On the existence of equilibria in complex nonlinear networks

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- Post-doc researcher at Lund University (current)
 - Hosted by Emma Tegling & Anders Rantzer

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 - Supervised by Claudio De Persis & Arjan van der Schaft
- Main interests:
 - Power systems
 - Existence of equilibria to nonlinear physical systems
 - (Nonlinear) controller design for vehicle platooning
 - Matrix theory & algebraic graph theory

• Existence of equilibria to complex nonlinear network

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 - DC power grids (past work)

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 - DC power grids (past work)
 - Hydraulic component of district heating grids (ongoing work)

Part 1

DC power grids and power flow feasibility

• Part I based on two part paper in IEEE Transactions on Automatic Control (Jan 2023)

DC power grids with constant-power loads—Part I: A full characterization of power flow feasibility, long-term voltage stability and their correspondence

Mark Jeeninga*, Claudio De Persis†, Arjan van der Schaft†

DOI 10.1109/TAC.2022.3157076

DC power grids with constant-power loads—Part II: Nonnegative power demands, conditions for feasibility, and high-voltage solutions

Mark Jeeninga*, Claudio De Persis†, Arjan van der Schaft†

DOI 10.1109/TAC.2022.3176808

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- Power flow (PF) equations

$$P_{i} = \sum_{j} |V_{i}||V_{j}| (G_{ij}\cos(\phi_{i} - \phi_{j}) + B_{ij}\sin(\phi_{i} - \phi_{j}))$$
$$Q_{i} = \sum_{j} |V_{i}||V_{j}| (G_{ij}\sin(\phi_{i} - \phi_{j}) - B_{ij}\cos(\phi_{i} - \phi_{j}))$$

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- Sustained mismatch leads to voltage collapse, blackouts
- Nonlinear equations: existence of solutions, non-uniqueness of solutions, finding desirable solutions.

- Classical problem: Research since 1960's
- Convex relaxations of PF equations
- Approximations and simplifications of PF equations (many flavors)
 - DC current flow ("DC power flow approximation")
 - Active-reactive decoupling
 - DistFlow
 - ...
- Excellent survey of Molzahn & Hiskens (2019)
- In general: A fundamental understanding of the PF equations is lacking

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- Stability and high-voltage solutions? Only partial answers.

The special case of DC power grids

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- Applications with constant-power components
 - ships, aircraft, spacecraft, ...
 - DC microgrids and smart grids
• DC power grids are a special subclass of AC power grids

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- Applications with constant-power components
 - ships, aircraft, spacecraft, ...
 - DC microgrids and smart grids
 - High-voltage direct current (HVDC) lines (grids?)



DC power grid at steady state \Rightarrow model as resistive circuit



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 \boldsymbol{n} loads, \boldsymbol{m} sources



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Kirchhoff matrix $Y \in \mathbb{R}^{(n+m) \times (n+m)}$:

$$Y_{ij} := \begin{cases} \sum_{k \sim i} G_{ik} & \text{if } i = j \\ -G_{ij} & \text{if } i \neq j \text{ and } i \sim j \\ 0 & \text{if } i \neq j \text{ and } i \not\sim j \end{cases}$$

with line conductances $G_{ij} > 0$



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$$V = \begin{pmatrix} V_{\rm L} \\ V_{\rm S} \end{pmatrix} > 0$$

Voltage potentials



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with line conductances $G_{ij} > 0$

$$V = \begin{pmatrix} V_{\rm L} \\ V_{\rm S} \end{pmatrix} > 0 \qquad \qquad \mathcal{I} = \begin{pmatrix} \mathcal{I}_L \\ \mathcal{I}_S \end{pmatrix} = \begin{pmatrix} Y_{\rm LL} & Y_{\rm LS} \\ Y_{\rm SL} & Y_{\rm SS} \end{pmatrix} \begin{pmatrix} V_{\rm L} \\ V_{\rm S} \end{pmatrix}$$

Voltage potentials

Currents flowing into network at nodes



Injected power at the nodes: $P = [V]\mathcal{I}$

$$([x] := \operatorname{diag}(x_1, \ldots, x_n))$$



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Open-circuit voltages:

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 $P_L = [V_L]Y_{LL}(V_L - V_L^*)$ Power flow feasibility problem: For which constant power demands $P_c \in \mathbb{R}^n$ does there exists an operating point $V_L > 0$ so that

 $P_{\rm c} = -P_L = [V_{\rm L}]Y_{\rm LL}(V_{\rm L}^* - V_{\rm L}).$

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- Root finding
- Fixed-point methods

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and want to identify the range of $P_{\rm c}(V_{\rm L})$.

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$$\mathcal{F} := \left\{ \left. \widehat{P}_{\mathbf{c}} \; \right| \; \exists V_{\mathrm{L}} > \mathbb{0} : P_{\mathbf{c}}(V_{\mathrm{L}}) = \widehat{P}_{\mathbf{c}} \;
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Note: feasibility is a property of all system parameters, not only demands

Set of feasible power demands - example



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Capture the "increasing load \Rightarrow decreasing steady state voltages"-phenomenon



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Theorem

A power demand satisfies $P_c \in \mathcal{F}$ only if there does not exists $\lambda > 0$ such that

$$\begin{pmatrix} Y_{\rm LL}[\lambda] + [\lambda]Y_{\rm LL} & [\lambda]Y_{\rm LS}V_{\rm S} \\ (Y_{\rm LS}V_{\rm S})^{\top}[\lambda] & 2\lambda^{\top} \frac{P_{\rm c}}{P_{\rm c}} \end{pmatrix}$$
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We show that this is necessary condition is also sufficient. Consequently, ${\cal F}$ is convex and closed.

Necessary and sufficient condition for power flow feasibility - example



 P_{max} is the vector of power demands that maximizes $\sum_{i} (P_{c})_{i}$.
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- 2. There is a one-to-one correspondence between the boundary of ${\cal D}$ and the boundary of $cl(conv({\cal F})).$
- 3. Show that there are no "holes" or "pockets" in the set ${\mathcal F}$













 γ stays within ${\cal D}$ since the boundaries are one-to-one.

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- We can find the \widehat{V}_{L} corresponding to \widehat{P}_{c} by solving the IVP $\gamma: [0,1] \to \mathbb{R}^{n}$,

$$\begin{cases} \gamma(0) = V_{\rm L}^* \\ \frac{\mathrm{d}}{\mathrm{d}t} \gamma(t) = \left(\frac{\partial P_{\rm c}}{\partial V_{\rm L}}(\gamma(t))\right)^{-1} \widehat{P}_{\rm c} \end{cases}$$

We have $\gamma(1) = \widehat{V}_{L}$.

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We have $\gamma(1) = \widehat{V}_{L}$.

• The set \mathcal{F} is closed and convex.

Necessary and sufficient condition for power flow feasibility

Theorem

A power demand satisfies $P_c \in \mathcal{F}$ if and only if there does not exists $\lambda > 0$ such that

$$Q := \begin{pmatrix} Y_{\rm LL}[\lambda] + [\lambda]Y_{\rm LL} & [\lambda]Y_{\rm LS}V_{\rm S} \\ (Y_{\rm LS}V_{\rm S})^{\top}[\lambda] & 2\lambda^{\top} \frac{P_{\rm c}}{P_{\rm c}} \end{pmatrix} \text{ is positive definite.}$$

Similarly, $P_c \in int(\mathcal{F})$ if and only if Q is never positive semi-definite.

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Similarly, $P_c \in int(\mathcal{F})$ if and only if Q is never positive semi-definite.

Packages like MOSEK solve this problem and its dual, to assess (in)feasibility.

High-voltage solutions and bifurcations



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The HV solution minimizes the dissipation among all equilibria.

Theorem

If an operating point \widehat{V}_{L} satisfies one of the following properties, it satisfies all of them:

- \widehat{V}_{L} is semi-stable (i.e., $\widehat{V}_{L} \in cl(\mathcal{D})$);
- \widehat{V}_{L} is the unique long-term voltage semi-stable operating point associated to \widehat{P}_{c} ;
- $\widehat{V}_{\rm L}$ is dissipation-minimizing;
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- \widehat{V}_{L} is a high-voltage solution;

Definition

A high-voltage (HV) solution is an equilibrium \widehat{V}_{L} such that for all other equilibria V_{L}° we have $(V_{L}^{\circ})_{i} < (\widehat{V}_{L})_{i}$.

The HV solution minimizes the dissipation among all equilibria.

Theorem

If an operating point \widehat{V}_{L} satisfies one of the following properties, it satisfies all of them:

- \widehat{V}_{L} is semi-stable (i.e., $\widehat{V}_{L} \in cl(\mathcal{D})$);
- \widehat{V}_{L} is the unique long-term voltage semi-stable operating point associated to \widehat{P}_{c} ;
- $\widehat{V}_{\rm L}$ is dissipation-minimizing;
- \widehat{V}_{L} is the unique dissipation-minimizing operating point;
- \widehat{V}_{L} is a high-voltage solution;

This proves practical wisdom.

Other work and open questions

- Plug & play certificates
- Braess' paradox: increasing line conductances may lead loss of PF feasibility
- Distance to infeasibility

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- Braess' paradox: increasing line conductances may lead loss of PF feasibility
- Distance to infeasibility

- How can we make loads behave such that they guarantee feasibility? (Dynamic pricing games?)
- Which dynamics on the loads lead to (global?) convergence in case of feasibility?

Part 2

Equilibria to district heating systems

Joint work with

- Juan Machado (University of Technology Cottbuss Senftenberg)
- Michele Cucuzzella (University of Pavia)
- Giacomo Como (Politecnico di Torino Lund University)
- Jacquelien Scherpen (University of Groningen)

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To be presented CDC 2023.





• Transport heat (energy) from producers to consumers



- Transport heat (energy) from producers to consumers
- Cutting costs by reusing waste heat from industrial processes

Components:

• Pipes



Components:

- Pipes
 - Hot and cold layer



Components:

- Pipes
 - Hot and cold layer
- Heat exchangers



Components:

- Pipes
 - Hot and cold layer
- Heat exchangers
- Pumps, in series with pipes



Components:

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We only focus on these components, but also valves and storage facilities may be considered.

We assume that the fluid is incompressible and laminar flow in the pipes.




• Each actuated pipe is in series with a pump;



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In particular, at steady state we have

$$u_i = \begin{cases} -f_i(q_i^*) + \Delta_i & \text{if } i \in \alpha \\ -f_i(q_i) + \Delta_i^* & \text{if } i \in \beta \\ 0 & \text{if } i \in \gamma \end{cases}$$

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Assumption: There is no coordination between the actuators of q_i^* and Δ_i^* .

For which placements of the pumps (actuators) does there exist an equilibrium for all choices of q_i^* and Δ_i^* ?

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Recast problem as an optimization problem. If a solution exists, it is unique.

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We define $F \in \mathbb{R}^{c \times e}$

 $F_{ki} = \begin{cases} \pm 1 & \text{if } i \text{ lies in the cycle that occurs by adding } k, \text{ with sign according to orientation} \\ 0 & \text{if } i \text{ lies in the cycle that occurs by adding } k \end{cases}$

We have $F = \begin{pmatrix} I & | & F^* \end{pmatrix}$.
Fundamental loop matrix - example



$$F = \begin{pmatrix} 1 & 0 & -1 & -1 & 0 \\ 0 & 1 & 0 & -1 & 1 \end{pmatrix}$$

Mark Jeeninga - Lund University

Main result

$q \in \operatorname{im} F^{\top}$	(KCL)
$F\Delta=\mathbb{0}$	(KVL)
$q_i = q_i^*$	for $i\in$
$\Delta_i = \Delta_i^*$	for $i\in$
$f_i(q_i) = \Delta_i$	for $i\in$

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Theorem

There exists an equilibrium $(\widehat{q}, \widehat{\Delta})$ for each choice of q_i^* for $i \in \alpha$ and Δ_i^* for $i \in \beta$ if and only if there exists a subset of edges $T \subseteq \mathcal{E}$, such that T forms a spanning tree and $\beta \subseteq T$ and $\alpha \subseteq \mathcal{E} \setminus T$. Moreover, $(\widehat{q}, \widehat{\Delta})$ is unique.

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Corollary

The unique equilibrium can be obtained from the solution of a dynamical system $\dot{x} = g(x)$ where g is a monotone bijection.

Main result - example



Main result - example



Perhaps unsurprisingly, this coincides with simultaneous cut set and loop analysis.

Conclusion

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- The problem we are solving is much more general. To what other types of systems is this actuator placement problem of interest?
- What changes if we also include the thermal layer into the system of equations?
- What if not all maps f_i are surjective?
- And what if we include constant-power loads?

Thank you for your attention!