

# Sizing of Energy Storage with Network Constraints Economic Dispatch of Fuel Cell Micro-Turbine and Renewable Energy Sources



Bharat Singh, Ashwani Kumar

**Abstract:** *Micro-Grid is the appropriate solution to various problems in the power system. Different types of energy sources, likewise Fuel cell (FC), Micro-Turbine (MT) and renewable energy sources can be integrated with micro-grids (MG). The battery energy storage has played a crucial role to support the power mismatch of on-grid or off-grid MG. Therefore the optimal size of battery energy storage along with the optimal cost-based calculation has become an essential part for the micro-grid operator. The piecewise linear cost method is used for the cost based analysis. The main contribution of this paper is: (i) the optimal size of battery energy storage has been determined with a Fuel cell (FC) and Micro-Turbine (MT) based distribution generation (DG). (ii) The impact of battery storage with DG and renewable energy sources (RES) has been considered. (iii) The total benefit and market benefit has been maximised. (iv) The unit-commitment cost of FC and MT with spinning reserve, piecewise linear cost function, ramp rate, minimum up and downtime constraints has been considered for the sizing of battery storage. (v) The network constrained has been found to obtain minimum daily energy loss for the optimal size of battery storage. (vi) The state of charge (SOC) of battery, the power output of DG's and RES, power loss, battery cost per day, operating cost of generation, etc. have been determined. The optimal sizing of battery energy storage determination is helpful for the both Microgrid operators as well as designers. The IEEE-33 bus test system with ZIP load has been carried out for analysis and result validation. The general algebraic modeling system (GAMS) is used to solve the deterministic optimisation problem.*

**Keywords:** *Battery Energy Storage Device (BES), Energy Loss, Market Benefit, Unit Commitment, Piecewise linear function, Renewable Energy Sources.*

## I. INTRODUCTION

In recent years, renewable energy has been intermittent with micro-grid (MG) in a large scale. The intermittency of renewable and distributed generation (DG) has become an essential need for storage in MG. The optimum sizing of storage devices has become an essential task for MG operators. Although the size of energy storage is varying in nature from the type to type of DG's. The sizing of battery storage must be considered with market benefit in MG with various energy sources along with the network constraints.

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The optimal size of BES has studied not only the total benefit of energy sales but also to reduce the energy loss of the distribution network.

The power loss saving is another issue for MG operators. The energy-saving capacity with renewable PV power generation using the rooftop installation of PV has represented in [1]. A potential game model has described in [2] for battery energy storage scheduling with renewable sources. The loss saving has been discussed with the installation of a photovoltaic (PV) system in the network [3]. In recent years, the power loss minimisation and energy-saving problem based on random search methods have been published. The metaheuristic Ant Lion Optimization (ALO) algorithm had used to determine the optimal DG size for loss minimisation [4]. The sizing of battery energy storage based literature has considered in MG for cost based objectives. Chen, S. X et al. [5], has determined the size of battery storage with cost-benefit based unit commitment problem but the minimum up and downtime constraints did not consider. The FC and MT have been taken into account for the unit commitment (UC) problem without network constraints also.

Bahmani-Firouzi et al. [6] the bat algorithm has been implemented for determining the size of battery storage. The piecewise linear cost function, minimum up and downtime constraints did not consider in [6]. To minimise the power losses and expected operational cost of the microgrid with the stochastic problem had been represented in [7]. The nonlinear constraints multi-objective has been solved using Adaptive Modified Particle Swarm Optimization algorithm (AMPSSO) is presented for MG dispatch with FC, MT and battery storage as a back-up [8]. The battery model was solved using Runge-Kutta method for standalone hybrid PV-battery system [9]. The conditional depreciation balancing strategy had used for hybrid energy storage and virtual battery model and compared with the state of charge method also [10]. The automatic segmentation method and the segmentation method are proposed to obtain the capacity of the battery energy storage system [11]. The formal mathematical model combined with power network topology has been represented for FC and MT integrated MG system [12]. V.V.S.N. Murty et al. [13] has represented Fuzzy logic based energy storage system scheduling for optimal energy dispatch strategy and energy saving.

The unit commitment was not considered in [13]. The probabilistic approach has been represented in [14] for the sizing of battery storage with Wind Turbine power fluctuations. The dispatching methodology with the cost-based rule has represented using Monte Carlo simulation (MCS) for micro-grids [15]. The solar radiation model using MCS as described in [16], but the battery storage has not considered.

G.Ma et al.[17] has considered the simplified unit commitment (UC) of generating units along with a one-hour time scale for energy storage with renewable Wind turbines and solar. The priority-based UC problem has been solved with demand-side bidding of controllable loads in paper [18]. The UC of the diesel plant has been considered using the mixed-integer formulation for the rating of the energy storage system along with isolated Wind Turbine-diesel. The marketable reduction in cost has been concluded utilising the combination of the energy storage system (ESS) and diesel generator in paper [19]. The total generation cost for the unit commitment problem using the gravitational search algorithm gives the better results, computation time and precision for the energy storage system in MG application in [20]. A piecewise linear approximation and integer algebra have been implemented for linear expression of nonlinearities with the renewable energy sources in paper [21]. The piecewise linear approximation constraints have also been used for computation of power loss in low voltage grid-connected battery storage system [22]. The battery storage has been considered with residential PV system in [23]. The energy saving issue has also been considered with influence of storage and PV system in literature [24]-[25].

In the above literature from [1] to [26] the various algorithm and techniques have been used for energy loss minimisation using renewable energy sources along with the BES. The multiple algorithm used for determining the size of BES with the installation of FC, MT, Wind Turbine (WT) and PV has been discussed in the literature [6] to [12]. The UC problem with spinning reserve has been considered for the sizing of BES in [17] to [22].

In this paperwork, the size of battery storage has been determined by considering the Fuel cell (FC), and Micro-Turbine (MT) based DG's along with Wind Turbine and solar-based renewable energy sources. The sizing of battery energy storage has been obtained, considering the impact of renewable-based energy sources also.

## II. PROBLEM FORMULATION AND MATHEMATICAL MODEL

In this paperwork, the optimal size of battery energy storage has been obtained. The size of BES has been determined considering the multi-objective function. The multi-objective function have been considered as follows;

- (i) To maximise the total benefit, including the cost of power sale/purchases from the grid.
- (ii) To minimise the daily energy loss profile.

In this paper, the objective function has consisted of the outer layer and inner layer optimisation problem.

- a. In the outer layer optimisation problem, an iterative algorithm has been solved. The BES has been obtained at each iteration. The total benefit, market benefit, cost of UC and daily energy loss curve have been obtained at each size of BES. Based on the result of the outer layer optimisation problem, the best size of BES has been obtained. The battery size has been obtained at that iteration having the minimum daily energy loss value and maximum market benefit.
- b. In the inner layer optimisation problem, the obtained size of BES from outer layer optimisation has been analysed as follows;
  - 1) The UC problem, spinning reserve, the total hourly spinning reserve has been solved.
  - 2) The piecewise linear cost function has been solved for determining the fuel cost of FC and MT units.
  - 3) The start-up and shut-down cost of generators have been determined with up-time and down-time constraints.
  - 4) The total power output of FC, MT, PV and WT have been determined.
  - 5) The state of charge SOC, charging and discharging power of BES has been obtained.

The outer layer optimisation has been solved using MATLAB simulation, whereas the inner layer optimisation problem has been solved using MINLP technique in GAMS software.

The algorithm has been solved for various case study. The unit commitment with spinning reserve has been considered for dispatch-able sources; likewise, Fuel cell and micro-turbine (MT). The renewable-based Wind Turbine and PV energy sources have been considered in this scenario.

In this paperwork, the IEEE 33 bus test system has been carried out. The time-varying ZIP load has been taken into account for the analysis. The impact of battery energy storage with and without renewable energy sources has also been analysed. The unit commitment problem has been formulated, including piecewise cost segment, ramp rate, minimum uptime and downtime constraints. The problem is solved by MINLP solver in GAMS. The data interpretation has been done with the interfacing of MATLAB and GAMS software.

### A. Mathematical Modelling

In this section the mathematical modelling of Solar, Wind Turbine, Fuel Cell, Micro-Turbine and battery storage has been represented as follows;

#### 1) PV Panel modeling

The PV generator is the renewable source which provides the DC at 48 V. The Monte Carlo Simulation (MCS) has been taken for the exact modelling of solar power output. In this scenario, 1000 numbers of the sample have been chosen for simulation [23].

The solar PV model is;

$$P_{solar}(I_{\beta}) = N_{PV} \cdot P_{rated}^{PV} \frac{G}{G_0} \cdot \{1 - T_c(T_A - 25)\} \cdot \eta_{inv} \eta_{rl} \quad (1)$$

where,  $P_{solar}$  is the output power,  $P_{rated}^{PV}$  rated power of PV, and  $N_{PV}$  is the total number of solar panel [16].  $G$  and  $G_0$  are solar irradiation and slandered solar irradiation in ( $\frac{watt}{m^2}$ ). The Fig.1 shows solar PV output for 24 hours.  $T_A$  is the ambient temperature and  $T_c$  is the temperature coefficient of the maximum power of PV.  $\eta_{inv}$  and  $\eta_{rl}$  represent the efficiency of the inverter and the relative efficiency of the PV modules respectively.

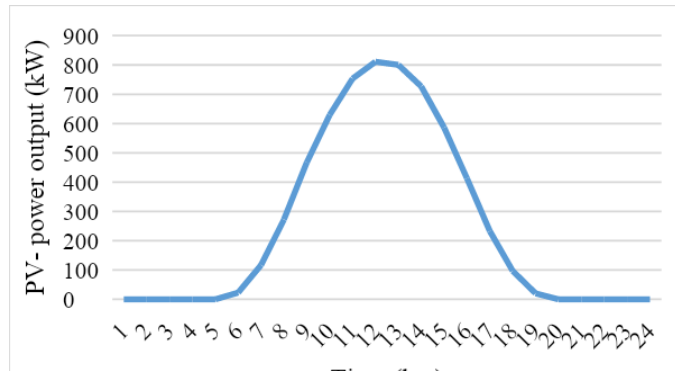


Fig. 1 Solar power output curve for 24 hrs

## 2) Wind Turbine Power Model

In this paper, the quadratic model of Wind Turbine has been taken. The wind turbine output is shown in Fig 2. The Wind Turbine model is as:

$$P_{wind} = \begin{cases} P_{rated} \left( \frac{(v-v_{in})^2}{(v_r-v_{in})^2} \right) ; & v_{in} \leq v \leq v_r \\ P_{rated} ; & v_r \leq v \leq v_{out} \\ 0 & \text{and } v < v_{cut} \end{cases} \quad (2)$$

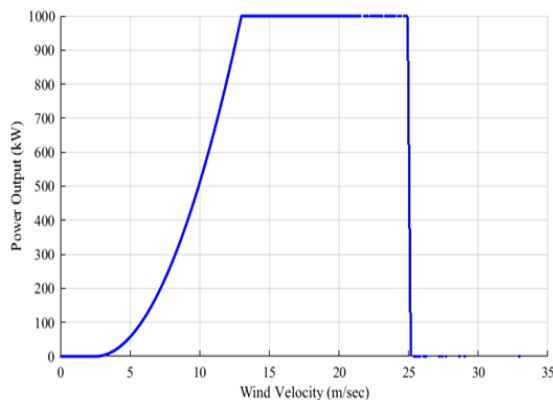


Fig. 2 Wind Turbine power output curve

where,  $P_{rated}$  is the rated Wind Turbine power,  $P_{wind}$  is the Wind-Turbine power output  $v_{in}$  is cut in the velocity of Wind Turbine,  $v_{out}$  is cut out Wind Turbine velocity.

## 3) Battery Storage Model

The battery storage works as back-up storage. The discharging and charging power limits of battery are the control parameters. The maximum value depends on the

nominal capacity, while the minimum value depends on its Depth of Discharge (DOD).

$$SOC_{min} = N_{bat} Batt_{size} (1 - DOD_{max\_bat}) \quad (3)$$

$$SOC_{max} = N_{bat} Batt_{size} \quad (4)$$

$$SOC(i, k + \Delta k) = SOC(i, k) \cdot (1 - \delta) + (P_{ch_i}^k \cdot \eta_{ch} - P_{dis_i}^k \cdot \eta_{dis}) \Delta k \quad (5)$$

Eq.(3) and (4) are represent the minimum and maximum value of BES, whereas Eq.(5) is represent the state of charge (SOC) calculation for battery storage device.

where,  $k$  is time in hrs 1,2,...,24 and  $\Delta k$  is the time step.  $DOD_{max\_bat}$  is the maximum depth of discharge,  $Batt_{size}$  is the nominal capacity (kWh),  $N_{bat}$  total number of battery,  $SOC$  is a state of charge,  $P_{ch}$  charging power,  $P_{dis}$  is discharging power,  $\eta_{ch}$  and  $\eta_{dis}$  are the charging and discharging efficiency of the battery.

The discharging schedule depends on the SOC of battery also. Once the peak energy-saving is stabilized the discharging of battery is as follows;

$$E_{dis,i,k}^{min} = \int_k^T (Pd_{Load,i}^k - (P_{grid_i}^k) - \max(P_{gen_i}^k)) \Delta t \quad (6)$$

if  $Pd_{Load,i}^k \geq (P_{grid_i}^k)$

where,  $P_{gen_i}^k$  is the generator output at each  $i^{th}$  bus for  $k^{th}$  time,  $P_{grid_i}^k$  is grid power,  $Pd_{Load,i}^k$  load demand.  $\forall i = 1,2 \dots nb$  and  $\forall k = 1,2 \dots T$ ,  $T$  is total time .i.e 24 hrs.

The charging schedule of battery energy storage has scheduled based on peak energy saving. The renewable-based DGs has stabilised to supply the load as well as to supply the battery storage. Once the peak energy is scheduled based on the lower market bid as well as the availability of renewable energy the formulation of charging of battery storage has determined as follows;

$$E_{ch,i,k}^{min} = \int_k^T ((P_{grid_i}^k) + (P_{gen_i}^k) - Pd_{Load,i}^k) \Delta t \quad (7)$$

if  $Pd_{Load,i}^k \leq (P_{grid_i}^k)$

where,  $E_{ch,i,k}^{min}$  and  $E_{dis,i,k}^{min}$  are minimum charging and discharging the energy of battery energy storage.

## 4) Fuel Cell (FC) Model

The fuel cells are considered as a clean energy source because FCs do not need conventional fuel. FC has a higher efficiency than a diesel engine and simple to maintain also. FC has needed the continuous source of fuel and oxygen; therefore, FCs are differed with the battery as per longer operating time. The cost of a fuel cell ( $Cost_{FC}$ ) depends on the FC's efficiency ( $\eta_{FC}$ ) and power output ( $P_{gen_i}^{FC}$ ) of a fuel cell.

$$Cost_{FC} = \left( \frac{P_{gen_i}^{FC}}{\eta_{FC}} \right) Csu_{fuel\_FC} \quad (8)$$

where,  $Csu_{fuel\_FC}$  is price to supply of fuel (\$/kWh).



### 5) Micro-Turbine

MT has more benefits as compared to conventional heat engine in terms of the low maintenance cost, small compact size, more substantial reliability, low emission and flexible operation of the fuel. The cost of MT ( $Cost_{MT}$ ) depends on the MT's efficiency ( $\eta_{MT}$ ) and active power output ( $P_{gen_i}^{MT}$ ) of MT.

### 6) Piecewise linear cost model of FC and MT generation

The piecewise linear cost function has been carried out for Fuel cell (FC) and Micro-Turbine (MT) generation. The number of segments is used for piecewise linear cost model[27]. The cost segments have been made for power segments ( $\Delta P_{i,k}^{sg}$ ).

$$0 \leq P_{i,k}^{sg} \leq \Delta P_{i,k}^{sg} \cdot U_{i,k}^{gen}; \forall sg \in nsg \quad (10)$$

$$\Delta P_{i,k}^{sg} = \frac{(P_{gen_{i,k}}^{max} - P_{gen_{i,k}}^{min})}{nsg} \quad (11)$$

$$P_{i,k,ini}^{sg} = (sg - 1)\Delta P_{i,k}^{sg} + P_{gen_{i,k}}^{min} \quad (12)$$

$$P_{i,k,final}^{sg} = \Delta P_{i,k}^{sg} + P_{i,k,ini}^{sg} \quad (13)$$

$$P_{gen_i}^k = P_{gen_{i,k}}^{min} \cdot U_{i,k}^{gen} + \sum_{sg}^{nsg} \{ \Delta P_{i,k}^{sg} \} \quad (14)$$

$$Cost_{gen_{i,k,ini}}^{sg} = \{ a_i (P_{i,k,ini}^{sg})^2 + b_i P_{i,k,ini}^{sg} + c_i \} \quad (15)$$

$$Cost_{gen_{i,k,final}}^{sg} = \{ a_i (P_{i,k,final}^{sg})^2 + b_i P_{i,k,final}^{sg} + c_i \} \quad (16)$$

$$s_i^{sg} = \frac{(Cost_{gen_{i,k,final}}^{sg} - Cost_{gen_{i,k,ini}}^{sg})}{\Delta P_{i,k}^{sg}} \quad (17)$$

$$Cost_{fuel}^{gen} = U_{i,k}^{gen} \{ a_i (P_{gen_i}^k)^2 + b_i P_{gen_i}^k + c_i \} + \sum_{sg}^{nsg} \{ s_i^{sg} \Delta P_{i,k}^{sg} \} \quad (18)$$

$\forall gen \in (FC, MT)$

where, nsg is total number of segments,  $U_{i,k}^{gen}$  is the on/off status of FC and MT units at time k,  $P_{gen_{i,k}}^{max}$  and  $P_{gen_{i,k}}^{min}$  maximum and minimum power limits of FC and MT respectively,  $Cost_{gen_{i,k,ini}}^{sg}$  and  $Cost_{gen_{i,k,final}}^{sg}$  are initial and final cost segment of FC and MT generation.  $Cost_{fuel}^{gen}$  is the fuel cost of FC and MT.  $a_i$ ,  $b_i$  and  $c_i$  are the cost coefficients of FC and MT respectively.

### 7) Load Model

In this paper, the time-varying ZIP load model is represented. The constant impedance, constant current and constant power load model for residential, commercial and industrial loads has been carried out for the analysis.

The expressions for zip load model is represented as follows;

$$P_{i,k}^{ZIP} = Pd_i \left[ Z_p \left( \frac{V_i^k}{V_{min}^k} \right)^2 + I_p \left( \frac{V_i^k}{V_{min}^k} \right) + P_p \right] \quad (19)$$

$$Q_{i,k}^{ZIP} = Qd_i \left[ Z_q \left( \frac{V_i^k}{V_{min}^k} \right)^2 + I_q \left( \frac{V_i^k}{V_{min}^k} \right) + P_q \right] \quad (20)$$

$\forall \{ Z_i + I_i + P_i = 1 \}$ , where,  $Z_i$ ,  $I_i$  and  $P_i$  are the constant impedance, constant current and constant power load parameter for different type of customer [28].  $Pd_i$  and  $Qd_i$  are

the load demand at each bus i. The active and reactive part of ZIP load is shown in Fig 3.

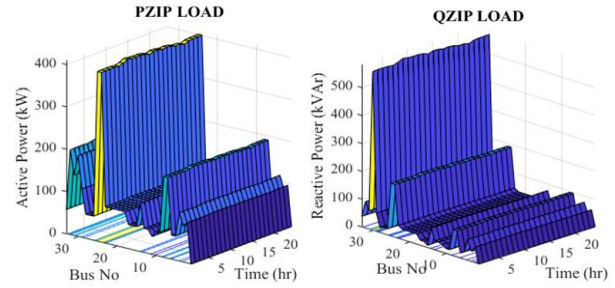


Fig. 3 ZIP Load profile [35]

### 8) Micro-Grid

The network consistence of IEEE-33 bus test system.

In Fig.4 the FC at 21<sup>st</sup> bus, MT-1 and MT-2 at bus 5<sup>th</sup> and 11<sup>th</sup>, WT at 15<sup>th</sup> bus and PV at 30<sup>th</sup> bus have been installed for optimal size of battery storage at 19<sup>th</sup> bus.

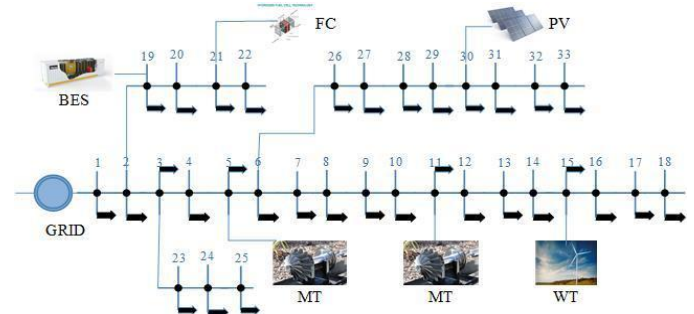


Fig. 4 MG network with Energy Resources

### B. Problem formulation

The following objective function has formulated as:

#### 1) Objective function formulation

The multi-objective function is to maximising the total benefit of grid-connected micro-grid and minimising the daily energy loss profile of the network. The multi-objective function  $f_1$  and  $f_2$  formulated as follows;

$$\max\{f_1\} = Market_{Benefit} - Batt_{CPD} \quad (21)$$

$$\min\{f_2\} = \sum_k^T \sum_i^{nb} G_{ij}^k \{ (V_i^k)^2 + (V_j^k)^2 - 2V_i^k V_j^k \cos \theta_{ik} - \delta_{jk} \} \quad (22)$$

$$Market_{Benefit} = \sum_k^T \{ Price_{Market} \cdot \sum_i^{nb} P_{gen_i}^k - UCC_{disp} \} \quad (23)$$

$$UCC_{disp} = \sum_k^T \sum_i^{nb} \{ rRn_{i,k} + Cost_{i,k}^{gen} + (U_{i,k}^{wind} voll^{wind}) \cdot P_{i,k}^{wind} + U_{i,k}^{PV} voll^{PV} \cdot P_{i,k}^{PV} \}$$

$$Cost_{i,k}^{gen} = STC_{i,k}^{gen} + SDC_{i,k}^{gen} + U_{i,k}^{gen} \left\{ a_i (P_{gen_i}^k)^2 + biP_{genik} + ci + sgns gsisg \Delta Pi, ksg \right\} \quad (24)$$

$$Batt_{CPD} = \left\{ \left( \frac{rt \cdot (1+rt)^{yr}}{(1+rt)^{yr} - 1} \right) \cdot Batt_{fc} + Batt_{MC} \right\} \frac{Batt_{Size}}{365} \quad (26)$$

where,  $UCC_{disp}$  unit commitment cost for generating unit,  $Rn_{i,k}$  spinning reserve for  $i$ th unit at  $k$ th time,  $Cost_{i,k}^{gen}$  is operating cost of generation unit .i.e. FC and MT.  $P_{i,k}^{wind}$  is power output of  $i$ th Wind Turbine unit at  $k$ th time.  $voll^{wind}$  and  $voll^{PV}$  are the value of Wind Turbine and PV respectively.  $P_{i,k}^{PV}$  is power output of  $i$ th PV unit at  $k$ th time.  $U_{i,k}^{wind}$  and  $U_{i,k}^{PV}$  are the on/off status of Wind Turbine and solar PV respectively.  $Batt_{CPD}$  is the battery cost per day,  $rt$  is interest rate,  $yr$  is number of year to use battery,  $Batt_{fc}$  and  $Batt_{MC}$  are the fixed and maintenance cost of battery storage.

Constraints Equations are as follows;

(i) Power balance constraints;

$$P_i^k = (Pg_i^k + Pgrid_i^k - Pd_{ZIP,i}^k) = V_i^k \sum_{j=1}^{nb} V_j^k (G_{ij}^k \cos(\delta_i^k - \delta_j^k) + B_{ij}^k \sin \delta_{ik} - \delta_{jk}) \quad (27)$$

$$Q_i^k = (Qg_i^k + Qgrid_i^k - Qd_{ZIP,i}^k) = V_i^k \sum_{j=1}^{nb} V_j^k (G_{ij}^k \sin(\delta_i^k - \delta_j^k) - B_{ij}^k \cos \delta_{ik} - \delta_{jk}) \quad \forall i \in SB \ \& \ k \in ST \quad (28)$$

where  $\forall i = 1, 2 \dots nb$ ,  $\forall j = 1, 2 \dots nl$ ,  $nb$  is a number of buses and  $nl$  is the total number of line.  $S_B$  is the set of buses, and  $S_T$  is the set of Time  $k$ .  $Pd_i^k$  and  $Qd_i^k$  are the active and reactive power demand for  $i$ th bus at  $k$ th time period.

(ii). Power generation constraints:

$$Pg_i^k = P_{gen,i}^k + N_{wind}(i) \cdot P_{wind_i}^k + N_{PV}(i) \cdot P_{PV_i}^k + N_{batt}(i) \cdot (P_{ch_i}^k - P_{dis_i}^k) \quad (29)$$

$$Qg_i^k = Q_{gen_i}^k + N_{wind}(i) \cdot Q_{wind_i}^k \quad (30)$$

where,  $P_{gen_i}^k$  and  $Q_{gen_i}^k$  are the active and reactive power supplied by diesel generator for  $i$ th bus at  $k$ th time period.

(iii). Ramp rate constraints;

The ramp rate constraints for generation of fuel cell and micro turbine has been represented as;

$$P_{gen_i}^k \leq P_{gen_{i,k}}^{max} [U_{i,k}^{gen} - X_{i,k+1}^{gen}] + SD_{i,k}^{gen} \cdot X_{i,k+1}^{gen} \quad (31)$$

$$P_{gen_i}^k \leq P_{gen_i}^{k-1} + RU_{i,k}^{gen} \cdot U_{i,k-1}^{gen} + SU_{i,k}^{gen} Y_{i,k+1}^{gen} \quad (32)$$

$$P_{gen_i}^k \geq P_{gen_i}^{k-1} - RD_{i,k}^{gen} \cdot U_{i,k}^{gen} - SD_{i,k}^{gen} \cdot X_{i,k}^{gen} \quad (33)$$

(iv). Start up/Down cost constraints;

$$Y_{i,k}^{gen} - X_{i,k}^{gen} = U_{i,k}^{gen} - U_{i,k-1}^{gen} \quad (34)$$

$$STC_{i,k}^{gen} = Cost_{i,k}^{ST} Y_{i,k}^{gen} \quad (35)$$

$$SDC_{i,k}^{gen} = Cost_{i,k}^{SD} X_{i,k}^{gen} \quad (36)$$

(v). Start up/Down Time constraints

Minimum up time ( $UT_i$ ) constraints is modelled as;

$$\sum_k^{T-UT_i+1} (1 - U_{i,k}^{gen}) = 0$$

$$\sum_{k=sg}^{sg-UT_i+1} (U_{i,k}^{gen}) \geq UT_i \cdot Y_{i,k}^{gen}$$

$$\sum_{k=sg}^T (1 - Y_{i,k}^{gen}) \geq 0 \quad (37)$$

$$\forall sg = T - UT_i + 2 \dots T$$

Minimum down time ( $DT_i$ ) constraints is modelled as;

$$\sum_k^{T-UT_i+1} (U_{i,k}^{gen}) = 0$$

$$\sum_{k=sg}^{sg-UT_i+1} (1 - U_{i,k}^{gen}) \geq DT_i \cdot X_{i,k}^{gen}$$

$$\sum_{k=sg}^T (1 - U_{i,k}^{gen} - X_{i,k}^{gen}) \geq 0 \quad (38)$$

$$\forall sg = T - DT_i + 2 \dots T$$

where,  $U_{i,k}^{gen}, X_{i,k}^{gen}, Y_{i,k}^{gen} \in (1,0)$ , is the binary variables.

$SD_{i,k}^{gen}$  and  $SU_{i,k}^{gen}$  are shut down and start-up cost constants of FC and MT.  $Cost_{i,k}^{SD}$  and  $Cost_{i,k}^{ST}$  are the cost coefficients of shut down and start up for FC and MT respectively.  $STC_{i,k}^{gen}$  and  $SDC_{i,k}^{gen}$  are start-up and shut down cost for generating unit.

(vii). Power Loss equation

$$|P_{ij}^k| = \left| \sum_k^T \sum_i^{nb} G_{ij}^k \{ (V_i^k)^2 + (V_j^k)^2 - 2V_i^k V_j^k \cos \cos(\delta_i^k - \delta_j^k) \} \right|$$

$$\leq P_{max}^k \quad (39)$$

where,  $P_{max}^k$  is the maximum apperent power flow through the line at  $k$ th hrs.  $l \in S_L$  is the set of line.

Inequality constraints:

(viii). Constraints for Transmission line

$$P_{fsmin_j}^k \leq P_{fs_j} \leq P_{fsmax_j}^k, \quad i \in S_{fs}$$

$$Q_{fsmin_i}^k \leq Q_{fs_j} \leq Q_{fsmax_j}^k, \quad i \in S_{fr}$$

$$P_{frmin_j}^k \leq P_{fr_j} \leq P_{frmax_j}^k, \quad i \in S_{fr}$$

$$Q_{frmin_i}^k \leq Q_{fr_j} \leq Q_{frmax_j}^k, \quad i \in S_{fr} \quad (40)$$

(ix). Capacity Limits of the generation system

$$P_{Gi}^{min} \leq P_{gi} \leq P_{gi}^{max}, \quad i \in S_G \quad (41)$$

$$Q_{gi}^{min} \leq Q_{gi} \leq Q_{gi}^{max}, \quad i \in S_G \quad (42)$$

(x). Voltage and angle limits

$$V_{i,k}^{min} \leq V_i^k \leq V_{i,k}^{max}, \quad i \in S_B \quad (43)$$

$$\square_{min_i}^k \leq \delta_i^k \leq \delta_{max_i}^k, \quad \forall i = 1, 2 \dots nb \quad (44)$$

(xi). Power factor limits

$$pf_i^{lo} \leq pf_i \leq pf_i^{up}, \quad i \in S_B \quad (45)$$

(xii) Energy storage constraints;  
 $SOC_i^{min}(k) \leq SOC_i(k) \leq SOC_i^{max}(k)$  (46)

$$SOC_i^{max}(1) = SOC_i^{max}(24) = 0.90 * N_{bat}(i)Batt_{size}$$
 (47)

$$0 \leq P_{ch_i}^k \leq 0.6 \cdot N_{bat}(i)Batt_{size}$$
 (48)

$$0 \leq P_{dis_i}^k \leq 0.6 \cdot N_{bat}(i)Batt_{size}$$
 (49)

$$P_{dis_i}^k \cdot P_{ch_i}^k = 0$$
 (50)

where,  $i$  is the total number of buses in the network .i.e.  $\forall i = 1,2 \dots nb$ .  $nb$  is the total number of buses.,  $k=$  time  $1 \dots 24$  hrs.

### III. ALGORITHM USED

In this paper, the outer and inner layer algorithm with MATLAB and GAMS interfacing is used. In the outer layer, the MATLAB is used for the required load data and load flow algorithm for obtaining the power loss. Whereas the inner layer, GAMS programming is executed for obtaining the battery size, total benefit, market benefit and other variables.

Step 1 Algorithm for outer layer as follows;

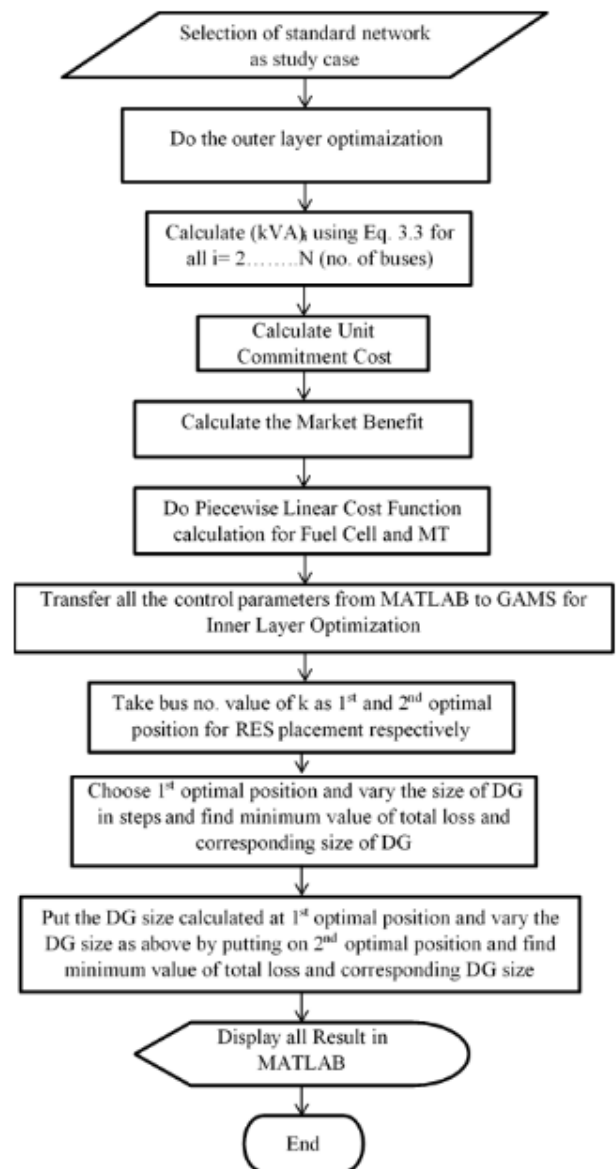
- (a) Read the system data and ZIP load parameters.
- (b) Solve the Monte-Carlo simulation for Wind Turbine and solar power calculation.

Step 2

- (a) Run the load flow program for 24-hrs and obtain the base Case total energy loss.
- (b) Select the candidate node having the highest energy loss for FC and MT location.

Step 3

- (a) Set the initial value of minimum battery size for iteration.
- (b) Obtain the total benefit, Market benefit, daily energy loss profile for each battery size.
- (c) Obtain the optimal battery size.
- (d) Transfer the all control parameter from MATLAB to GAMS



**Fig. 5 Two-layer Algorithm used to solve Battery Size in MG**

Step 4 Algorithm for inner layer as follows;

- (a) Solve the objective function (21) and (22). Solve the constraints equation from (25) to (30) calculate Market Benefit using MINLP solver.
- (b) Obtain the size of the battery (3) SOC, charging and discharging of the cell, and solve equation (46) and (50).
- (c) Obtain the power output of FC and MT by solving constraints from (31) to (38).
- (d) Obtain the cost segment using piecewise linear cost function by solving (10) to (18).

Step 6 Transfer the objective variables form GAMS to MATLAB and get the results.

Step 7 Print the results.

The flow chart of the proposed hybrid algorithm is shown in Fig.5.

#### IV. SYSTEM DATA

The system data are given in this paper represented as follows;

##### A. Fuel Cell and Micro-Turbine Data

The FC and MT power generation data [5] is given in Table I.

**Table- I: Generator data for FC and MT [5]**

| Type | a      | b      | c    | Pmin | Pmax |
|------|--------|--------|------|------|------|
| FC   | 0.0    | 0.35   | 80   | 100  | 1000 |
| MT   | 0.0    | 0.50   | 50   | 100  | 1000 |
| MT   | 0.0    | 0.13   | 30   | 100  | 2000 |
|      | RU     | RD     | UT   | DT   |      |
| FC   | 30     | 30     | 0    | 0    |      |
| MT   | 64     | 64     | 0    | 0    |      |
| MT   | 40     | 40     | 2    | 2    |      |
|      | CostSD | CostST | R10  | P10  |      |
| FC   | 57.1   | 57.1   | 500  | 1000 |      |
| MT   | 50.6   | 50.6   | 500  | 1000 |      |
| MT   | 42.6   | 42.6   | 1000 | 0    |      |
|      | SU     | U0     | d    | r    |      |
| FC   | 80     | 3      | 30   | 0.10 |      |
| MT   | 140    | 2      | 30   | 0.10 |      |
| MT   | 110    | 1      | 150  | 0.10 |      |

##### B. Solar and Wind Turbine cost data

**Table- II: The input data for the energy sources [29], [30] & [31].**

|                    | Acquisition cost (\$) | Operation and Maintenance Cost (\$/year/kW) | Replacement Cost (\$/Lifetime) | Lifespan (year) | Rating    |
|--------------------|-----------------------|---|--------------------------------|-----------------|-----------|
| PV module          | 2400                  | 18  | 2.85 @ 25 year of life time    | 25              | 800 (kW)  |
| Wind Turbine (1MW) | 3724.5                | 31  | 3009.5                         | 20              | 1000 (kW) |
| Battery Storage    | 600                   | 20  | 4.64 @ 1.45 year               |                 | 100 (kWh) |

The input data used in this paper has shown in Table- II. The cost estimation data for the PV-based DG and wind-based DG have been taken from the National Renewable Energy Laboratory (NREL) [29], [30] & [31]. The data for battery, regulators and investors are taken from the literature [32].

#### V. RESULTS AND DISCUSSION

In this section, the results for the sizing of battery storage is discussed. The multi-objective function has been solved, as explained in section 2. There are two case scenario has been considered as follows;

Case 1: Size of energy storage with wind and solar-based renewable energy sources.

Case 2: Size of energy storage without wind and solar-based renewable energy sources.

##### A. Case 1

In this case study, the size of battery energy storage has obtained with WT, PV, FC and MT.

###### 1). Result for the outer layer

In this section, the result for the outer layer has been discussed. The maximum and minimum size of battery storage obtained is 3000 kWh and 100 kWh. The incremental capacity of battery ( $\Delta Batt_{size}$ ) taken is 100 kWh. Therefore the total 30 number of iteration is taken. In Fig.5, the minimum daily energy loss obtained is 3042.892 kWh. Therefore the size of battery storage is 900 kWh at minimum energy loss.

**Table-III: Result for battery energy storage size at each size of battery**

| Size of Battery (kWh) | Battery Cost per day (\$) | Total Benefit (\$) | Market Benefit (\$) | Daily Energy Loss (kWh) |
|-----------------------|---------------------------|--------------------|---------------------|-------------------------|
| 100                   | 66.97696                  | -7606.6            | -7539.63            | 4270.897                |
| 200                   | 133.9539                  | 2046.153           | 2180.107            | 4054.654                |
| 300                   | 200.9309                  | 2445.144           | 2646.075            | 3890.979                |
| 400                   | 267.9078                  | -22.0854           | 245.8224            | 3612.016                |
| 500                   | 334.8848                  | 5317.934           | 5652.818            | 4346.567                |
| 600                   | 401.8617                  | -10084.2           | -9682.35            | 889.8202                |
| 700                   | 468.8387                  | 4028.243           | 4497.081            | 3925.117                |
| 800                   | 535.8156                  | 1606.186           | 2142.002            | 3969.417                |
| <b>900</b>            | <b>602.7926</b>           | <b>7379.872</b>    | <b>7982.664</b>     | <b>3042.892</b>         |
| 1000                  | 669.7696                  | 7647.786           | 8317.556            | 3965.747                |
| 1100                  | 736.7465                  | 6358.572           | 7095.319            | 4576.981                |
| 1200                  | 803.7235                  | 8251.035           | 9054.759            | 3793.969                |
| 1300                  | 870.7004                  | 5782.677           | 6653.377            | 3203.448                |
| 1400                  | 937.6774                  | -5348.67           | -4410.99            | 3994.263                |
| 1500                  | 1004.654                  | -3761.92           | -2757.27            | 3821.006                |
| 1600                  | 1071.631                  | 8875.188           | 9946.819            | 3565.436                |
| 1700                  | 1138.608                  | 8850.938           | 9989.546            | 4109                    |
| 1800                  | 1205.585                  | 4921.203           | 6126.788            | 3641.643                |
| 1900                  | 1272.562                  | -3942.97           | -2670.41            | 3884.087                |
| 2000                  | 1339.539                  | -7530.15           | -6190.61            | 3631.245                |
| 2100                  | 1406.516                  | 2060.561           | 3467.077            | 4484.755                |
| 2200                  | 1473.493                  | 5008.265           | 6481.758            | 3288.303                |
| 2300                  | 1540.47                   | 678.5209           | 2218.991            | 3903.079                |
| 2400                  | 1607.447                  | -4494.92           | -2887.47            | 4215.521                |
| 2500                  | 1674.424                  | 5243.989           | 6918.413            | 3875.806                |
| 2600                  | 1741.401                  | 6603.386           | 8344.787            | 3649.042                |
| 2700                  | 1808.378                  | 7046.523           | 8854.901            | 3940.553                |
| 2800                  | 1875.355                  | 2221.064           | 4096.419            | 3949.684                |



|      |          |          |          |          |
|------|----------|----------|----------|----------|
| 2900 | 1942.332 | 4476.257 | 6418.589 | 4435.717 |
| 3000 | 2009.309 | -5127.37 | -3118.06 | 3745.243 |

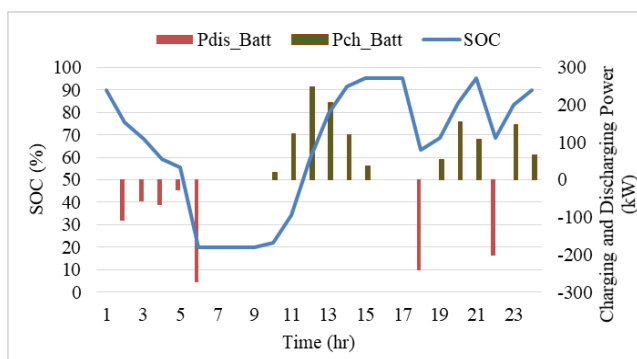
The battery cost per day obtained is \$ 602.7926, cost of unit commitment obtained is \$ 7496.482, the total benefit obtained is \$ 7379.872, the market benefit obtained is \$ 7982.664 and fuel cost of FC & MT obtained is \$ 7261.927. The maximum market benefit obtained is 9989.54(\$ for battery size of 1700 kWh, but the energy loss obtained is 4109 kWh. Therefore the best size selection of battery storage is 900 kWh.

In the Table-III the cost of market benefit (MB) and minimum energy loss for the size of battery energy storage along with solar and Wind Turbine power is shown.

In this paperwork, the analysis of battery storage of 900 kWh has been carried out along with the solar and Wind Turbine-based renewable energy sources.

**2). Result for inner layer optimization**

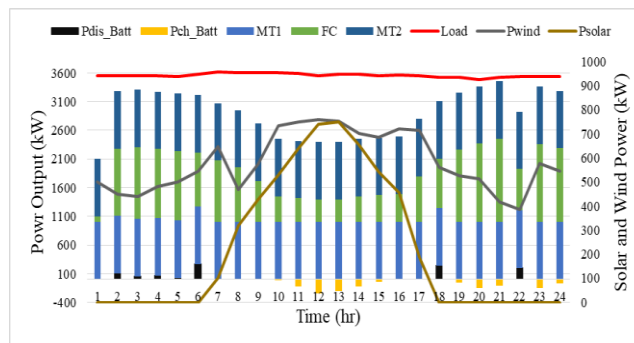
In this section, the results for inner layer optimisation is discussed. The battery size obtained in outer layer case is 900 kWh; therefore the inner layer analysis has been done for 900 kWh capacity.



**Fig. 6 State of Charge of battery storage with renewable energy sources**

In the above Table-III the size of battery energy storage obtained is 900 kWh for minimum energy loss of the distribution network. In Fig.6 red bars are shown to discharging power and green bars for charging power of battery storage, whereas the blue line shows the state of charge for battery in percentage. The negative power indicates the power supplied by battery storage.

The fixed cost of battery storage is 600 (\$/kWh) and maintenance cost of BES is 20 (\$/kWh). The interest rate is 6.5% and the life of BES is 3 year taken in this paperwork.



**Fig. 7 Power output of fuel cell, Micro-Turbine, battery storage with Wind Turbine and solar based renewable energy sources**

The minimum discharge and charging power of the battery set is 0 kW, whereas the maximum discharging and charging power set is 20% of battery storage size. The initial SOC set is 90% at time k of 1 hour. The final SOC for 24<sup>th</sup> hours is set at 95 % of SOC. Therefore the life of battery storage is better. The Li-ion battery has been selected for this paperwork.

In Fig.7 the power output of fuel cell, micro-turbine, and battery storage with Wind Turbine and solar has been shown. The solar, Wind Turbine-based renewable has been installed at 30<sup>th</sup> and 15<sup>th</sup> bus. The micro-turbine (MT1 and MT2), fuel cell are installed at 13<sup>th</sup>, 21<sup>st</sup>, and 18<sup>th</sup> bus, respectively. The obtained size of 900 kWh battery storage has been installed at 19<sup>th</sup> bus. The maximum power output obtained is 1457.50 kW of MT, 1000 kW of FC1 and FC2, 760 kW of Wind Turbine power and 748.7 kW of solar energy for 24 hours ZIP load. The required data has been taken from section IV.

**B. Case 2**

In this section, the size of battery storage has been obtained without renewable energy sources. The size of battery storage is obtained with MT and FC.

**1). Result for the outer layer**

In Table-IV the market benefit-cost and minimum energy loss point has been carried out for the optimal size of battery storage.

**Table-IV: Result of outer layer for battery energy storage size at each iteration**

| Size of Battery (kWh) | Battery Cost per day (\$) | Total Benefit (\$) | Market Benefit (\$) | Daily Energy Loss (kWh) |
|-----------------------|---------------------------|--------------------|---------------------|-------------------------|
| 100                   | 66.97696                  | 17304.86           | 17371.84            | 4838.601                |
| 200                   | 133.9539                  | 17163.05           | 17297               | 4593.833                |
| 300                   | 200.9309                  | 13904.9            | 14105.83            | 4002.295                |
| 400                   | 267.9078                  | 18054.04           | 18321.94            | 5747.159                |
| 500                   | 334.8848                  | 2379.403           | 2714.288            | 4836.945                |
| <b>600</b>            | <b>401.8617</b>           | <b>14521.22</b>    | <b>14923.08</b>     | <b>3854.554</b>         |
| 700                   | 468.8387                  | 14877.28           | 15346.11            | 5116.568                |





|      |          |          |          |          |
|------|----------|----------|----------|----------|
| 800  | 535.8156 | 16070.36 | 16606.18 | 5450.305 |
| 900  | 602.7926 | 18912.82 | 19515.61 | 5209.669 |
| 1000 | 669.7696 | -1749.97 | -1080.2  | 3860.991 |
| 1100 | 736.7465 | 11029.84 | 11766.59 | 3904.356 |
| 1200 | 803.7235 | 14286.35 | 15090.07 | 5230.66  |
| 1300 | 870.7004 | 16444.22 | 17314.92 | 5191.115 |
| 1400 | 937.6774 | 11934.66 | 12872.34 | 4221.412 |
| 1500 | 1004.654 | 119.0748 | 1123.729 | 5209.266 |
| 1600 | 1071.631 | 9605.887 | 10677.52 | 4465.198 |
| 1700 | 1138.608 | 12685.79 | 13824.4  | 5158.918 |
| 1800 | 1205.585 | 12773.85 | 13979.44 | 5338.624 |
| 1900 | 1272.562 | 16776.83 | 18049.39 | 4151.34  |
| 2000 | 1339.539 | 15823.58 | 17163.12 | 5586.383 |
| 2100 | 1406.516 | 13689.3  | 15095.81 | 4572.34  |
| 2200 | 1473.493 | 12529.67 | 14003.17 | 5706.083 |
| 2300 | 1540.47  | 14629.05 | 16169.52 | 4590.122 |
| 2400 | 1607.447 | 16362.38 | 17969.82 | 5529.146 |
| 2500 | 1674.424 | 16043.89 | 17718.31 | 5181.696 |
| 2600 | 1741.401 | 14227.51 | 15968.91 | 4815.476 |
| 2700 | 1808.378 | 12014.09 | 13822.46 | 5155.262 |
| 2800 | 1875.355 | 15109.68 | 16985.03 | 4372.484 |
| 2900 | 1942.332 | 15628.77 | 17571.1  | 5812.47  |
| 3000 | 2009.309 | 11936.45 | 13945.75 | 4989.631 |

The minimum energy loss obtained is 3854.6 kWh for a battery of capacity 600 kWh and market benefit of 14923\$ without renewable energy sources. The battery cost per day obtained is \$ 401.8617, cost of unit commitment obtained is \$ 6095.765, total benefit obtained is \$14521.22, market benefit obtained is \$14923.08 and fuel cost of FC & MT obtained is \$5764.83. The maximum market benefit obtained is \$18912.82 for battery storage of 900 kWh and energy loss of 5209.669 kWh. Therefore the energy losses have been increased with the size of battery and market benefit also. Consequently, the best size of the battery selected is 600 kWh. In this paperwork, the analysis has been carried out for 600 kWh battery along with FC and MT. In Table-IV the market benefit-cost and minimum energy loss-point has been carried out for the optimal size of battery storage. The minimum energy loss obtained is 3854.6 kWh for a battery of capacity 600 kWh and market benefit of 14923\$ without renewable energy sources. The maximum market benefit obtained is \$18912.82 for battery storage of 900 kWh and energy loss of 5209.669 kWh. Therefore the energy losses have been increased with the size of battery and market benefit also. Consequently, the best size of the battery selected is 600 kWh. In this paperwork, the analysis has been carried out for 600 kWh battery along with FC and MT.

## 2). Result for inner layer

In this section the inner layer optimization has been done for analysis of battery obtained size of 600kWh from outer layer optimization. Therefore the various variables are obtained for 600 kWh battery storage.

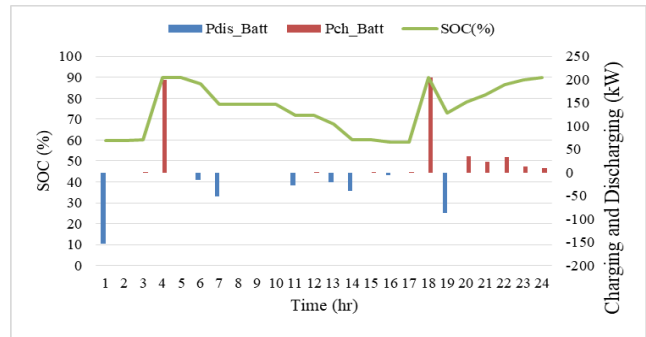


Fig.8 State of Charge of battery storage without renewable energy sources

In the Fig.8 the SOC, charging and discharging power of battery without renewable energy sources is shown. The size of 600kWh battery storage is carried out for minimum energy loss

The time required for charging and discharging is 2 hours for the battery. The minimum SOC is set at 20% and maximum at 95% of battery capacity. The charging and discharging power limit is set at 50% of the full capacity of battery storage.

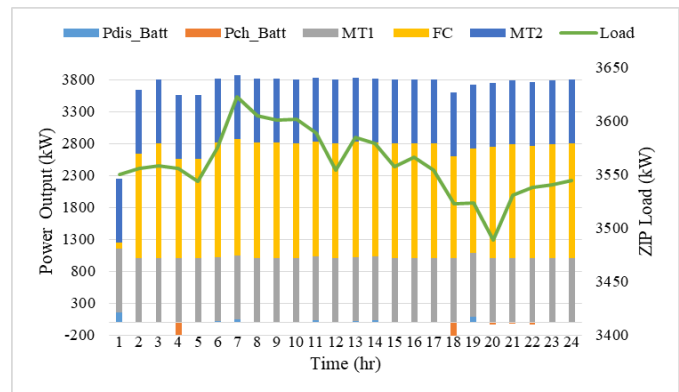


Fig.9 Power output for 24 hrs load variation

In Fig.9 the power output of fuel cell, micro-turbine and battery storage with Wind Turbine and solar has been shown. The two numbers of micro-turbine (MT1 and MT2), fuel cell (FC) are installed at 13<sup>th</sup>, 21<sup>st</sup>, and 18<sup>th</sup> bus, respectively. The obtained size of 600 kWh battery storage has been installed at 19<sup>th</sup> bus. The maximum power output obtained is 1457.50 kW of MT, 1000 kW of FC1 and FC2, 760 kW of Wind Turbine power and 748.7 kW of solar energy for 24 hours ZIP load.

## VI. CONCLUSION

The optimal size of battery energy storage (BES) can be obtained by the method presented in this paper. This method has been tested in IEEE-33 bus test system with considering the network constrained. The time-varying ZIP load model, as explained in section IV, has been considered for observation of the battery impact on the system.

The battery energy storage size obtained for case 1 are 900 kWh at the lowest energy loss point, and 2700 kWh at the maximum benefit point. The size of BES at the maximum benefit point, the energy loss is maximum as compared with the lowest energy loss point.

Similarly, for Case-2; the size of BES obtained are 600 at lowest energy loss point and 900 kWh at maximum benefit point. Although, the losses has been increased to 26.011% with consideration of the maximum benefit point for sizing of BES. Therefore the following points are concluded as follows;

- 1) The battery size obtained is 900 kWh for case 1. In this case the energy loss determine is 3042.89 kWh.
- 2) The battery size obtained is 600 kWh for case 2. The energy loss determine is 3854.553952kWh.
- 3) The energy loss is increased in case 2 up to 26.6% with concerning case 1. Therefore the use of renewable energy source in MG is beneficial for daily energy saving.
- 4) The total benefit in case 2 increased up to 48 % with respect to case 1, because of the maintenance cost of renewable energy source in case 1.
- 5) The fuel cost of FC and MT in case 2 obtained is \$ 5674 and in case 1 obtain is \$ 7261. The increment of fuel cost in case1 is 21.85 %.
- 6) It is concluded that in case 1 at maximum benefit point (at BES size 1700 kWh) the daily energy loss is increased to 14.65 % with optimal BES of 900 kWh point.
- 7) The maximum benefit point in case 2 (at BES size of 900 kWh) the daily energy loss is increased to 26.011 % with optimal BES of 600 kWh.

It is concluded that the optimal size of BES obtained is 900 kWh in case1 and 600 kWh in case 2 with considering the minimum daily energy loss.

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