Optimal Location and Size of Multi-distributed Generation with Minimization of Network Losses

Akhilesh Kumar Barnwal , Shailendra Singh , and M. K. Verma

Abstract Distribution system is one of integral part of complex power system. Power losses in distribution system branches are very high rather than power losses in transmission system branches. These higher losses lead to higher operational cost in distribution system. The advancement of technology using distributed generations has been proved to be very important in optimizing network losses, environment pollution, and reliability of power systems. The DG allocation is a mixed-integer optimization problem with nonlinearity associated. In this paper, the work optimal size location and power factor of single and multiple placements of different distributed generators have been presented. Distribution network loss has been minimized for optimal power factor, size, and location of distributed generator to be optimized. Optimum size and minimum loss have been determined. Results thus obtained have been compared with the results in the literature. The proposed method has been validated on the IEEE33-bus test system.

Keywords Distributed generation (DG) · Optimum size · Optimum location · DG types · Voltage profile · Power loss

1 Introduction

The day-by-day increase in electrical power demand, as load is increasing rapidly, has rendered the existing central generation and transmission network unable to manage such a large burden. This increasing power demand has challenged the power engineer to maintain the power system reliably, securely as well as economically [\[1](#page-10-0)]. Hence, it is clear that either increasing the capacity of existing transmission network or production and supply in a small—scale near the load center can cope up with these issues. Power production of small generation units dispersed across the power grid or networks is defined as distributed generation [[2\]](#page-10-1). These power producing technologies have led the multidimensional research opportunities in the field of distribution

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A. K. Barnwal (\boxtimes) · S. Singh · M. K. Verma

Indian Institute of Technology, Banaras Hindu University, Varanasi, India e-mail: akhileshkb.rs.eee16@iitbhu.ac.in

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system planning and operation [\[3](#page-10-2)]. Apart from traditional very large scale power generation utility, distributed generator installation near load center requires very less capital cost, operation cost, and maintenance cost. Distributed generators are also environment friendly, when they are used as different renewable energy technology. Renewable energy technologies which are not very new include solar generation, micro-hydro power plants, wind, geothermal generation, power from municipal waste, landfill gas, and biomass. Emerging major power source of renewable technologies comes from sea waves and tidal stream. These energy sources possess the property of lower energy density compared to fossil fuels, which leads to smaller, economic, and geographically spread power plants [\[4](#page-10-3)]. Benefit of effective integration of DGs includes reduced generation of central power plants, enhanced utilization of available transmission/distribution network capacity, and improved system security, more reliable operation and overall costs and pollutant gas emission reduction.

Being a conventional approach in power industry, distributed generation has a large number of definitions and terms. The term distributed generation is also known by different terminology in literature such as "embedded generation," "dispersed generation," and "decentralized generation" based on their geospatial locations. "Dispersed generation" and "embedded generation" are mostly popular in North-American and Anglo-American countries respectively, while Europe and Asian countries use the term "decentralized generation" [[5\]](#page-10-4). According to American council of energy efficient economy sources of electricity generation which are closer to point of use are termed as "decentralized or on-site generation" contrary to large power producing central units [\[6](#page-10-5)]. Gas Research Institute acknowledge the term distributed generation for the amount of power production "more than 25 kW but always lesser than 25 MW" [[7\]](#page-10-6). These generations can include PV solar generation, wind generation, combined heat power plant, and others. Distributed generation changes the flow of power in network and hence results in change in network losses, not only in distribution system but also for transmission network. These reductions in losses further result in reduced charges for transmission network uses by utility.

It has been shown that poor power factor size and location of DG results in increased distribution losses compared to losses with optimally located DG $[8–10]$ $[8–10]$ $[8–10]$. Lee et al. have presented selection of optimal locations and ratings before the integration of multiple DGs to the power grid so that minimum line losses and maximum benefits of DGs are achieved [\[11](#page-10-9)]. Amanifar in his paper has presented particle swarm optimizer (PSO) to achieve the minimum operating and maintenance cost, reduced line losses, and reduction in THD with optimally located and sized DG [\[12](#page-10-10)]. The concept of network reconfiguration by opening and closing the tie switches and maintaining the radial structure of the operational distribution network to minimize the losses and voltage deviation has been achieved in [[13–](#page-10-11)[17\]](#page-11-0). Mathematical modeling for reducing network losses with reconfiguration has been established in [[18\]](#page-11-1). Fractal theory-based stochastic search algorithm [[19\]](#page-11-2) and water cycle algorithm [[20\]](#page-11-3) were applied to obtain a better solution in order to minimize losses while reconfiguring the distribution network in presence of DG sources. In Refs. [[21](#page-11-4)[–25](#page-11-5)],

method of analytical expression has been illustrated the optimality in size and location to obtain minimum distribution loss and to improve the system voltages at all nodes.

In this paper, different cases of DG allocation strategy have been presented for optimal location and size problem for minimizing real power losses while satisfying different constraints. Optimal size corresponding to optimal bus for minimum loss has been computed based on repeated load flow method with power factor. In a case where the optimal power factor, optimal location and optimal size have been calculated for minimum loss. The optimal power factor has been calculated by running load flow for different power factor. For calculation of distribution loss, load flow algorithm by backward—forward sweep is utilized [\[26](#page-11-6)]. The method proposed in this paper has been implemented on standard 33-bus distribution test system.

2 Problem Formulation

This paper presents the main objective to minimize the total active power losses in distribution network, i.e.,

$$
\text{Minimize } P_{\text{L}} = \sum_{k=1}^{\text{nb}} I_k^2 * r_k \tag{1}
$$

Subject to constraints:

$$
V_{i,\min} \le V_i \le V_{i,\max} \tag{2}
$$

$$
dg_size \le dg_size_{max} \tag{3}
$$

$$
I_k \le I_{k,\max} \tag{4}
$$

$$
dg_loc_1 \neq dg_loc_2 \neq dg_loc_3
$$
 (5)

where P_L is total network loss, I_k and r_k is current and resistance, respectively, of branch *k, nb* is maximum number of branches in the network, *Vi* voltage at *i*th node. The maximum and minimum limit on voltage is $\pm 5\%$ [\[27](#page-11-7)]. dg_loc1, dg_loc2 and dg_loc3 are the 1st, 2nd, and 3rd location of DG placed, respectively, which must not be same in any case.

The total network loss P_L has been calculated by sum of losses in all branches of network [\(1](#page-2-0)) using the load flow algorithm using backward–forward sweep as given in Ghosh and Das [[26\]](#page-11-6). To calculate the loss in a branch, the current flowing in that branch is multiplied by the corresponding branch resistance. The current through any particular branch is the addition of the all load currents beyond that particular

Fig. 1 a Current drawn by load at nth bus. **b** Voltage calculation at receiving end bus

branch, i.e.,

$$
I_k = \sum_n I_{\text{load}}(n) \ \forall \ n \text{ beyond branch } k \tag{6}
$$

The current $I_{load}(n)$ at a particular node *n* is calculated by

$$
I_{\text{load}}(n) = \frac{P_l(n) - j Q_l(n)}{v(n)^*}
$$
 (7)

*P*_{*l*}(*n*) and *Q*_{*l*}(*n*) are real and reactive power load demand at node (*n*), and $v(n)^*$ is complex conjugate of voltage *v* at node *n*.

The voltage at receiving end node connected with sending end node by *k*th branch is calculated by

$$
V_{\mathrm{rn},k} = V_{\mathrm{sn},k} - I_k * Z_k \quad \forall k = 1, 2, 3 \dots nb \tag{8}
$$

where $V_{\text{m},k}$ and $V_{\text{sn},k}$ are voltages at receiving end node and sending end node, respectively, connected by branch k . I_k and Z_k are branch current and branch impedance of *k*th branch, respectively. Initially, a flat voltage profile has been assumed for each node in the network (Fig. [1\)](#page-3-0).

2.1 Optimal Location and Size of DG

The optimal locations and sizes of DGs play a very crucial role for minimization of distribution network losses. At a bus, the loss is the function of injected power by DG placed at that bus, so starting from minimum DG size, if we increase the size of DG at that particular bus the losses starts decreasing till a particular DG size, which is optimal size of DG corresponding to that particular bus. Beyond this particular optimal DG size, any further increment in DG size leads to higher distribution losses, and it may overtake the losses corresponding to base case losses. Similarly, it is true

for all the buses in network. Hence, selection of DG size is very crucial as it may result in higher distribution losses. Also, the size of DG must not be more than maximum load demand and should be consumable within the distribution network boundary, otherwise there will be a large amount of loss because of design of distribution network and decreasing conductor sizes as power in passive distribution system flows in forward direction from substation to load.

DG installation for location size and minimum power loss has been calculated for different cases as below:

- A single unit of Type-3 DG rated in MVA injecting both active and reactive power has been computed.
- Losses with multi-DG placed simultaneously injecting only active power has been computed.

3 Methodology

In this section, loss calculation for Type-3 DG has been presented. Load flow has been performed to get the optimal size and location for each power factor, and corresponding loss also has been calculated. Thus, power factor for which loss is minimum has been obtained by comparing losses at other power factor. Power factor has been taken from zero to unity and has been increased in small steps of 0.02. For each power factor, different DG size has been taken into account starting from zero to 4 MW in a small step, and then, load flow has been run to calculate the losses at each bus. And thus optimal DG size, location, and optimal power factor corresponding to minimum loss are stored.

3.1 Procedure

- Step 1 Run base caseload flow using input system data.
- Step 2 Start with initial chosen size of DG, initial DG location, and initial power factor as initial solution vector and calculate the system loss.
- Step 3 Increment the size of DG in a fixed small step to get the corresponding loss.
- Step 4 If the loss found with DG size in step 3 is lesser than previous loss, update the solution vector else go to step 3 until the maximum DG size is reached.
- Step 5 Increment the DG location by one.
- Step 6 Repeat steps 2–6 until all the possible DG location have been checked and update the solution vector and corresponding loss if found lesser than previous.
- Step 7 Make an increment in previous power factor by a fixed step change.
- Step 8 Repeat steps 2 to 8 until unity power factor and update the solution vector and corresponding loss if found lesser than previous loss.
- Step 9 Print the updated solution vector and stop.

Applying the above procedure, it is also possible to get the minimum loss, optimum DG size, and location at any given power factor. In this paper, the work has been extended to obtain the minimum loss, optimal size, and location of multiple DGs injecting only real power, i.e., Type-1 DG. The procedure for placement of multiple units of Type-1 DG is as follows.

3.2 Procedure for Multi-type-1 DG Placement

- Step 1 Input the system data and run the load flow to obtain the size and location for 1st DG, as stated in previous method for unity power factor, for minimum distribution loss.
- Step 2 Store the DG size, optimal location, and minimum loss obtained for 1st DG.
- Step 3 Fix the DG of capacity/size obtained above, at their respective optimal location.
- Step 4 Repeat steps 1 and 2 to obtain the size and location, corresponding to minimum loss for 2nd DG, and then for 3rd DG also.

4 Results and Discussion

4.1 Size, Location, and Loss

The methodology is tested on standard 33-bus 32 branch test system with 2.3 MVAr and 3.715 MW load at 100 MVA, 12.66 kV [\[17](#page-11-0)]. The test system is radial in nature. A MATLAB code has been written in the MATLAB R2018a environment to evaluate the optimal location of DG and its size to calculate the minimum loss in the network.

In Fig. [2](#page-6-0), minimum loss at each DG location corresponding to different power factors for 33-bus system is shown. For more clarity, Fig. [2](#page-6-0) is redrawn and shown in Fig. [3](#page-6-1) in a more clear way for some selected power factors at 0, 0.5, 0.82, 0.9, and unity power factor. For each power factor, it is found that loss corresponding to that power factor occurs at different location and different DG size. Figure [4](#page-7-0) is drawn for the minimum loss obtained at each power factor, which exhibits that at 0.82 power factor loss is minimum.

Case 1: For Type-3 DG injecting both real as well as reactive power, load flow for every power factor with varying DG size for each and every bus has been performed, and corresponding minimum loss is calculated which is shown in Fig. [5](#page-7-1). It is found that at 0.82 power factor, locating 3.1 MVA capacity of DG at bus no. 6 gives the minimum loss of 61.371 kW. In Fig. [5](#page-7-1), optimum DG size and losses corresponding to optimally located DG at each bus is shown for Type-3 DG.

In Fig. [5,](#page-7-1) optimum DG size and losses corresponding to optimum size of DG placed at each bus is shown for Type-3 DG.

Fig. 2 Total loss with Type-3 DG at different buses at various power factors

Fig. 3 Total loss with Type-3 DG at different buses for selected power factors

Case 2: As this case has been studied for multiple Type-1 DG placements in distribution network. Three successive DGs of optimum size have been placed one by one at their optimum location found with previously installed DGs, and losses have been computed as shown in Fig. [6](#page-8-0). Thus, it is noticed that after placing 1st DG of

Fig. 4 Loss variation with variation in power factor

Fig. 5 Optimal size and corresponding loss for Type-3 DG at each bus

size 2.6 MW at bus no. 6, the optimal location for 2nd DG is bus no. 16 of DG size 0.4 MW reduces the losses to 93.736 kW. And for 3rd DG, it is found that 0.6 MW DG at bus no. 25 reduces the losses further to 85.989 kW.

Voltage: Voltage profile for all the cases mentioned in this paper has been calculated for each case. In Table [1,](#page-8-1) the minimum and maximum voltage obtained in each case and corresponding bus with and without DG placement is reported.

In Fig. [7,](#page-8-2) the voltage profiles for all cases have been drawn, and it is clear that using multiple numbers of Type-1 DG improves the voltage mostly as compared to Type-3 DG. In Table [1,](#page-8-1) minimum and maximum voltage and corresponding bus with and without DG are also shown.

Fig. 6 Loss curve for multiple DG placements

Fig. 7 Voltage curve for different cases of DG placement

Cases		Base case	Case 1	Case 2		
Opt. DG location		-	6	6 and 16	6, 16 and 25	
Opt. DG size	МW	-		2.6 and 0.4	2.6, 0.4 and 0.6	
	MVA (pf)	-	3.1, 0.82			
$Loss$ (kW)		202.67	61.371	93.736	85.989	
% Loss reduction		-	69.72	53.75	57.57	
% Voltage increment			5.9	5.2	5.46	

Table 2 Result obtained for two cases

Table 3 Comparison of results

	Case 2	Multi-DG placement		
In Ref. $[16]$	DG size in MW (DG location)	0.1070 (18)	0.5724 (17)	1.0462 (33)
	Power loss (kW)	96.76		
	Minimum voltage	0.967		
	$\%$ Loss reduction	52.26		
Method applied in this paper	DG size in MW (DG location)	2.6 (6)	0.4 (16)	0.6 (25)
	Power loss (kW)	85.989		
	Minimum voltage (bus)	0.96291(33)		
	$%$ Loss reduction	57.57		

In Table [2](#page-9-0), it is shown that loss is lowest for case 1 using Type-3 DG which reduces losses to 61.371 kW, while using multiple DGs reduces the losses in a great extent but lower than case 1. Type-3 DG reduces the losses by 69.72%, while three numbers of Type-1 DG reduce the losses by 57.57%.

A comparative study of optimal location of multiple Type-1 DG approach for maximum loss reduction is shown in Table [3](#page-9-1), which shows that placing DG at nodes 6, 16, and 25 has reduced the losses to 85.989 kW as compared to 96.76 kW loss obtained with the meta-heuristic harmony search algorithm (HSA) [\[16](#page-11-8)]. And loss reduction has been improved to 57.57% as compared to 52.26% of HSA. Although it is found that voltage profile with the method applied in this paper experiences a slight decrement compared to HSA [[17\]](#page-11-0) but within its acceptable limit.

5 Conclusion

This paper has presented the Type-3 as well as multiple numbers of Type-1 DGs to minimize the real power losses in distribution network by injecting real or reactive power. From above discussion, it can be concluded that Type-3 DG is best suitable

for the most loss reduction which is calculated as 69.72% as can been seen in Fig. [6](#page-8-0) and Table [2,](#page-9-0) while improvement of voltage at almost all buses after installing DG at their optimal location is well within the limit of $\pm 5\%$. Placing a single Type-3 DG improves the voltage significantly which is almost equivalent to placing two Type-1 DGs as can be seen in Fig. [7.](#page-8-2) A more improved voltage profile has been achieved with three Type-1 DG placement cases.

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