

## Transient Stability Constrained Optimal Power Flow Problems



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#### Motivation

#### HEXAGON

- Standard Security Constrained OPF (SCOPF) problems give an optimal solution that guarantees • steady-state security (control and state variables in-bounds, N-1 security criteria etc.)
- the increase of *converter-based* clean generation resources substitutes the *rotating-machine* based ٠ generation lowering the available system inertia and negatively affecting system's dynamic security:



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• It is thus necessary to formulate an SCOPF that also considers Transient Stability aspects, in other words, a Transient Stability Constrained OPF (TSC-OPF)

min C(p)  $\rightarrow$  p is the decision variable vector  $p = (P_g, Q_g, V, \theta)^T$ 

such that

 $g_s(p) = 0$   $\rightarrow$  set of the **steady-state** equality constraints (PF eq, branch currents, etc)

 $h_s(p) \ge 0$   $\rightarrow$  set of the **steady-state** inequality constraints (capability, box bounds, N-1 security conditions etc)





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min C(p)  $\rightarrow$  p is the decision variable vector  $p = (P_g, Q_g, V, \theta)^T$ 

such that

 $\dot{x} = f(x(t), y(t), p) \rightarrow x$  is the vector of state variables (rotor angles, generators frequencies, etc.) y is the vector of algebraic link variables dot operator is the derivative wrt. time

 $0 = g(x(t), y(t), p) \rightarrow$  link algebraic equations

 $x(t_0) = I_{x0} \rightarrow \text{set of initial conditions for } x$ 

 $y(t_0) = I_{y0} \rightarrow \text{set of initial conditions for y}$ 





 $h(x(t), y(t)) \leq 0 \rightarrow \text{stability constraints}$ 

• **Constraint transcription** is an algorithmic framework that decouples optimization algorithms and simulation tools [\*]. Differential equations are integrated outside the optimization process and interfaced with NLP solvers:



[\*] S. Abhyankar, G. Geng, M. Anitescu, X. Wang, and V. Dinavahi, "Solution techniques for transient stability-constrained optimal power flow - Part I," IET Gener. Transm. Distrib., vol. 11, no. 12, pp. 3177–3185, 2017





TSC-OPF – Numerical Optimization Methods - Constraint transcription

• Integration into optimization problem:

$$H(x(p,t), y(p,t)) = \sigma \int_0^T [\max(0, h(x(p,t), y(p,t))]^{\eta} dt = 0$$

- Remarks:
  - > x(p,t) and x(p,t) are expressed, using trajectory analysis, as an approximation valid in the vicinity of  $p_0$ , the previous NLP optimal solution
  - $\succ$  remember that h(x(t), y(t)) is the function quantifying the stability conditions
  - $\succ$  **!!!**  $\sigma$ ,  $\mu$  are user defined parameters to assure smoothness of convergence
  - the equality condition is, in general, to hard and may lead to divergence of NLP





TSC-OPF – Numerical Optimization Methods - Constraint transcription

• Integration into optimization problem - relaxation

 $H(x(p,t) - \rho, y(p,t) - \rho) \le 0$ 

 $\blacktriangleright$  where  $\rho$  is a vector of positive slack variables minimized in the objective function





- *Simulation discretization:* the differential equations for all time steps are discretized to non-linear algebraic equations by using a numerical integration scheme.
  - in power systems optimization the few work available have used the Taylor integration scheme for this

$$x(t) - x(t - \Delta t) = \frac{\Delta t}{2} \cdot [f(x(t), y(t), p) - f(x(t - p), y(t - p), p)]$$

where  $\Delta t$  is the integration step



## TSC-OPF – Numerical Optimization Methods - Simulation discretization Orthogonal Colocation Method [\*\*]

 The solution of the differential equations at discrete time points is approximated by a Lagrange interpolating polynomial



[\*\*] J. D. Hedengren, R.A. Shishavan, K. M. Powell, T. F. Edgar, "Nonlinear modeling, estimation and predictive control in APMonitor," Computers & Chemical Engineering, vol. 70, 2014, pp. 133-148.





 The objective is to determine a matrix M that maps the derivatives to the nonderivative values:

$$\begin{bmatrix} \dot{x}_1 \\ \dot{x}_2 \\ \dot{x}_3 \end{bmatrix} = M \left( \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} - \begin{bmatrix} x_0 \\ x_0 \\ x_0 \end{bmatrix} \right)$$

• Time points for each interval are chosen according to *Lobatto quadrature*; In the case of 4 nodes per horizon step, the internal values are chosen at  $t_{1,2} = \frac{1}{2} \pm \frac{\sqrt{5}}{10}$ ; time points are shifted to a reference time of zero ( $t_0 = 0$ ) and a final time of  $t_f = 1$ 

## TSC-OPF – Numerical Optimization Methods - Simulation discretization Orthogonal Colocation Method

• Substituting the polynomial into the mapping relationship:

$$\begin{bmatrix} B + 2Ct_1 + 3Dt_1^2 \\ B + 2Ct_2 + 3Dt_2^2 \\ B + 2Ct_3 + 3Dt_3^2 \end{bmatrix} = M \begin{bmatrix} Bt + Ct_1^2 + Dt_1^3 \\ Bt + Ct_2^2 + Dt_2^3 \\ Bt + Ct_3^2 + Dt_3^3 \end{bmatrix} \implies M = \begin{bmatrix} 1 & 2t_1 & 3t_1^2 \\ 1 & 2t_2 & 3t_2^2 \\ 1 & 2t_3 & 3t_3^2 \end{bmatrix} \begin{bmatrix} T_1 & t_1^2 & t_1^3 \\ t_2 & t_2^2 & t_3^2 \\ t_3 & t_3^2 & t_3^3 \end{bmatrix} = M \begin{bmatrix} t_1 & t_1^2 & t_1^3 \\ t_2 & t_2^2 & t_3^2 \\ t_3 & t_3^2 & t_3^3 \end{bmatrix} \begin{bmatrix} B \\ C \\ D \end{bmatrix}$$

• Now, the mapping relationship is fully determined:

$$M^{-1}\begin{bmatrix} \dot{x}_1\\ \dot{x}_2\\ \dot{x}_3 \end{bmatrix} = \begin{bmatrix} x_1\\ x_2\\ x_3 \end{bmatrix} - \begin{bmatrix} x_0\\ x_0\\ x_0 \end{bmatrix}$$



## TSC-OPF — Numerical Optimization Methods - Simulation discretization Orthogonal Colocation Method

• Example:



$$\tau \cdot M \cdot \begin{pmatrix} x_1 & x_0 \\ x_2 & x_0 \\ x_3 & x_0 \end{pmatrix} = - \begin{pmatrix} x_1 \\ x_2 \\ x_3 \end{pmatrix}$$



TSC-OPF – Frequency stability model

- GOAL: find the minimum inertia at control area level so that the frequency stability following major events (short-circuits, line trips, etc.) is guaranteed.



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$$\min\sum_{i\in BUS}H_i$$

such that

$$\frac{dP_{mi}}{dt} = \frac{1}{T_{govi}} \left[ P_{mi}^0 + \frac{1}{R_i} \left( \frac{\Delta \omega_i}{\omega_s} - P_{mi} \right) \right]$$





#### TSC-OPF – Frequency stability model

- Grid model & algebraic link equations:







 $\min\sum_{i\in BUS}H_i$ 

such that

$$P_{e,i}(t) = \sum_{j=1}^{ngen} \left( E_{E_i} * E_{E_j} * |Y_{red,ij}| * \cos\left(\delta_i(t) - \delta_j(t) - \theta_{ij}\right) \right)$$

$$\left( \sum_j H_j \cdot A_{n,j} \right) \cdot \omega_a^{COI^t} = \sum_j H_j \cdot A_{n,j} \cdot \omega_j^t \quad \text{COI frequency calculation}$$

$$ROCOF_i^{500} \le 2 \qquad ROCOF_i^{1000} \le 1.5 \qquad ROCOF_i^{2000} \le 1.25 \quad \text{Stability Constraints}$$





TSC-OPF – Frequency stability model

#### HEXAGON

• Modeling events:

$$P_{e,i}(t) = \sum_{j=1}^{ngen} \left( E_{E_i} * E_{E_j} * \left| Y_{red,ij} \right| * \cos\left(\delta_i(t) - \delta_j(t) - \theta_{ij}\right) \right)$$

Short-Circuit











### TSC-OPF – Frequency stability model Numerical test 1: method performance

- Rueda Network (a CWE equivalent):
- 16 buses with generating units
- Optimization model transient simulation results were compared to results of Digsilent, a tool for PS transient simulation
- Shortcircuit at bus A2 is applied and cleared after 200 ms

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17

### TSC-OPF – Frequency stability model Numerical test 1: method performance





#### TSC-OPF – Frequency stability model Numerical test 1: method performance



Simulation Discretization method	$\varDelta t_{max}$ [ms]
Trapezoid	20
Orthogonal colocation	250





## TSC-OPF – Frequency stability model Numerical test 2: Real Case – Sicily grid

#### Sicily Network:

- Analyzed scenario: 8<sup>th</sup> May 2019
- minimum inertia available: 71.5 s
- maximum inertia available: 247 s
- a series of events have been considered and the minimum inertia required was determined as the envelope (max(min))



Grid Map downloads (entsoe.eu)



### TSC-OPF – Frequency stability model Numerical test 2: Real Case – Sicily grid

- Sicily Network: 90 MW demand disconnection
- the optimizer brings the inertia to the minimum possible
- stability limit is well satisfied → not a critical case

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## TSC-OPF – Frequency stability model Numerical test 2: Real Case – Sicily grid

#### Sicily Network: Separation from continent



- the optimizer brings the inertia to the minimum possible while ROCOF1000 limit is pushed to its lower bound
- the case is critical in the minimum inertia is  $H_{min} = 108 s$







The minimum inertia requirement is not satisfied by the initial dispatch provided by the energy market. In ASM formulation a minimum zonal inertia constrain is added:

$$\sum Y_{u,t} \cdot E_u \ge \sum (Y_{u,t} \cdot A_u^n) \cdot H_{min,t}$$

where:

- $H_u$  is the inertia of generating unit <u>u</u>;
- $E_u$  is the kinetic energy of generating unit <u>u</u>;
- $A_u^n$  is the apparent nominal power of generating unit *u*;
- $H_{min,t}$  is the minimum level of inertia required.





# Future Work

- test other "orthogonal collocation" approximation functions for x(t) that could allow for a larger  $\Delta t$
- consider also converter-based DERs dynamic models with synthetic inertia capabilities



#### Questions





