

#### Electric power networks & their conventional operation





- electric energy is our lifeblood
- purpose of electric **power grid**: generate/transmit/distribute
- **constraints**: op, econ, & stab

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- controllable fossil fuel sources
- 2 centralized bulk generation
- synchronous generators
- generation follows load
- **o** monopolistic energy markets
- I human in the loop & heuristics



- $\Rightarrow$  stochastic renewable sources
- $\Rightarrow$  distributed low-voltage generation
- $\Rightarrow$  low/no inertia power electronics
- $\Rightarrow$  controllable load follows generation
- $\Rightarrow$  deregulated energy markets
- $\mathbf{0}$  centralized top-to-bottom control  $\Rightarrow$  distributed non-hierarchical control
  - $\Rightarrow$  "smart" real-time decision making

#### **Microgrids**

#### **Structure**

- Iow-voltage distribution networks
- grid-connected or islanded
- ► autonomously managed

#### **Applications**

hospitals, military, campuses, large vehicles. & isolated communities

#### **Benefits**

- naturally distributed for renewables
- ► flexible, efficient, & reliable

#### **Operational challenges**

- volatile dynamics & low inertia
- plug'n'play & no central authority



#### Conventional control architecture from bulk power ntwks



#### 3. Tertiary control (offline)

- Goal: optimize operation
- Strategy: centralized & forecast

#### 2. Secondary control (slower)

- Goal: maintain operating point
- Strategy: centralized

#### 1. Primary control (fast)

- Goal: stabilization & load sharing
- Strategy: decentralized

Microgrids: distributed, model-free, online & without time-scale separation ⇒ break vertical & horizontal hierarchy

#### A preview – plug-and-play operation architecture

flat hierarchy, distributed, no time-scale separations, & model-free  $\ldots$ 



#### Outline

Introduction

Modeling

**Primary Control** 

**Tertiary Control** 

Secondary Control

Virtual Oscillator Control

Conclusions

we will illustrate all theorems with experiments

## modeling & assumptions



primary control



#### Decentralized primary control of active power

Emulate physics of dissipative coupled synchronous machines:

 $M_i \ddot{\theta} + D_i \dot{\theta}_i$ =  $P_i^* - \sum_j B_{ij} \sin(\theta_i - \theta_j)$ 

**Conventional wisdom:** physics are naturally stable & sync frequency reveals power imbalance



Putting the pieces together... differential-algebraic, nonlinear, large-scale closed loop network physics power balance:  $P_i^{mech} = P_i^* + P_i^c - P_i(\theta)$ power flow:  $P_i(\theta) = \sum_j B_{ij} \sin(\theta_i - \theta_j)$ droop control  $D_i \dot{\theta}_i = (P_i^* - P_i(\theta))$ 

passive loads: $0 = P_i^* - \sum_j B_{ij} \sin(\theta_i - \theta_j)$ synchronous machines: $M_i \ddot{\theta}_i + D_i \dot{\theta}_i = P_i^* - \sum_j B_{ij} \sin(\theta_i - \theta_j)$ inverter sources: $D_i \dot{\theta}_i = P_i^* - \sum_j B_{ij} \sin(\theta_i - \theta_j)$ controllable loads: $D_i \dot{\theta}_i = P_i^* - \sum_j B_{ij} \sin(\theta_i - \theta_j)$ 



## Mechanical oscillator network $\Omega_1$ Angles $(\theta_1, \ldots, \theta_n)$ evolve on $\mathbb{T}^n$ as $\Omega_1$ $M_i \ddot{\theta}_i + D_i \dot{\theta}_i = \Omega_i - \sum_j K_{ij} \sin(\theta_i - \theta_j)$ $\bullet$ $\bullet$ inertia constants $M_i > 0$ $\bullet$ $\bullet$ viscous damping $D_i > 0$ $\Omega_3$

A perspective from coupled oscillators

- external torques  $\Omega_i \in \mathbb{R}$
- spring constants  $K_{ij} \ge 0$

#### Droop-controlled power system









#### Tertiary control and energy management an offline resource allocation & scheduling problem



# The product of the p

#### Objective I: decentralized proportional load sharing

- 1) Sources have injection constraints:  $P_i(\theta) \in [0, \overline{P}_i]$
- 2) Load must be serviceable:  $0 \leq \left| \sum_{\text{loads}} P_j^* \right| \leq \sum_{\text{sources}} \overline{P}_j$
- 3) **Fairness:** load should be shared proportionally:  $P_i(\theta) / \overline{P}_i = P_j(\theta) / \overline{P}_j$



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A little calculation reveals in steady state:

 $\frac{P_{i}(\theta)}{\overline{P}_{i}} \stackrel{!}{=} \frac{P_{j}(\theta)}{\overline{P}_{j}} \implies \frac{P_{i}^{*} - (D_{i}\omega_{sync} - \omega^{*})}{\overline{P}_{i}} \stackrel{!}{=} \frac{P_{j}^{*} - (D_{j}\omega_{sync} - \omega^{*})}{\overline{P}_{i}}$ ... so choose  $\frac{P_{i}^{*}}{\overline{P}_{i}} = \frac{P_{j}^{*}}{\overline{P}_{i}} \text{ and } \frac{D_{i}}{\overline{P}_{i}} = \frac{D_{j}}{\overline{P}_{i}}$ 

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Theorem: fair proportional load sharing [J. Simpson-Porco, FD, & F. Bullo, '12] Let the droop coefficients be selected **proportionally**:

$$\boxed{D_i/\overline{P}_i = D_j/\overline{P}_j \& P_i^*/\overline{P}_i = P_j^*/\overline{P}_j}$$

The the following statements hold:

- (i) Proportional load sharing:  $P_i(\theta) / \overline{P}_i = P_j(\theta) / \overline{P}_j$
- (ii) Constraints met:  $0 \le \left| \sum_{\text{loads}} P_j^* \right| \le \sum_{\text{sources}} \overline{P}_j \iff P_i(\theta) \in [0, \overline{P}_i]$



Objective II: economic generation dispatch minimize the total accumulated generation (many variations possible)	
minimize $_{\theta \in \mathbb{T}^n}$ , $_{u \in \mathbb{R}^{n_l}}$	$f(u) = \sum_{\text{sources}} \alpha_i u_i^2$
subject to	
source power balance:	$P_i^* + u_i = P_i(\theta)$
load power balance:	$P_i^* = P_i(\theta)$
branch flow constraints:	$  heta_i -  heta_j  \le \gamma_{ij} < \pi/2$

Unconstrained case: identical marginal costs  $\alpha_i u_i^* = \alpha_j u_j^*$  at optimality

In conventional power system operation, the economic dispatch is

solved offline, in a centralized way, & with a model & load forecast

In a grid with distributed energy resources, the economic dispatch should be

• solved online, in a decentralized way, & without knowing a model

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#### Objective II: decentralized dispatch optimization

**Insight:** droop-controlled system = decentralized primal/dual algorithm

Theorem: optimal droop [FD, Simpson-Porco, & Bullo '13, Zhao, Mallada, & FD '14]

The following statements are equivalent:

- (i) the economic dispatch with cost coefficients  $\alpha_i$  is strictly feasible with global minimizer  $(\theta^*, u^*)$ .
- (ii)  $\exists$  droop coefficients  $D_i$  such that the power system possesses a unique & locally exp. stable sync'd solution  $\theta$ .

If (i) & (ii) are true, then  $\theta_i \sim \theta_i^*$ ,  $u_i^* = -D_i(\omega_{sync} - \omega^*)$ , &  $\left| D_i \alpha_i = D_j \alpha_j \right|$ .

- recover load sharing for  $\alpha_i \propto 1/\overline{P}_i$  & similar results in constrained case
- similar results in transmission ntwks with DC flow [E. Mallada & S. Low, '13]
   & [N. Li, L. Chen, C. Zhao, & S. Low '13] & [X. Zhang & A. Papachristodoulou, '13] &
   [M. Andreasson, D. V. Dimarogonas, K. H. Johansson, & H. Sandberg, '13] & ... 16/32

#### Some quick simulations & extensions



## secondary control (frequency regulation)



#### Conventional secondary frequency control in power systems



#### Distributed Averaging PI (DAPI) control

$$D_{i}\dot{\theta}_{i} = P_{i}^{*} - P_{i}(\theta) - \Omega_{i}$$
  
$$k_{i}\dot{\Omega}_{i} = D_{i}\dot{\theta}_{i} - \sum_{j \subseteq \text{sources}} a_{ij} \cdot (\alpha_{i}\Omega_{i} - \alpha_{j}\Omega_{j})$$

- no tuning & no time-scale separation: k<sub>i</sub>, D<sub>i</sub> > 0
- distributed & modular: connected comm. ⊆ sources
- recovers primary op. cond.
   (load sharing & opt. dispatch)
- $\Rightarrow$  plug'n'play implementation





#### Plug'n'play architecture flat hierarchy, distributed, no time-scale separations, & model-free source # 1source # 2source # n Transceiver Transceiver Transceiver Secondary Secondary Secondary Tertiary Tertiary Tertiary Control Control Control Control Control Control Primary Primary Primary Control Control Control Power System

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Experimental validation of control & opt. algorithms

#### Experimental validation of control & opt. algorithms

frequency/voltage regulation & active/reactive load sharing



what can we do better?

algorithms, detailed models, cyber-physical aspects, ...

today: virtual oscillator control

#### Removing the assumptions of droop control

- idealistic assumptions: quasi-stationary operation & phasor coordinates
- $\Rightarrow~$  future grids: more power electronics & renewables and fewer machines
- droop control = coupled phase oscillators constrained to limit-cycle
- ⇒ Virtual Oscillator Control: control inverters as limit cycle oscillators [Torres, Moehlis, & Hespanha, '12, Johnson, Dhople, Hamadeh, & Krein, '13]



stable sustained oscillations



dynamic behavior of droop control

digitally implemented VOC 25/32



#### Crash course on planar limit cycle oscillators





- the origin & positive elsewhere
- $\Rightarrow$  unique & stable limit cycle



stable sustained oscillations





#### Co-evolution: "dynamic process over dynamic network"

#### Nonlinear oscillators:

- passive circuit impedance  $z_{ckt}(s)$
- active current source g(v)

#### **Co-evolving network:**

- RLC network is LTI
- Kron reduction: eliminate loads

#### Homogeneity assumptions:

- identical oscillators & local loads after Kron reduction
  - $\rightsquigarrow$  perfect sync of waveforms



Kron reduction

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#### Time-domain analysis

#### [S. Dhople, B. Johnson, FD, & A. Hamadeh, '13]





$$\overbrace{\Pi i}^{\mathcal{F}(Z_{\mathrm{ckt}}(s), Y_{\mathrm{red}}(s))} \overbrace{\Pi v}^{\mathcal{F}(Z_{\mathrm{ckt}}(s), Y_{\mathrm{red}}(s))}$$

frequency domain **sync** criterion:

"stability of  $\mathcal{F}$ " > "instability of g"

apply Lure system analysis: passivity, L<sub>2</sub> small-gain, IQC,...

 $\Rightarrow$  sync problem  $\rightsquigarrow$  stability problem

**4** Liénard limit-cycle condition: sync'd & decoupled system oscillates if

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"instability of g" > "local dissipation" for heterogeneous systems?
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#### many open questions:

- some IQCs work only for some networks
- sync analysis of heterogeneous VOCs
- nonlinear constant power load models
- secondary amplitude & frequency control
- • •



#### Conclusions

#### Summary

- primary  $P/\dot{\theta}$  droop control
- new quadratic droop control
- fair proportional load sharing & economic dispatch optimization
- distributed secondary control strategies based on averaging
- virtual oscillator control
- experimental validation

#### Ongoing work & next steps

- better models & sharper analysis
- other energy management tasks
- solve these problems without comm
- many open problems for VOC inverters



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### addendum: proof of optimality of droop control

#### Key ingredients of the proof

**O** convexification via flow bijection:

AC flow:  $P_i = \sum_i B_{ij} \sin(\theta_i - \theta_j)$  DC flow:  $P_i = \sum_i B_{ij} (\delta_i - \delta_j)$ 

The flow map  $sin(\theta_i - \theta_i) = (\delta_i - \delta_i)$  is bijective in acyclic networks.

Argument can be extended to cyclic networks [C. Zhao, E. Mallada, & FD, '14]

- ② droop control is surjective & 1-to-1: ∃ droop coefficients to uniquely reach every feasible steady-state (with flow & injection constraints)
- **S** KKT conditions = steady state & identical marginal costs (= frequs)

 $\frac{\partial \mathcal{L}}{\partial \theta_{i}} = 0: \ 0 = \sum_{j} \lambda_{j} \cdot \frac{\partial P_{j}(\theta)}{\partial \theta_{i}} \qquad \frac{\partial \mathcal{L}}{\partial \lambda_{i}} = 0: \ -u_{i} = P_{i}^{*} - P_{i}(\theta) \text{ (controllable)}$  $\frac{\partial \mathcal{L}}{\partial u_{i}} = 0: \ 2\alpha_{i}u_{i} = -\lambda_{i} \qquad \qquad \frac{\partial \mathcal{L}}{\partial \lambda_{i}} = 0: \ 0 = P_{i}^{*} - P_{i}(\theta) \text{ (passive)}$ 

**4** droop-controlled **dynamics** converge to stable KKT steady state

#### addendum: reactive power



#### Intuition extends to complex networks - essential insights









#### Closed-loop stability under quadratic droop control



#### secondary control of reactive power

Active & reactive power DAPI control

DAPI control for reactive power sharing [J. Simpson-Porco, FD, & F. Bullo, '12]

$$D_{i}\dot{\theta}_{i} = P_{i}^{*} - P_{i}(\theta) - \Omega_{i}$$
  

$$\tau_{i}\dot{E}_{i} = -C_{i}E_{i}(E_{i} - E_{i}^{*}) - Q_{i}(E) - e_{i}$$
  

$$\kappa_{i}\dot{\Omega}_{i} = D_{i}\dot{\theta}_{i} - \sum_{j \subseteq \text{ sources}} a_{ij} \cdot \left(\frac{\Omega_{i}}{D_{i}} - \frac{\Omega_{j}}{D_{j}}\right)$$
  

$$\kappa_{i}\dot{e}_{i} = -\sum_{j \subseteq \text{ sources}} a_{ij} \cdot \left(\frac{Q_{i}}{\overline{Q}_{i}} - \frac{Q_{j}}{\overline{Q}_{j}}\right) - \varepsilon e_{i}$$

**Reactive DAPI control** =  $(quadratic droop) \cap ((injection ratio averaging) \cup \varepsilon \cdot (voltage regulation))$ 

- Case  $\varepsilon \to \infty \Rightarrow$  steady-state voltage regulation
- Case  $\varepsilon \to 0 \Rightarrow$  reactive load sharing (with non-unique voltages) [J. Schiffer, T. Seel, J. Raisch, & T. Sezi, '14] & [L.Y. Yu & C.C. Chu '14]

#### Active & reactive power DAPI control

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