

Economic Load Dispatch of Thermal Power Plants Using Differential Evolution

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Abstract- In present days with increasing in load demand and with large interconnection of networks it is essential to run the generating stations optimally with in its constraints so as to meet the load demand. Without optimization the price for the cost of generation is increasing day to day. So it is very essential to reduce the running charges for generating electric energy. The main economic factor in power system planning, operation and control is with the cost of generating real power. The running cost will be the main consideration with respect to the fuel for thermal power plants. So minimization of fuel cost will be criteria for thermal power plants.

A major objective for the thermal power generation is to minimize fuel consumption by allocating optimal power generation to each unit (economic dispatch) subject to equality and inequality constraints. The optimum generation scheduling plays an extremely important role in optimal operation of utility power system. This importance is due to power savings. This paper proposed a lambda based approach for solving the Economic Dispatch (ED) problem. The ED is to minimize the operating fuel cost while satisfying the load demand and operational constraints. This paper solves sample test system of six generator system and 15 generator systems for various load demands neglecting transmission losses.

Nomenclature: Analytical method-lambda iterative method, P_G -real power generations, P_L -transmission loss, c -cost of real power generations, a_i , b_i , d_i - generator coefficients, P_D -load demand, ED-economic dispatch, EDC-economic dispatch computation

I. INTRODUCTION

The size of electric power system is increasing rapidly to meet the energy requirements. A number of power plants are connected in parallel to supply the system load by interconnection of power stations. With the development of grid system it becomes necessary to operate the plant unit most economically. The economic generation scheduling problem involves two separate steps namely the unit commitment and the online economic dispatch. The unit commitment is the selection of unit that will supply the anticipated load of the system over a required period of time at minimum cost as well as provide a specified margin of the operating reserve. The function of the online economic dispatch is to distribute the load among the generating units actually paralleled with the system in such a manner as to minimize the total cost of the fuel [1]. To calculate electric power generation of various units with different load demands, is solved by

iterating the value of sum of the generator outputs equals the system load demand. Economic dispatch programs which are installed today in the most modern control centres uses the analytical methods to solve a well known exact co-ordination equations. The main difference between different techniques is the method used to solve the co-ordinations equations proposed by K.Srikrishna [2]. The co-ordination equations are generally solved by interactively adjusting the load until the generator output matches the system load demand when we neglect transmission losses. New graphical method for optimum power generation with neglecting the B-coefficient matrix is discussed [3]. The differential evolution method to optimize generation schedule neglecting the transmission losses is discussed in method proposed by kirchmayer [4]. Simplified approach to solution of co-ordination equation for generation scheduling is discussed by a method named Quick method to optimize generation scheduling proposed by C. Palanichamy [5]. The economic load dispatch solution can be analysed as the optimal solution corresponding to the minimum cost of generation proposed by K. Nagappa [6]. The cost of power generation is not the same for every unit. So, to have the minimum cost of generation for a particular load demand, we have to distribute the load among the units which minimize the overall generation cost with the constraint that no unit is overloaded.

II. OBJECTIVE FUNCTION

The majority of generating units have a non linear cost function. The objective function of thermal power plant is

$$C_i = a_i P_{Gi}^2 + b_i P_{Gi} + d_i \dots (1)$$

Where a_i is a measure of losses in the system, b_i is the fuel cost and d_i is the salary and wages, interest and depreciation.

The optimal dispatches for the thermal power plants should be such that the total electric power generation equal to the load demand when neglecting line losses, which can be written as:

$$\sum_{i=1}^n P_{Gi} = PD \dots (2),$$

n = total number of generating plants, P_{Gi} = generation of i^{th} plant, PD = system load demand.

The inequality constraints is given by

$$P_{GiMin} \leq P_{Gi} \leq P_{GiMax} \dots (3)$$

Maximum active power generation P_{GiMax}

Minimum active power generation P_{GiMin}

III. METHODOLOGY

The objective of optimum generation scheduling for thermal power plants is to allocate the generation to each and every units in a plant for a given load such that fuel cost is minimum subjected to equal and inequality constraints. Here, optimum generation scheduling is achieved by following technique.

DIFFERENTIAL EVOLUTION

Differential Evolution is a method used in this paper to solve the economic load dispatch problem when transmission losses are neglected. An initially random population of individuals (trial solutions) is created. Mutations are then applied to each individual to create new individuals. Mutations vary in the severity of their effect on the behaviour of the individual. The new individuals are then compared to select which should survive to form the new population. DE is similar to a genetic algorithm, but models only the behavioural linkage between parents and their offspring, rather than seeking to emulate specific genetic operators from nature such as the encoding of behaviour in a genome and recombination by genetic crossover. Mutation, recombination, and selection are iterated with the goal of driving a population of candidate solutions toward better and better regions of the search space. We have to select the number of populations' value randomly until we get optimum scheduling which meets the sum of generations of all units equal to load demand and transmission losses. This value of number of populations is selected by using trial and error method. Then the dimensions for the system which we apply differential evolution is selected. After we select scheduling of generators optimally, we need minimum cost of generation, so from optimum scheduling the cost of real power generation which has minimum value is selected. The dimensions are selected based on the number generators we are scheduling for optimality. The cross over to solve the optimum generation scheduling is taken. Then the strategy to solve this scheduling is taken for small population sizes and fast convergence. Dimensionality should not be too high. In this paper, we consider number of dimensions with "D", number of parameter, number of populations as "N_p", cross over probability as "CR". The minimum and maximum generating constraints are considered for optimum scheduling. The weight vector is also considered for the scheduling to be optimum.

Algorithm

The Algorithm is as follows:

1. Start
2. Initially chose $\lambda = \lambda_0$, this value should be greater than the largest intercept of the incremental cost of the various units. Calculate $P_{G1}, P_{G2}, \dots, P_{Gi}$ based on equal incremental cost.
3. Assume $P_{Gi} = 0.0$; $i=1, 2 \dots N$
4. Read the constants a_i, b_i, d_i , power demands P_D , maximum P_{GiMax} , minimum P_{GiMin} generators real power limits.

Steps including differential evolution

- i. An Initial population of N_p parent vectors is considered as the trial solution and the number of dimensions is taken as D. Then cross over probability is taken as CR and weight vector is also considered.
 - ii. From these parents off springs are created by mutation, hence N_p off springs are obtained
 - iii. By combining the parents and off springs, $2N_p$ solutions are obtained
 - iv. Through competition and selection, first N_p optimal solutions are selected
 - v. The selected solutions are considered as parents for the next iteration
 - vi. After the required number of iterations, the best optimal solution is obtained
5. Calculate the generation at all buses using $P_{Gi} = (1 - b_i/\lambda) / (2a_i/\lambda) \dots (4)$ where $i=1, 2, \dots, n$ keeping in mind that the values of powers to be substituted on the RHS of Equation during zero iteration correspond to the values calculated in step 2. For subsequent iterations the values of powers to be substituted corresponds to the powers in the previous iteration. However if any generator violates the limit of generation that generator is fixed at the limit violated.
6. Check if the difference in power at all generator buses between two consecutive iterations is less than the specified value, otherwise go backing to step 2.
 7. Check if power balance equation is satisfied, $\sum_{i=1}^n P_{Gi} - P_D < \epsilon \dots (5)$ if yes, stop. Otherwise, go to step-9.
 8. Increase λ by $\Delta\lambda$; if $\sum_{i=1}^n P_{Gi} - P_D < 0 \dots (6)$ decrease λ by $\Delta\lambda$; if $\sum_{i=1}^n P_{Gi} - P_D > 0 \dots (7)$
 9. Repeat from step 5
 10. Update λ as $\lambda^{(k+1)} = \lambda^{(k)} - \Delta\lambda^{(k)}$ where λ is the step size

IV. TEST CASES

Here we consider two test systems. In the first case 6 generators are considered with their cost curve equations (second order polynomial expression). The optimum generation scheduling of six thermal generating units for different loads are determined and also cost of generation for different loads is determined. The cost for economic allocation of generation to each generating unit is determined and whether all units are satisfying its equality and in equality constraints are verified. In the second case 15 generators are considered with their cost curve expression (second order polynomial equation). The optimum generation scheduling for different load conditions is explained here. The optimum generation scheduling of 6 thermal generating units and 15 thermal generating units for different loads are determined and also cost of generation for different loads is determined using Differential Evolution technique. The cost for economic allocation of generation to each generating unit is determined and whether all units are satisfying its equality and in equality constraints are verified.

Results:

Test Case I

The input data is taken from reference [7]. The result for optimum generation scheduling for different load conditions is given in table 4.1. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically [9].

P _{DT}	955	942	935	930	935	963
P _{G1}	347.8 55	351.36 57	409.510 6	301.35 04	409.51 06	354.19 94
P _{G2}	165.4 891	87.083 5	158.051 2	154.90 01	158.05 12	131.44 45
P _{G3}	172.6 39	260.09 27	128.165 5	253.36 07	128.16 55	188.36 19
P _{G4}	93.89 89	104.75 34	94.7536	63.789 7	94.753 6	95.232 6
P _{G5}	123.3 17	80.396 2	83.9223	97.539 2	83.922 3	141.31 84
P _{G6}	52.16 83	58.647 8	59.6836	59.324	59.683 6	53.864
cost	673740	673740	670860	665820	670860	687000

Table 4.1 Real power generations & cost for various loads

The result for different load conditions is given in table 4.2. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

P _{DT}	989	1023	1126	1150	1201	1235
P _{G1}	319.84 2	424.21 57	488.16 65	446.00 42	498.21 54	461.10 63
P _{G2}	129.26 67	129.72 78	131.16 74	174.15 68	149.55 65	133.04 98
P _{G3}	235.13 08	260.47 43	231.19 82	157.35 55	246.47 54	262.06 45
P _{G4}	72.723 1	94.259 9	121.83 76	144.09 19	71.188 6	128.77 15
P _{G5}	177.22 77	62.702 2	94.295 5	166.48 67	179.64 6	183.96 28
P _{G6}	55.018 7	52.055 1	59.869 1	63.492 2	55.783 7	95.926 5
cost	708720	733560	813000	833280	870780	895440

Table 4.2 Real power generations & cost for various loads

The result for different load conditions is given in table 4.3. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

P _{DT}	1190	1251	1263	1250	1221	1202
P _{G1}	440.28 51	495.67 1	423.00 91	487.06 23	455.17 97	476.86 19
P _{G2}	134.08 39	185.59 82	191.96 01	192.18 7	170.71 64	181.59 59
P _{G3}	284.51 4	254.69 25	253.35 23	295.07 11	232.02 05	200.51 52
P _{G4}	119.66 67	54.479 2	136.32 31	113.60 57	137.92 11	79.284 9
P _{G5}	137.41 86	189.23 33	196.28 65	94.486 1	158.34 75	199.73 91
P _{G6}	74.461 9	66.685 5	62.577 4	68.262 2	66.758 4	62.673 9
cost	860220	910920	917640	910740	884040	872340

Table 4.3 Real power generations & cost for various loads

Optimal generation allocation and cost of real power generation of six generating units for different load conditions are shown in tabular column. The result for different load conditions is given in table 4.4. From the

tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

P _{DT}	1159	1092	1023	984	975	960
P _{G1}	470.43 21	416.85 79	382.74 02	406.98 19	369.09 26	405.88 95
P _{G2}	184.73 92	109.17 63	130.35 32	86.381 9	187.84 93	78.746 5
P _{G3}	231.34 6	219.50 47	249.76 96	274.95 11	203.58 5	246.87 97
P _{G4}	69.579 6	97.172 3	71.668 8	79.754 3	70.139	75.011 5
P _{G5}	138.32 15	187.49 64	114.29 93	78.601 7	88.266 1	95.112 1
P _{G6}	64.578 6	61.649 2	74.369 3	57.241 2	56.222	57.888 9
cost	837120	784920	731700	705120	697560	685800

Table 4.4 Real power generations & cost for various loads

Thus above tabular columns show the optimal scheduling of six thermal generating plants along with their cost for real power generation. The graph shows the relation for time in 24 hrs for different load demands the cost of generating units in Rs/Hr to generate real power to meet load demands. Fig 1 shows the relation for time in hrs and cost of power generations of six units for 24 hrs to meet the load demand.

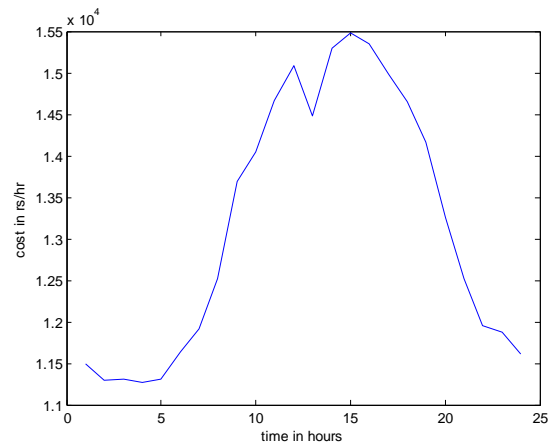


Fig 1. Time vs Cost real power generations of all units

Thus from Differential evolution programming technique we determine the real power generations for economic dispatch and cost of real power generation. The curve explains during peak load hrs cost of generation also increases. The results are shown in tabular column and graph.

Test Case II

The input data is taken from reference [9]. In this case we determine optimal generation allocation and cost of real power generation for 15 generating units for different load conditions. The result for different load conditions is given in table 4.5. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically [7].

P _{DT}	2236	2240	2226	2236	2298	2316
P _{G1}	260.3 649	328.91 43	180.3993	248.78 37	183.54 2	342.4 472
P _{G2}	440.3	253.49	281.5067	336.35	277.69	303.1

	8	17		29	18	894
P _{G3}	122.5 413	103.34 66	120.59	123.96 8	37.649 8	34.79 09
P _{G4}	125.3 876	94.593 4	114.2406	62.562 6	26.108 6	43.67 85
P _{G5}	216.0 923	236.52 45	395.6461	283.50 87	394.93 63	211.0 301
P _{G6}	186.9 027	334.44 09	151.361	151.80 17	414.77 48	316.8 199
P _{G7}	323.6 81	292.14 8	436.9093	395.43 14	396.36 82	385.1 255
P _{G8}	202.3 006	108.18 69	134.4656	163.59 47	131.32 23	218.9 524
P _{G9}	120.7 097	105.62 39	50.5642	119.58 06	143.31 47	122.3 768
P _{G10}	66.28 48	141.08 11	113.4644	112.92 28	123.85 35	98.59 76
P _{G11}	43.63 11	64.375 2	68.232	63.141 63	23.653 33	53.61 33
P _{G12}	40.21 31	70.903 6	62.652	42.764 8	60.040 9	39.53 3
P _{G13}	32.73 96	55.875 76.8126		61.418 3	29.355 8	82.98 09
P _{G14}	18.47 75	28.644 1	22.2384	40.813 2	18.88 18.88	19.53 69
P _{G15}	36.95 77	22.248	17.0219	27.789 5	35.649 9	41.79 32
cost	997560	1000740	935040	914700	1005060	948900

Table 4.5 Real power generations & cost for various loads

The result for different load conditions is given in table 4.6. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

	2331	2443	2630	2728	2783	2785
P _{G1}	371.8 958	265.31 48	292.61 61	432.75 38	441.45 11	441.49 3
P _{G2}	226.1 616	278.65 28	404.57 55	387.10 26	383.00 42	445.59 31
P _{G3}	102.6 343	56.843 7	33.927 3	117.67 28	121.87 48	91.523 2
P _{G4}	39.26 82	115.43 9	65.891 7	37.436 8	93.027 8	86.600 7
P _{G5}	336.5 01	369.65 71	451.16 84	424.13 55	427.34 29	468.33 27
P _{G6}	176.2 453	419.62 27	139.68 3	328.37 41	313.51 84	225.80 16
P _{G7}	297.2 865	405.42 45	449.48 89	269.17 93	423.91 08	416.69 21
P _{G8}	231.6 795	79.144	294.61 77	227.06 4	118.34 86	164.80 33
P _{G9}	148.0 727	149.45 34	161.23 19	158.21 06	34.973 4	97.116
P _{G10}	119.4 719	46.096 2	57.432 1	111.56 7	117.43 18	132.65 43
P _{G11}	60.42 62	68.701 8	77.216 6	73.432 6	78.997 8	42.697 5
P _{G12}	57.77 35	60.516 9	71.932 9	52.444 7	73.214 8	46.811
P _{G13}	62.91 62	44.325 7	70.239 8	45.119 5	80.495 1	25.387
P _{G14}	47.71 94	39.953 9	42.976 3	16.639 8	25.298 4	49.647 8
P _{G15}	53.00 9	44.001	17.446 2	47.754 5	52.471 8	48.446
cost	946500	1100700	1036080	1239660	1267620	1259100

Table 4.6 Real power generations & cost for various loads

Optimal generation allocation and cost of real power generation for six generating units for different load conditions are shown in tabular column. The result for different load conditions is given in table 4.7. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

	2780	2830	2970	2950	2902	2803
P _{G1}	395.0 907	383.73 13	385.65 22	335.20 32	426.54 87	324.20 11
P _{G2}	434.5 94	440.64 61	445.80 44	412.40 08	398.93 91	388.76 57
P _{G3}	60.42 21	24.589 5	128.65 48	95.803 9	112.86 47	40.634 9
P _{G4}	101.5 333	128.33 37	53.695 2	28.873 3	112.96 58	114.18 03
P _{G5}	435.5 896	433.98 23	333.59 91	386.23 02	428.24 69	317.32 7
P _{G6}	452.8 634	414.02 66	426.78 93	456.44 81	439.65 49	296.24 21
P _{G7}	407.5 947	440.11 24	429.85 13	418.13 97	343.16 51	463.74 6
P _{G8}	148.5 852	272.20 82	281.48 59	294.94 73	188.14 52	264.82 42
P _{G9}	94.38 33	64.188 5	133.29	100.06 85	145.16 58	136.50 93
P _{G10}	41.92 41	28.326 2	128.86 59	159.94 21	126.23 45	147.23
P _{G11}	40.63 18	27.333 3	67.465 4	66.739 9	48.002 4	68.458 2
P _{G12}	42.79 36	61.648 4	38.215 9	35.020 7	27.085 1	79.295 6
P _{G13}	62.46 15	40.306 8	40.181 5	83.324 3	42.833 4	77.387 8
P _{G14}	41.01 8	32.590 8	53.463 3	27.939 9	18.194 4	42.447
P _{G15}	18.98 2	38.182	23.104 9	50.397 5	44.295	43.143 6
cost	1334640	1301460	1266540	1233540	1353540	1085820

Table 4.7 Real power generations & cost for various loads

The result for different load conditions is given in table 4.8. From the tabular column it is cleared that all generators are operating within its constraint limits. It means that all generators are operating economically.

	2651	2584	2432	2312	2261	2254
P _{G1}	328.3 683	337.59 47	309.64 25	406.01 48	179.29 34	388.57 34
P _{G2}	420.1 364	447.90 77	423.18 32	196.08 81	287.79 82	239.84 77
P _{G3}	40.56 46	62.236 6	85.536	68.661	126.31 02	68.521 7
P _{G4}	65.01 21	43.552 2	87.710 2	110.70 3	109.44 72	37.945
P _{G5}	395.0 422	351.74 98	362.74 77	319.19 75	340.15 38	401.87 06
P _{G6}	386.6 808	211.76 52	147.58 61	172.22 06	405.28 02	218.93 07
P _{G7}	374.0 531	397.14 96	445.65 77	451.51 7	428.36 5	267.28 2
P _{G8}	181.3 784	272.20 82	90.604 6	174.08 81	132.62 37	226.23 71
P _{G9}	25.69 81	116.18 75	104.15 13	121.10 38	48.724 8	42.917 4
P _{G10}	156.8 187	88.207 3	88.34	56.81	27.764 3	106.92 99
P _{G11}	48.07 07	73.942 7	77.265 4	61.571 8	23.337 7	52.164 9

P_{G12}	66.43 83	77.385	72.785 1	32.622 4	60.828 6	52.536 4
P_{G13}	83.18 48	38.834 4	52.633 7	70.008 2	30.454 7	69.376 9
P_{G14}	26.10 92	47.512 1	41.729	17.664 3	40.871 5	51.747 3
P_{G15}	53.57 6	17.022 7	39.698 5	51.693 9	21.252 4	28.376 6
cost	11866 80	107514 0	104658 0	955680	105918 0	101436 0

Table 4.8 Generations and cost of generations for various loads

Thus above tabular columns show the optimal scheduling of fifteen thermal generating plants along with their cost for real power generation. The graph shows the relation for time in 24 hrs for different load demands the cost of generating units to generate real power to meet load demands. Fig 2 shows the relation for time in hrs and cost of power generations of six units for 24 hrs to meet the load demand.

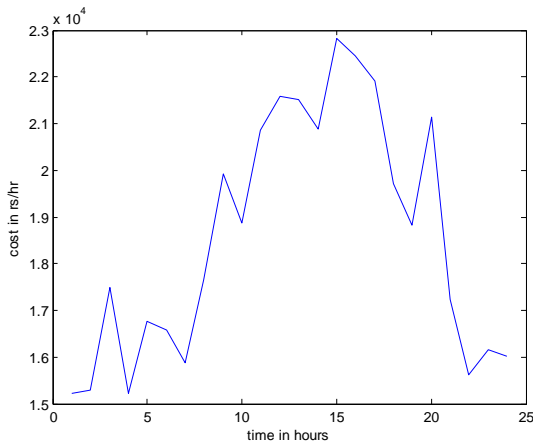


Fig 2. Time vs Cost of real power generations of all units

V. CONCLUSION:

This paper deals with optimal generation scheduling in thermal power plant using differential evolution programming method. The equality and inequality constraints are considered while optimizing generation scheduling. In both case studies it is clear that all generators run within its constraint limits for optimum generation allocation or economic load dispatch. If the generators do not run in its constraint limits whether below its minimum generation capacity or above its maximum generation capacity economic load dispatch is not possible. Therefore economic load dispatch is possible only if all generating units run within its constraints limits. This paper concludes that scheduling through Differential Evolution programming technique is economical compared to analytical solution technique.

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