

DEPARTMENT OF ELECTRICAL AND ELECTRONIC
ENGINEERING

EEEN60321/40321 POWER SYSTEM OPERATION AND
ECONOMICS

**Economic Dispatch, Optimal Power Flow
and Security Constrained OPF
Laboratory Report**

Vinodh Jayakrishnan

Student ID : 10877410

vinodh.jayakrishnan@postgrad.manchester.ac.uk

Version 1.0

August 21, 2022

1 Introduction

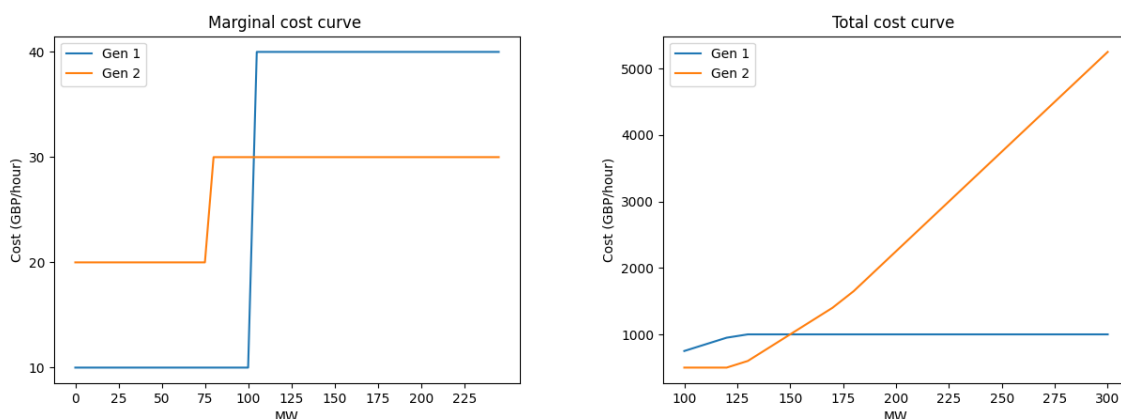
In Electrical Power System, energy as a commodity is define as MWh at a given time and a given location, with a given level of supply security. (Levi, 2020). Power System Operational planning includes energy trade economics and safety parameters. Selection of generators and level of security is carried out using three major techniques called Power Flow(PF), Economic Dispatch(ED) and Optimal Power Flow(OPF). This report contains usage and explanation of these techniques, its outcomes used for decision making, and the key differences between them.

2 Economic Dispatch

The cost of generating a unit of power at different circumstances has to be minimized to maximize the profit. When multiple generators of varying specifications are part of the system, the choice of generators to provide the ever changing consumer load is decided by economic dispatch. Ideally, the cheapest generator should provide for all the loads in the system, but practically, there are numerous constraints that does not allow this, and hence increases the cost. For e.g. the upper limit of generation capacity. The purpose of economic dispatch is to minimize costs or maximise the profit. ED does not concern with transmission line network capabilities. This section looks at economic dispatch for a two generator system.

2.1 Marginal Costs and Total Costs

The marginal costs of a generator represents the cost of next unit of energy to be produced when demanded by load. Marginal Costs could be represented by a linear function or a piece-wise linear function. In the case below, marginal cost of two generators are represented as piece-function. Generator 1 is cheaper until 100MW load. The total cost plateaus at £1000 for Generator 1 and ED restricts its generation in normal generation condition. The total costs for Generator 2 is steadily increasing as it is providing the increase in load.



2.2 Normal Conditions

For the two generator system, the load is increased from 100MW to 300MW in steps of 10. The generator output and total costs at each step are recorded in the table below. Under normal conditions, as seen from the marginal cost curve, Generator 1 is cheap until 100MW

load, after that point, Generator 2 takes over the supply of load. Inequality constraints with respect to the lower limit of Generators are considered at all steps.

2.3 Reduced Generation Capacity

For the two generator system, the load is increased from 100MW to 300MW in steps of 10. The generator output and total costs at each step are recorded in the table below. Under reduced generation conditions, Generator 2 has a upper limit of 150MW. Once it hits the limit, Generator 2 is asked to supply the remaining load even though it is pricier. Inequality constraints with respect to the lower limit of Generators are considered at all steps.

2.4 Simulation Results

| Load (MW) | Gen 1 (MW) | Gen 2 (MW) | G1 (£/hr) | G2 (£/hr) | Gen 1 (MW) | Gen 2 (MW) | G1 (£/hr) | G2 (£/hr) |
|--------------|---------------|---------------|--------------|--------------|---------------|---------------|--------------|--------------|
| 100 | 75 | 25 | 750 | 500 | 75 | 25 | 750 | 500 |
| 110 | 85 | 25 | 850 | 500 | 85 | 25 | 850 | 500 |
| 120 | 95 | 25 | 950 | 500 | 95 | 25 | 950 | 500 |
| 130 | 100 | 30 | 1000 | 600 | 100 | 30 | 1000 | 600 |
| 140 | 100 | 40 | 1000 | 800 | 100 | 40 | 1000 | 800 |
| 150 | 100 | 50 | 1000 | 1000 | 100 | 50 | 1000 | 1000 |
| 160 | 100 | 60 | 1000 | 1200 | 100 | 60 | 1000 | 1200 |
| 170 | 100 | 70 | 1000 | 1400 | 100 | 70 | 1000 | 1400 |
| 180 | 100 | 80 | 1000 | 1650 | 100 | 80 | 1000 | 1650 |
| 190 | 100 | 90 | 1000 | 1950 | 100 | 90 | 1000 | 1950 |
| 200 | 100 | 100 | 1000 | 2250 | 100 | 100 | 1000 | 2250 |
| 210 | 100 | 110 | 1000 | 2550 | 100 | 110 | 1000 | 2550 |
| 220 | 100 | 120 | 1000 | 2850 | 100 | 120 | 1000 | 2850 |
| 230 | 100 | 130 | 1000 | 3150 | 100 | 130 | 1000 | 3150 |
| 240 | 100 | 140 | 1000 | 3450 | 100 | 140 | 1000 | 3450 |
| 250 | 100 | 150 | 1000 | 3750 | 100 | 150 | 1000 | 3750 |
| 260 | 100 | 160 | 1000 | 4050 | 110 | 150 | 1400 | 3750 |
| 270 | 100 | 170 | 1000 | 4350 | 120 | 150 | 1800 | 3750 |
| 280 | 100 | 180 | 1000 | 4650 | 130 | 150 | 2200 | 3750 |
| 290 | 100 | 190 | 1000 | 4950 | 140 | 150 | 2600 | 3750 |
| 300 | 100 | 200 | 1000 | 5250 | 150 | 150 | 3000 | 3750 |

2.5 Analysis

Given the cost function and constraints for generators:

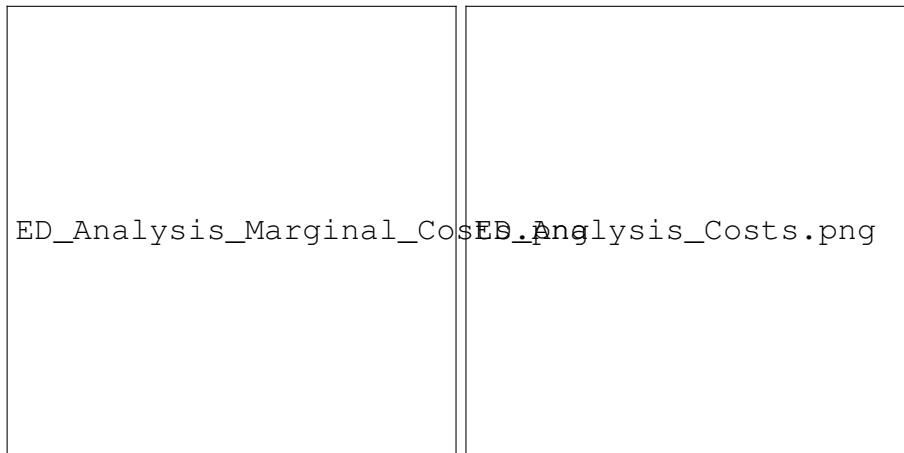
$$C1 = 430 - 12.5P_1 + 0.15P_1^2 \Rightarrow 50.00 \leq P_1 \leq 250.00$$

$$C2 = 150 + 12.0P_2 + 0.08P_2^2 \Rightarrow 25.00 \leq P_2 \leq 200.00$$

2.5.1 Marginal Costs

The marginal costs of the quadratic function is calculated by the first derivative of the cost function as shown in the figure. Constant Marginal costs or Piece-wise linear marginal costs does not affect the ED solution at the every increment, It changes at thresholds or limits. Meanwhile quadratic cost curves generate a ramp curve for marginal costs. In the example

shown below, the curves overlap at certain point. From that point the generators swap roles from an ED perspective. A single MW increment after the overlapping point(175MW) on G1 axis would require change in generator outputs at both sides. Part of the reason this involves both generators is because of the lower limits or minimum required generation by the unit.



2.5.2 Graphical Representation

The equality and inequality constraints can be graphically represented by the following diagram. The solution curve for both scenarios of load is also represented.

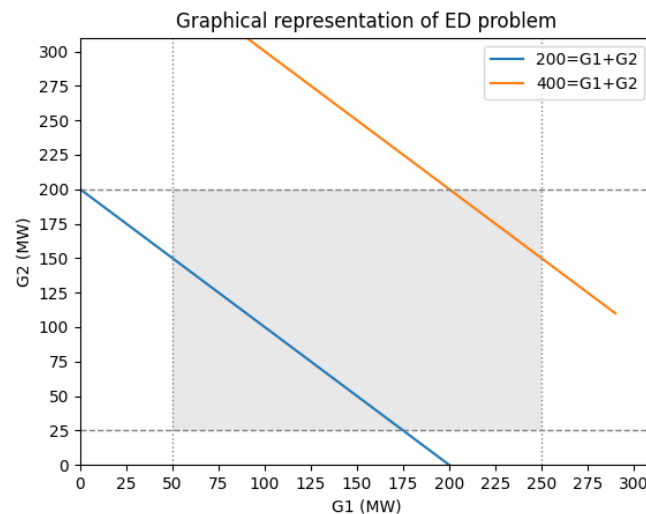


Figure 1: ED Graphical Solution

2.5.3 Lagrangian Equations

Economic Dispatch is carried out to determine the optimal generator output with respect to the objective function. Transmission line network and its output is neglected as it does not take part in ED. Hence, to supply load L , by Generator 1 @ Bus1 generating P_1 power and Generator 2 @ Bus2 generating P_2 power, the cost functions are given by:

$$C1 = 430 - 12.5P_1 + 0.15P_1^2$$

$$C2 = 150 + 12P_2 + 0.08P_2^2$$

Total Cost Objective Function($C = C1 + C2$):

$$C = 580 - 12.5P_1 + 0.15P_1^2 + 12P_2 + 0.08P_2^2$$

Subject to:

$$L - P_1 - P_2 = 0$$

$$50 - P_1 \leq 0$$

$$P_1 - 250 \leq 0$$

$$25 - P_2 \leq 0$$

$$P_2 - 200 \leq 0$$

2.5.4 Scenario 1 : Load = 200.00MW

The Lagrangian with binding constraints is given by:

$$l = (580 - 12.5P_1 + 0.15P_1^2 + 12P_2 + 0.08P_2^2) + \lambda(200 - P_1 - P_2) + \mu(25 - P_2)$$

$$\frac{\partial l}{\partial P_1} = -12.5 + 0.3P_1 - \lambda = 0$$

$$\frac{\partial l}{\partial P_2} = 12 + 0.16P_2 - \lambda - \mu = 0$$

$$\frac{\partial l}{\partial \lambda} = 200 - P_1 - P_2 = 0$$

$$\frac{\partial l}{\partial \mu} = 25 - P_2 \leq 0$$

1. Complimentary Slackness - $\mu > 0$; $g_j(P) = 0$

Applying this condition in the above equation:

$$P_1 = 175; P_2 = 25; \lambda = 40; \mu = -24$$

This fails to satisfy the Complimentary Slackness condition because $\mu < 0$

2. Complimentary Slackness - $\mu = 0$; $g_j(P) < 0$

Applying this in the above equations:

$$P_1 = 122.83; P_2 = 77.174; \lambda = 24.35; \mu = 0$$

This satisfies the condition $(25 - P_2) \leq 0$

3. Solution

| P_1 (MW) | P_2 (MW) | λ {£/ MWh} | Nodal prices(all buses) {£/ MWh} |
|------------|------------|--------------------|-------------------------------------|
| 123 | 77 | 24.35 | 24.35 |

2.5.5 Scenario 2 : Load = 400.00MW

Here, it is assumed that inequality constraints are non-binding and Economic Dispatch is solved with no inequality constraints. The Lagrangian is given by:

$$l = (580 - 12.5P_1 + 0.15P_1^2 + 12P_2 + 0.08P_2^2) + \lambda(400 - P_1 - P_2)$$

$$\frac{\partial l}{\partial P_1} = -12.5 + 0.3P_1 - \lambda = 0$$

$$\frac{\partial l}{\partial P_2} = 12 + 0.16P_2 - \lambda = 0$$

$$\frac{\partial l}{\partial \lambda} = 400 - P_1 - P_2 = 0$$

Solving the above equations for P1 and P2 gives:

$$P_1 = 192.39 \text{ MW}; P_2 = 207.39; \lambda = 45.217;$$

This fails to satisfy the inequality constraint for Generator 2 with an upper limit of 200MW. To bring the solution under constraints, increase lambda or reduce the generation of Generator 2 under the 200MW limit.

The modified Lagrangian with $P_2 = 199 \text{ MW}$ is :

$$\begin{aligned} l &= (580 - 12.5P_1 + 0.15P_1^2 + 2388 + 3168.1) + \lambda(400 - P_1 - 199) \\ &= 6136.08 - 12.5P_1 + 0.15P_1^2 \end{aligned}$$

$$\frac{\partial l}{\partial P_1} = -12.5 + 0.3P_1 - \lambda = 0$$

Solving this in the above equations:

$$P_1 = 201; P_2 = 199; \lambda = 47.8; \mu = 0$$

| P ₁ (MW) | P ₂ (MW) | λ {£/ MWh} | Nodal Prices(all buses) £/MWh |
|---------------------|---------------------|--------------------|----------------------------------|
| 201 | 199 | 47.8 | 47.8 |

2.6 Conclusion

For Economic Dispatch the equality constraint is generation-load balance, and the inequality constraints are generator minimum and maximum limits. Minimum limits of all generators are considered and the load is then served with the cheapest generator until it hits its maximum limit. The marginal cost of system and nodal prices are identified by the Lagrangian coefficient.

3 Optimal Power Flow

Power Flow or Load Flow studies gives a snapshot of the network. It is conducted to find out the line flows in the system, to verify if any lines are getting overloaded. One generator in the system is assumed to have infinite power which provides for the next load increment. Power flow never concerns about money. Economic dispatch finds maximum profit by minimising cost and does not concern with transmission lines. Optimal Power Flow is marriage between Power Flow and Economic Dispatch. It finds the optimum solution with generation, price and availability.

3.1 Marginal costs

The marginal costs of the generators are given by:

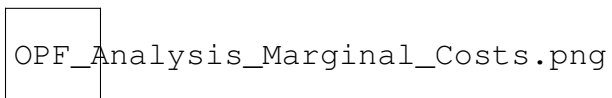


Figure 2: OPF Marginal Costs of generator

3.2 Power flow, ED and OPF simulation

By disabling the transmission constraints, Power Flow Analysis and OPF is performed on the system. OPF is run again by enabling transmission constraints. The generator and line outputs are recorded at steps by increasing the load from 200MW to 300MW in steps of 10MW. The results are tabulated below:

Table 1: Power flow without thermal limits(Units in MW)

| Load | Gen 1 | Gen 2 | L12 | L13 | L23 |
|------|-------|-------|-----|-----|-----|
| 200 | 150 | 50 | 33 | 117 | 83 |
| 210 | 160 | 50 | 37 | 123 | 87 |
| 220 | 170 | 50 | 40 | 130 | 90 |
| 230 | 180 | 50 | 43 | 137 | 93 |
| 240 | 190 | 50 | 47 | 143 | 97 |
| 250 | 200 | 50 | 50 | 150 | 100 |
| 260 | 210 | 50 | 53 | 157 | 103 |
| 270 | 220 | 50 | 57 | 163 | 107 |
| 280 | 230 | 50 | 60 | 170 | 110 |
| 290 | 240 | 50 | 63 | 177 | 113 |
| 300 | 250 | 50 | 67 | 183 | 117 |

Table 2: OPF without thermal limits(Units in MW)

| Load | Gen 1 | Gen 2 | L12 | L13 | L23 |
|------|-------|-------|-----|-----|-----|
| 200 | 50 | 150 | 33 | 83 | 117 |
| 210 | 50 | 160 | 37 | 87 | 123 |
| 220 | 50 | 170 | 40 | 90 | 130 |
| 230 | 50 | 180 | 43 | 93 | 137 |
| 240 | 50 | 190 | 47 | 97 | 143 |
| 250 | 50 | 200 | 50 | 100 | 150 |
| 260 | 50 | 210 | 53 | 103 | 157 |
| 270 | 50 | 220 | 57 | 107 | 163 |
| 280 | 50 | 230 | 60 | 110 | 170 |
| 290 | 50 | 240 | 63 | 113 | 177 |
| 300 | 50 | 250 | 67 | 117 | 183 |

Table 3: OPF with thermal limits(Units in MW)

| Load | Gen 1 | Gen 2 | L12 | L13 | L23 |
|------|-------|-------|-----|-----|------------|
| 200 | 50 | 150 | 33 | 83 | 117 |
| 210 | 50 | 160 | 37 | 87 | 123 |
| 220 | 50 | 170 | 40 | 90 | 130 |
| 230 | 50 | 180 | 43 | 93 | 137 |
| 240 | 50 | 190 | 47 | 97 | 143 |
| 250 | 50 | 200 | 50 | 100 | 150 |
| 260 | 70 | 190 | 40 | 110 | 150 |
| 270 | 90 | 180 | 30 | 120 | 150 |
| 280 | 110 | 170 | 20 | 130 | 150 |
| 290 | 130 | 160 | 10 | 140 | 150 |
| 300 | 150 | 150 | 0 | 150 | 150 |

3.3 Observations from simulation results

Following are the observations from the simulation results table [Table 1](#), [Table 2](#), [Table 3](#) :

1. In Power Flow Analysis, slack bus generator, provides all the extra load in the system. In reality, this load is shared by all generating units in the system. As the load increases, the slack bus output increases linearly. The transmission line flows are not a concern for Power flow analysis. The primary objective is to find the state of power flow in the system as a snapshot
2. In Economic Dispatch, the objective is to minimise costs. ED overlooks network constraints to an assumption that all generators and load is connected to a single bus. The cheapest generator cuts the slack in ED. It provides the load until its limit is reached. PF and ED would look like a mirror image with load less than the generation limits
3. OPF considers all constraints including generator and network limits. The solution of OPF is often costlier than ED and never the other way around. From [Table 3](#) , even though Gen 2 is proffered by ED, OPF brings in Gen 1 due to the thermal limit of Line 2-3

3.4 Analysis

$$Gen1costs(\text{£/h}) = 100.00 + 40.00 * P1 \Rightarrow 50.00 \leq P1 \leq 200.00$$

$$Gen2costs(\text{£/h}) = 1000.00 + 30.00 * P2 \Rightarrow 50.00 \leq P2 \leq 300.00$$

subject to:

$$Line_1 - 2 \leq 140.00MW$$

$$Line_1 - 3 \leq 150.00MW$$

$$Line_2 - 3 \leq 160.00MW$$

3.4.1 Scenario 1 - Load = 200.00MW

$$\text{The Equality Constraint} \Rightarrow 200 - P1 - P2 = 0$$

Considering the impedance of all three lines are same, by using Superposition theorem in the linear system, power flow in the lines can be calculated using:

$$P_{12} = \frac{P1}{3} - \frac{P2}{3}$$

$$P_{23} = \frac{P1}{3} + \frac{2 * P2}{3}$$

$$P_{13} = \frac{2 * P1}{3} + \frac{P2}{3}$$

The Marginal Cost of Generator 2 is less than that of Generator 1. Generator 1 output is set to minimum, and Generator 2 is allowed to generated the remaining load:

$$P1 = 50 \text{ MW and } P2 = 150MW$$

Power flow in lines are calculated from the equations above:

$$P_{12} = 33MW(\text{reverse} - \text{flow})$$

$$P_{23} = 116.67MW$$

$$P_{13} = 83.33MW$$

All the lines are within its capacity and the generator limit constraints are satisfied.

| G1(MW) | G2(MW) | Cost of Security (£/hr) OPF _{price} - ED _{price} |
|--------|--------|---|
| 50 | 150 | 0(6500 -6500) |

3.4.2 Scenario 2 - Load = 275.00MW

1. Graphical solution

The red and orange dashed lines are not binding. The green dashed line representing L23 is the only binding transmission line constraint, which should be taken into consideration in selecting the generation. The intersection point with the solution(blue solid line) corresponds to G2=206MW and G1=69MW on the x and y axis respectively. The same has been verified by simulations

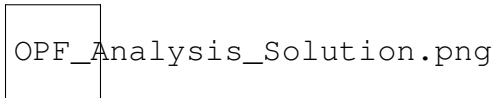


Figure 3: OPF Graphical Solution

2. Lagrangian method - marginal costs of the transmission constraint The Lagrangian is with binding constraints is given by:

$$l = (1100 + 40P_1 + 30P_2) + \lambda(275 - P_1 - P_2) + \mu(0.333P_1 + 0.667P_2 - 160)$$

$$\frac{\partial l}{\partial P_1} = 40 - \lambda + 0.333\mu = 0$$

$$\frac{\partial l}{\partial P_2} = 30 - \lambda + 0.667\mu = 0$$

$$\frac{\partial l}{\partial \lambda} = 275 - P_1 - P_2 = 0$$

$$\frac{\partial l}{\partial \mu} = 0.333P_1 + 0.667P_2 - 160 \leq 0$$

- (a) Complimentary Slackness - $\mu = 0$; $g_i(P) < 0$ Applying the generator values from graphical solution, $P_1 = 69\text{MW}$ and $P_2 = 206\text{MW}$,

$$0.333 * 69 + 0.667 * 206 - 160 = 0.3172$$

This does not satisfy the condition. Adjusting the values to $P_1 = 70$ and $P_2 = 205$:

$$0.333 * 70 + 0.667 * 205 - 160 = -0.016$$

satisfies the condition and is the proposed solution

| G1(MW) | G2(MW) | Cost of Security (£/hr) OPF _{price} - ED _{price} |
|--------|--------|---|
| 70 | 205 | 200(8950 - 8750) |

Marginal Costs at Bus 1, Bus 2 and Bus 3 is 40£/hr, 30£/hr, 50£/hr respectively. Bus 3 has a congestion price at 10£/hr.

Max load that can be served is 310MW at 10700£/hr

4 Contingency Analysis

4.1 OPF Solution

Only Transmission Line contingencies are considered: Following are the contingency cases and the line flows(same impedance lines) with respect to Generator output(P_1 and P_2) are calculated as:

Table 4: Line flows from Superposition method

| | Line 1-2 Open | Line 1-3 open | Line 2-3 open |
|-----------------|---------------|---------------|---------------|
| P12 (max 140MW) | 0 | P1 | -P2 |
| P23 (max 160MW) | P2 | P1 + P2 | 0 |
| P13 (max 150MW) | P1 | 0 | P1 + P2 |

Table 5: N-1 case for Load = 125MW; P1 = 50MW; P2 = 75MW

| | Line 1-2 Open | Line 1-3 open | Line 2-3 open |
|-----------------|---------------|---------------|-----------------------------|
| P12 (max 140MW) | 0 | 50 | -75 (75 in opp. direction)) |
| P23 (max 160MW) | 75 | 125 | 0 |
| P13 (max 150MW) | 50 | 0 | 125 |
| ED cost (£/hr) | 4250 | 4250 | 4250 |
| OPF cost (£/hr) | 4250 | 4250 | 4250 |

The cost has remained same but the maximum load that can be served changes with respect to each contingency.

5 Seven bus example

5.1 Thermal Constraints

Following table shows the results of 7-bus system with transmission line limits disabled and enabled in PowerWorld simulation:

| Network Limits | Hourly Cost (£/hr) | Top Area (£/hr) | Left Area (£/hr) | Right Area (£/hr) | G1 MW | G2 MW | G4 MW | G6 MW | G7 MW |
|----------------|--------------------|-----------------|------------------|-------------------|-------|-------|-------|-------|-------|
| Disabled | 16416 | 12591 | 3325 | 501 | 220 | 290 | 127 | 200 | 200 |
| Enabled | 16666 | 9493 | 4738 | 2435 | 100 | 150 | 200 | 232 | 200 |

Observations:

1. The lines L1-2, L1-3 and L2-5 are overloaded in the system when constraints were disabled
2. L2-5 was at 150% of its capacity.
3. After enabling the limits, all lines were within limits
4. The hourly cost increased by £200

Table 6: N-1 case for Load = 150MW; P1 = 50MW; P2 = 100MW

| | Line 1-2 Open | Line 1-3 open | Line 2-3 open |
|------------------------------|---------------|---------------|------------------------------|
| P12 (max 140MW) | 0 | 50 | -100(100 in opp. direction)) |
| P23 (max 160MW) | 100 | 150 | 0 |
| P13 (max 150MW) | 50 | 0 | 150 |
| ED cost (£/hr) | 5000 | 5000 | 5000 |
| OPF cost (£/hr) | 5000 | 5000 | 5000 |
| Maximum serviceable load(MW) | 310 | 160 | 150 |

5. The zonal price at Right Area went up four times after enabling the limits whereas Top area had an advantage with £3000 reduction. Left had moderate increase in price

5.2 Contingency Analysis

Following are the observations after contingency analysis:

1. At normal run(with all lines functioning), the system seems to be stable within limits
2. The overall cost is 15612 £/hr
3. Two contingencies, Line 1-2 and Line 1-3 makes the system vulnerable; as identified by contingency analysis
4. Disabling either of these lines will cause the other to run at nearly full load(120MW), as verified by Power Flow solution
5. There is a marginal rise in cost at 15629 and 15632 respectively.

5.3 Security Constrained OPF

By inserting contingencies and running SCOPF has identified two violations at L1-3 and L1-2, both exceeding the limits of 120MW. With normal OPF and SCOPF run on the seven bus system, following are the observations:

1. The marginal costs remained same in both cases at all nodes
2. The control Generators changed at buses. In normal OPF, Generator 1 was controlling the changes at multiple nodes, with SCOPF, the load response control was done by Generator 4, which was not present in normal OPF
3. The control was also distributed among Gen 5 and Gen 7 at their respective nodes in both cases
4. By running the power flow in the system after inserting contingencies separately at L1-2 and L1-3, it was noticed that the **Security of the system improved** because when L1-2 was open, line L1-3 was not overloaded in SCOPF

6 Conclusion

As mentioned in the introduction, energy as a commodity is define as MWh at a given time and a given location, with a given level of supply security. ([Levi, 2020](#)). From the lessons learned through the course and laboratory, Economic dispatch identifies the MWh at a given time based on the load curve and the marginal costs of generators involved. Optimal power flow identifies energy at a given location based on transmission constraints and nodal prices. The security of the system is confirmed by Contingency analysis and SCOPF.

7 References

[1] Victor Levi, EEEN60321 Concepts of Operation & Economics, 2020, The University of Manchester.