



UNIVERSITÀ DEGLI STUDI DI PALERMO

DEIM – Dipartimento di Energia, Ingegneria della Informazione e Modelli Matematici

# Microgrids Optimal Power Flow through centralized and distributed algorithms

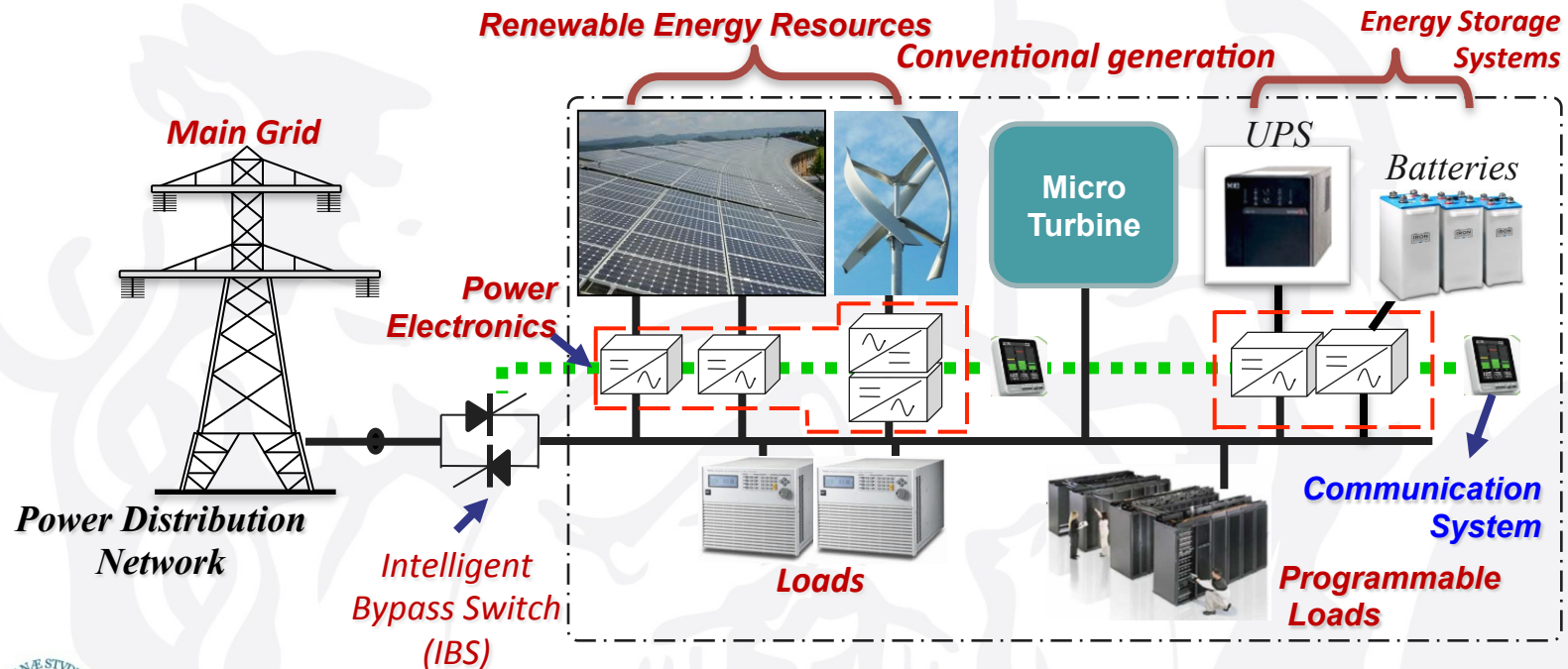
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Clean energy in vietnam after COP21  
Hanoi, december 2015

# Background

**Microgrids** are groups of interconnected loads and Distributed Energy Resources, DER, with clearly defined electrical boundaries acting as a single controllable entity as compared to the main grid and can operate in grid connected or islanded modes.

## *Typical structure of a flexible Microgrid*



# Background

Most part of generation units in Microgrids are inverter interfaced units. They are controlled by means of a **hierarchical control** architecture implemented through suitable control of Voltage Source Inverters control operating points interfacing ESS (Wind and Solar are in MPPT).

## Primary regulation

The droop-control method is often used in this level to emulate physical behaviors that makes the system stable and more damped. It can include a virtual impedance control loop to emulate physical output impedance.

### **VIRTUAL INERTIA**

## Secondary regulation

Ensures that the electrical levels into the MG are within the required values. In addition, it can include a synchronization control loop to seamlessly connect or disconnect the MG to or from the distribution system

## Tertiary regulation and EMS are different in grid connected and islanded modes

# Background

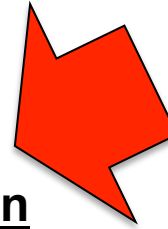
Most part of generation units in Microgrids are inverter interfaced units. They are controlled by means of a **hierarchical control architecture**.

## GRID CONNECTED MG Tertiary regulation

This energy-production level controls the power flow between the MG and the grid. It may take care of **sharing** the request among generating units, based on COST effective sharing and **TECHNICALLY FEASIBLE** power sharing

## ISLANDED MG Tertiary regulation

At this level, both COST effective power sharing and **TECHNICALLY FEASIBLE** power **sharing** should be considered, still considering **stability issues**.



**Energy management systems** optimally dispatch the energy resources of the MG



# Background

EMS try to compensate load request in each elementary time interval, **since frequency variations and voltage drops depend on differences between production and consumption:**

- **Production follows slowly consumption (when?)**
- **Production is too far from consumption (where?)**



# Optimal Power Flow Problem formulation in islanded systems

## *Minimize Losses and/or Costs*

Variables: [set points of inverter interfaced units (P,Q); droop parameters of gens]

Under the following constraints:

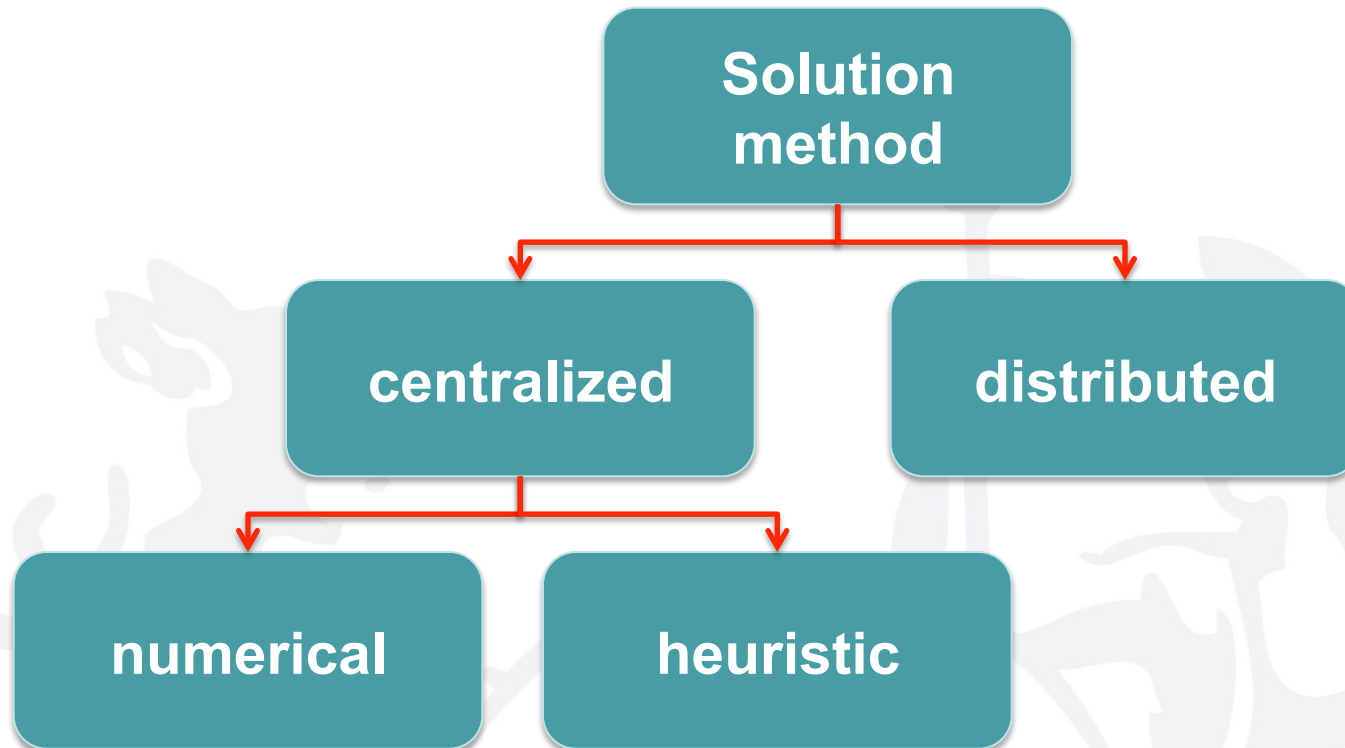
Load flow equations (f)

Voltage drop below x%

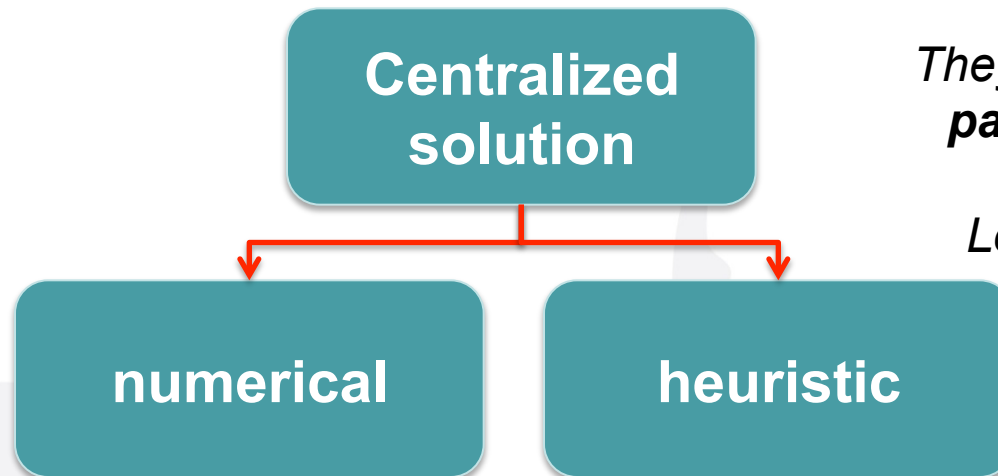
Current in branches below  $I_{lim}$

*If losses are considered, the problem is strongly **non linear** and is not solvable with standard OPF methods. There is no slack bus available, **when the grid is operated in islanded mode.***

# Optimal Power Flow Problem formulation



# Optimal Power Flow centralized solution



*They both handle **droop parameters** of inverter interfaced units. Loads and generators model accounts for **frequency***

- Uses Lagrange multipliers
- Is iterative
- Is deterministic
- It cannot manage unbalanced loads
- It cannot efficiently account for constraints

- Uses GSO
- Is iterative
- It can manage unbalanced loads
- It can efficiently account for constraints

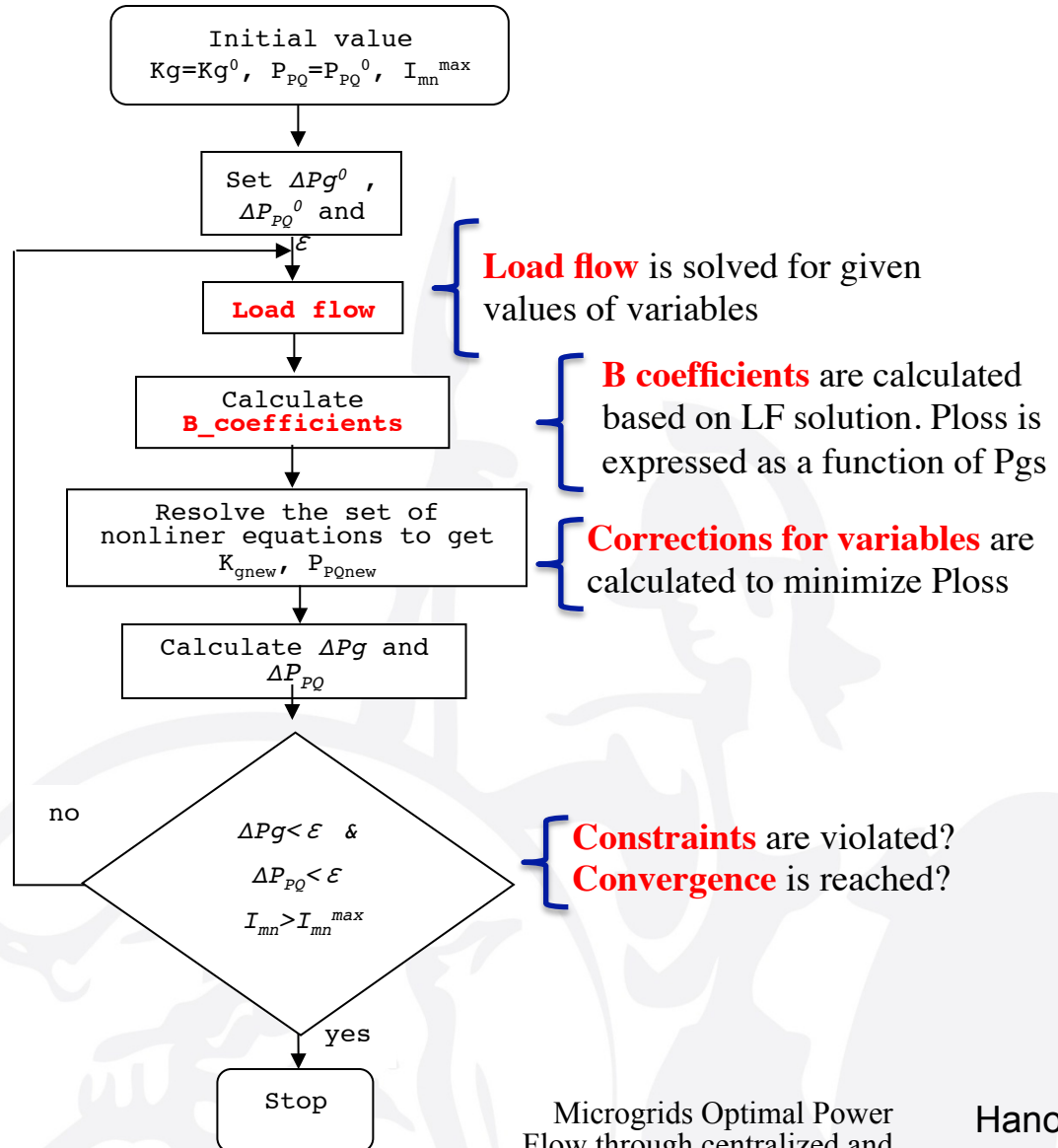


# Optimal Power Flow centralized numerical solution

## Comments

Uses Kron's formula, thus:

- Unbalanced loads cannot be considered
- Reactive generation cannot be accounted for



# Optimal Power Flow centralized heuristic solution

## Comments

- Unbalanced loads can be considered
- Reactive generation can be accounted for
- Constraints can be included

*Initialize Archive A*  
*Repeat Until **Termination***

## **Condition**

*Do m times*

*Step 1: deterministic **choice (selection)** of the base vector*

*Step 2: probabilistic **choice (selection)** of the target vector (Roulette Wheel technique based on  $l(t)$ )*

*Step 3: **recombination***

*END m*

*Step 4: create **new population (replace A)***

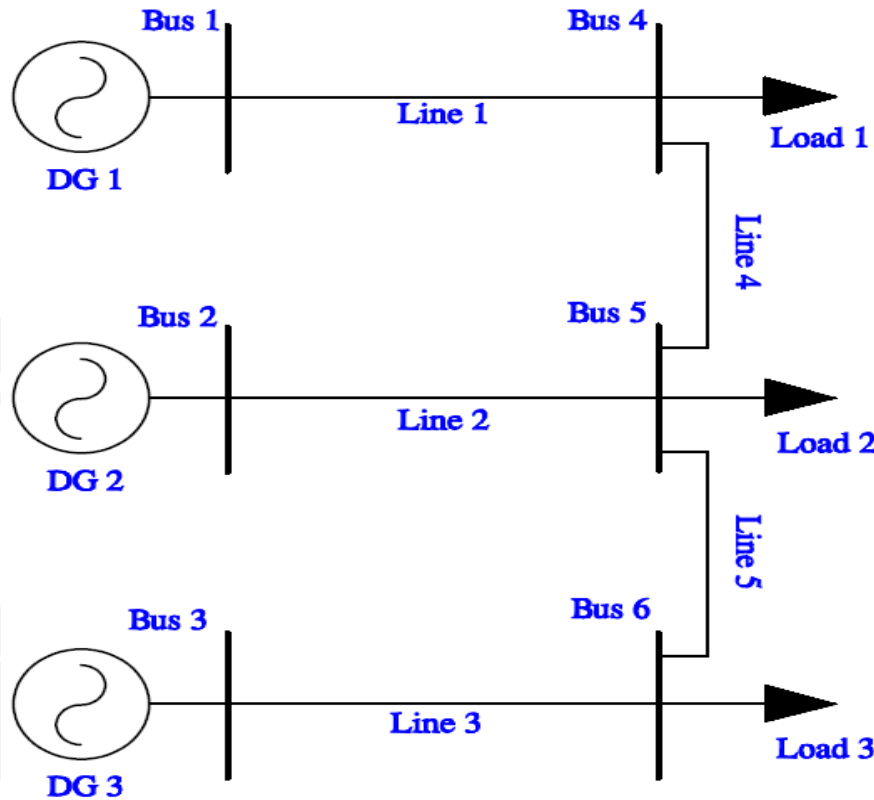
*END*

**A= archive**

**m=archive size**



# Test system



G1, G2 and G3 are inverter interfaced units



# Results

Result of optimal load flow on 6\_bus system by Lagrange method taking into account Kgs, pu

<b>KG1</b>	<b>KG2</b>	<b>KG3</b>	<b>Plossmin</b>	<b>f</b>
19.8331	10.3798	22.1034	0.0178887	1.0525

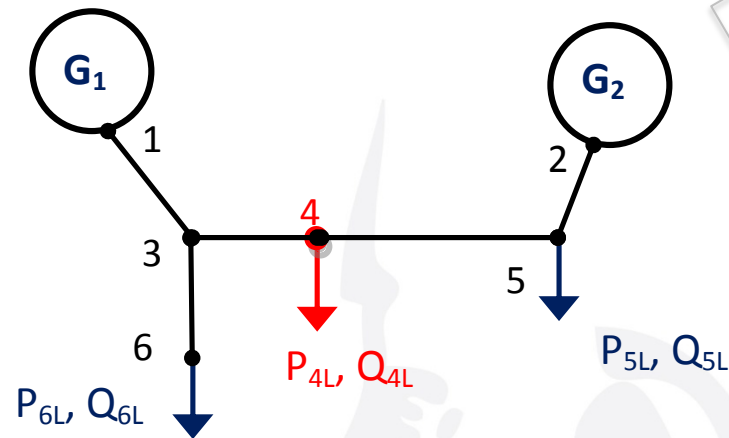
Result of optimal load flow on 6\_bus balanced system by GSO Heuristic method taking into account Kgs, pu

<b>Random</b>	<b>KG1</b>	<b>KG2</b>	<b>KG3</b>	<b>Plossmin</b>	<b>f</b>
1	17.8094	8.5080	21.2252	0.0178565	1.0507
2	16.8141	8.0211	20.0541	0.0178565	1.0496
3	20.9933	10.0258	25.0000	0.0178565	1.0536
4	19.5054	9.2860	23.2543	0.0178565	1.0524
5	18.0566	8.5681	21.5628	0.0178565	1.0509
6	20.4090	9.7189	24.3476	0.0178565	1.0531
7	15.1747	7.2123	18.1372	0.0178565	1.0473
8	19.9132	9.5046	23.7349	0.0178565	1.0527
9	18.3848	8.7741	21.9239	0.0178565	1.0513
10	15.5311	7.4100	18.5159	0.0178565	1.0479



# Optimal Power Flow distributed Heuristic solution

UNDER  
DEVELOPMENT



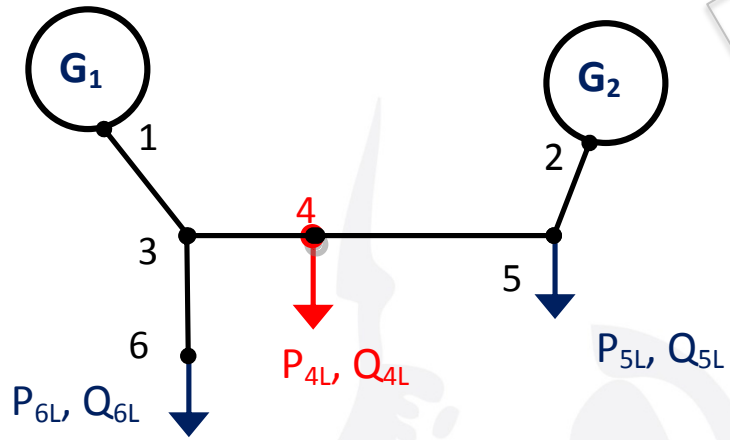
3 steps similar to **reinforcement learning**:

- 1) Power flow tracing
- 2) Backward phase: Starting from sink buses, go backwards, calculate losses and for each branch produce an elementary correction for the generation bus
- 3) Forward phase: Starting from generation buses, go forward, calculate updated power losses and generate a correction on some parameters affecting the search



# Optimal Power Flow distributed Heuristic solution

UNDER DEVELOPMENT



Generated Power, Learning Procedure and Ploss of Cases

	Generated Power		Learning Procedure			Ploss, W
	Pg1, W	Pg2, W	yt	W43	W54	
New 0	41721	30000	1	0.84	0.16	1883.33
New 1	40825	26445	1	0.51	0.11	1521.32
New 2	39976	26907	0	0.23	1.04	1502.47
New 3	39158	27388	1	0.23	1.04	1486.53

*Weights account for the intensity of the correction produced by the PL calculation on a given branch to the relevant generation source*

Both generators reduce their injection because the power losses get strongly reduced.



# Conclusions: OPF in microgrids

