

# Baseband mitigation of nonlinear impairments in SOA based coherent optical OFDM systems: stochastic and experimental analyses

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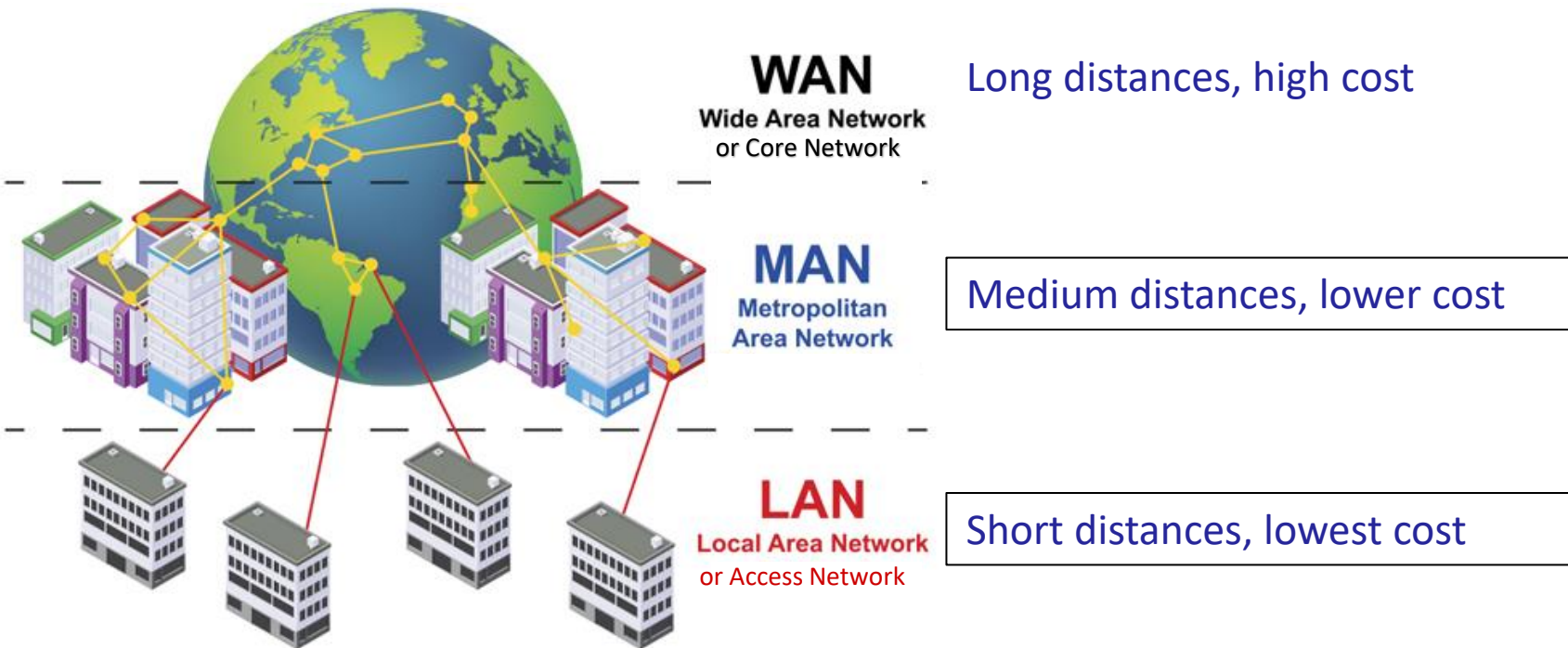


# Outline

1. Context
2. Setup
3. Predistortion principles
4. Numerical analysis
5. Stochastic analysis
6. Experimental setup
7. Conclusion

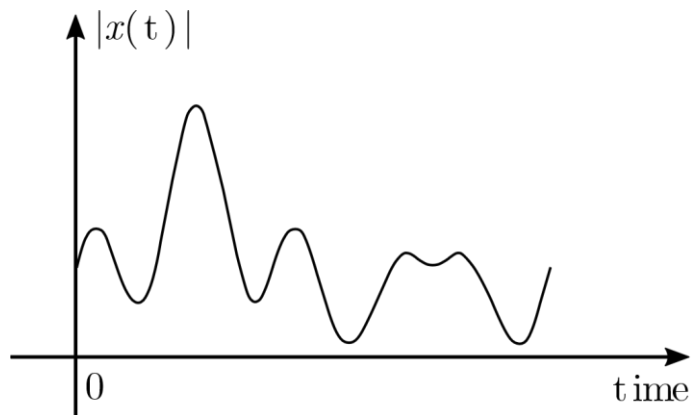
# Context

- Demand for high data rates and spectral efficiency growing exponentially
  - ◇ Optical fiber
    - + Higher data rate
    - + Low attenuations
    - + High potential for capacity increase

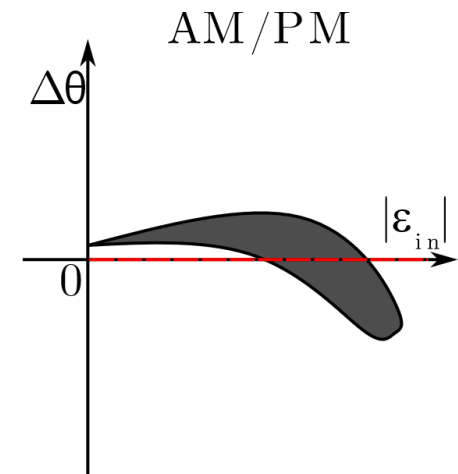
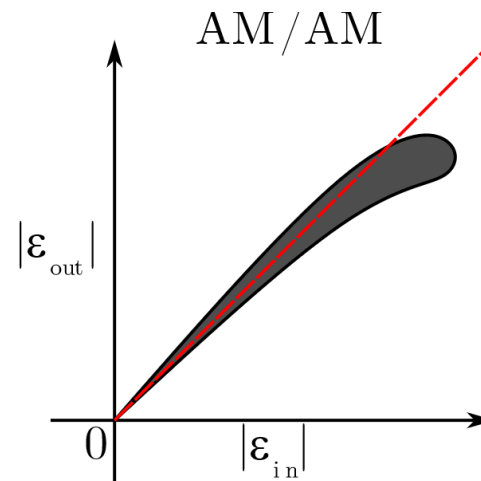


# Context

- Coherent optical communications
  - ◇ Orthogonal Frequency Division Multiplexing (OFDM) used in RF
    - + Uses Digital Signal Processing (DSP)
    - + High spectral efficiency
    - + Dynamic allocation of frequency bands
    - Non-constant envelope
- Access and metropolitan networks
  - ◇ Semiconductor Optical Amplifiers (SOAs) sparking interest
    - + Low cost
    - + Compact
    - + Large optical bandwidth
    - Nonlinear effects (Four Wave Mixing, phase-amplitude coupling)

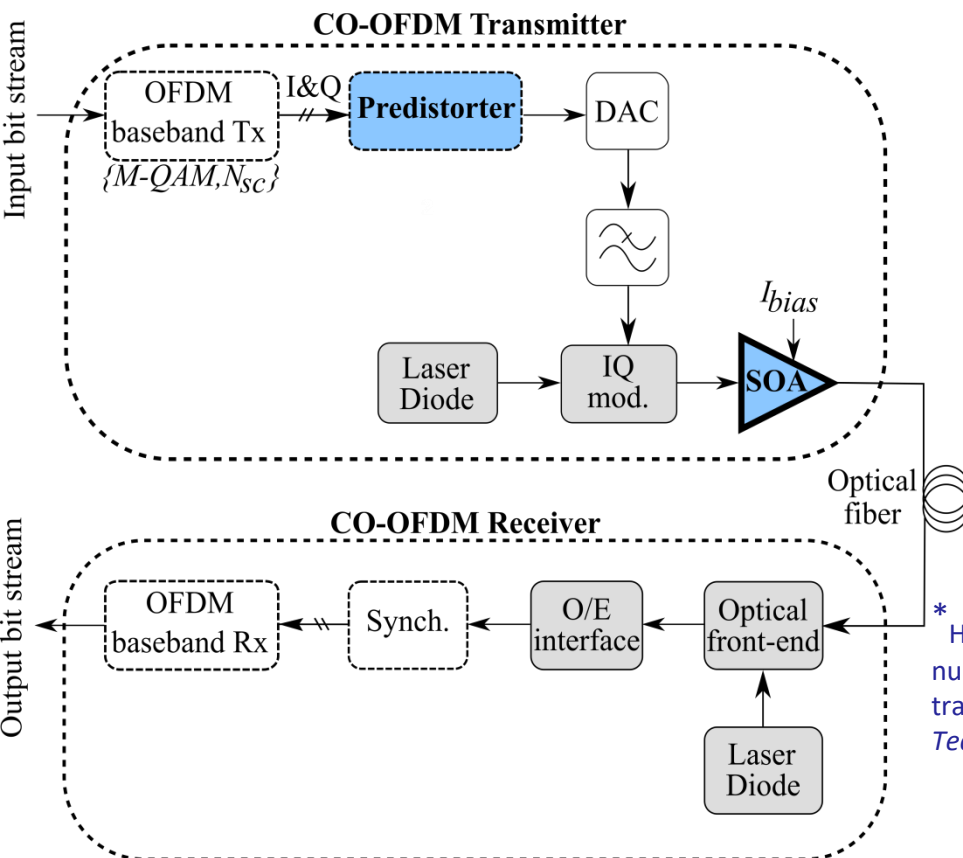


$$PAPR(x[n]) = \max_{0 \leq n \leq N-1} \frac{|x[n]|^2}{E[|x[n]|^2]}$$



# Setup

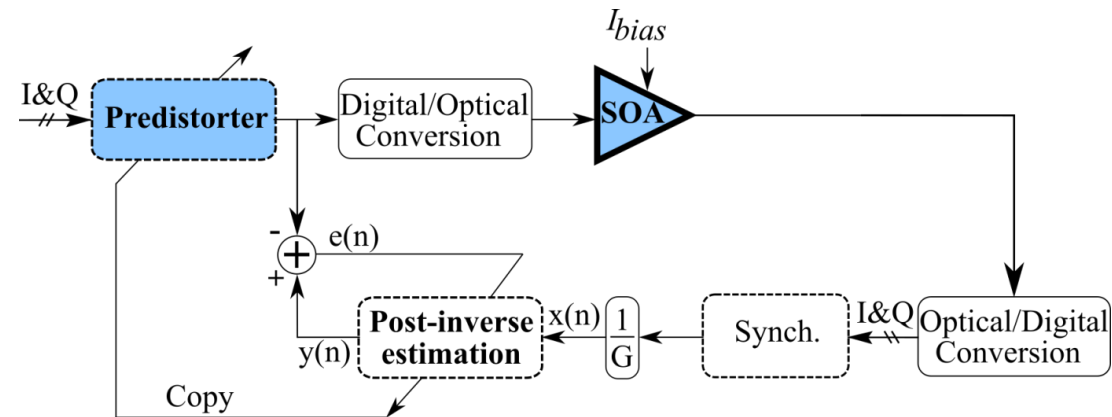
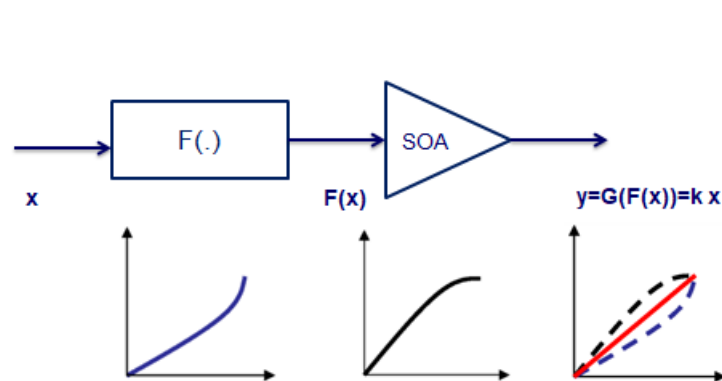
- Co-simulation MATLAB/ADS, SOA booster, optical Back-to-Back
- Physical model of a SOA (INPHENIX-IPSAD1501) has been implemented by *Khaleghi et al.*<sup>\*</sup>, using Agilent ADS software



<sup>\*</sup> H. Khaleghi, P. Morel, A. Sharaiha, and T. Rampone, "Experimental validation of numerical simulations and performance analysis of a coherent optical-OFDM transmission system employing semiconductor optical amplifier," *J. Lightw. Technol.*, vol. 31, no. 1, pp. 161–170, January 2013.

# Predistortion principles

- Objective: Linearize SOA characteristics via digital baseband predistorters (DPD)



- Indirect Learning Approach
- Minimize Least Squares error

- Three criteria of interest:

- Normalized Mean Square Error (NMSE)
- Error Vector Magnitude (EVM)
- Structural complexity

# Predistortion principles

- Simplified versions of the Volterra Series like the Memory Polynomials (MP) and Envelope Memory Polynomials (EMP):

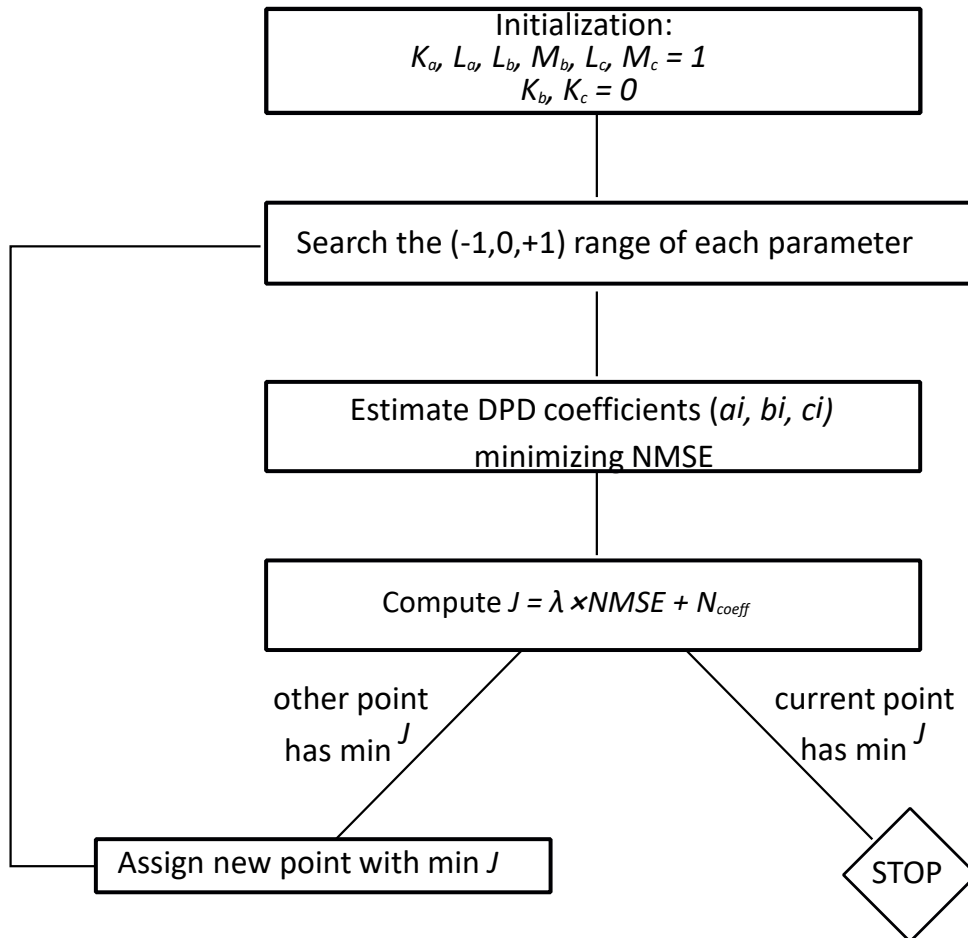
$$y_{MP}(n) = \sum_{k=0}^{K-1} \sum_{l=0}^{L-1} a_{kl} x(n-l) |x(n-l)|^k \quad y_{EMP}(n) = x(n) \left( c_0 + \sum_{k=1}^{K-1} \sum_{l=0}^{L-1} a_{kl} |x(n-l)|^k \right)$$

- The Generalized Memory Polynomials (GMP) encompasses other known predistorders such as MP and EMP

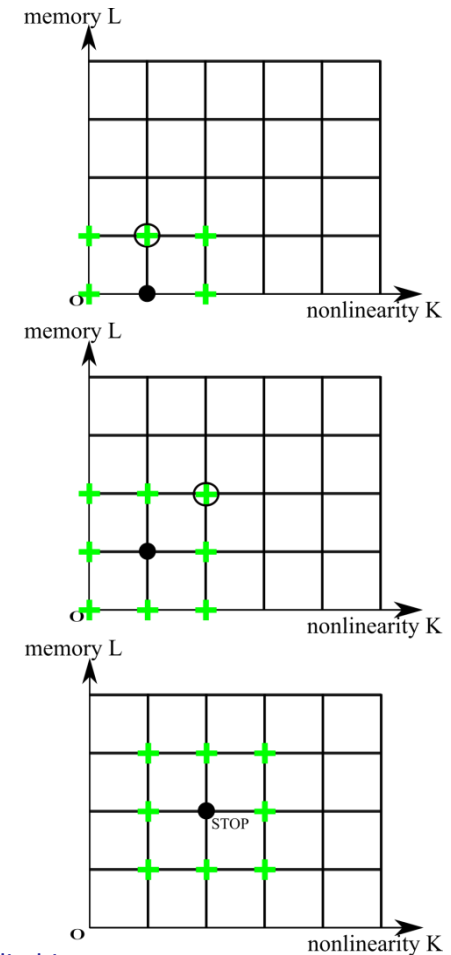
$$\begin{aligned} y_{GMP}(n) = & \sum_{k=0}^{K_a-1} \sum_{l=0}^{L_a-1} a_{kl} x(n-l) |x(n-l)|^k \\ & + \sum_{k=1}^{K_b} \sum_{l=0}^{L_b-1} \sum_{m=1}^{M_b} b_{klm} x(n-l) |x(n-l-m)|^k \\ & + \sum_{k=1}^{K_c} \sum_{l=0}^{L_c-1} \sum_{m=1}^{M_c} c_{klm} x(n-l) |x(n-l+m)|^k \end{aligned}$$

# Hill-Climbing heuristic

- Finding structural parameters  $K_i$ ,  $L_i$ , and  $M_i$



2-D example:

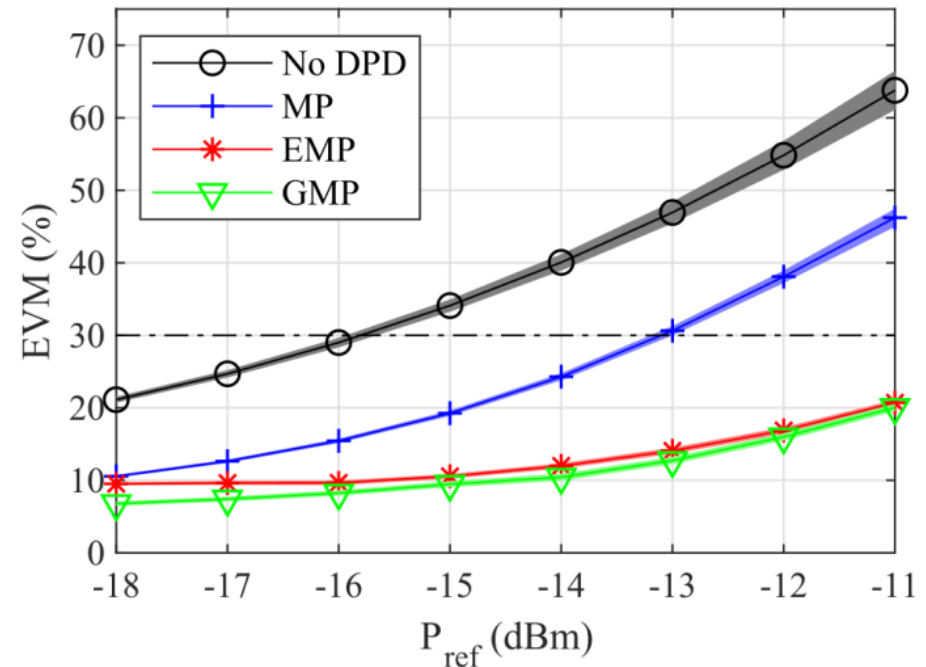
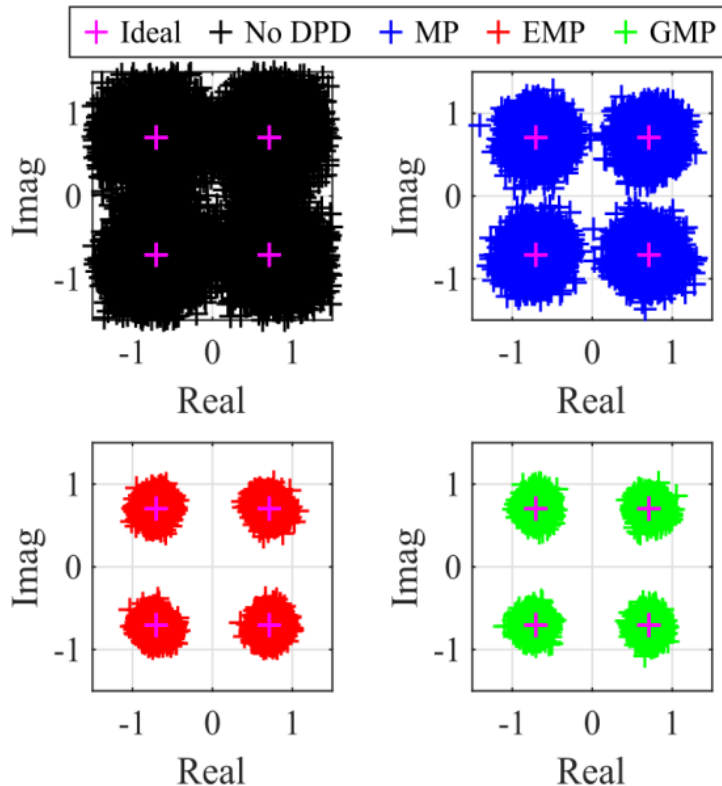


S. Wang, et al., "Optimal sizing of generalized memory polynomial model structure based on hill-climbing heuristic," IEEE 46th European Microwave Conference (EuMC), pp. 190–193, October 2016.



# Predistortion numerical results

- Digital predistortion (DPD) helps linearize the SOA

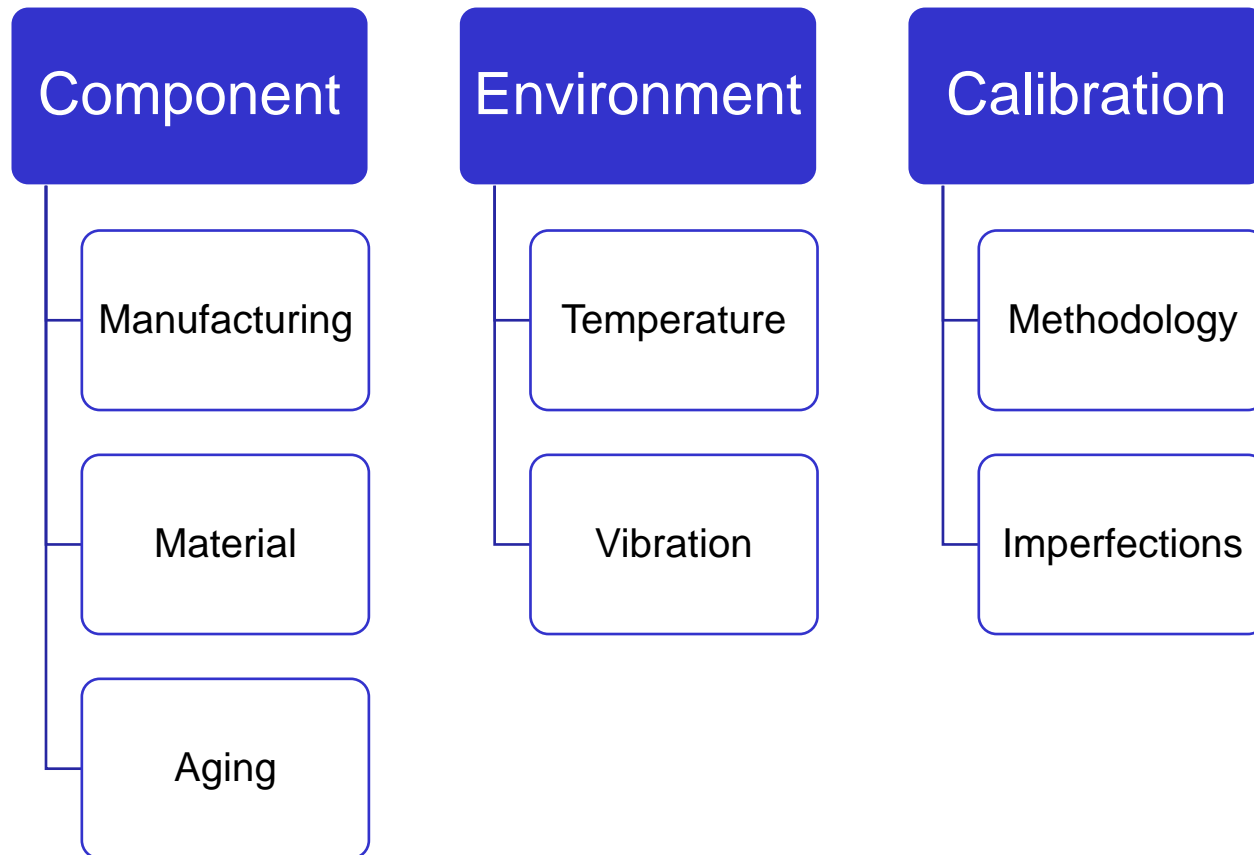


- 30% EVM corresponds to bit error rate (BER) of  $10^{-3}$
- We can increase input power from -16 dBm (no DPD) to -13 dBm (MP). And to more than -11 dBm for EMP/GMP

J. E. Sime, P. Morel, M. Telescu, N. Tanguy, S. Azou, "Digital Predistortion for CO-OFDM Systems Using Generalized Memory Polynomials," *8th IEEE Int. Conf. on Communications and Electronics (IEEE ICCE 2020)*, Phu Quoc Island, Vietnam, Jan. 13-15<sup>th</sup> 2021.

# Stochastic analysis

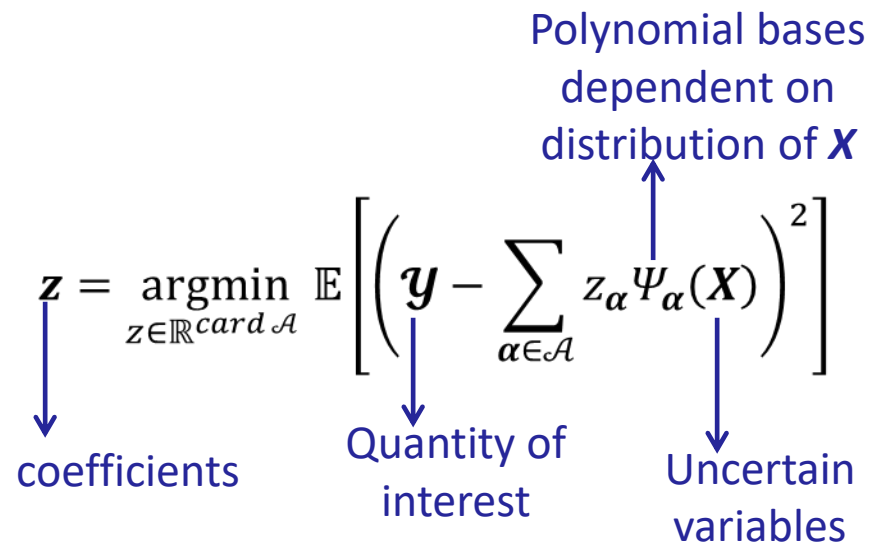
- Uncertainty of communication systems



# Polynomial Chaos Expansion

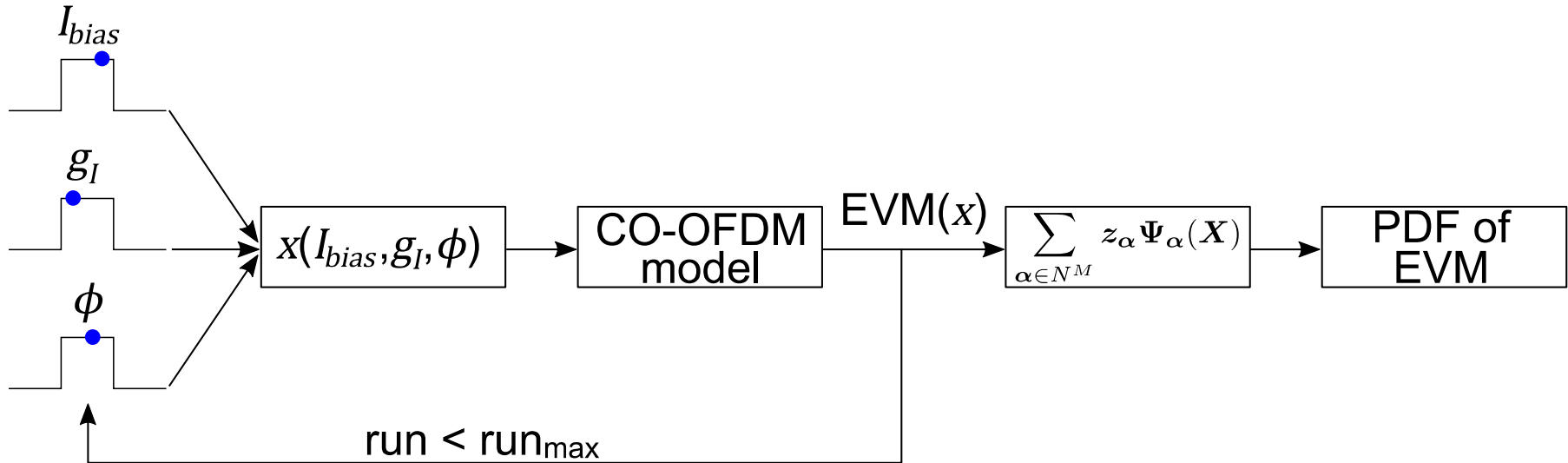
- Monte-Carlo constructs PDF by simulating each sample point
- PCE constructs metamodel by simulating a few sample points then computes the PDF using the metamodel

$$Y \approx \mathcal{M}(X) = \sum_{\alpha \in N^M} z_{\alpha} \Psi_{\alpha}(X)$$



# PCE Setup

oPCE done through Marelli and Sudret's UQLab\*



Distribution of input variables: Uniform

Uncertainty :  $\pm 5/10/15\%$

Sampling of uncertain variables : LHS

Quantity of Interest (QoI) : EVM

Runs to create model : 50

Error minimization method : LARS

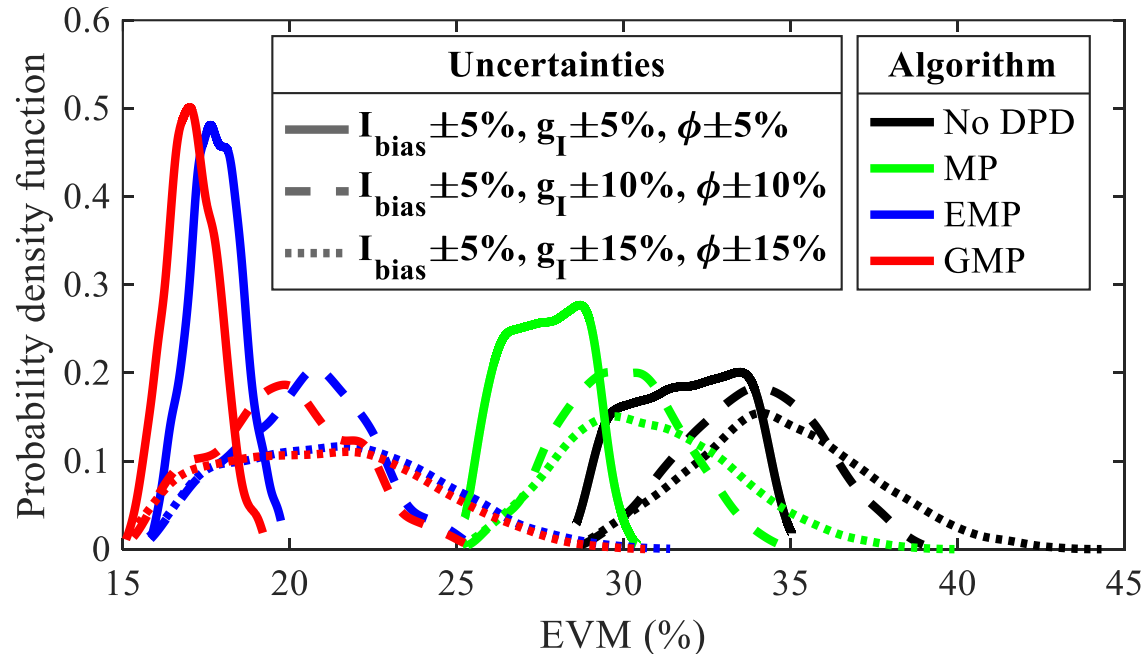
LHS: Latin Hypercube Sampling

LARS: Sparse least-angle regression

\* S. Marelli, B. Sudret, "UQLab: A framework for uncertainty quantification in Matlab," *Proc. 2<sup>nd</sup> ICVRAM*, Liverpool, UK, 2014, pp. 2554-2563.

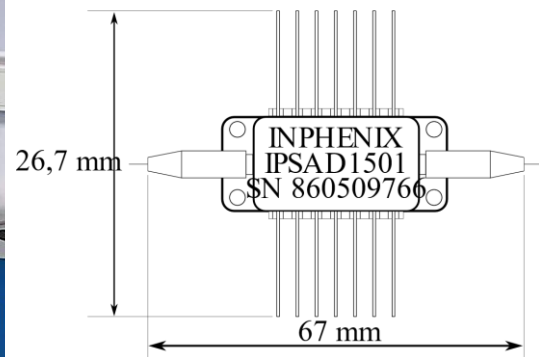
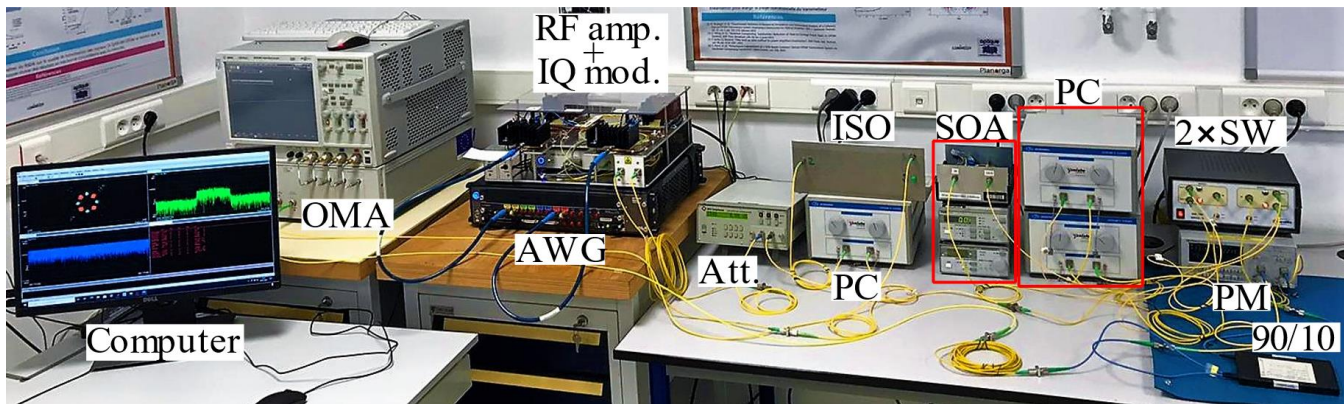
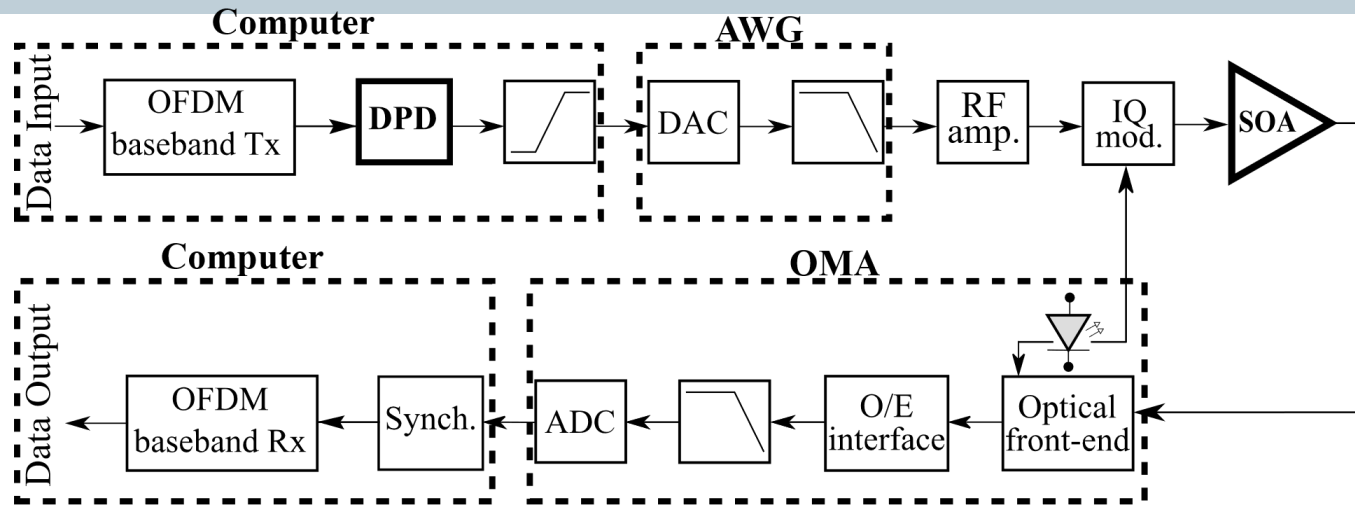
# Numerical results

- 4-QAM configuration (27.8 Gbit/s) with a  $P_{ref} = -14$  dBm into the SOA :



- # of coefficients: MP 9, EMP 33, GMP 69
- 30% EVM  $\rightarrow 10^{-3}$  BER (bit error rate)
- EMP and GMP meet requirements
- MP meets requirements for 5% uncertainty
- Improvement in robustness to uncertainties

# Experimental setup



# Concluding remarks

- Digital pre and postdistortion
  - In-line SOA
  - Effect of data rate on DPD efficiency
  - GEMP more general structure like the GMP focusing on signal's envelope
- 
- For more details: PhD defense on November 30 at ENIB at 10:30 am



# Thanks

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