

# A Novel way out to Unit Commitment Problem utilizing Evolutionary Particle Swarm Optimization

Padmanabha Raju Chinda

**Abstract:** This paper differentiates the shows of three Unit Commitment strategies, three of which are the essential arrangement techniques for taking care of the Unit Commitment Problem named Priority List and Dynamic Programming strategies. The third strategy is the Evolutionary Particle Swarm Optimization method which has been applied productively to a plentiful blend of streamlining issues. Various regions in control frameworks require understanding at least one nonlinear streamlining emergencies. In spite of the way that systematic techniques may experience moderate intermingling and the scourge of dimensionality, heuristics-based swarm knowledge can be a capable substitute. Evolutionary Particle Swarm Optimization (EPSO), some portion of the swarm insight family, is known to adequately take care of enormous scale nonlinear improvement issues. This paper introduces the exit plan for Unit Commitment Problem by methods for EPSO system. A calculation was created to achieve an exit plan to the Unit Commitment Problem utilizing EPSO procedure. The adequacy of the calculation is tried on three generating units and the cultivated results utilizing the three techniques are thought about for complete working expense.

**Keywords :** Unit Commitment, Priority List, PMAX, Dynamic Programming, Swarm Intelligence, Particle Swarm Optimization.

## I. INTRODUCTION

One of the central exercises in the activity of a power framework is the plan generation units. Unit Commitment (UC) is the difficulty of organizing the calendar of creating units contained by a power framework exposed to device and operating constrictions. The framework burden and hold necessities must be met by the submitted units at least operational expense. The Economic Dispatch issue (EDP) is to ideally disseminate the heap request among the running units while fulfilling the power balance conditions and units working points of confinement [1]. The arrangement of the Unit Commitment Problem (UCP) is extremely a mind boggling streamlining issue. It very well may be all around considered as two connected improvement issues, the first is a combinatorial issue and the second is a nonlinear programming issue. The precise way out of the UCP can be procured by a total specification of every single attainable blend of producing units, which could be an immense number.

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At that point, the financial dispatch issue is worked out for each attainable mix. Fundamentally, the high component of the conceivable arrangement space is the genuine trouble in taking care of the issue. The arrangement strategies being utilized to illuminate the UCP [2–3] are a ton. These are characterized into heuristic and non-heuristic approaches. Heuristic methodologies include the Priority List strategy, PMAX, Dynamic Programming, Lagrangian Relaxation and the branch and bound strategies. Despite the fact that the heuristic strategies are straightforward and quick, they experience the ill effects of numerical combination and way out unmistakable quality issues. The expanded issue size unfavorably impacts the computational time and the nature of the arrangements. The non-heuristic quest calculations for example particle swarm optimization, evolutionary programming, genetic algorithms and ant colony optimization are competent to achieve over the limitations of traditional improvement forms [4-5]. Superb arrangements are gained by methods for these techniques which can switch complex nonlinear limitations. The epic improvement method expressly the Evolutionary Particle Swarm Optimization (EPSO) is taken up to get an exit plan to the unit responsibility issue in kind of accomplishing least working expense. It was created from the replication of a rearranged social framework, and has been seen as lively in working out nonstop nonlinear advancement issues. The EPSO system can induce top notch arrangements inside shorter count time and firm combination trademark than other stochastic strategies. The aggregate of choice factors is incredibly outlined by this detailing. EPSO is proposed for taking care of the unit commitment issue because of its uncomplicatedness and less parameter adjustments utilizing the PSO phase. In this paper a calculation utilizing EPSO was developed for making a decision about an exit plan to unit commitment issue.

## II. UNIT COMMITMENT OBJECTIVE FUNCTION

The plan of the UC issue is to reduce the absolute working expense thus satisfying the need. It is assumed that the creation cost,  $PC_j$  for unit 'j' in a given time interim is a quadratic capacity of the measure of delivered intensity of the generator,  $P_j$ . [6]

$$F_j(P_{G_j}) = a_j P_j^2 + b_j P_j + c_j \quad (1)$$

Where  $a_j, b_j, c_j$  are the consequent cost coefficients of the units.

For the planning time frame 'T' the total of the generation cost's gotten from the relating submitted units gives the complete working expense,  $OC_T$ .

$$OC_T = \sum_{t=1}^T \sum_{j=1}^N PC_{j,t} U_{j,t} \quad (2)$$

Where  $U_{j,t}$  is a parallel variable for demonstrating the on/off status of the unit  $j$  at time  $t$ . The aim is to limit  $OC_T$  exposed to various imperatives. The supposition is that the whole framework request is provided by every single generators coupled to a similar bus. The ensuing requirements are incorporated:

#### A. System power balance Constraint

The all out produced power and burden at relating hours must be equivalent. That is the all-out created control from all the submitted units must be equivalent to the demand.

$$\sum_{j=1}^N P_{j,t} U_{j,t} = P_D \quad (3)$$

#### B. Generation Limit constraint

The produced power of a unit ought to be inside its base and most extreme power breaking points.

$$P_{jmin} \leq P_j \leq P_{jmax} \quad (4)$$

### III. METHODOLOGIES FOR WORKING OUT UC PROBLEM

The basic solution methods for unit commitment problem are the Priority List,  $P_{max}$  and Dynamic Programming methods. This section presents a comprehensive analysis of these methods.

#### A. Priority list method

This is one of the most crude and direct way to deal with decide the unit plans. It is still widely utilized in the business. Priority List strategy, as utilized in these investigations, appoints units as indicated by a need course of action dependent on unit Full Load Average Production Cost (FLAPC). Commitment advances each hour in turn. At the point when the heap stays unaffected the dedication for the earlier hour is utilized, when the heap builds, more units are included and when the heap diminishes, units might be closed down. When mounting the on-line capacity of the framework, a current unit with a lower FLAPC will be begun as long as this unit can be closed down when the framework burden falls beneath the heap for the present hour. Correspondingly, when diminishing the on-line framework limit, an on-line unit with prevalent FLAPC is closed down first, if it tends to be restarted again when the framework burden mounts up at some future hour. Along these lines, the activity of increasingly economical units is boosted while the activity of less proficient units is limited. That is first the full load average production cost is calculated for each unit. The unit with least Full load average production cost (FLAPC) is given the utmost preference. The next least units are given the next preference in order as the load increases. The schedule acquired from the Priority List method decides that the more costly unit (i.e. the unit with highest FLAPC) should be in off status, whereas the cheaper unit (unit with least FLAPC) should be in on status. The FLAPC for unit 'j' is given in following equation (5). Priority Listing is the simplest method from a modeling viewpoint. All plants simply should be positioned in a heuristic with expanding activity costs. This one of a kind positioning request is then used to submit units to fulfill request and hold prerequisites consistently. There are

no further financial improvements. The figuring time for this technique is little, in any event, for huge frameworks.

$$FLAPC = \frac{a_j P_{G_j(max)}^2 + b_j P_{G_j(max)} + c_j}{P_{G_j(max)}} \quad (5)$$

#### B. Dynamic Programming method

Dynamic programming goes about as a significant enhancement system with expansive application in numerous regions. The reason for Dynamic Programming (DP) is the hypothesis of optimality clarified by Bellman in 1957. This technique can be utilized to clarify emergencies in which numerous sequential ends are to be taken in characterizing the ideal activity of a framework, which comprises of unmistakable number of stages. It is essentially a phase savvy search technique for improvement issues whose arrangements might be seen as the aftereffect of a grouping of choices. This technique has numerous preferences, for example, its ability to continue arrangement attainability. By the by, this technique has dimensional issue with a huge power framework in light of the fact that the issue size builds quickly with the quantity of producing units to be submitted, which results in an unfortunate arrangement time. Dynamic programming deteriorates an issue into a succession of littler issues, exercises the little issues, and construct ups a most ideal answer for the first issue bit by bit. The ideal arrangement is develop from the auxiliary issue recursively. The investigation might be in forward or in reverse course. Inside a time frame the blends of units are known as the states. In Forward DP the most financial calendar is found by starting at the fundamental stage storing up the complete costs, at that point remembering from the blend of least gathered cost beginning at the last stage and consummation at the underlying stage. The phases of the DP issue are the times of the investigation skyline. Each stage more often than not speaks to one hour of activity and the blends of units steps forward each hour in turn, and courses of action of the units that are to be booked are put away for every hour.

At long last, the most affordable schedule is acquired by backtracking from the blend with the least complete expense at the last hour through the ideal way to the mix at the underlying hour. Along these lines in the event that there are 30 schedulable units in 60 minutes, at that point there are 230 mixes to assess. Clearly, it isn't down to earth to assess the majority of the mixes. Besides, a large number of the mixes are prohibited because of lacking accessible limit i.e., they are said to be infeasible and there is commonly some example in beginning request of the units so it isn't important to assess all conceivable unit mixes [7]. Consequently, heuristic systems are utilized to create mixes of transitional or minimal units which are characterized by a pursuit go.

The algorithm for dynamic programming approach is as follows:

- 1) Start arbitrarily by thinking about any two units.
- 2) In the type of discrete burden levels, amass the aggregate yield of the two units.
- 3) The most affordable blend of the two units for all the heap levels is resolved. It is to be seen that at every single burden level, the financial activity is potentially to run either a unit or the two units with an unequivocal burden sharing between the two units.



- 4) Attain the beneficial practical cost bend for the two units in discrete structure and it very well may be revealed as cost bend of specific equal unit.
- 5) Add the third unit and the cost bend for the blend of three units is acquired by rehashing the strategy. It might be noticed that by this method the working blends of the third and first and second units are not basic to be worked out bringing about broad decrease in estimation.
- 6) Unless all of the current units is viewed as the technique is repeated.

The advantage of this strategy is that having the best method of running N units, it is easy to discover the most ideal path for running N + 1 units. The DP approach depends on the accompanying recursive connection.

$$F_M(P) = \min[f_M(Q) + F_{M-1}(P - Q)] \quad (6)$$

Where,

$F_M(P)$  is the base expense in Rs. /hr of generation of P MW by M generating units.

$f_M(Q)$  is the cost of generation of Q MW by  $M^{\text{th}}$  unit.

$F_{M-1}(P - Q)$  is the base expense of generation of (P-Q) MW by the rest of the (M - 1) units.

In its natural structure, the dynamic programming calculation for unit commitment issue investigates each conceivable state in each interim. A portion of these states are dismissed immediately as they are seen as infeasible. In a practical express the submitted units can supply the fundamental load. The dimensionality of the issue is impressively declined which is the significant bit of leeway of this method.

The major skilled savvy mix of units can be very much decided utilizing the recursive connection. Here the most efficient blend of units is to such an extent that it yields the base working expense, for discrete burden levels extending from the base passable heap of the littlest unit to the whole of the limits of every single accessible unit. In this procedure, the all out least working expense and the heap shared by every unit of the ideal mix are consequently decided for each heap level. Extensive computational sparing can be achieved by utilizing this technique. It isn't important to illuminate the co-appointment conditions. The all out number of units accessible, their individual cost qualities and burden cycle should be known. This strategy is suitable just when the choices at the later stages don't influence the activity at the prior stages.

### C. Evolutionary Particle Swarm Optimization

EPSO was created by Miranda et al. [8] that consolidates customary PSO with the developmental methodology. It can either be seen either as PSO with developing loads or as a transformative calculation with a development rule acquired from PSO. EPSO has just demonstrated to be proficient, precise and hearty, along these lines appropriate to power system issues [9-10].

EPSO can be viewed as a mixture strategy for Evolution Strategies and Particle Swarm Optimization methods [158]. An EPSO calculation might be depicted as pursues. At a given cycle, think about a lot of arrangements or particles. The general plan of EPSO is the followings:

- REPLICATION: every molecule is imitated R times
- MUTATION: every molecule has its vital parameters transformed
- REPRODUCTION: each changed molecule produces a

posterity as per the molecule development rule

- EVALUATION: every posterity has its wellness assessed
- SELECTION: by stochastic competition or other choice system, the best particles make due to frame another age.

The proliferation rule for EPSO is as in eqns. underneath: given a molecule  $s_i^k$ , another molecule results from  $s_i^{k+1}$

$$s_i^{new} = s_i + v_i^{new} \quad (7)$$

$$v_i^{k+1} = w_{i0}^* v_i^k + w_{i1}^* (pbest_i - s_i^k) + w_{i2}^* (gbest^* - s_i^k) \quad (8)$$

Up until now, this appears PSO—the development rule keeps its terms of dormancy, memory, and collaboration. Be that as it may, the weights experience transformation as given

$$w_{ik}^* = w_{ik} + \tau \cdot N(0,1) \quad (9)$$

where N (0, 1) is a arbitrary variable with Gaussian dispersion, 0 mean, and variance 1. From the following equation, the global best (gbest) is arbitrarily upset to give

$$gbest^* = gbest + \tau' \cdot N(0,1) \quad (10)$$

The  $\tau$ ,  $\tau'$  learning parameters (either fixed or treated additionally as key parameters and in this way likewise subject to change.

This plan profits by two "pushes" in the correct heading, the Darwinistic procedure of determination and the molecule development rule, and consequently it is normal to expect that it might show invaluable union properties when contrasted and ES or PSO alone. Besides, EPSO can likewise be delegated a self-versatile calculation, since it depends on the mutation and selection of vital parameters, similarly as any evolution technique.

#### EPSO Parameters Selection

Various parameters impact the exhibition of the EPSO calculation [11-12]. Some of these parameter's qualities and their choices for any predetermined streamlining emergency, have extraordinary effect on the viability of the EPSO technique and different parameters have little or no results. The central parameters of the EPSO calculation are swarm size or number of particles or populace size, number of iterations/emphasess, velocity components, acceleration coefficients and inertia weight.

### IV. UNIT COMMITMENT USING EPSO

For handling the UC issues the coming about steps are utilized within the EPSO framework:

1. A population of particles  $p_i$  and extra factors are introduced. All particles are regularly produced subjectively inside adequate range  $P_{jmin} \leq P_j \leq P_{jmax}$  where  $P_j$  speaks to the power created by  $j^{\text{th}}$  unit in the power system.
2. The parameters as an example figure of particles, the dimension of population, primary and final inertia weight, particle's speed i.e., velocity, variety of iterations etc.
3. The fitness function for the population is estimated.

$$OC_T = \sum_{i=1}^T \sum_{j=1}^N PC_{j,t} U_{j,t} \quad (11)$$

Where,



$$PC_j = a_j + b_j P_j + c_j P_j^2.$$

Each individual's fitness value is compared with its  $P_{best}$ . The finest fitness value amongst the  $P_{best}$  values is denoted as  $G_{best}$ .

4. Alter the individual's velocity  $V_i$  of every individual utilizing the condition

$$V_i^{t+1} = wV_i^t + c_1 r_1^t [P_{best,i}^t - x_i^t] + c_2 r_2^t [G_{best}^t - x_i^t] \quad (12)$$

5. Reexamine the individual's position  $x_i$  utilizing  $x_i^{t+1} = x_i^t + V_i^{t+1}$  (13)

6. In the event that every individual's estimation worth is superior to the earlier  $P_{best}$ , the present worth is situated as  $P_{best}$ . In the event that the best  $P_{best}$  is better than  $G_{best}$  the worth is taken as  $G_{best}$ .

7. If the end criteria i.e., the amount of cycles achieves the most outrageous worth by then go to stage 8, else go to stage 3.

8. Evaluate the full scale cost, control scattering between the units, number of units submitted.

9. The person that incites the most up to date  $G_{best}$  is the most ideal power produced by every unit with the least total generation cost.

### V. RESULTS AND DISCUSSION

The four methods are applied for test system. Test system consists of three generating units. The results for the test system via different solution schemes are illustrated in the figures given below. The parameters for implementing the Evolutionary Particle Swarm Optimization technique are shown in table I.

Table- I: EPSO PARAMETERS

| Parameter              | Value    |
|------------------------|----------|
| Size of populace       | 50       |
| Iteration Number       | 500      |
| Cognitive constant, c1 | 2        |
| Social constant, c2    | 2        |
| Inertia weight, W      | 0.3-0.95 |

Three units are to be loyaled to serve 24-h burden design. Information concerning the units and burden example is given in tables II and III [12].

Table -II Fuel cost components for Test System

| Unit | Min. (MW) | Max. (MW) | a (\$/MW <sup>2</sup> h) | b (\$/MWh)             | c (\$/h)            |
|------|-----------|-----------|--------------------------|------------------------|---------------------|
| 1    | 150       | 600       | $1562 \times 10^{-6}$    | $792 \times 10^{-2}$   | $5.61 \times 10^2$  |
| 2    | 100       | 400       | $1940 \times 10^{-6}$    | $785 \times 10^{-2}$   | $3.10 \times 10^2$  |
| 3    | 50        | 200       | $5784 \times 10^{-6}$    | $956.4 \times 10^{-2}$ | $0.936 \times 10^2$ |

Table - II Load data for Test System

| Hr(s) | 1,2, 23,24 | 3    | 4,22 | 21   | 5,20 | 19              |
|-------|------------|------|------|------|------|-----------------|
| Load  | 1200       | 1150 | 1100 | 1050 | 1000 | 950             |
| Hr(s) | 6,18       | 17   | 7,16 | 8,15 | 9    | 10,11,12, 13,14 |
| Load  | 900        | 850  | 800  | 600  | 550  | 500             |

Figures 1, 2 & 3 represent the solution to unit commitment problem via Priority list method. Figure 1 represents the power sharing between three units for the corresponding load. Figure 2 represents the unit wise generation cost for 24 hours. Figure 3 speaks to the hourly all out cost acquired by submitting units.

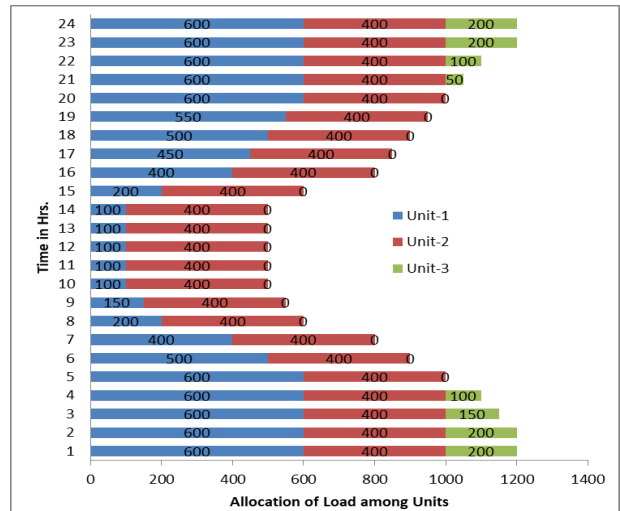


Fig.1 Power Sharing (MW) between the units obtained from Conventional Priority List method

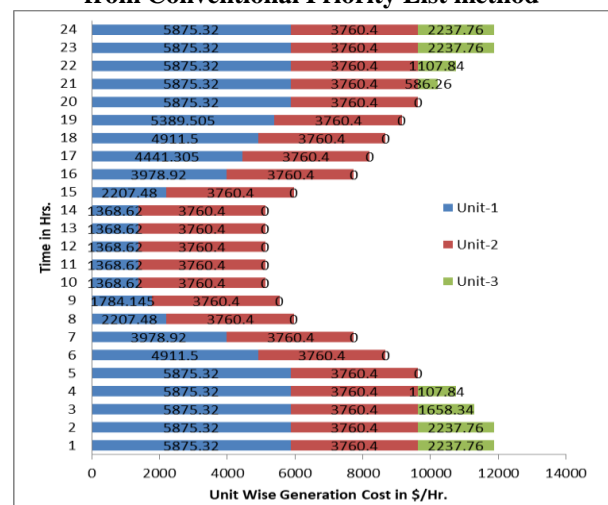


Fig. 2 Unit wise generation cost obtained from Conventional Priority List method

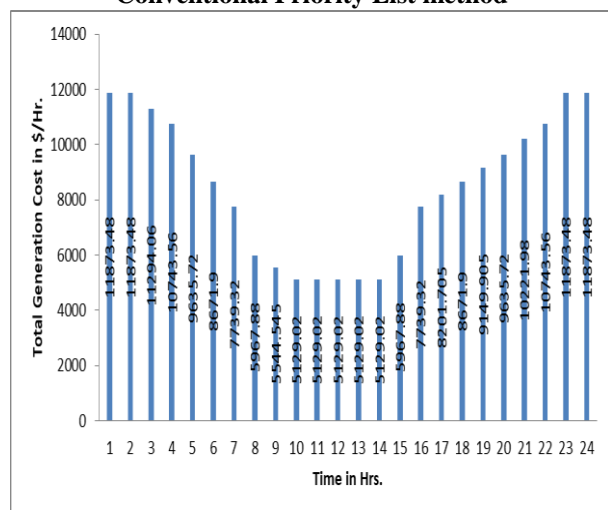


Fig. 3 Hourly total generation cost obtained from Conventional Priority List method

Figures 4, 5 & 6 represent the answer for UC issue by means of Dynamic Programming strategy. Figure 4 represents the power sharing between three units for the corresponding load. Figure 5 represents the unit wise generation cost for 24 hours. Figure 6 speaks to the hourly all out cost acquired by submitting units.



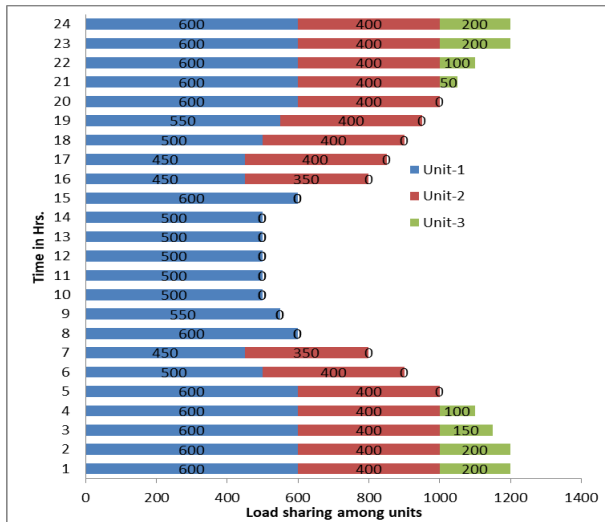


Fig. 4 Power Sharing (MW) between the units obtained from Dynamic Programming method

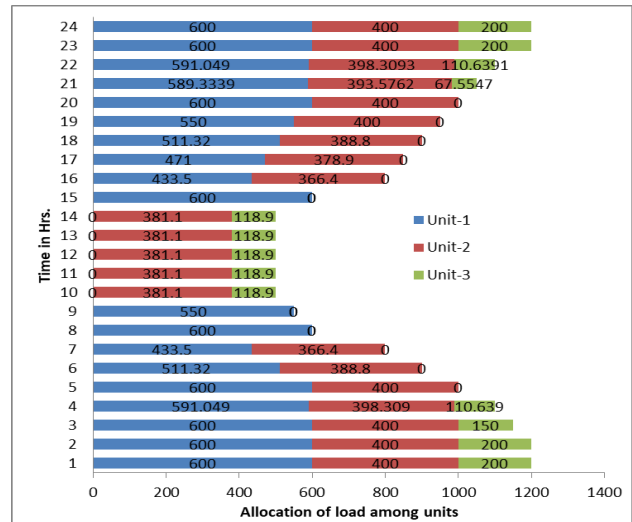


Fig. 7 Power Sharing (MW) between the units obtained from EPSSO method

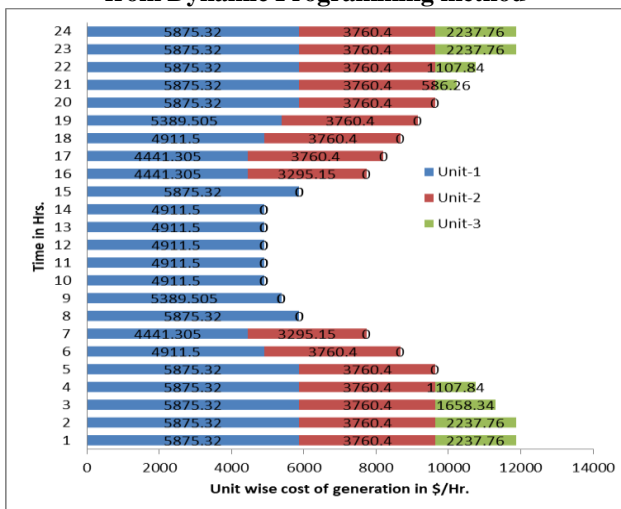


Fig. 5 Unit wise generation cost obtained from Dynamic Programming method

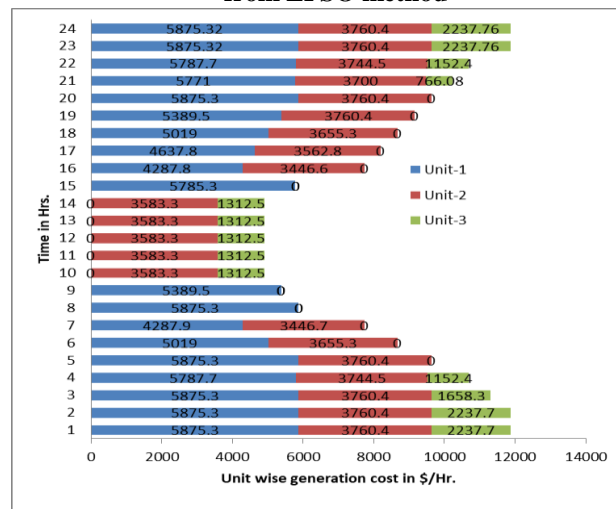


Figure 8 Unit wise generation cost obtained from EPSSO method

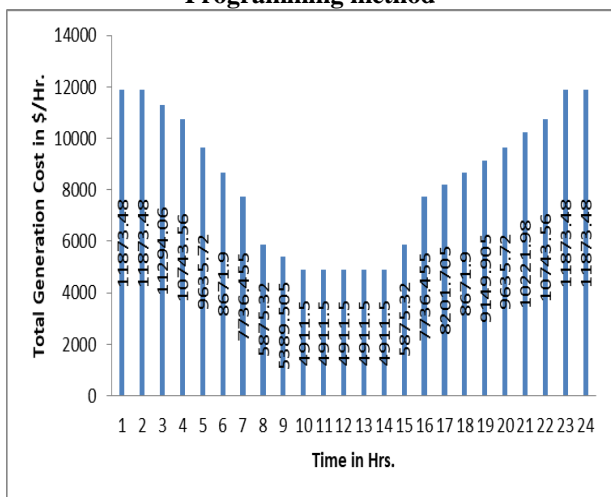


Figure 6 Hourly total generation cost obtained from Dynamic Programming method

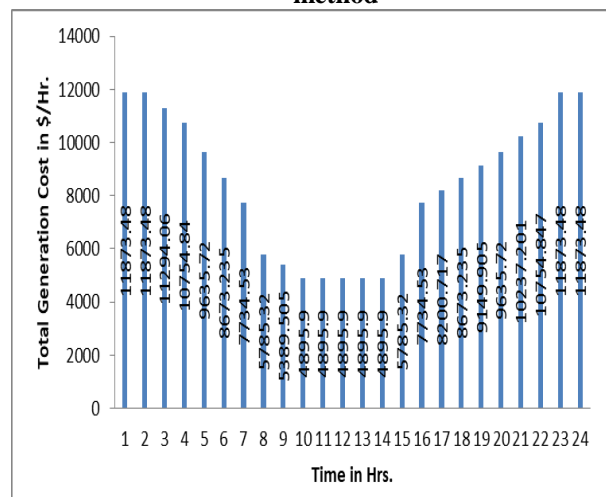


Figure 9 Hourly total generation cost obtained from EPSSO method

Figures 7, 8 & 9 speak to the answer for UC issue through EPSSO strategy. Figure 7 represents the power sharing between three units for the corresponding load. Figure 8 represents the unit wise generation cost for 24 hours. Figure 9 speaks to the hourly all out cost acquired by submitting units.

Table 4 gives the comparison of the three techniques for complete working expense.

**Table 4 Comparison of three solution methods**

| METHOD                                   | TOTAL OPERATING COST(\$) |
|--|--------------------------|
| Evolutionary Particle Swarm Optimization | 201412.112               |
| Dynamic Programming                      | 201634.485               |
| Priority List                            | 203067.975               |

**VI. CONCLUSION**

It is perceived that the ideal unit commitment of thermal systems brings about an extraordinary saving for electric utilities. Unit commitment is the fundamental and indispensable step in the day by day operational arranging of the power system. The UCP is a combinatorial optimization problem with equality and inequality constraints. Unit Commitment is the issue of deciding the calendar of producing units subject to gadget and working limitations. A successful, vigorous UC arrangement is a fundamental commitment to the working On/Off plans of the generating units. The plan of unit commitment has been talked about and the solution was acquired utilizing the examined strategies.

This paper talked about a calculation dependent on Evolutionary Particle Swarm Optimization system, which is a populace global search and optimization technique, has been created to tackle the unit commitment issue. The viability of the calculation was tried on a test framework involving three units. It is discovered that the outcome got for the unit commitment utilizing Evolutionary Particle Swarm Optimization is least contrasted with the outcome got from old style techniques.

**REFERENCES**

1. S. Pineda, R. Fernández-Blanco and J. M. Morales, "Time-Adaptive Unit Commitment," in IEEE Transactions on Power Systems, vol. 34, no. 5, pp. 3869-3878, Sept. 2019.
2. Ju, Y.; Wang, J.; Ge, F.; Lin, Y.; Dong, M.; Li, D.; Shi, K.; Zhang, H. "Unit Commitment Accommodating Large Scale Green Power". Appl. Sci. 2019, 9, 1611
3. Yang, Yinping & Qin, Chao & Zeng, Yuan & Wang, Chengshan. (2019). Interval Optimization-Based Unit Commitment for Deep Peak Regulation of Thermal Units. Energies. 12. 922. 10.3390/en12050922.
4. N. P. Padhy, "Unit commitment—A bibliographical survey," IEEE Trans. Power Syst., vol. 19, no. 2, pp. 1196–1205, May 2004
5. Yongli Zhu, Xuechun Liu, Yujia Zhai, and Ran Deng, "Monthly Unit Commitment Model and Algorithm with Renewable Energy Generation Considering System Reliability," Mathematical Problems in Engineering, vol. 2019, Article ID 3835296, 9 pages, 2019. <https://doi.org/10.1155/2019/3835296>.
6. L. Alvarado-Barrios & A. Rodríguez del Nozal & A. Tapia & J. L. Martínez-Ramos & D. G. Reina, 2019. "An Evolutionary Computational Approach for the Problem of Unit Commitment and Economic Dispatch in Microgrids under Several Operation Modes," Energies, MDPI, Open Access Journal, vol. 12(11), pages 1-23, June.
7. Castillo, Anya et al. "The Unit Commitment Problem With AC Optimal Power Flow Constraints." IEEE Transactions on Power Systems 31 (2016): 4853-4866.
8. Dai, H. , Zhang, N. and Su, W. (2015) A Literature Review of Stochastic Programming and Unit Commitment. Journal of Power and Energy Engineering, 3, 206-214. doi: 10.4236/jpee.2015.34029.
9. Lijun Sun, Xiaodong Song, and Tianfei Chen, "An Improved Convergence Particle Swarm Optimization Algorithm with Random Sampling of Control Parameters," Journal of Control Science and Engineering, vol. 2019, Article ID 7478498, 11 pages, 2019. <https://doi.org/10.1155/2019/7478498>.
10. Zhen Wang, Jihui Zhang, Shengxiang Yang, "An improved particle swarm optimization algorithm for dynamic job shop scheduling problems with random job arrivals", Swarm and Evolutionary

Computation", Volume 51, 2019, 100594, ISSN 2210-6502, <https://doi.org/10.1016/j.swevo.2019.100594>

11. Dongping Tian, Xiaofei Zhao, Zhongzhi Shi, "Chaotic particle swarm optimization with sigmoid-based acceleration coefficients for numerical function optimization", Swarm and Evolutionary computation, Volume 51, 2019, 100573, ISSN 2210-6502, <https://doi.org/10.1016/j.swevo.2019.100573>.
12. S.Usha Rani and Ch.Padmanabha Raju "A Solution to Unit Commitment Problem via Dynamic Programming and Particle Swarm Optimization", International Journal of Current Engineering and Technology (published by INPRESSCO-USA) (ISSN: 2277-4106), Volume.3, Issue.4, October-2013, pp.1495-1503G.

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