

# A Theory of Solvability for Lossless Power Flow Equations

John W. Simpson-Porco



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# This talk is based on these papers

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1361


## A Theory of Solvability for Lossless Power Flow Equations—Part I: Fixed-Point Power Flow

John W. Simpson-Porco , *Member, IEEE*

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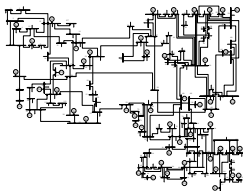
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## A Theory of Solvability for Lossless Power Flow Equations—Part II: Conditions for Radial Networks

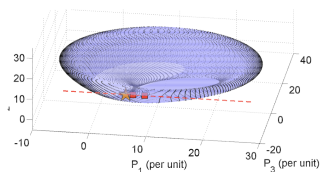
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# Problems in power system operations

## Power Flow Analysis

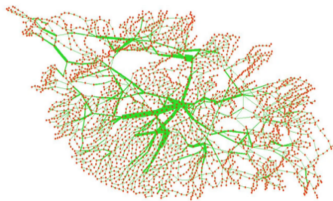


## Optimal Power Flow



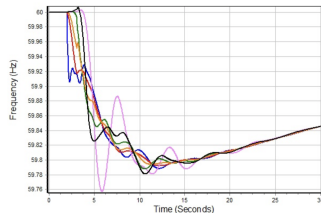
[Molzahn et al.]

## Contingency Analysis



[Rezaei et al.]

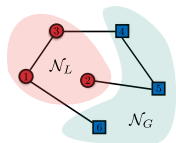
## Transient Stability



[Overbye et al.]

# Modeling AC power flow

- active power:  $P_i = \sum_j V_i V_j B_{ij} \sin(\theta_i - \theta_j)$
- reactive power:  $Q_i = -\sum_j V_i V_j B_{ij} \cos(\theta_i - \theta_j)$



⑥  $n$  Loads (●) and  $m$  Generators (■)  $\mathcal{N} = \mathcal{N}_L \cup \mathcal{N}_G$

⑦ **Load Model:** PQ bus      constant  $P_i$       constant  $Q_i$

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## Power Flow Equations

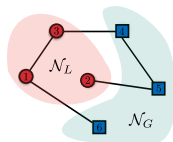
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$2n + m$  equations in variables  $\theta \in \mathbb{T}^{n+m}$  and  $V_L \in \mathbb{R}_{>0}^n$ .

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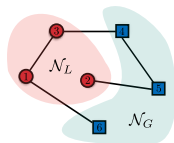
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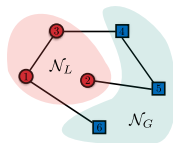
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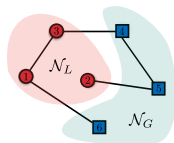
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# Why study solvability of power flow problems?

① Because it is interesting to do so

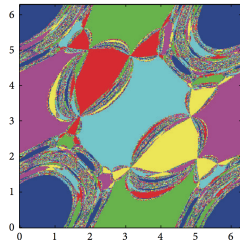
② Numerical methods

- understand convergence, divergence, and initialization issues

- **State vector:**  $x = (\theta, V)$

- **Newton iteration:**

$$x^{k+1} = x^k - J(\theta^k, V^k)^{-1} f(x^k)$$



[Deng et al.]

③ Optimal power flow

④ Transient stability

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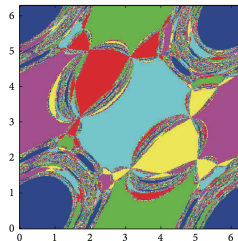
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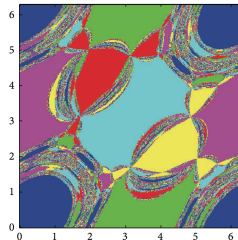
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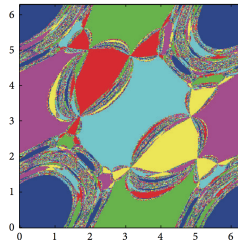
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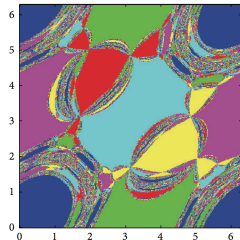
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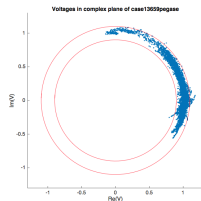
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# Intuition on power flow solutions

① 'Normally', exists unique **high-voltage** soln:

- voltage magnitude  $V_i \simeq 1$
- phase diff  $|\theta_i - \theta_j| \ll 1$



[Josz et al.]

② **Lightly loaded systems:** many **low-voltage** solutions

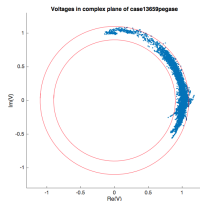
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- non-convex feasible set in  $(P, Q)$ -space

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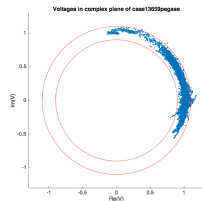
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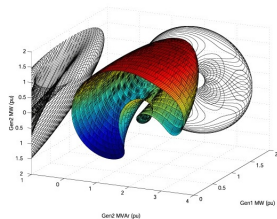


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[Hiskens & Davy]



# Mysteries of power flow

**Given data:** network topology, impedances, generation & loads

**Q:**  $\exists$  “stable high-voltage” solution? unique? properties?

Partial answers from **45+ years** of literature:

- Jacobian singularity [Weedy '67]
- Multiple dynamically stable solutions [Korsak '72]
- Existence conditions [Wu & Kumagai '80, '82]
- Active power flow singularity [Araposthatis, Sastry & Varaiya, '81]
- Counting # of solutions [Baillieul and Byrnes '82]
- Properties of quadratic equations [Makarov, Hill & Hiskens '00]
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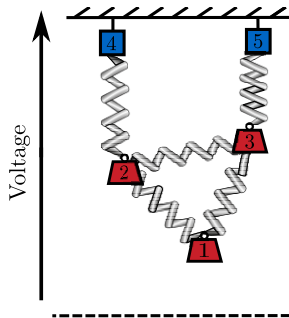
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Partial answers from **45+ years** of literature:

## Main insight: stiffness vs. loading

- 1 Stiff network + light loading  $\Rightarrow$  feasible
- 2 Weak network + heavy loading  $\Rightarrow$  infeasible

**Q:** How to quantify network stiffness vs. loading?



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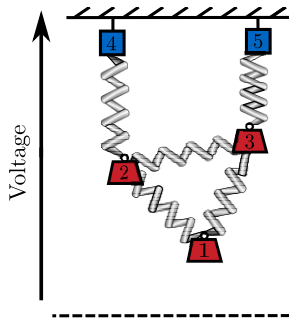
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# Solution of Two-Bus System

$$P_L = bV_G V_L \sin(-\eta)$$

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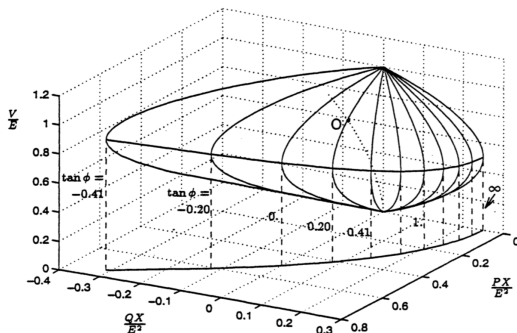
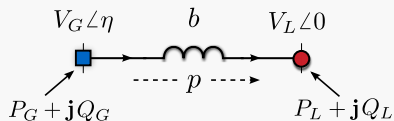
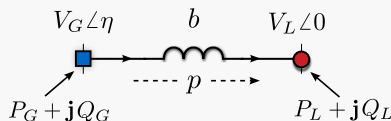


Figure 2.6 Voltage as a function of load active and reactive powers

# Solution of Two-Bus System

$$p = bV_G V_L \sin(\eta)$$
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## 1 Change Variables

$$v := \frac{V_L}{V_G} \quad \Gamma := \frac{p}{bV_G^2} \quad \Delta := \frac{Q_L}{-\frac{1}{4}bV_G^2}$$

## 2 Square equations, add, and solve quadratic in $v^2$

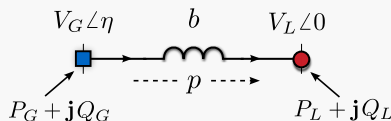
$$v_{\pm} = \sqrt{\frac{1}{2} \left( 1 - \frac{\Delta}{2} \pm \sqrt{1 - (4\Gamma^2 + \Delta)} \right)}$$

## 3 Nec. & Suff. Condition

$$4\Gamma^2 + \Delta < 1$$

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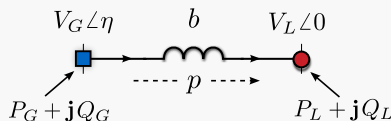
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- ① **High-voltage** solution

$$v_+ \in [\frac{1}{2}, 1)$$

- ② **Low-voltage** solution

$$v_- \in [0, \frac{1}{\sqrt{2}})$$

Angle:  $\sin(\eta_{\mp}) = \Gamma/v_{\pm}$

- ① **Small-angle** solution

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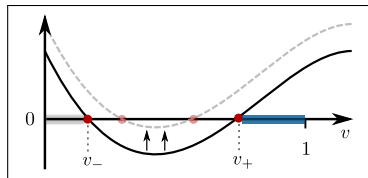
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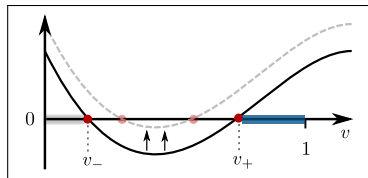
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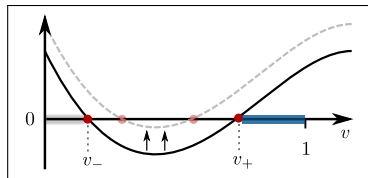
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$$v_+ \in [\frac{1}{2}, 1)$$

- ② **Low-voltage** solution

$$v_- \in [0, \frac{1}{\sqrt{2}})$$



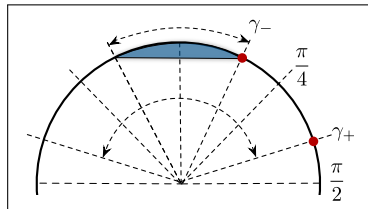
Angle:  $\sin(\eta_{\mp}) = \Gamma / v_{\pm}$

- ① **Small-angle** solution

$$\eta_- \in [0, \pi/4)$$

- ② **Large-angle** solution

$$\eta_+ \in [0, \pi/2)$$



## Solution of Two-Bus System IV

- Squaring and adding equations **does not generalize** to networks.
- Is there any hope then?

$$\begin{aligned}\Gamma &= v \sin(\eta) \\ \Delta &= -4v^2 + 4v \cos(\eta)\end{aligned}$$

- Use  $\cos(\eta) = \sqrt{1 - \sin^2(\eta)} \implies \Delta = -4v^2 + 4v \sqrt{1 - (\Gamma/v)^2}$
- Rearrange to get *fixed-point equation*

$$v = f(v) := -\frac{1}{4} \frac{\Delta}{v} + \sqrt{1 - \left(\frac{\Gamma}{v}\right)^2}$$

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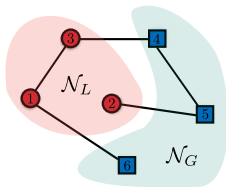
**This generalizes!**

# Network Notation I: Branches Between Bus Types

## Power Flow Equations

$$P_i = \sum_j V_i V_j B_{ij} \sin(\theta_i - \theta_j), \quad i \in \mathcal{N}_L \cup \mathcal{N}_G$$

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- Bus partitioning  $\mathcal{N} = \mathcal{N}_L \cup \mathcal{N}_G$  induces **branch partitioning**

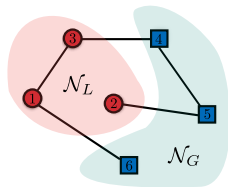
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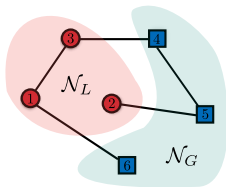
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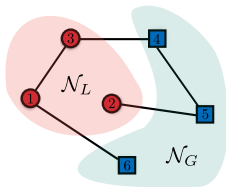
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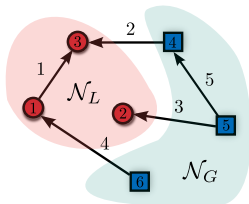
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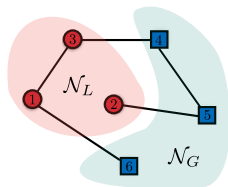
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$$V = \begin{pmatrix} V_L \\ V_G \end{pmatrix}, \quad B = \begin{pmatrix} B_{LL} & B_{LG} \\ B_{GL} & B_{GG} \end{pmatrix}$$

Open-circuit voltages

$$V_L^* \triangleq \underbrace{-B_{LL}^{-1} B_{LG}}_{\text{Generators} \rightarrow \text{Loads}} \cdot V_G$$

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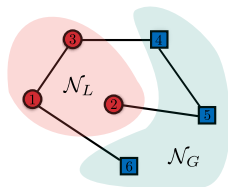
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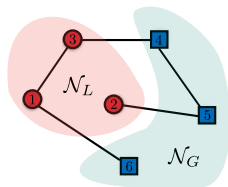
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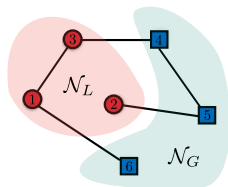
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- Need to **non-dimensionalize** power flow equations
- **Stiffness matrices** quantify **grid strength** in **units of power**

① **Nodal** stiffness matrix

$$S \triangleq \frac{1}{4} [V_L^*] \cdot B_{LL} \cdot [V_L^*]$$

② **Branch** stiffness matrix

$$D \triangleq [V_i^* V_j^* B_{ij}]_{(i,j) \in \mathcal{E}}$$

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# Main Modeling Result

## Fixed-Point Power Flow: Meshed Networks

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# New Approximate Power Flow Solution

- The model says  $v = f(v, p_c)$ , and  $\sin(A^T \theta) = \psi(v, p_c)$ .
- By construction, when  $P = Q_L = 0$ , a solution is

$$v = \mathbb{1}_n, \quad p_c = 0_c, \quad A^T \theta = 0_{|\mathcal{E}|}.$$

- **Taylor expand** FPPF model around this solution

$$A^T \theta_{\text{approx}} = A^T L^\dagger P$$

$$v_{\text{approx}} \simeq \mathbb{1}_n - \frac{1}{4} S^{-1} Q_L + \frac{1}{8} S^{-1} |A|_L D[A^T L^\dagger P] A^T L^\dagger P$$

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$$p_{c,\text{approx}} = \mathbb{0}$$

# New Approximate Power Flow Solution

- The model says  $v = f(v, p_c)$ , and  $\sin(A^T \theta) = \psi(v, p_c)$ .
- By construction, when  $P = Q_L = \mathbb{0}$ , a solution is

$$v = \mathbb{1}_n, \quad p_c = \mathbb{0}_c, \quad A^T \theta = \mathbb{0}_{|\mathcal{E}|}.$$

- **Taylor expand** FPPF model around this solution

$$A^T \theta_{\text{approx}} = A^T L^\dagger P$$

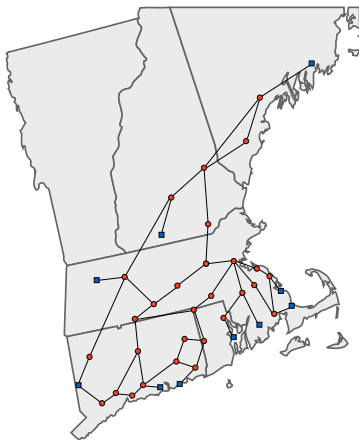
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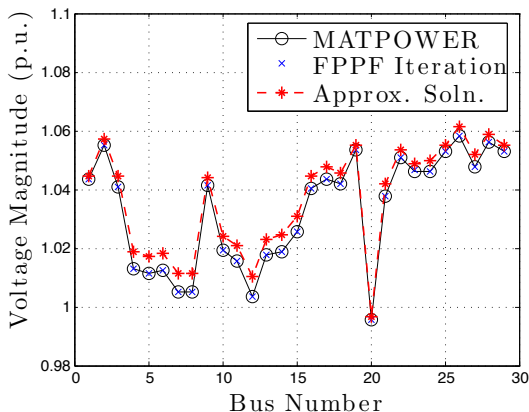
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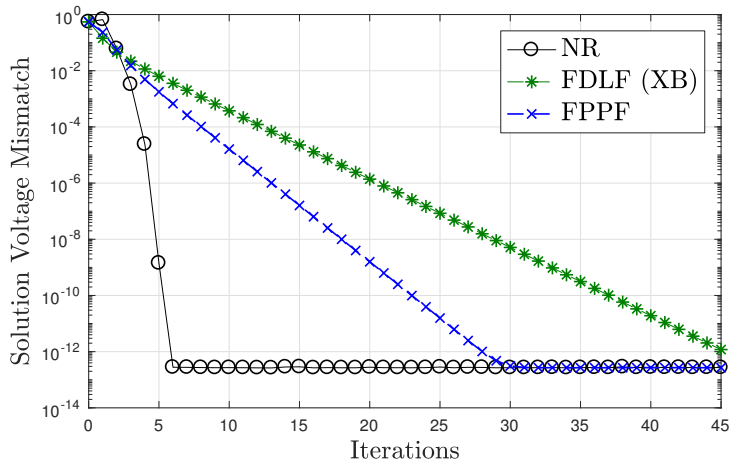
# Numerical Results I

$$\delta_{\max} = \|v - v_{\text{approx}}\|_{\infty}, \quad \delta_{\text{avg}} = \frac{1}{n} \|v - v_{\text{approx}}\|_1$$

	Base Load			High Load	
Test Case	FPPF Iters.	$\delta_{\max}$ (p.u.)	$\delta_{\text{avg}}$ (p.u.)	FPPF Iters.	$\delta_{\max}$ (p.u.)
New England 39	4	0.006	0.004	8	0.086
57 bus system	5	0.011	0.003	8	0.118
RTS '96 (3 area)	4	0.003	0.001	8	0.084
118 bus system	3	0.001	0.000	7	0.054
300 bus system	6	0.022	0.004	8	0.059
PEGASE 1,354	5	0.011	0.001	8	0.070
Polish 2,383 wp	4	0.003	0.000	8	0.078
PEGASE 2,869	5	0.015	0.002	8	0.098
PEGASE 9,241	6	0.063	0.003	9	0.133

## Numerical Results II – Convergence Rates

- IEEE 300 bus system under heavy loading



## Numerical Results III – Sensitivity to Initialization

- perturb voltage magnitude initialization randomly
- IEEE 118 bus system, base case

IC Spread ( $\alpha$ )	NR	FDLF	FPPF
0.05	0.98	0.98	1.00
0.10	0.53	0.53	1.00
0.15	0.18	0.18	1.00
0.2	0.03	0.03	1.00
0.3	0.00	0.00	1.00
0.5	0.00	0.00	1.00
0.7	0.00	0.00	0.99
0.9	0.00	0.00	0.99

- extreme insensitivity to initialization (contraction)

# FPPF Simplifies for Acyclic Networks

## Fixed-Point Power Flow: Radial Networks

$(\theta, V_L)$  is a power flow solution iff  $v$  is a fixed point of

$$f(v) \triangleq \mathbb{1}_n - \frac{1}{4}S^{-1}[Q_L][v]^{-1}\mathbb{1}_n + \frac{1}{4}S^{-1}[v]^{-1}|A|_L D[h(v)]u(v),$$

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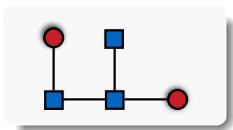
On what invariant set is  $f$  a **contraction**?

# Solvability Results for Different Acyclic Topologies



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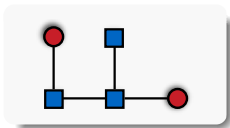
PQ buses have one PV bus neighbor



Sufficient + Necessary  
Existence + Uniqueness

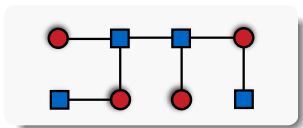
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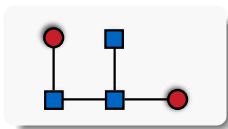
PQ buses have many PV bus neighbors



Sufficient + Tight  
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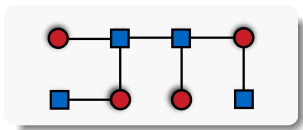
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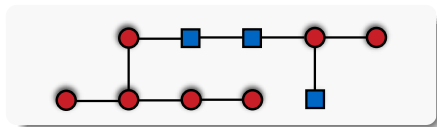
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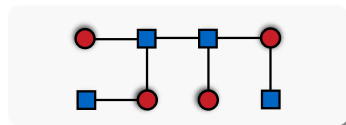
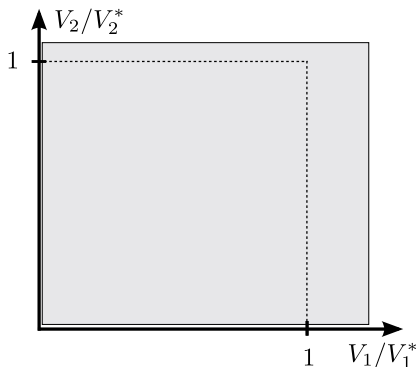
Sufficient + Tight  
Existence + Uniqueness

General interconnections



Sufficient  
Existence

# Partitioning of Voltage Space



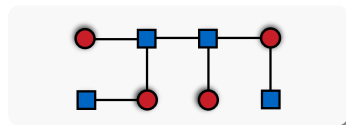
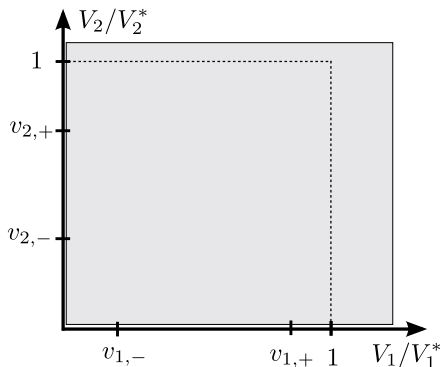
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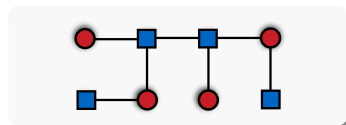
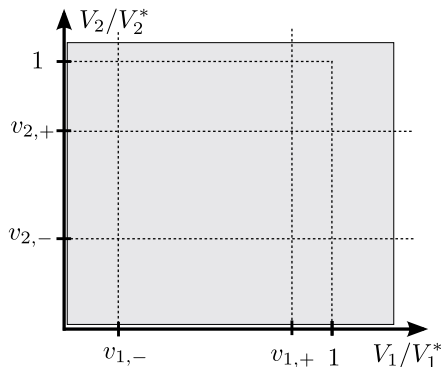
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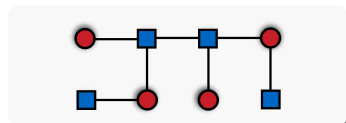
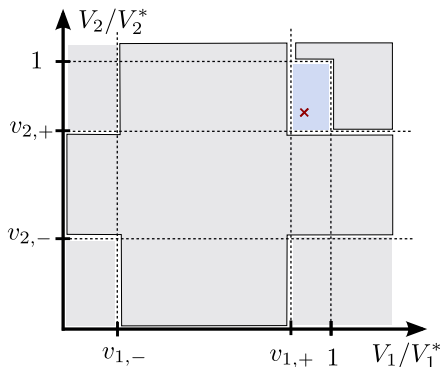
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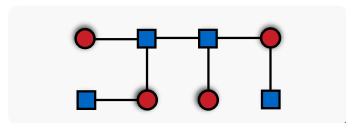
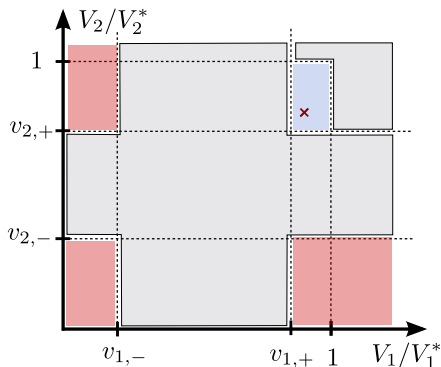
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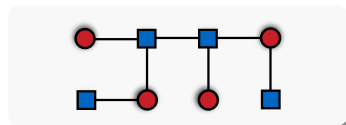
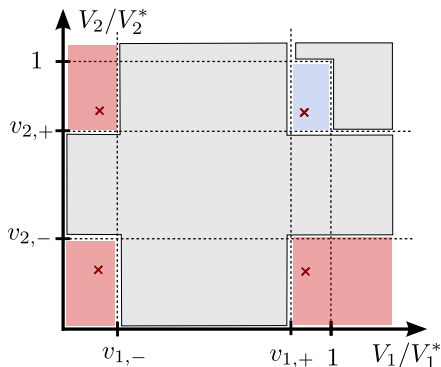
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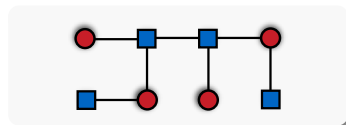
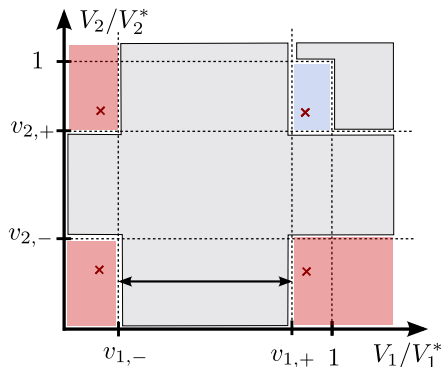
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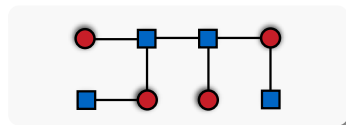
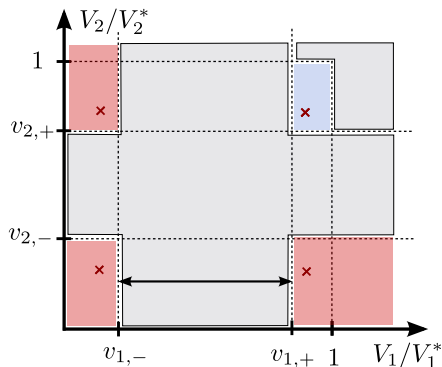
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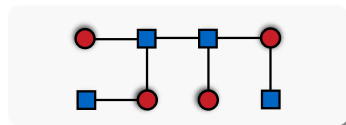
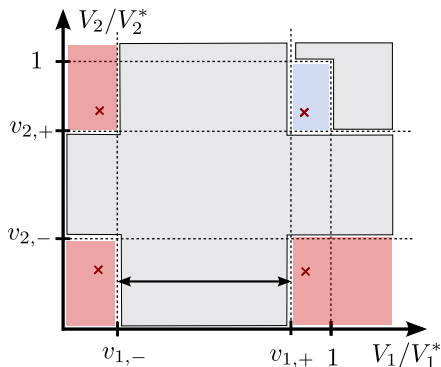
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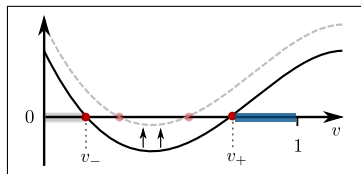
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# What About Networks with Losses?

IEEE TRANSACTIONS ON POWER SYSTEMS, VOL. 33, NO. 3, MAY 2018

2477

## Lossy DC Power Flow

John W. Simpson-Porco , *Member, IEEE*

Focus just on **active power balance** (minus slack bus)

$$P_i = \sum_j V_i V_j B_{ij} \sin(\theta_i - \theta_j) + G_{ii} V_i^2 + \sum_j V_i V_j G_{ij}$$

### Key ideas for analysis:

- 1 The case  $G = 0$  is (somewhat) well understood
- 2 (Solvability with  $G = 0$ ) +  $\|G/B\| \leq \rho \implies$  Solution?

# Decoupled Active Power Flow on Radial Networks

Let  $A_r$  be the (reduced) graph incidence matrix, and define

$$\Gamma := \|A_r^T L_r^{-1} P_r\|_\infty \quad (\text{lossless loading margin})$$

$$\rho := \|\text{diag}(B_{ij})^{-1} A_r^{-1} |A_r| \text{diag}(G_{ij})\|_\infty \quad (r/x \text{ ratio})$$

If  $\Gamma^2 + 2\Gamma\rho < 1$ , then

①  $\exists!$  soln.  $\theta^*$  satisfying  $|\theta_i^* - \theta_j^*| \leq \arcsin(\beta_-) \in [0, \frac{\pi}{2})$ , where

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# Conclusions

Framework for studying **Lossless Power Flow**:

- ① Fixed-Point Power Flow
- ② Approximate solution

A Theory of Solvability for Lossless Power Flow  
Equations — Part I: Fixed-Point Power Flow

John W. Simpson-Porco, *Member, IEEE*

New **conditions for power flow solvability**:

- ③ Contractive iteration
- ④ Existence/uniqueness
- ⑤ Generalizes known results

**What's next?**

- ① **Lossless meshed** case unresolved
- ② **Lossy radial** case unresolved
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# Conclusions

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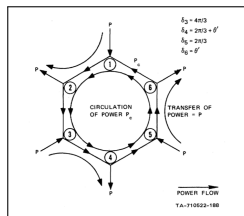
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# Questions



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# appendix

# Power flow and grid connectivity

*"[Power flow feasibility] is one question which is unresolved in power systems analysis, but which is of basic theoretical and practical importance . . . **is a given network structurally susceptible to unfeasibility?** What type and what value of injections are most likely to result in unfeasible situations?"*

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*"**Root causes of [the northeastern] blackout: lack of basic understanding of power systems . . . theoretical understanding of nonlinear power system dynamics is inadequate.** It is time for more theoretical research to develop alternatives to complement scenario-based simulation paradigm: mathematical theory to understand the complex dynamic behavior of large-scale interconnected power systems utilizing modern nonlinear mathematics."*

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