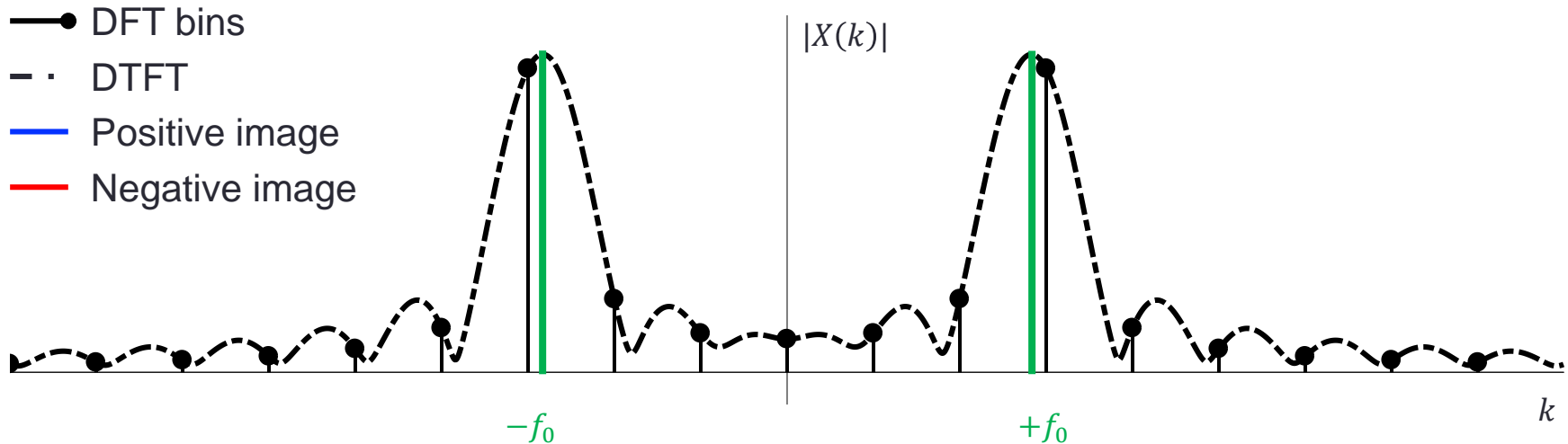
Problem statement

The Signal Frequency test

$$x(t) = A_0(t) \cos(2\pi f_0(t)t + \varphi_0)$$



$$X(k) = X_0^+(k) + X_0^-(k)$$



Find the **frequency** f_0 , **amplitude** A_0 and **phase** φ_0 of the **fundamental tone** of a signal

Problem statement

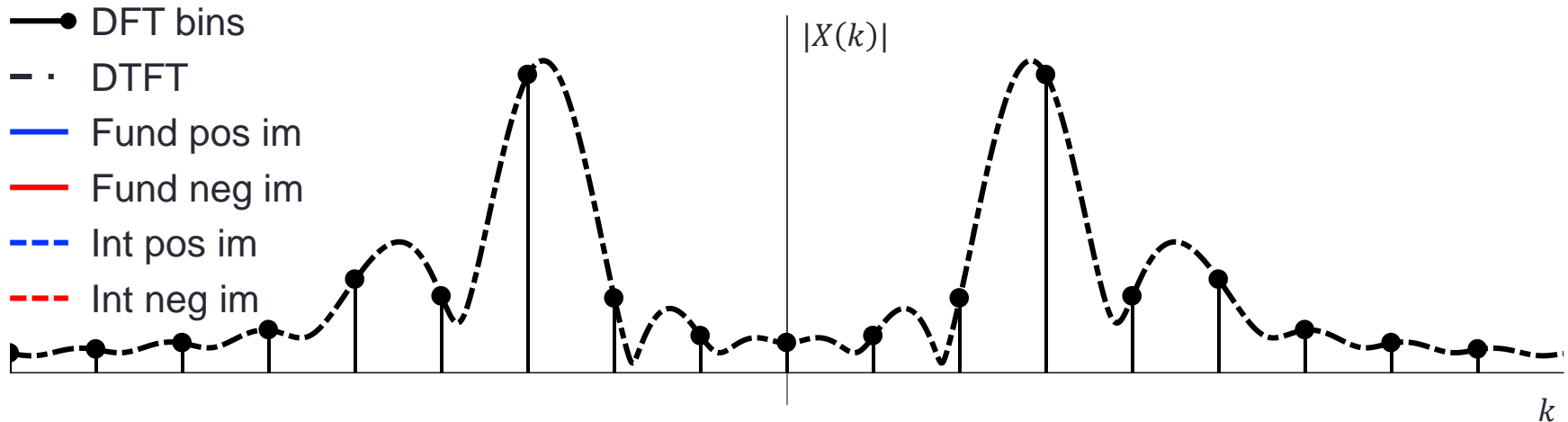
The Out-of-band Interference (OOBI) test

$$x(t) = A_0(t) \cos(2\pi f_0(t)t + \varphi_0) + A_i(t) \cos(2\pi f_i(t)t + \varphi_i)$$



$$X(k) = X_0^+(k) + X_0^-(k) + X_i^+(k) + X_i^-(k)$$

$$f_0/f_i \notin \mathbb{N}$$



Find the *frequency* f_0 , *amplitude* A_0 and *phase* φ_0 of the **fundamental tone** of a signal characterized by two tones, a fundamental and an interharmonic tone, both of unknown frequency amplitude and phase

The Interpolated DFT (IpDFT)

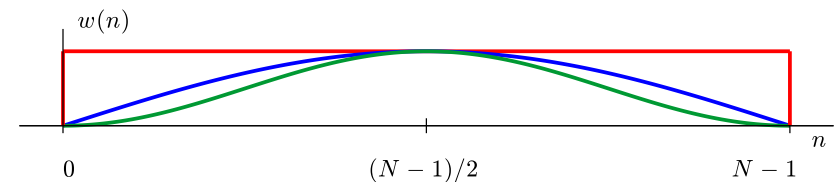
IpDFT problem solution for \cos^α window functions

The IpDFT is a technique to extract the parameters f_0 , A_0 and φ_0 of a sinusoidal waveform by interpolating the highest DFT bins of the signal spectrum. It mitigates the effects of **incoherent sampling** ($f_0/\Delta f \notin \mathbb{N}$):

- Applying special windowing functions → reduce **spectral leakage**

$$w_\alpha(n) = \sin^\alpha\left(\frac{\pi n}{N}\right)$$

$\alpha = 0$ → Rectangular



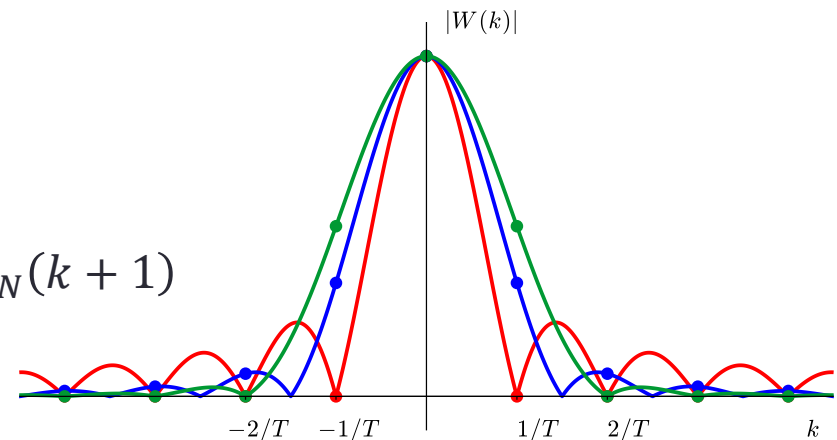
$$D_N(k) = e^{-j\pi k(N-1)/N} \frac{\sin(\pi k)}{\sin(\pi k/N)}$$

$\alpha = 2$ → Hanning (hann)

$$W_H(k) = -0.25 \cdot D_N(k-1) + 0.5 \cdot D_N(k) - 0.25 \cdot D_N(k+1)$$

$\alpha = 1$ → Cosine (cos)

$$W_C(k) = -0.5 \cdot j \cdot D_N(k-0.5) + 0.5 \cdot j \cdot D_N(k+0.5)$$



— rect — hann — cos

The Interpolated DFT (IpDFT)

IpDFT problem solution for \cos^α window functions

The IpDFT is a technique to extract the parameters f_0 , A_0 and φ_0 of a sinusoidal waveform by interpolating the highest DFT bins of the signal spectrum. It mitigates the effects of **incoherent sampling** ($f_0/\Delta f \notin \mathbb{N}$):

- Interpolating the highest DFT bins \rightarrow minimize **spectral sampling**

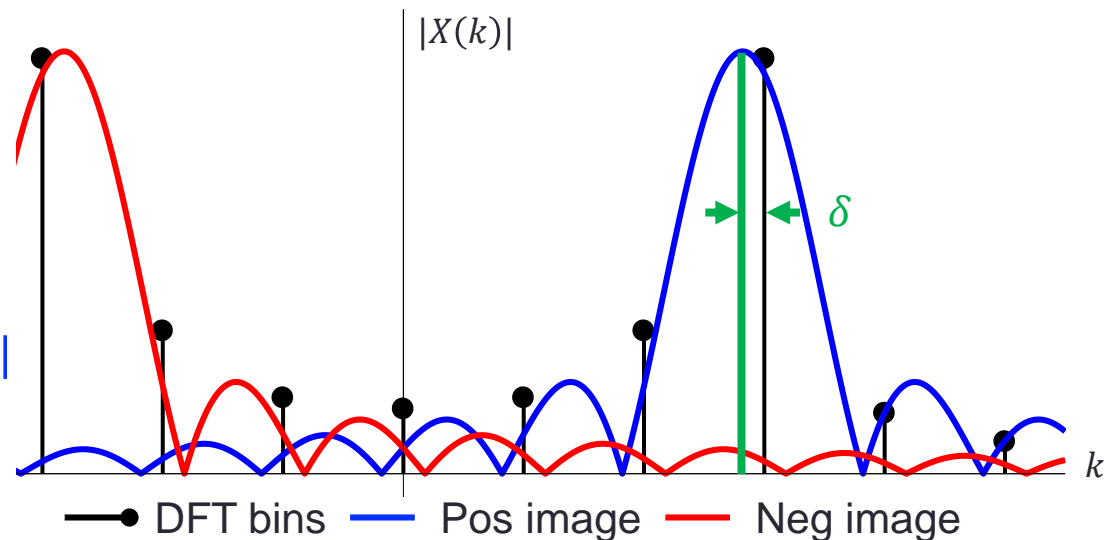
$$\delta = a \cdot \varepsilon \frac{|X(k_m + \varepsilon)| - |X(k_m - \varepsilon)|}{|X(k_m - \varepsilon)| + 2|X(k_m)| + |X(k_m + \varepsilon)|}, \quad a = 1.5 \text{ cos}, \quad a = 2 \text{ hann}$$

$$f_0 = (k_m + \delta)\Delta f$$

$$\varphi_0 = \angle X(k_m) - \pi\delta$$

$$A_{0C} = 4 \cdot |X(k_m)| \left| \frac{\delta^2 - 0.25}{\cos(\pi\delta)} \right|$$

$$A_{0H} = |X(k_m)| \left| \frac{\pi\delta}{\sin(\pi\delta)} \right| |\delta^2 - 1|$$



The Interpolated DFT (IpDFT)

IpDFT weaknesses

Assumptions behind the IpDFT

The input signal is characterized by time-invariant parameters

The sampling rate is higher than the highest signal's spectral component

The DFT bins used to perform the interpolation are only generated by the positive image of the tone under analysis

Possible solutions

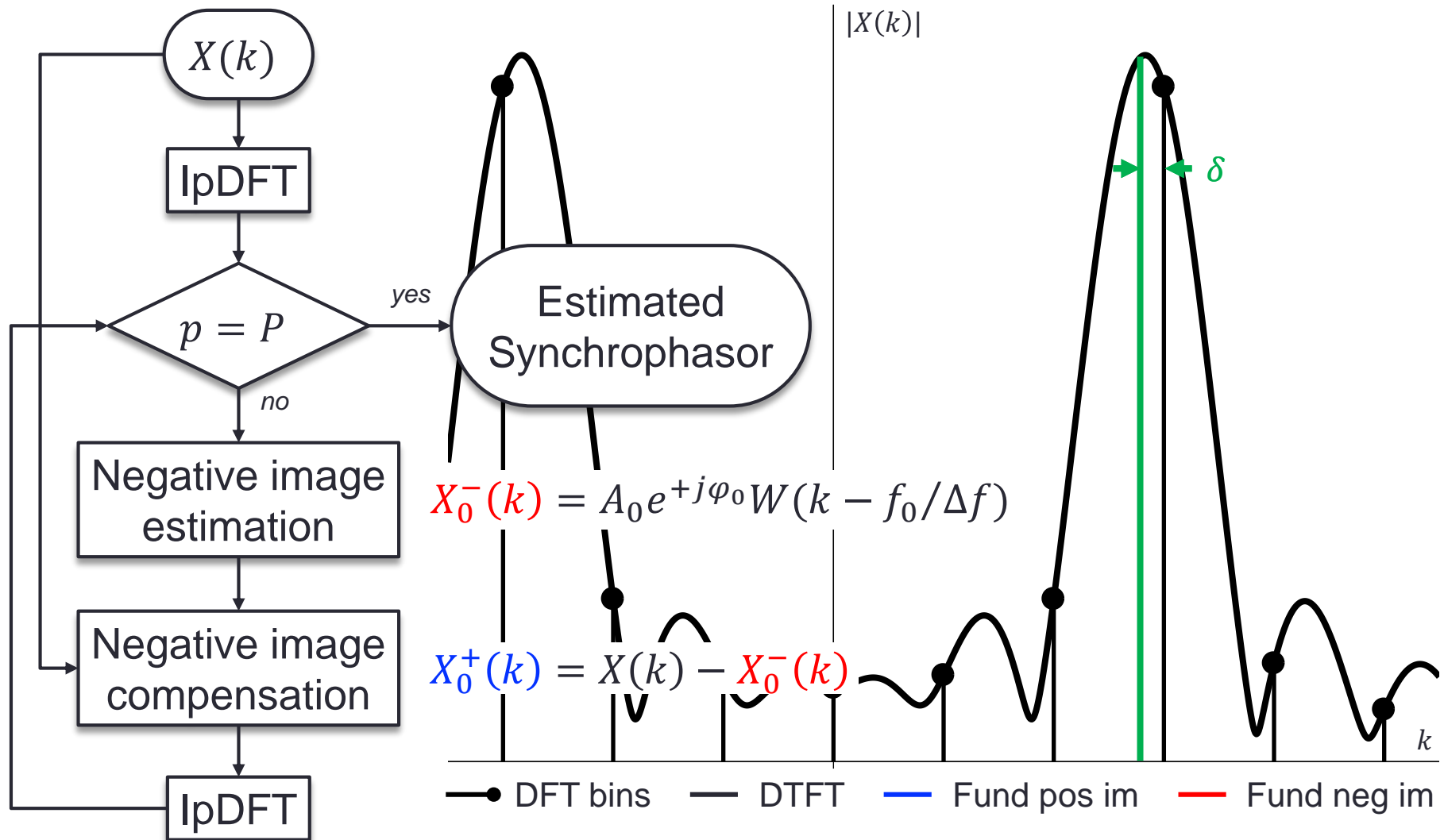
Window lengths containing few periods of a signal at the rated power system frequency

Sampling rate F_S in the order of tens of kHz

- Enhanced IpDFT (e-*IpDFT*) → Iterative compensation of the spectral interference produced by the main tone negative image
- **Iterative IpDFT (i-*IpDFT*)** → Iterative compensation of the spectral interference produced by the nearby tones

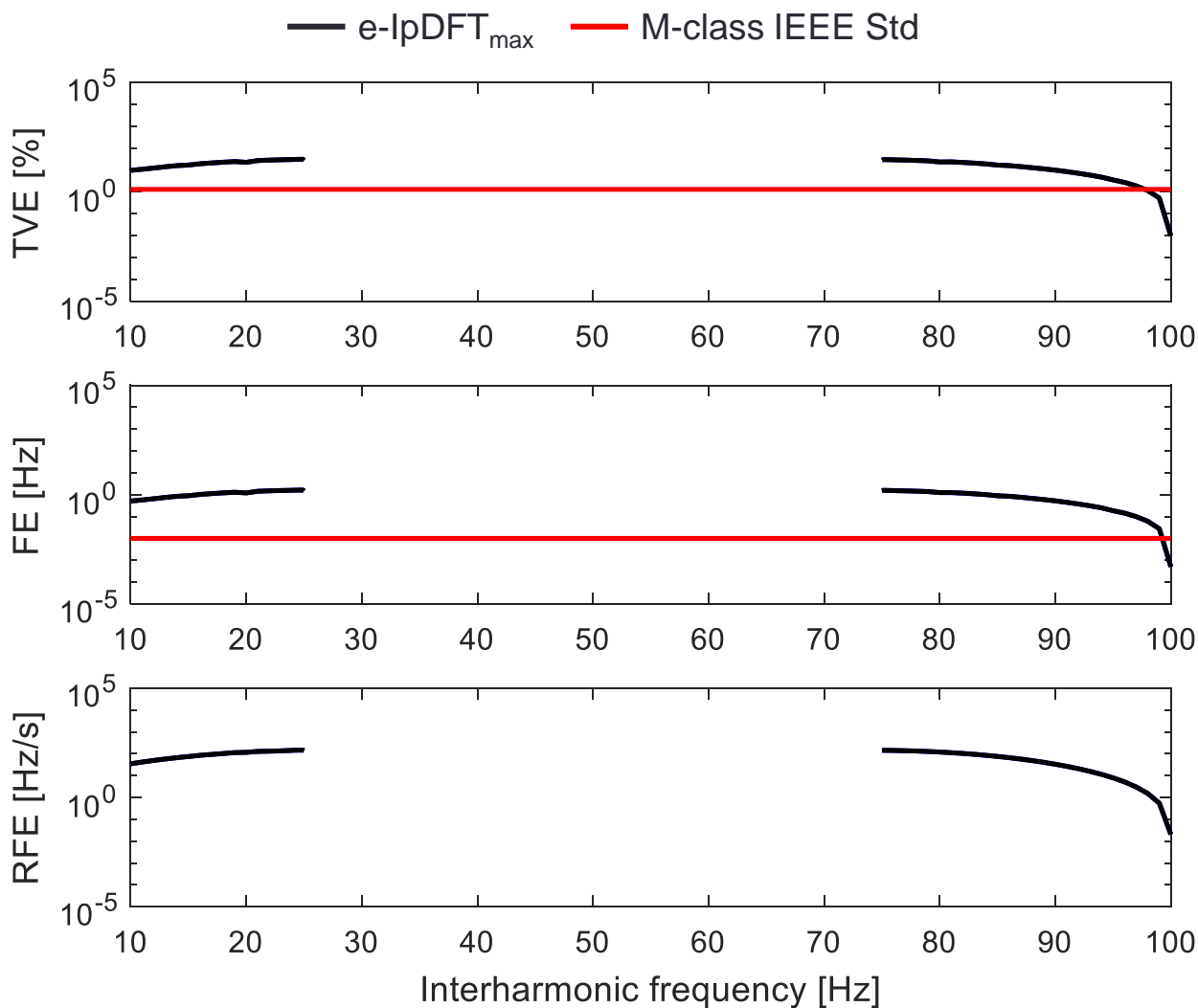
The enhanced-IpDFT (e-IpDFT)

Algorithm formulation



The enhanced-IpDFT (e-IpDFT)

The Out-Of-Band Interference test



Max Errors:

TVE

IEEE Std = 1.3%

e-IpDFT = 31%

FE

IEEE Std = 10 mHz

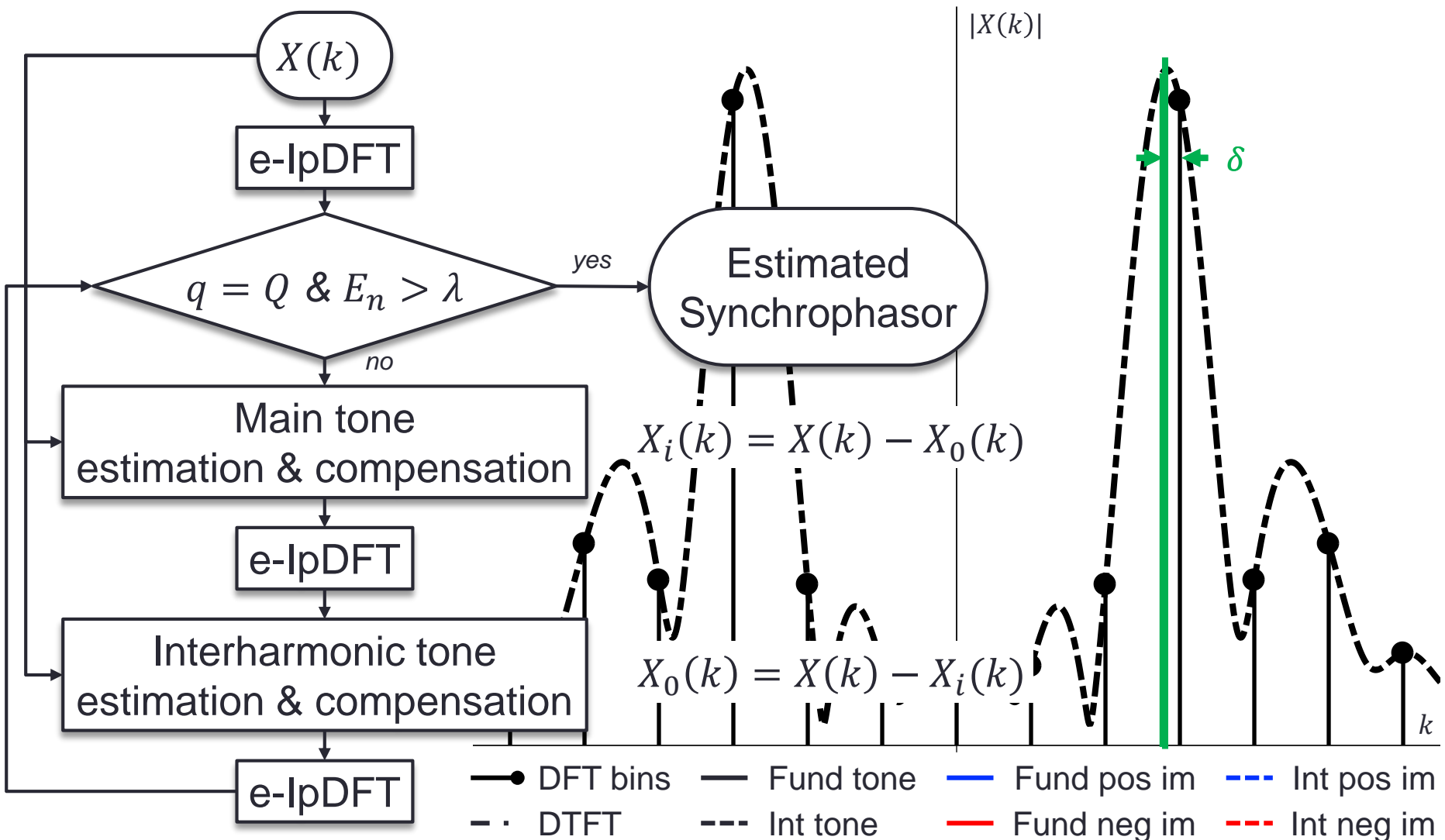
e-IpDFT = 1.6 Hz

RFE

e-IpDFT = 145 Hz/s

The iterative-lpDFT (i-lpDFT)

Algorithm formulation



The iterative-IpDFT (i-IpDFT)

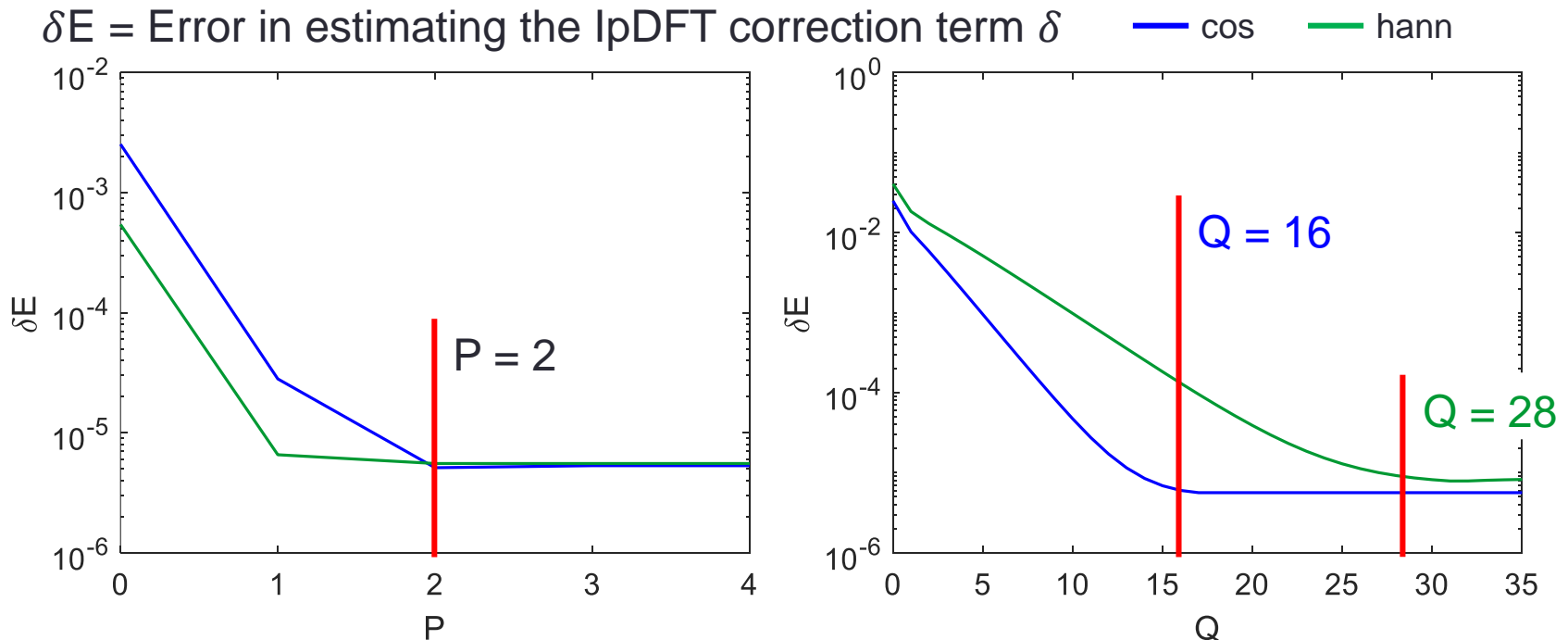
On the tuning of the number of iterations P and Q

P → # iterations compensation
negative image of the tone

Q → # iterations overall
procedure

e-IpDFT → $f_0 = 47.5$ Hz

i-IpDFT → $f_0 = 47.5$ Hz, $f_i = 20$ Hz

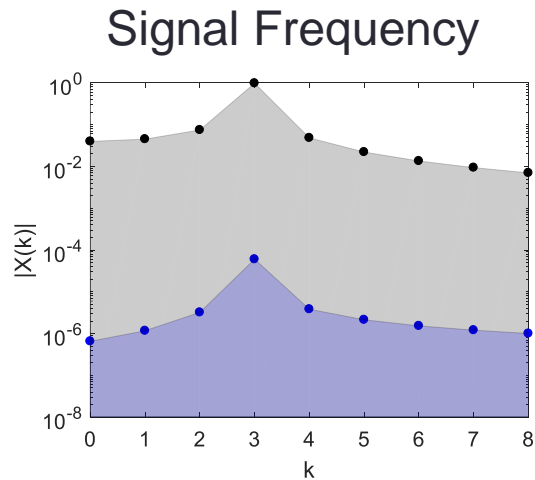


The iterative-lpDFT (i-lpDFT)

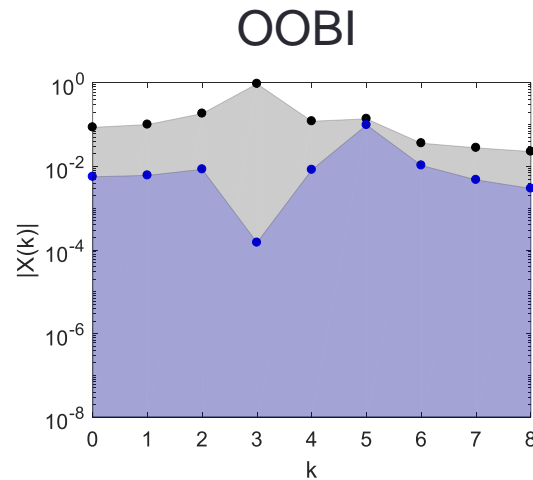
On the tuning of the threshold λ

$$E_n = \frac{E[X(k) - \hat{X}_0^0(k)]}{E[X(k)]} = \frac{\sum_{k=0}^K |X(k) - \hat{X}_0^0(k)|^2}{\sum_{k=0}^K |X(k)|^2} > \lambda$$

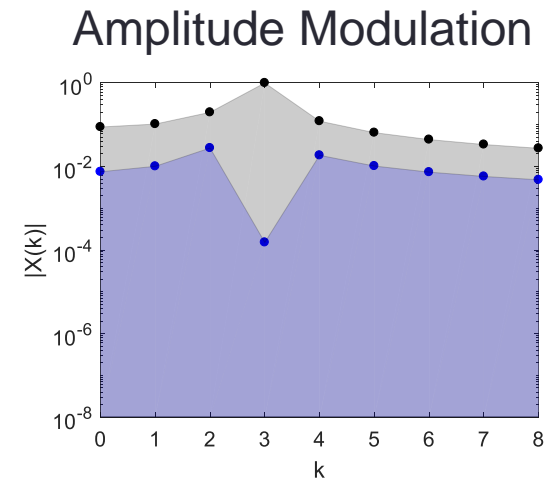
—●— $|X(k)|$ —●— $|X(k) - \hat{X}_0^0(k)|$



E_n low



E_n high

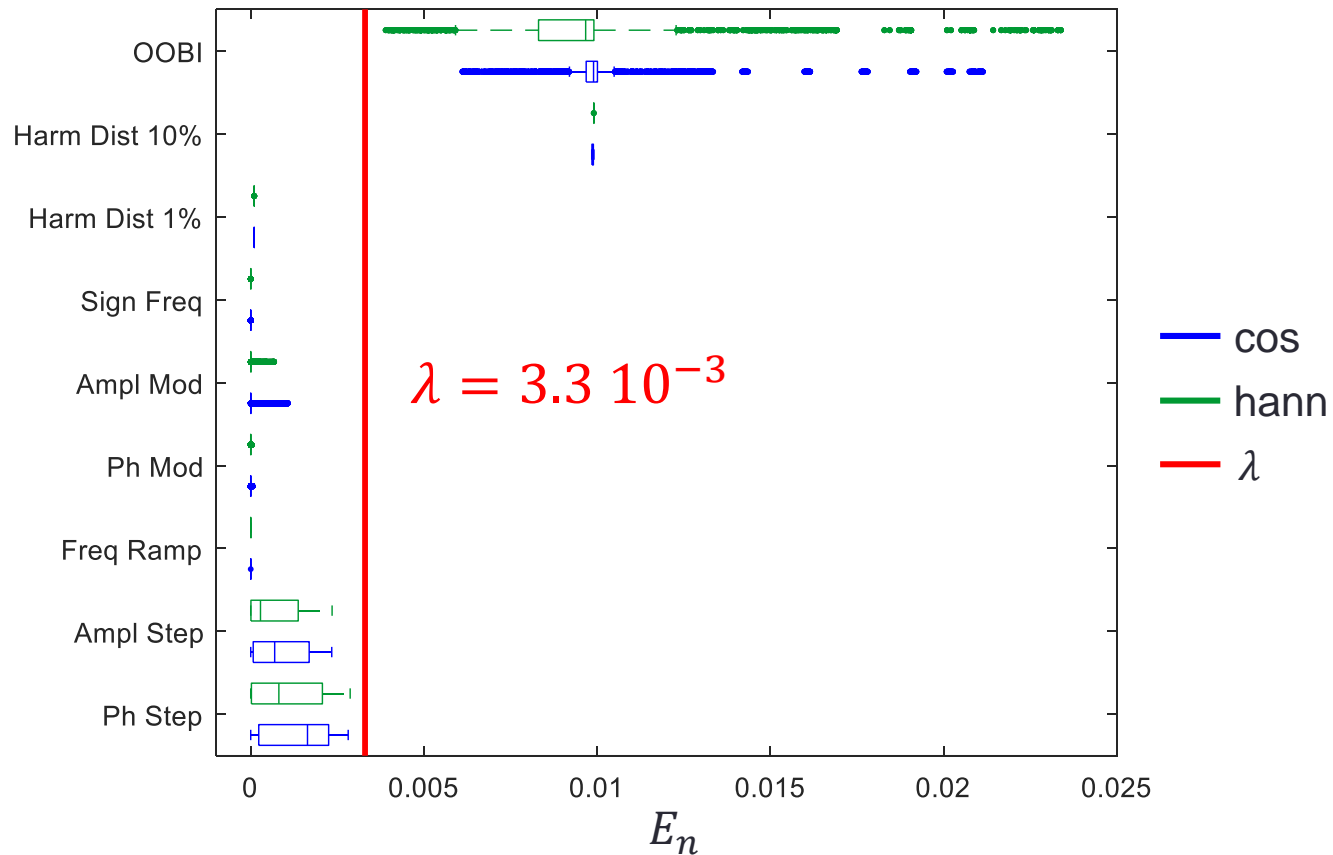


E_n low

The iterative-lpDFT (i-lpDFT)

On the tuning of the threshold λ

$$E_n = \frac{E[X(k) - \hat{X}_0^0(k)]}{E[X(k)]} = \frac{\sum_{k=0}^K |X(k) - \hat{X}_0^0(k)|^2}{\sum_{k=0}^K |X(k)|^2} > \lambda$$



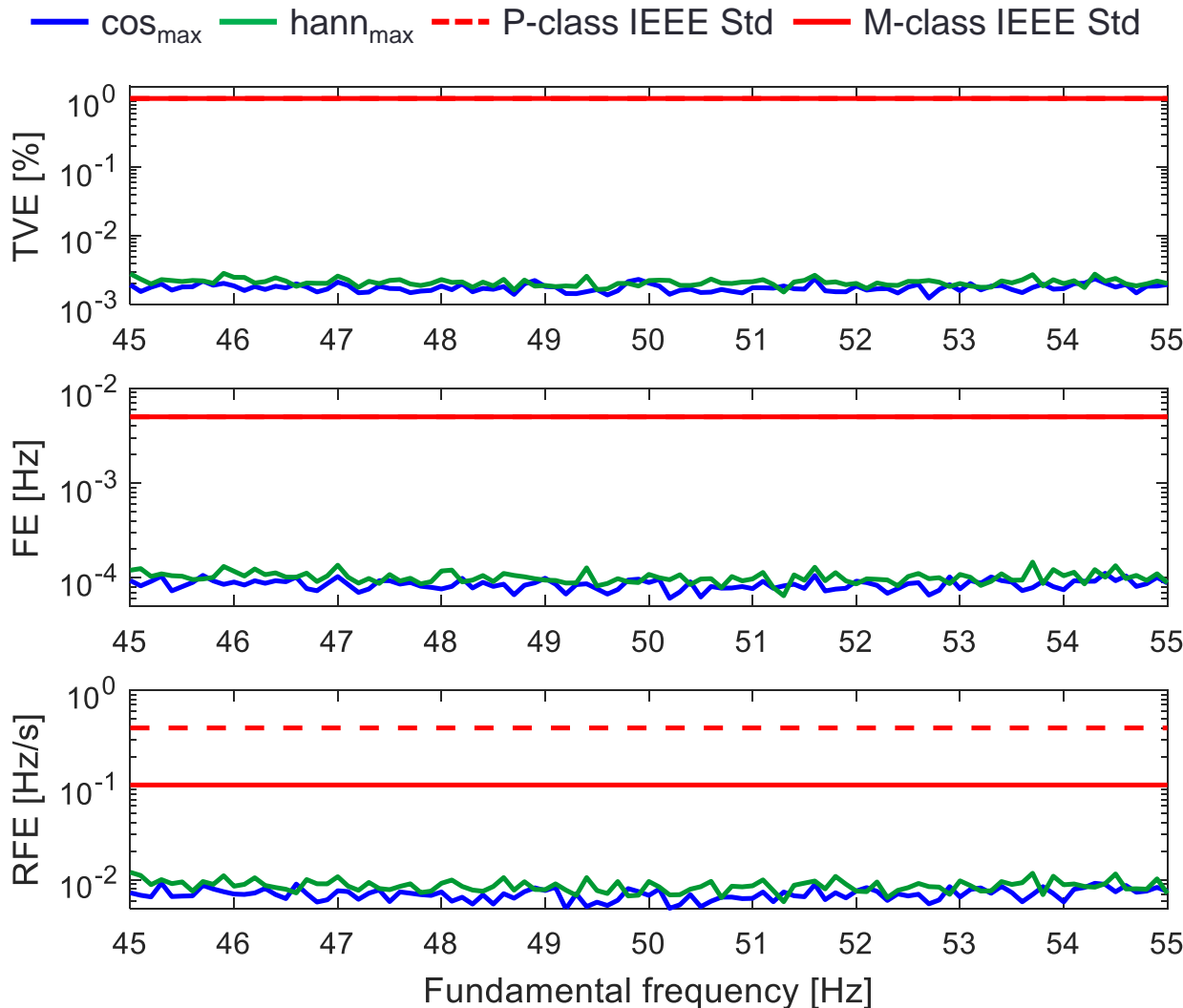
Performance Assessment

i-IpDFT Parameters

Parameters	Variable	Value
Nominal system frequency	f_0	50 Hz
Window length	T	$3 \cdot T_0 = 60$ ms
Sampling rate	F_S	50 kHz
PMU reporting rate	F_R	50 fps
# DFT bins	K	11
IpDFT interpolation points		3-points
# iterations	P	2
# iterations	Q	16 (cos) 28 (Hann)
Noise		80 dB

Performance Assessment

Static conditions – Signal Frequency



Max Errors:

TVE

P&M = 1%

cos = 0.002%

hann = 0.003%

FE

P&M = 5 mHz

cos = 0.1 mHz

hann = 0.1 mHz

RFE

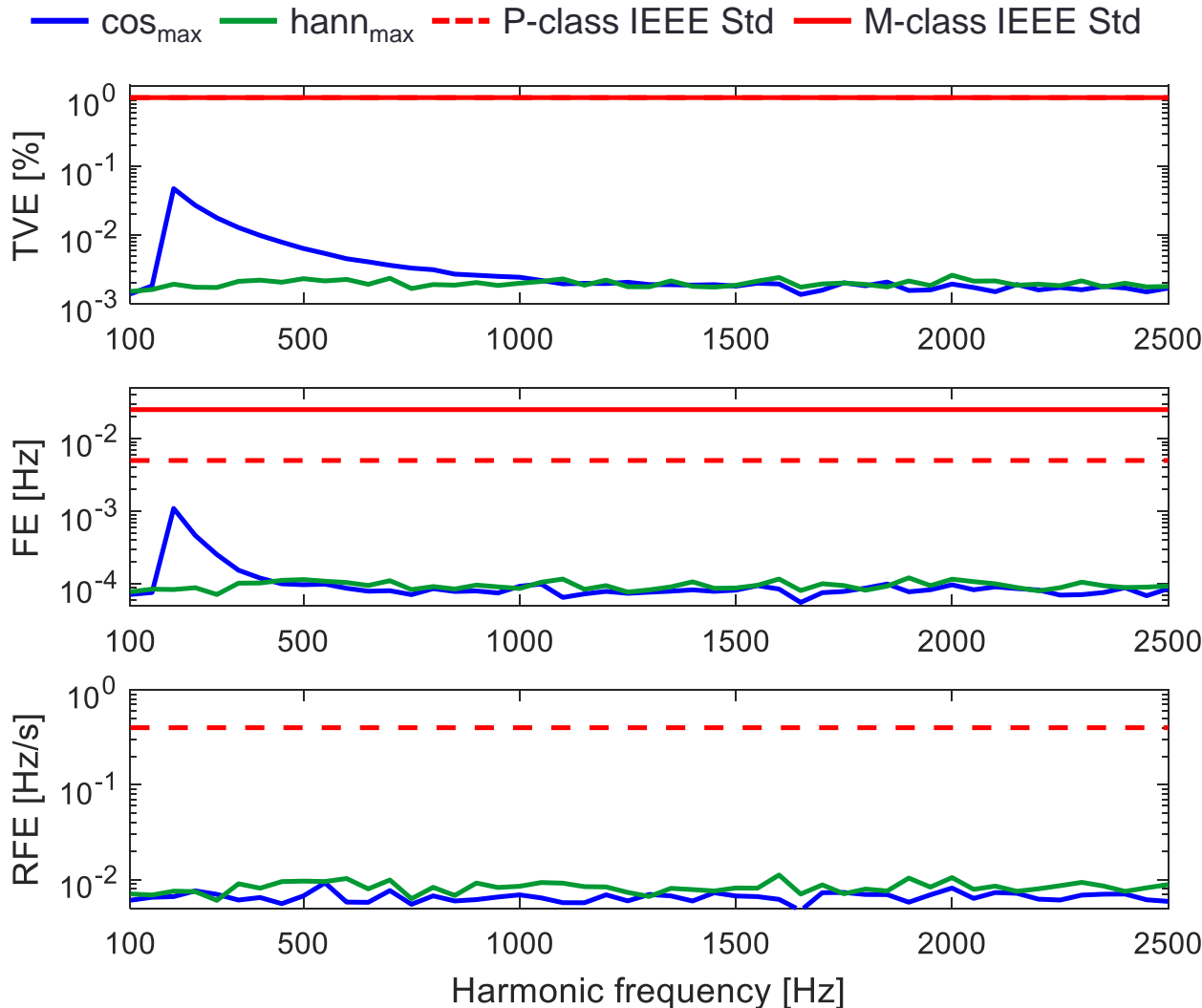
P = 0.4, M = 0.1 Hz/s

cos = 0.01 Hz/s

hann = 0.01 Hz/s

Performance Assessment

Static conditions – Harmonic Distortion



Max Errors:

TVE

P&M = 1%

\cos = 0.05%

hann = 0.003%

FE

P = 5, M = 25 mHz

\cos = 1.1 mHz

hann = 0.1 mHz

RFE

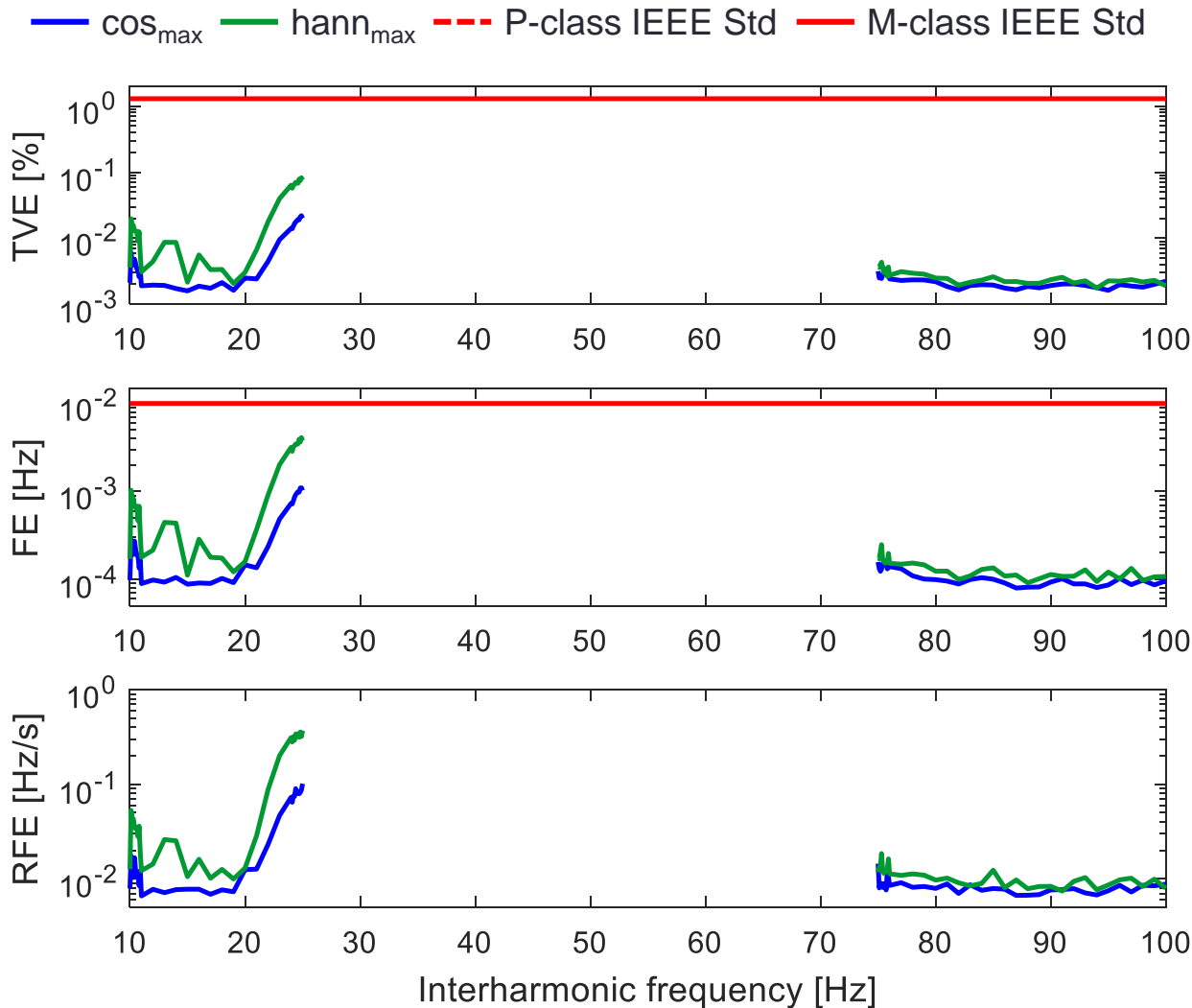
P = 0.4 Hz/s

\cos = 0.01 Hz/s

hann = 0.01 Hz/s

Performance Assessment

Static conditions – OOB



Max Errors:

TVE

$M = 1.3\%$

$\text{cos} = 0.02\%$

$\text{hann} = 0.08\%$

FE

$M = 10 \text{ mHz}$

$\text{cos} = 1.1 \text{ mHz}$

$\text{hann} = 4.1 \text{ mHz}$

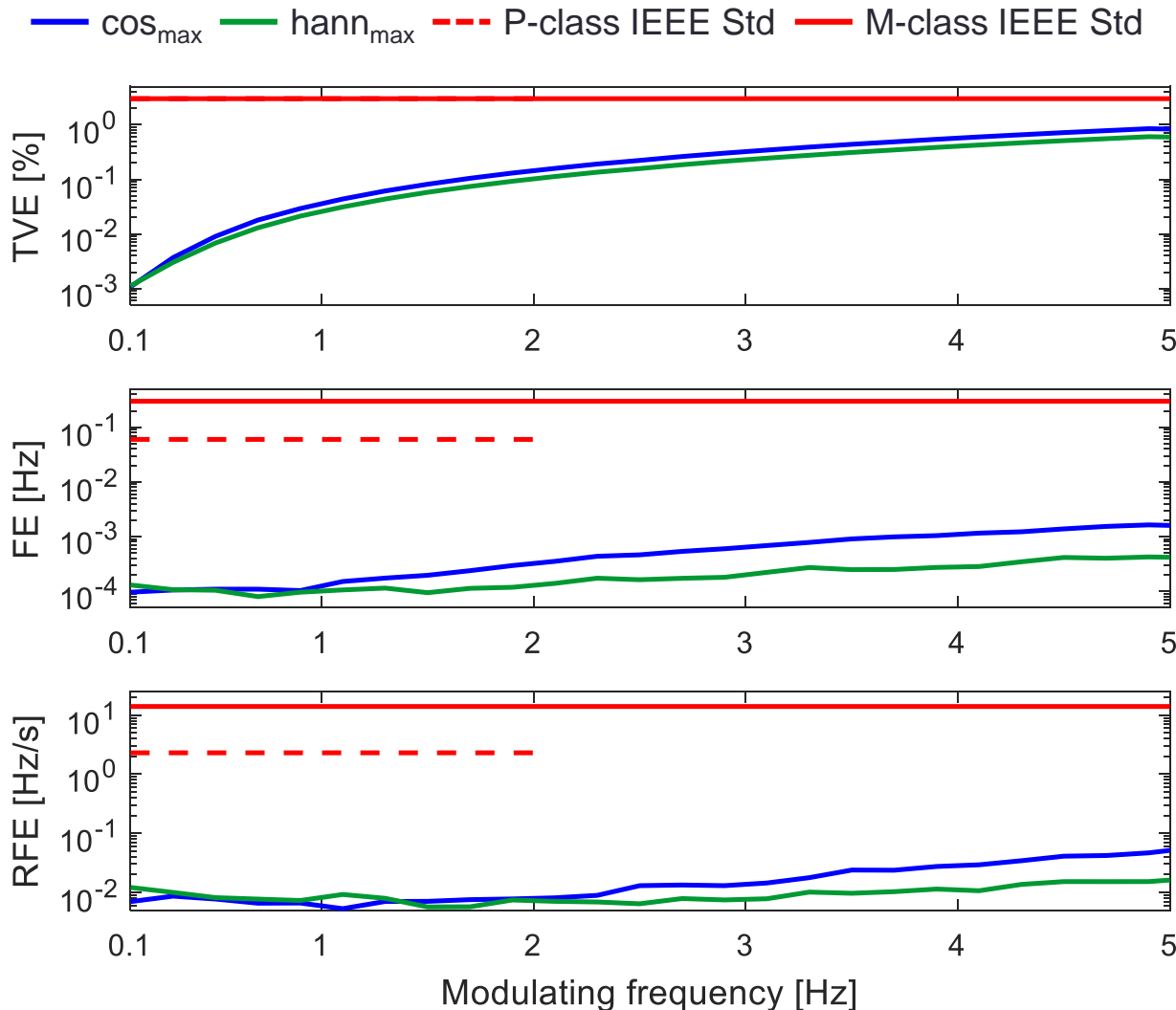
RFE

$\text{cos} = 0.1 \text{ Hz/s}$

$\text{hann} = 0.4 \text{ Hz/s}$

Performance Assessment

Dynamic conditions – Amplitude Modulation



Max Errors:

TVE

P&M = 3%

cos = 0.8%

hann = 0.6%

FE

P = 60, M = 300 mHz

cos = 1.6 mHz

hann = 0.4 mHz

RFE

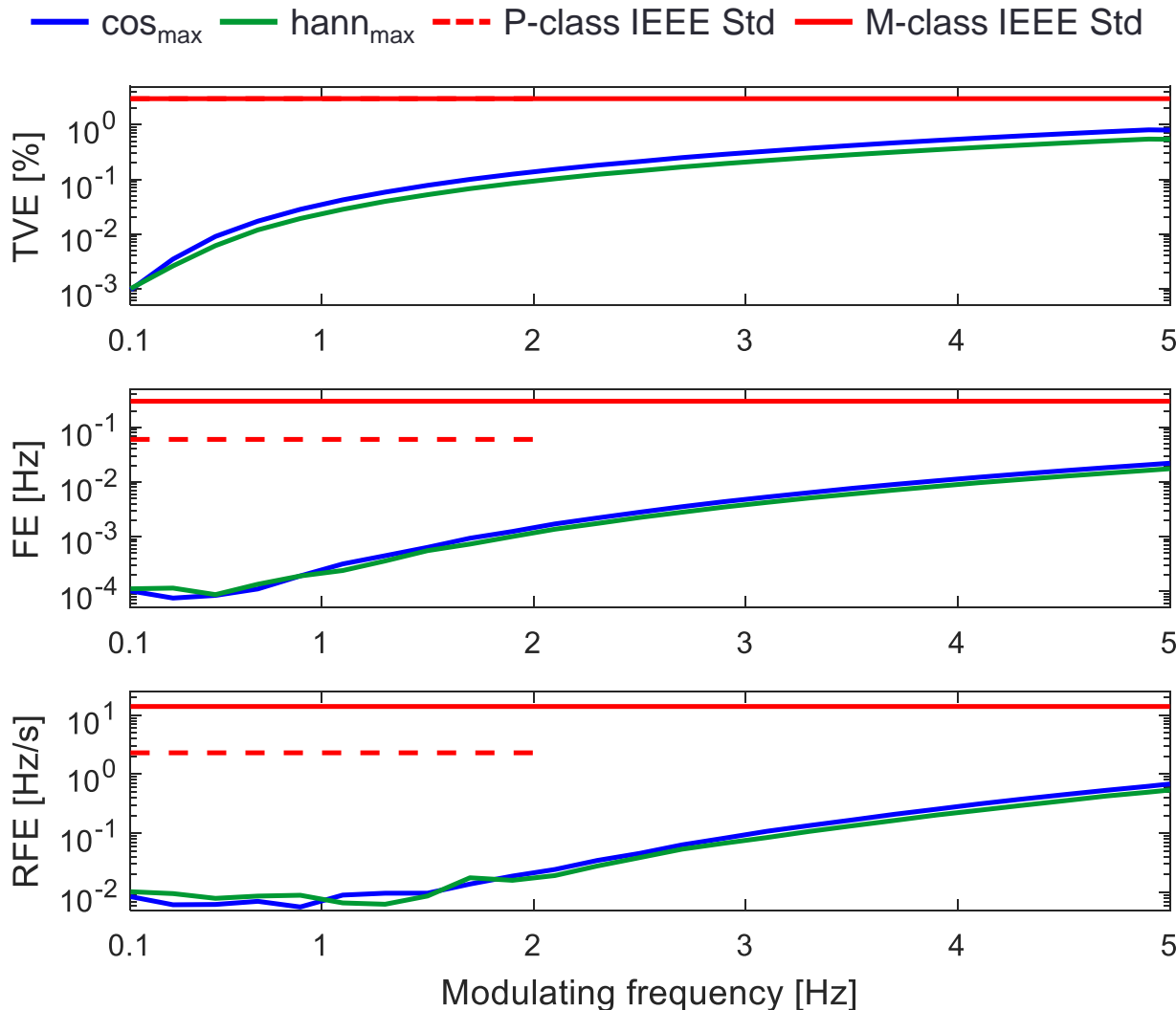
P = 2.3, M = 14 Hz/s

cos = 0.05 Hz/s

hann = 0.02 Hz/s

Performance Assessment

Dynamic conditions – Phase Modulation



Max Errors:

TVE

P&M = 3%

\cos = 0.8%

hann = 0.5%

FE

P = 60, M = 300 mHz

\cos = 22 mHz

hann = 17 mHz

RFE

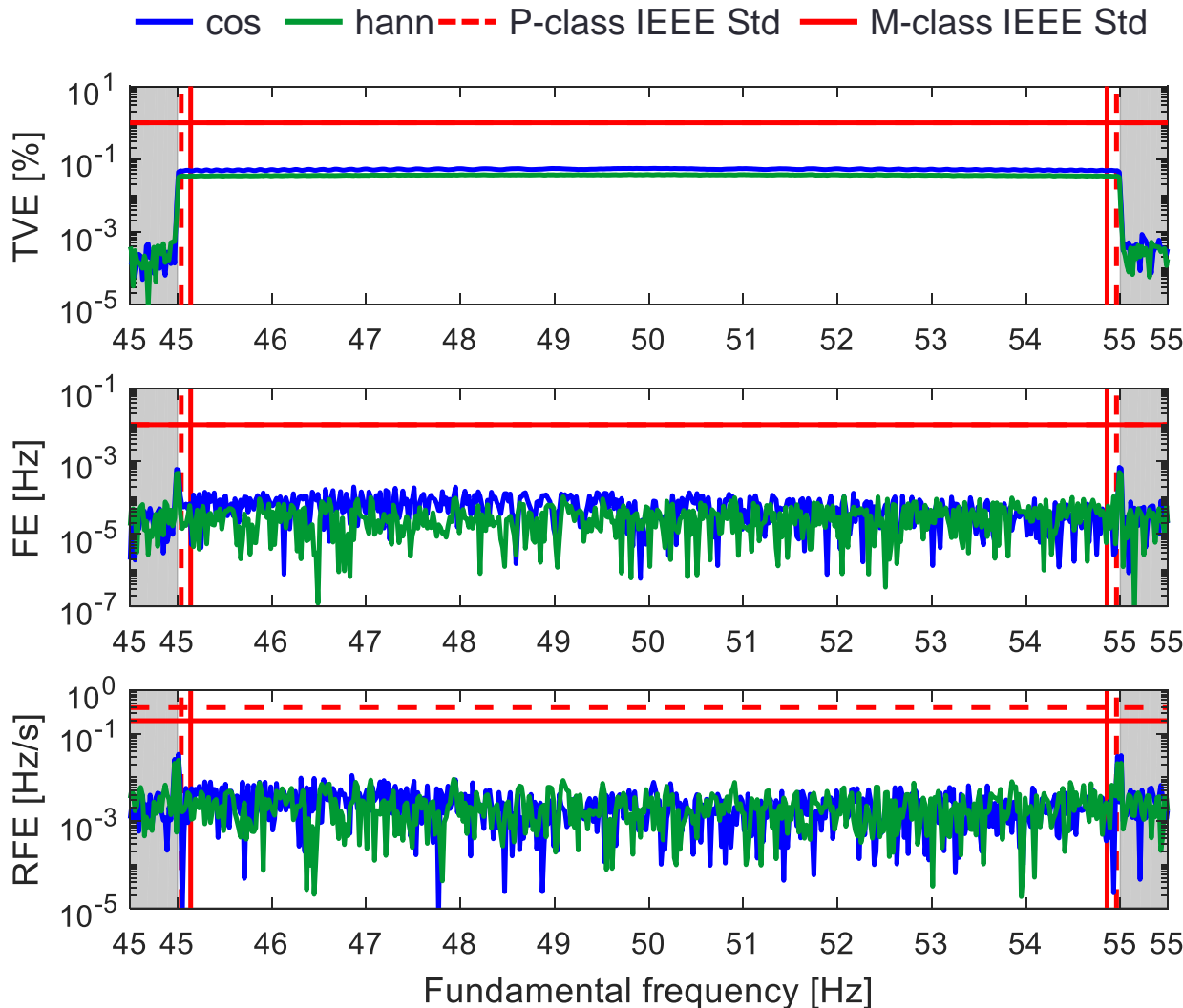
P = 2.3, M = 14 Hz/s

\cos = 0.6 Hz/s

hann = 0.5 Hz/s

Performance Assessment

Dynamic conditions – Frequency Ramp (positive)



Max Errors:

TVE

P&M = 1%

cos = 0.06%

hann = 0.04%

FE

P&M = 10 mHz

cos = 0.2 mHz

hann = 0.2 mHz

RFE

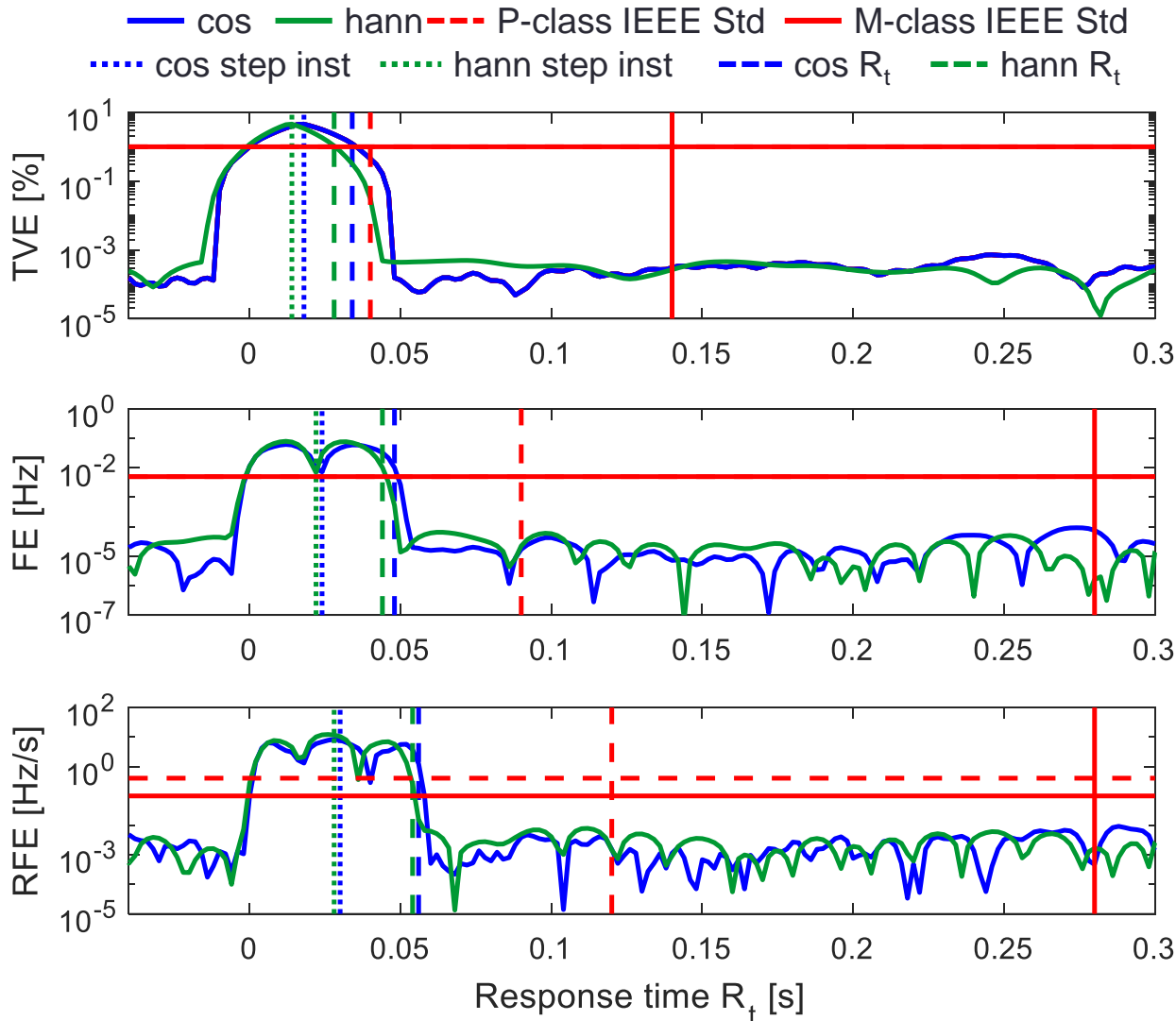
P = 0.4, M = 0.2 Hz/s

cos = 0.01 Hz/s

hann = 0.01 Hz/s

Performance Assessment

Dynamic conditions – Amplitude Step (positive)



Max Response time:

TVE

P = 0.04, M = 0.14 s

cos = 0.034 s

hann = 0.028 s

FE

P = 0.09, M = 0.28 s

cos = 0.048 s

hann = 0.044 s

RFE

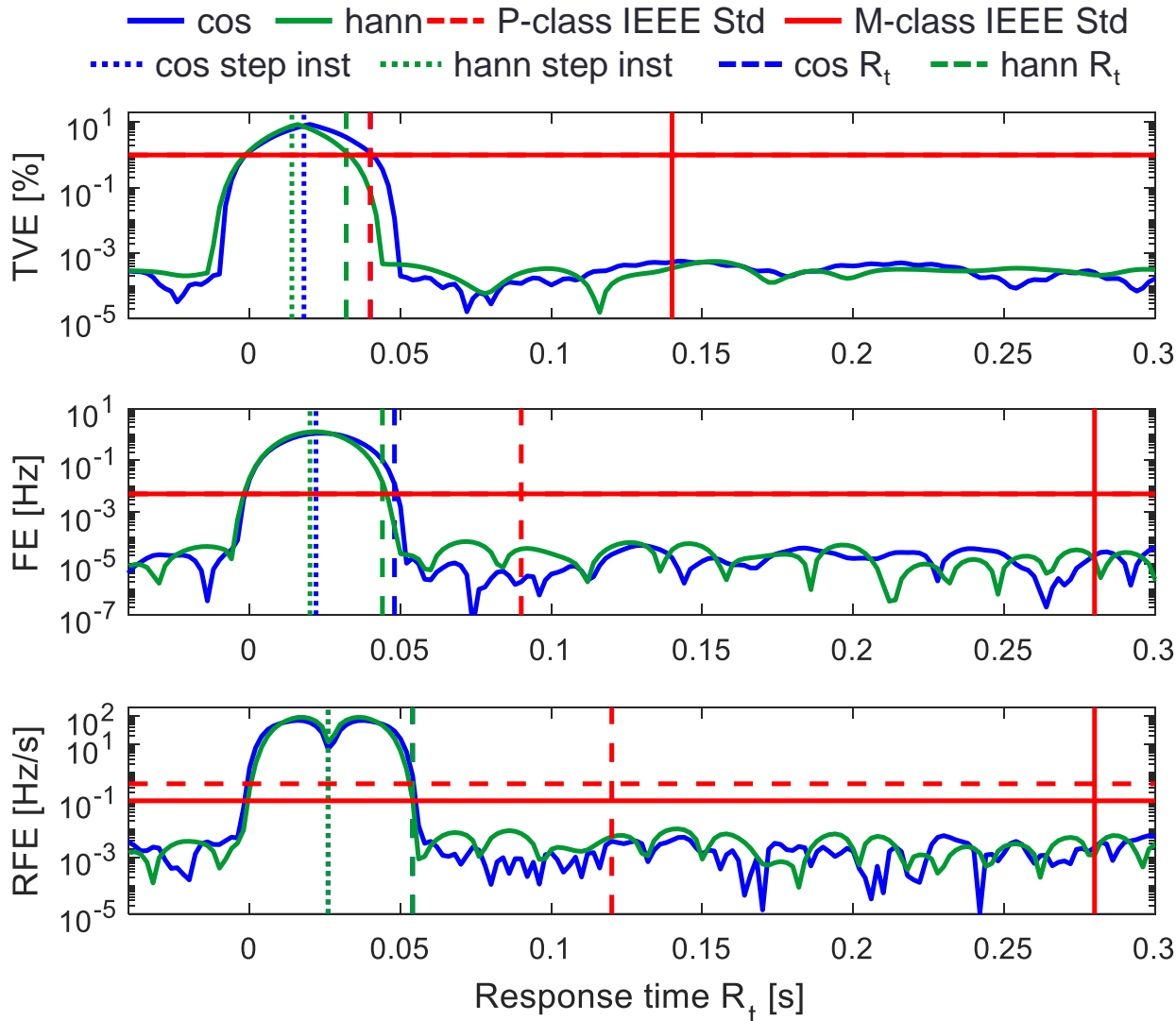
P = 0.12, M = 0.28 s

cos = 0.056 s

hann = 0.054 s

Performance Assessment

Dynamic conditions – Phase Step (positive)



Max Response time:

TVE

P = 0.04, M = 0.14 s

cos = 0.040 s

hann = 0.032 s

FE

P = 0.09, M = 0.28 s

cos = 0.048 s

hann = 0.044 s

RFE

P = 0.12, M = 0.28 s

cos = 0.054 s

hann = 0.054 s

Computational Complexity

Implementation on National Instruments Compact-Rio

- e-IpDFT → 20 μs [3]
- i-IpDFT → $2 \cdot Q \cdot 20 \mu\text{s}$ → 0.64 ms cos and 1.12 ms hann
- Compatible with the 10 ms time budget @ 50 fps
- Feasibility of the i-IpDFT technique implementation on an FPGA-based embedded device

```

1:  $X(k) = \text{DFT}(x(n))$ 
2:  $\{\hat{f}_0^0, \hat{A}_0^0, \hat{\varphi}_0^0\}|_P = e^{-\text{IpDFT}}[X(k)]$ 
3:  $\hat{X}_0^0(k) = \text{wf}(\hat{f}_0^0, \hat{A}_0^0, \hat{\varphi}_0^0) + \text{wf}(-\hat{f}_0^0, \hat{A}_0^0, -\hat{\varphi}_0^0)$ 
4: if  $\sum |X(k) - \hat{X}_0^0(k)|^2 > \lambda \cdot \sum |X(k)|^2$ 
5:   for  $q = 1 \rightarrow Q$ 
6:      $\{\hat{f}_i^q, \hat{A}_i^q, \hat{\varphi}_i^q\}|_P = e^{-\text{IpDFT}}[X(k) - \hat{X}_0^{q-1}(k)]$ 
7:      $\hat{X}_i^q(k) = \text{wf}(\hat{f}_i^q, \hat{A}_i^q, \hat{\varphi}_i^q) + \text{wf}(-\hat{f}_i^q, \hat{A}_i^q, -\hat{\varphi}_i^q)$ 
8:      $\{\hat{f}_0^q, \hat{A}_0^q, \hat{\varphi}_0^q\}|_P = e^{-\text{IpDFT}}[X(k) - \hat{X}_i^q(k)]$ 
9:      $\hat{X}_0^q(k) = \text{wf}(\hat{f}_0^q, \hat{A}_0^q, \hat{\varphi}_0^q) + \text{wf}(-\hat{f}_0^q, \hat{A}_0^q, -\hat{\varphi}_0^q)$ 
10:  end for
11: else
12:   break
13: end if

```

	i-IpDFT Variable		Value
	K		11
	P		2
	Q		16 (cos), 28 (Hann)
Function	+	- ×	÷ exp sin
IpDFT	14		3
wf (cos)	18K		11K
wf (Hann)	23K		16K
e-IpDFT	$(P+1) \cdot \text{IpDFT} + P \cdot \text{wf} + KP$		$(P+1) \cdot \text{IpDFT} + P \cdot \text{wf}$
Alg. II	+	- ×	÷ exp sin
line 2	e-IpDFT		e-IpDFT
line 3	$K + 2 \cdot \text{wf}$		$2 \cdot \text{wf}$
line 4	$5K - 2$		-
line 6, 8	$Q \cdot e^{-\text{IpDFT}} + K$		$Q \cdot e^{-\text{IpDFT}}$
line 7, 9	$Q \cdot (K + 2 \cdot \text{wf})$		$Q \cdot (2 \cdot \text{wf})$

Conclusions & Future Works

- IpDFT-based SE algorithm for P and M-class compliant PMUs
- **First IpDFT-based synchrophasor estimation technique resilient to OOBI**
- During OOBI test the **maximum TVE** is **0,1%** (being 1,3% the maximum allowed limit) and the **maximum FE** is **4 mHz** (being 10 mHz the maximum allowed limit)

- Patent submitted to PCT
- Implementation of the i-IpDFT in an embedded device (National Instruments Compact-Rio embedded control and acquisition system)

Iterative-Interpolated DFT for Synchronphasor Estimation: a Single Algorithm for P and M-class compliant PMUs

*École Polytechnique Fédérale de Lausanne (EPFL)
Distributed Electrical Systems Laboratory (DESL)
Asja Derviškadić, Paolo Romano and Mario Paolone*



ÉCOLE POLYTECHNIQUE
FÉDÉRALE DE LAUSANNE

References

1. A. Derviškadić, P. Romano and M. Paolone, “Iterative-interpolated DFT for Synchrophasor Estimation: a Single Algorithm for P and M-class compliant PMUs,” *IEEE Transactions on Instrumentation and Measurement*.
2. P. Romano and M. Paolone, “Enhanced interpolated-DFT for synchrophasor estimation in FPGAs: Theory, implementation, and validation of a PMU prototype,” *IEEE Transactions on Instrumentation and Measurement*, vol. 63, no. 12, pp. 2824–2836, Dec 2014.
3. P. Romano and M. Paolone, “An enhanced interpolated-modulated sliding DFT for high reporting rate PMUs,” in *2014 IEEE International Workshop on Applied Measurements for Power Systems Proceedings (AMPS)*, Sept 2014, pp. 1–6.