The DC Optimal Power Flow Quantitative Energy Economics

Anthony Papavasiliou





Transmission Constraints

Lines can carry a limited amount of power

- Thermal limits
- Stability limits
- Voltage drop limits

Kirchhoff voltage and current laws

- Non-linear mapping: power injection in buses \rightarrow power flow in lines
- We will linearize these

Optimal power flow problem (OPF): Maximize welfare (minimize cost) subject to Kirchhoff laws + transmission limits

Transmission system is represented as a directed graph

- N: set of nodes
- *K*: set of lines (denoted by k = (m, n))
- G_n : set of generators located in node $n, G = \bigcup_{n \in N} G_n$
- L_n : set of loads located in node $n, L = \bigcup_{n \in N} L_n$

Decisions:

- *p_g*: amount of power produced by generator *g*
- d_l: amount of power consumed by load l

Two *equivalent* models, depending on system state and input data:

- Model 1
 - System state: nodal injections
 - Input data: power transfer distribution factors (depend on physical characteristics of lines)
- Model 2
 - System state: nodal phase angles
 - Input data: reactance (depend on physical characteristics of lines)



2 The OPF Using Reactance

Model 1: Power Transfer Distribution Factors



Hub node: reference node that "absorbs" all injections

Injection r_n : amount of power shipped from node n to the hub

$$r_n = \sum_{g \in G_n} p_g - \sum_{l \in L_n} d_l$$

Not amount of power flowing over line connecting n and hub

Conservation of energy:

$$\sum_{n\in N}r_n=0$$

Power Flows

Power transfer distribution factor (PTDF) (F_{kn}): amount of power flowing on line *k* as a result of shipping 1 MW from *n* to hub

- $F_{\text{hub},n} = 0$
- PTDF: input data, depend on physical characteristics of lines
- PTDF depend on choice of hub
- Flow *f_k* is

$$f_k = \sum_{n \in N} F_{kn} r_n$$

- Flow can be positive or negative (interpretation?)
- *T_k*: limit on power that each line can carry

$$-T_k \leq f_k \leq T_k$$

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Example

All lines have identical electrical characteristics



- Express shipment of 30 MW from 1 to 2 as transaction through hub
- Occupie flow f_{1-2} from steps 1, 2
- Note: r₁ and f_{1-hub} are different

The OPF Using PTDFs

$$\max \sum_{l \in L} \int_{0}^{d_{l}} MB_{l}(x) dx - \sum_{g \in G} \int_{0}^{p_{g}} MC_{g}(x) dx$$
$$(\lambda_{k}^{+}): f_{k} \leq T_{k}$$
$$(\lambda_{k}^{-}): -f_{k} \leq T_{k}$$
$$(\psi_{k}): f_{k} - \sum_{n \in N} F_{kn} r_{n} = 0$$
$$(\rho_{n}): r_{n} - \sum_{g \in G_{n}} p_{g} + \sum_{l \in L_{n}} d_{l} = 0$$
$$(\phi): \sum_{n \in N} r_{n} = 0$$
$$p_{g}, d_{l} \geq 0$$

Denote P_g , D_l as maximum production/consumption of generators/loads (imposed through domain of objective function)

There exists a threshold ρ_n for all *n* such that:

- If $0 < p_g < P_g$, then $\rho_n = MC_g(p_g)$. If $0 < d_l < D_l$, then $\rho_n = MB_l(d_l)$.
- If $p_g = P_g$, then $\rho_n \ge MC_g(P_g)$. If $d_l = D_l$, then $\rho_n \le MB_l(D_l)$.
- If $p_g = 0$, then $\rho_n \leq MC_g(0)$. If $d_l = 0$, then $\rho_n \geq MB_l(0)$.

Proof: KKT conditions

$$0 \le p_g \perp MC_g(p_g) - \rho_{n(g)} \ge 0$$
$$0 \le d_l \perp -MB_l(d_l) + \rho_{n(l)} \ge 0$$

- *n*(*g*): node where generator *g* is located
- n(1): node where load I is located

Helpful in understanding transmission pricing

- φ: marginal change in welfare from marginal increase in production/marginal decrease in consumption
- λ_k^+ and λ_k^- : marginal impact of increasing line capacity
- *ρ_n*: marginal impact of marginal increase of consumption/decrease of generation in node *n* (what if demand is inelastic?)

What sign do we expect for these dual variables?

Useful identity for computing prices:

$$\rho_{n} = -\phi + \sum_{k \in K} F_{kn} \lambda_{k}^{-} - \sum_{k \in K} F_{kn} \lambda_{k}^{+}$$

Proof: KKT conditions





Case 1

• $D_2 = 50$ MW, T_{1-2} unlimited

•
$$\rho_1 = \rho_2 = 20$$
 //MWh

Case 2

• $D_2 = 50$ MW, $T_{1-2} = 50$ MW

• $\rho_1 =$ 20 \$/MWh, 20 \$/MWh $\leq \rho_2 \leq$ 40 \$/MWh

Case 3

- $D_2 = 60$ MW, $T_{1-2} = 50$ MW
- $\rho_1 = 20$ /MWh, $\rho_2 = 40$ /MWh

Can you explain multiplier values?





Model 2: Reactance



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- Reactance: input data, depends on physical characteristics of lines
- Independent on choice of hub
- Flow f_k is

$$f_{(m,n)} = B_{(m,n)}(\theta_m - \theta_n)$$

- Translation of θ results in identical flows, fix $\theta_{hub} = 0$
- Conservation of energy:

$$\sum_{g\in G_n} p_g + \sum_{k=(\cdot,n)} f_k = \sum_{k=(n,\cdot)} f_k + \sum_{l\in L_n} d_l.$$

 Input data is independent of network topology: transmission line investment, transmission line outages

The OPF Using Reactance

$$\max \sum_{l \in L} \int_{0}^{d_{l}} MB_{l}(x) dx - \sum_{g \in G} \int_{0}^{p_{g}} MC_{g}(x) dx$$
$$(\rho_{n}): \quad -\sum_{g \in G_{n}} p_{g} - \sum_{k=(\cdot,n)} f_{k} + \sum_{l \in L} d_{l} + \sum_{k=(n,\cdot)} f_{k} = 0$$
$$(\gamma_{k}): \quad f_{k} - B_{k}(\theta_{m} - \theta_{n}) = 0, k = (m, n)$$
$$(\lambda_{k}^{+}): \quad f_{k} \leq T_{k}$$
$$(\lambda_{k}^{-}): \quad -f_{k} \leq T_{k}$$
$$p_{g}, d_{l} \geq 0$$

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