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# Effect of placement of droop based generators in distribution network on small signal stability margin and network loss

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### 4 Abstract

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Optimal location of distributed generators (DGs) in a utility-connected system is well described in literature. For a utility-connected system, issues related to small signal stability with DGs are insignificant due to the presence of a very strong grid. Optimally placed sources in utility connected microgrid system may not be optimal/stable in islanded condition. Among others issues, small signal stability margin is on the fore. The present research studied the effect of location of droop-controlled DGs on small signal stability margin and network loss on an IEEE 33-bus distribution system and a practical 22-bus radial distribution network. A complete dynamic model of an islanded microgrid was developed. From stability analysis, the study reports that both location of DGs and choice of droop coefficient have a significant effect on small signal stability and transient response of the system. For multi-objective optimization of the DG network, Pareto fronts were identified and the non-dominated solutions found with two and three generators. Results were validated by time domain simulations using MATLAB.

5 Keywords: Islanded microgrid, droop control, small signal stability margin.

## <sup>6</sup> 1. Introduction

Growing environmental concerns competitive energy policies has led to the decentralization of power generation. Installations of distributed generators (DGsphotovoltaic, wind, etc.) are expected to increase worldwide in the next decade [1]. Due to their location being close to consumers, DGs provide better power in terms of quality and reliability [2]. Controllable DGs along with controllable loads present themselves to the upstream network as microgrid. Microgrids when operating in grid-connected mode provide/draw power based on supply/demand within. In islanded mode (when not connected to
the main grid), microgrids operate as an independent power system [2].

The optimality in placement of a DG is decided by the owner based on the 16 availability of primary resource, site, and climatic conditions. Thus, choosing 17 an inappropriate location may result in losses and fall in power quality. Lit-18 erature has widely addressed optimal placement of DGs in a network based 19 on objective functions of energy/power loss minimization, cost minimization. 20 voltage deviation minimization, profit maximization, loadability maximiza-21 tion, etc [3]. Different approaches, methods, and optimization techniques for 22 DG siting and sizing are presented in [3]-[9]. 23

DG siting and sizing is a multi-objective optimization problem classifiable 24 into two groups. The first group focuses on economics of the system [9]-[17]. 25 With respect to islanded microgrids, minimization of total annual energy 26 losses and cost of energy for distributed generation is an area of much interest 27 to investors [10]. One study [9] presented a multi-objective optimization 28 problem of minimization of photovoltaic, wind generator and energy storage 29 investment cost, expectation of energy not supplied, and line loss. Economic 30 and environmental restrictions for a microgrid are outlined in [11]. Operation 31 cost (local generation cost and grid energy cost) minimization is presented 32 in [12]. An optimization problem considering operation cost and emission 33 minimization is presented in [13]. Economic dispatch problem in a hybrid, 34 droop-based microgrid is presented in [14]. 35

The second group focuses on the optimal design of a microgrid based on 36 technical parameters such as network losses, maximum loadability, voltage 37 profile, reactive power, power quality, and droop setting. The assessment of 38 maximum loadability for a droop-based islanded microgrid is presented in 39 [18]-[20] considering reactive power requirements and various load types. A 40 decision-making program for load procurement in a distribution network is 41 presented in [21] based on uncertainty parameters like electricity demand, 42 local power investors, and electricity price. Optimal setting of droop to 43 minimize the cost of wind generator is presented in [22]. One wind-generation 44 study combined economics and stability issues due to uncertainty (volatility) 45 and its effect on small signal stability [23]-[24]. This study of small signal 46 stability in droop-based islanded microgrids is thus worthy in the context of 47 potential benefits of optimal DG placement to grid managers. 48

<sup>49</sup> A microgrid may present as much complexities as a conventional power <sup>50</sup> system. When connected to a grid, these optimally placed and sized DGs <sup>51</sup> (inverter-based) operate in current control mode, feeding maximum power to the network. When a grid is not available, these DGs shift to droop control
mode for effective power sharing.

Two important aspects of an islanded microgridload sharing and stabil-54 ityare widely addressed in literature. A higher droop in these DGs is desired 55 for better power sharing and transient response [25]-[28]. Higher droop and 56 stability margin improves the transient response of the system and hence 57 power sharing among the sources [28]. Inappropriate settings of droop value 58 may cause a power controller to operate at low frequency mode and fall 59 into an unstable region [29]-[31]. Stability of islanded microgrids [25]-[27] is 60 a growing operational challenge. A grid-connected system optimized for DG 61 sizing and siting may be vulnerable to small signal stability when islanded. 62

The impact of optimal DG placement on enhancement of small signal 63 stability margin and loss minimization is investigated on a standard IEEE 64 33-bus distribution system and a practical 22-bus radial distribution network 65 of a local utility. The rest of the paper is organized as follows: Section 2 66 presents a description of the system considered and the mathematical model 67 designed for stability studies. Eigen value analysis and identified Pareto 68 fronts are presented in Section 3. Validation of Eigen value analysis by time 69 domain simulation is presented in Section 4, followed by conclusions of the 70 study in Section 5. 71

#### 72 2. System Description and Mathematical Modeling

Microgrids integrated with renewable energy sources through voltage source
inverters (VSIs), together with loads and interconnecting lines, were considered for the present study. An IEEE 33-bus radial distribution system (Fig.
1) and a 22-bus practical radial distribution network of Andhra Pradesh
Eastern Power Distribution Company Limited (APEPDCL) (Fig. 2) were
considered.

#### 79 2.1. System State Space Equation

The modeling of VSIs, line, and load in d-q axis reference frame for small signal stability is defined in [32]. Equation (1) is the overall state space (matrix) equation for the total system under consideration. For the IEEE 33-bus system, the size of matrix  $A_{MG}$  with two generators is  $152 \times 152$ , which includes 26 states of DGs, 62 states of lines, and 64 states of loads. With three generators, the size of  $A_{MG}$  is  $165 \times 165$  (39 states of DGs, 62 states of lines, and 64 states of loads). Similarly, for the 22-bus practical radial distribution network of APEPDCL, the size of  $A_{MG}$  with three generators is 121 × 121 (39 states of DGs, 40 states of lines, and 42 states of loads).

$$\begin{bmatrix} \Delta \dot{X}_{DG} \\ \Delta I_{DQ_{Line}} \\ \Delta I_{DQ_{Load}} \end{bmatrix} = A_{MG} \begin{bmatrix} \Delta X_{DG} \\ \Delta I_{DQ_{Line}} \\ \Delta I_{DQ_{Load}} \end{bmatrix}$$
(1)

#### 89 2.2. Loss calculation

<sup>90</sup> Consider a line of impedance  $(R + jX) \Omega$  connected between two nodes <sup>91</sup> through which current  $I_i$  is flowing. This current  $(I_i)$  can be expressed as:

$$I_i = I_d \pm j I_q \tag{2}$$

Real power loss in the line can be calculated using :

$$P_{loss,i} = I_i^2 \times R \tag{3}$$

where,  $I_i^2 = I_d^2 + I_q^2$ . Total real power loss of the network containing *n* lines is the sum of individual line loss which is

$$P_{loss} = \sum_{i=1}^{n} P_{loss,i} \tag{4}$$

#### 95 2.3. Small Signal Stability Margin and Constraint

In this study, small signal stability margin is related to droop parameters.
Higher droop is desired for better power sharing and transient response. The
system is said to be stable if the real part of all Eigen values (other than 0)
is negative. Small signal stability constraint is thus defined as::

$$R[\lambda_i] < 0, \ \forall \ eigenvalues \ except \ 0 \tag{5}$$

where,  $\lambda_i$  is the *i*<sup>th</sup> Eigenvalue of the system and  $R[\lambda_i]$  is the real part of that Eigenvalue. Small signal stability limit can be obtained by varying the stability constraints. In this study, droop parameters  $(m_p \text{ and } n_q)$  are taken as system variables. The droop constants are designed using (6) and (7). For the present work, initial values of  $m_p$  and  $n_q$  are taken as  $1.0 \times 10^{-6} rpm/W$ and  $1.0 \times 10^{-5} V/VAR$ , respectively.

$$m_{p1} \times P_1 = m_{p2} \times P_2 = \dots = m_{pn} \times P_n \tag{6}$$

$$n_{q1} \times Q_1 = n_{q2} \times Q_2 = \dots = n_{qn} \times Q_n \tag{7}$$

To perform Eigen value analysis, draw the root locus plot and calculate the losses, we obtain the operating condition/point using time domain simulation or from load flow analysis. Literature on load flow analysis for islanded systems is scarce [33]. The present study preferred time domain simulation using MATLAB/SIMULINK to obtain the operating point. The time domain simulation is also used to validate the Eigen value analysis.

The optimal location of DGs for an IEEE 33-bus radial distributed system presented in [34] is taken as base case for this study. The line and load data for a standard IEEE 33-bus network is available in [35]. Description of the 22-bus practical radial distribution network of APEPDCL is available in [36]-[37].

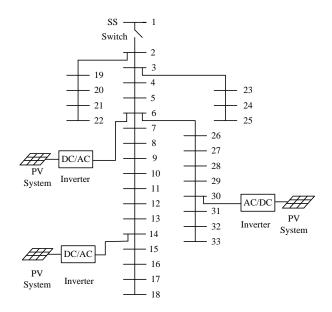


Figure 1: IEEE 33-bus radial distribution system

#### 117 3. Eigen Value Analysis and Pareto Front Identification

#### 118 3.1. IEEE 33-bus system with two DGs

The optimal locations of two generators (in a grid-connected system) based on loss minimization proposed in [34] are at nodes 6 and 30. When islanded, these two generators operate in droop control mode (for size in

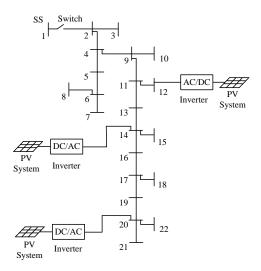


Figure 2: Practical radial distribution (22 bus) network APEPDCL

proportion of 1:0.50) for load sharing. From the droop law, we know that 122 system frequency takes a new steady state value till secondary control acts. 123 System simulation (time domain) is performed with these two generators 124 at various locations (cases) in a standard IEEE 33-bus radial distribution 125 network. From the operating points, state space matrix is obtained using 126 (1). Root locus analysis is performed for these cases by varying the droop 127 constants to identify the stability limit. The values of  $m_{p,max}$  and  $n_{q,max}$  are 128 noted when the system reaches an unstable region. Losses in the system, 129 minimum voltage value in the total network,  $m_{p,max}$ ,  $n_{q,max}$ , and minimum 130 distance between the DGs for all these cases are presented in Table 1. It 131 is clear that the maximum values of  $m_{p,max}$  and  $n_{q,max}$  are not the best 132 for case 1. This is true since the decision for placement of generators in this 133 location in [34] was made with separate conditions (grid-connected, exporting 134 power, etc.). However, in systems where grid reliability is poor (true in many 135 developing countries), such location may not be optimum. From network loss, 136 stability, and voltage perspectives, case 1, case 6, and case 13 are preferred 137 options, respectively. 138

Figure 3 shows the plot between  $m_{p,max}$  and Z, while Fig. 4 shows the plot between  $n_{q,max}$  and Z for the cases tabulated in Table 1. Electrical distance (in terms of impedance) between generators is an important parameter contributing to small signal stability margin. From Figs. 3 and 4, it is observed that higher electrical distance between sources results in better

$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Case	DG-1	DG-2	$P_{loss}$	$V_{min}$	$m_{p,max}$	$n_{q,max}$	Ζ
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Node	Node	(kW)	(p.u.)	$(10^{-5})$	$(10^{-4})$	$(\Omega)$
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	1	6	30	65.05	0.9469	1.24	1.34	3.5709
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	2	24	30	74.27	0.9303	2.30	2.21	7.1671
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	3	18	24	120.48	0.9193	4.90	5.92	16.8053
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	4	13	30	264.07	0.9206	3.43	2.84	11.1844
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	5	18	25	143.45	0.9068	5.33	6.10	17.9422
$\begin{array}{ c c c c c c c c c c c c c c c c c c c$	6	18	22	207.91	0.8855	5.55	6.31	19.6787
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	7	22	33	185.24	0.9003	3.39	3.84	12.4616
$\begin{array}{ c c c c c c c c c c c c c c c c c c c$	8	22	25	175.09	0.8906	2.08	2.72	7.3835
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	9	25	33	106.39	0.9131	3.16	3.48	10.7276
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	10	18	33	386.46	0.8833	5.39	4.58	19.2281
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	11	6	14	83.96	0.9528	2.44	3.12	8.4827
$\begin{array}{ c c c c c c c c c c c c c c c c c c c$	12	6	18	120.38	0.9524	3.60	5.08	0.9524
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	13	6	10	72.29	0.9532	1.53	1.97	5.1831
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	14	3	5	97.04	0.9335	0.88	0.37	0.8118
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	15	6	26	84.97	0.9487	0.82	0.23	0.2278
$\begin{array}{ c c c c c c c c c c c c c c c c c c c$	16	3	4	103.26	0.9273	0.80	0.27	0.4107
19 17 18 525.83 0.7425 0.65 0.50 0.9302	17	9	10	238.42	0.8823	0.73	0.59	1.2764
	18	32	33	291.85	0.8507	0.43	0.47	0.6304
20 24 25 182 31 0 8890 0 66 0 58 1 1377	19	17	18	525.83	0.7425	0.65	0.50	0.9302
	20	24	25	182.31	0.8890	0.66	0.58	1.1377

Table 1: Various case study results for two DGs placement for IEEE 33-bus radial network

stability margin. Root locus plot and time domain simulation further prove
this point. Case 1 (base case), case 6 (highest stability margin), and case 18
(least stability margin) are considered for detailed analysis.

Figure. 5 shows the root locus plot of the system for case -1, case -6, and 147 case -18.  $\lambda_{12}$  indicates the interaction of low-frequency modes between two 148 sources. From the three sets of Eigen traces, it s clear that the system is 149 going into an unstable region after a certain value of  $m_P$ . In Fig. 5,  $\lambda_{12}$  for 150 case -1 starts from -15.066  $\pm$  j 16.60 and reaches the imaginary axis at 0  $\pm$  j 151 74.40, while for case -6 and case -18 the starting points for  $\lambda_{12}$  are at -15.346 152  $\pm$  j 1.1835 and -12.971  $\pm$  j 28.278 and they reach the imaginary axis at 0  $\pm$ 153 j 87.05 and  $0 \pm j$  58.84, respectively. From these root locus plots, the effect 154 of impedance between sources on stability margin is observed, and it is clear 155 that, distance between sources influences the stability of the system. 156

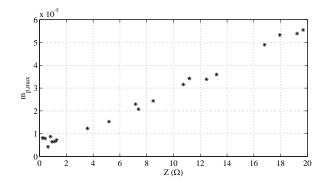


Figure 3: Impedance vs.  $m_{p,max}$  plot

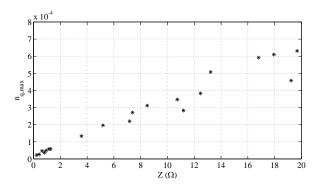


Figure 4: Impedance vs.  $n_{q,max}$  plot

#### 157 3.2. IEEE 33-bus system with three DGs

Optimal locations of three generators (in grid connected system) based 158 on loss minimization, proposed in [34], are at nodes 6, 14, and 30. When is-159 landed, these three generators operate in droop control mode for load sharing. 160 System simulation (time domain) is performed with these three generators 161 at various locations (cases) in a standard IEEE 33 bus radial distribution 162 network. From the operating points, state space matrix is obtained using 163 (1). Root locus analysis is performed for these cases by varying droop con-164 stants to identify the stability limit. The values of  $m_{p,max}$  and  $n_{q,max}$  are 165 noted when the system reaches an unstable region. Losses in the system, 166 minimum voltage value in the total network,  $m_{p,max}$ ,  $n_{q,max}$  and minimum 167 distance between the DGs for all these cases are presented in Table. 2. 168

It is clear that the maximum values of  $m_{p,max}$ ,  $n_{q,max}$  are not the highest

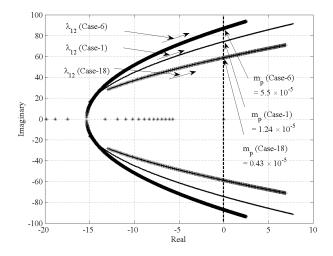


Figure 5: Table 1, cases-1, 6, 18 : Rootlocus plot with variation in droop gain  $m_p$ 

for case-1. This is true since the decision for this location for placement of generators in this location in [34] was done with separate conditions (gridconnected, exporting power, etc). From network loss, stability, and voltage perspectives, case -37, case -3 and case -33 are preferred options.

Figure. 6 shows the eigenvalues plot for case -1 (base case). Out of 165 174 eigenvalues 92 eigenvalues are shown in figure (rest of the Eigenvalues are 175 highly damped). For dynamic stability, low-frequency mode Eigenvalues, 176 which are sensitive to the droop gains of the system, are of interest. These 177 low-frequency modes correspond to the power controller mode of the VSI. 178 Case -1 (base case), case -3 (highest stability margin), and case -41 (least 179 stability margin) are considered for detailed analysis. Two complex conjugate 180 low-frequency mode trajectories sensitive to real power droop gain for these 181 cases are shown in Fig. 7, Fig. 8 and Fig. 9, respectively.  $\lambda_{12}$  shows the 182 interaction of low frequency modes between VSIs 1 and 2 while  $\lambda_{13}$  shows the 183 interaction of low frequency modes between VSIs 1 and 3. This trajectory 184 shows that  $\lambda_{12}$  goes into an unstable mode at a lower value of  $m_p$  than  $\lambda_{13}$ . 185

In Fig. 7,  $\lambda_{12}$  starts at -15.7 ± j 6.2054 and reaches the imaginary axis at 0 ± 81.265. In Figs. 8 and 9,  $\lambda_{12}$  starts from -15.24 ± j 8.065 and -11.213 ± j 33.373 and reaches to imaginary axis at 0 ± j 86.75 and 0 ± j 60.118 respectively. From these root locus plots, the impact of minimum distance between sources on stability margin is clearly observed, and it is understood that sources separated with higher impedance have relatively higher stability

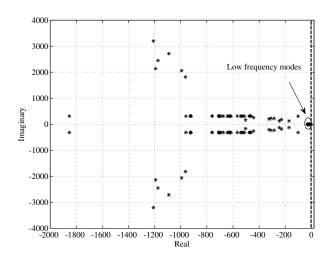


Figure 6: Eigenvalue plot of the microgrid

192 margin.

Table 2: Various case study results for three DGs placement for IEEE 33-bus radial network

Case	DG-1	DG-2	DG-3	$P_{loss}$	Vmin	$m_{p,max}$	$n_{q,max}$	$Z_{min}$
- 1	Node	Node	Node	(kW)	(p.u.)	$(10^{-5})$	$(10^{-4})$	$(\Omega)$
	6	30	14	$\frac{60.03}{67.09}$	0.9581	1.81	1.31	$\frac{3.5709}{10.7974}$
2	25	33	18	67.98	0.9635	2.91	4.12	10.7274
3	22	33	18	86.76	0.9441	2.94	4.73	12.4616
4	24	30	8	32.36	0.9694	0.92	1.80	6.1455
5	24	$\frac{30}{20}$	18	44.86	0.9751	2.38	2.62	7.1671
$\frac{6}{7}$	6	$\frac{30}{20}$	18	79.30	0.9577	1.78	1.38	3.4992
7	$\frac{24}{24}$	$\frac{30}{20}$	$\frac{6}{22}$	45.94	0.9530	0.53	0.76	3.5965
8		30		52.07	0.9364	1.35	2.05	6.2483
9	24	6	18	84.58	0.9613	1.22	1.29	3.5965
10 - 11	10	$\frac{30}{24}$	15	126.06	0.9347	1.19	1.31	4.0902
11	10	$\frac{24}{22}$	15	153.56	0.9360	1.18	1.30	4.0902
$\frac{12}{12}$	10		15	151.49	0.9167	1.19	1.35	4.0902
$\frac{13}{14}$	24	$\frac{30}{20}$	20	45.87	0.9370	1.08	1.50	4.4788
14	24	20	18	95.61	0.9321	1.80	1.84	4.4788
15	24	30	$\frac{3}{10}$	46.11	0.9471	0.54	0.57	1.6905
$\frac{16}{17}$	24	3	18	75.06	0.9422	0.44	0.16	1.6905
17	24	21	3	135.0	0.9235	0.43	0.53	1.6905
18	24	22	18	114.78	0.9299	2.23	2.62	6.2483
19	6	11	18	212.26	0.9554	0.94	1.71	5.3783
20	2	6	18	65.20	0.9617	1.07	0.97	2.456
21	24	21	2	139.08	0.9181	0.40	0.59	2.2352
22	2	6	30	36.66	0.9528	0.61	0.79	2.456
23	24	21	6	96.28	0.9509	0.82	1.04	3.5965
24	8	14	18	362.75	0.9062	0.62	1.46	4.7548
25	2	4	6	76.63	0.9514	0.41	0.42	0.964
26	24	21	11	91.14	0.9409	1.63	2.01	5.0983
27	7	26	30	64.41	0.9514	0.64	0.26	0.8209
28	10	14	18	386.80	0.8604	0.60	1.16	3.2999
29	3	6	11	41.92	0.9627	0.72	0.77	2.3629
30	3	6	30	34.80	0.9532	0.60	0.72	2.3629
31	24	21	14	85.60	0.9363	1.83	2.08	5.0983
32	24	30	11	25.81	0.9770	1.48	2.68	7.1429
33	23	30	18	51.56	0.9779	2.31	2.25	6.0099
34	23	33	18	77.61	0.9746	2.84	3.22	15.6619
35	23	19	3	112.85	0.9244	0.37	0.25	0.5472
36	6	12	18	231.84	0.9552	0.82	1.70	5.7461
37	24	30	14	25.69	0.9759	1.94	2.64	7.1671
38	23	3	4	100.50	0.9301	0.43	0.25	0.4170
39	19	2	3	130.38	0.9224	0.41	0.27	0.2267
40	5	6	26	67.69	0.9532	0.43	0.21	0.2278
41	29	30	31	193.0	0.8980	0.33	0.34	0.6214
42	24	23	3	119.09	0.9236	0.37	0.31	0.5472
43	21	20	19	246.34	0.9051	0.42	0.45	0.6297
44	4	6	8	52.80	0.9630	0.44	0.64	1.5007
45	28	30	32	175.37	0.9153	0.35	0.61	1.6249
46	10	11	12	295.94	0.8632	0.50	0.22	0.2071

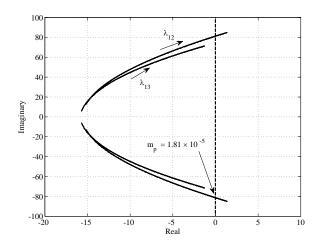


Figure 7: Table 2, case-1 : Rootlocus plot with variation in droop gain  $m_p$ 

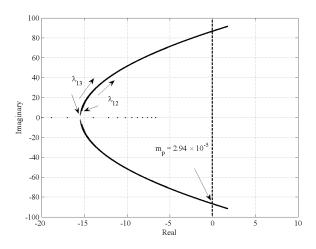


Figure 8: Table 2, case-3 : Rootlocus plot with variation in droop gain  $m_p$ 

#### 193 3.3. 22-bus APEPDCL Distribution Network

The optimal locations of three generators (in a grid-connected system) based on loss minimization, proposed in [36], are at nodes 12, 14, and 20. System simulation (time domain) is performed with these three generators at various locations (cases) in the 22-bus APEPDCL distribution network. From the operating points, state space matrix is obtained using (1). Root

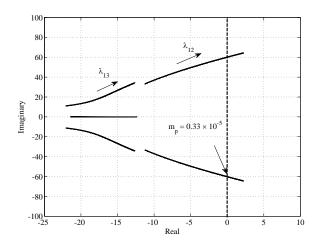


Figure 9: Table 2, case-41 : Rootlocus plot with variation in droop gain  $m_p$ 

locus analysis is performed for these cases by varying droop constants to identify the stability limit. The values of  $m_{p,max}$  and  $n_{q,max}$  are noted when the system reaches an unstable region. Losses in the system, minimum voltage value in the total network,  $m_{p,max}$ ,  $n_{q,max}$ , and minimum distance between the DGs for all these cases are presented in Table. 3.

It is clear that the maximum values of  $m_{p,max}$ ,  $n_{q,max}$  are not the highest for case 1. This is true since the decision for placement of generators in this location was made with separate conditions (grid-connected, exporting power, etc.). From network loss, stability, and voltage perspectives, case 8, case 6, and case 8 are preferred options. Case 1 (base case), case 6 (highest stability margin) and case 20 (least stability margin) are considered for detailed analysis.

Case	DG-1	DG-2	DG-3	$P_{loss}$	$V_{min}$	$m_{p,max}$	$n_{q,max}$	$Z_{min}$
	Node	Node	Node	(kW)	(p.u.)	$(10^{-6})$	$(10^{-5})$	$(\Omega)$
1	12	14	20	0.740	0.9952	7.23	4.48	1.2137
2	3	14	20	0.752	0.9967	7.29	4.90	1.2137
3	8	12	22	3.154	0.9951	12.06	8.49	3.6752
4	8	13	22	2.627	0.9958	11.01	8.04	3.0911
5	4	15	22	0.612	0.9971	8.41	6.10	1.8402
6	8	10	22	4.4459	0.9942	13.01	8.16	2.9157
7	3	15	22	0.953	0.9965	8.45	6.25	1.8402
8	4	14	20	0.367	0.9972	7.26	4.85	1.1897
9	9	15	22	0.732	0.9968	8.33	5.76	1.8402
10	8	9	17	5.078	0.9965	10.32	7.10	2.8026
11	3	10	17	3.675	0.9965	10.04	5.60	1.5681
12	8	11	17	3.586	0.9967	8.95	6.49	2.0428
13	8	10	18	5.041	0.9961	10.66	7.47	2.9157
14	12	15	18	0.943	0.9953	5.91	3.49	0.5567
15	15	18	22	2.712	0.9903	7.60	3.50	0.5567
16	10	12	15	2.050	0.9954	8.06	4.11	0.8826
17	13	14	15	1.514	0.9945	6.02	2.13	0.0249
18	20	21	22	6.410	0.9840	6.43	2.17	0.0980
19	9	10	11	5.281	0.9879	6.61	2.16	0.0615
20	6	7	8	19.336	0.9683	5.83	2.15	0.0673

Table 3: Various case study results for three DGs placement for APEPDCL 22-bus practical radial network

Plots of  $m_{p,max}$  vs.  $Z_{min}$  (minimum impedance among sources) and  $n_{q,max}$ vs.  $Z_{min}$  are shown in Figs. 10 and 11, respectively.

Figures. 12, 13 and 14 show root locus plot for cases 6, 8 and 20, re-213 spectively.  $\lambda_{12}$  shows the interaction of low-frequency modes between VSIs 1 214 and 2 while  $\lambda_{13}$  shows the interaction of low frequency modes between VSIs 215 1 and 3. This trajectory shows that  $\lambda_{12}$  goes into an unstable mode at a 216 lower value of  $m_p$  than  $\lambda_{13}$ . In Fig. 12  $\lambda_{12}$  starts from an approximate value 217 of  $-15.55 \pm j$  21.27 and reaches the imaginary axis at an approximate value 218 of 0  $\pm$  j 63.3. In Figs. 13 and 14,  $\lambda_{12}$  approximately starts from -15.27  $\pm$ 219 j 15.275 and -16.19  $\pm$  j 24.70 and reaches the imaginary axis approximately 220 at  $0 \pm i$  71.1 and  $0 \pm i$  59.7 respectively. The following are some critical 221 observations from the case studies: 222

• The system configuration (generator location) with low losses in grid

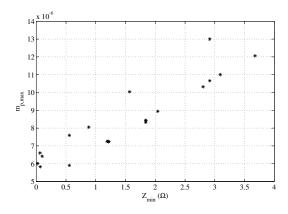


Figure 10: Plot between  $m_{p,max}$  vs.  $Z_{min}$ 

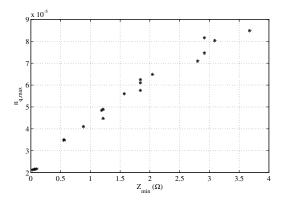


Figure 11: Plot between  $n_{q,max}$  vs.  $Z_{min}$ 

connected mode may suffer from stability issues when islanded. This 224 can be a serious problem when the reliability of the main grid is poor. 225 • The interaction of low-frequency modes between various DGs is differ-226 ent and the location of some inverters is critical (inverter 2 in this case) 227 with respect to the stability. 228 • Stability margin (gain of droop constant) is a function of minimum 229 distance between the generators in an islanded network. 230 • It is important to choose an optimal location for these generators by 231 considering stability and network losses. 232

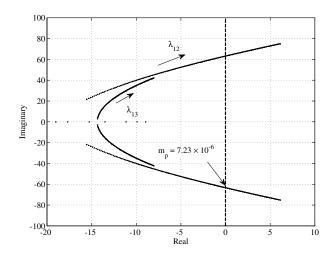


Figure 12: Table 3, case-1 : Rootlocus plot with variation in droop gain  $m_p$ 

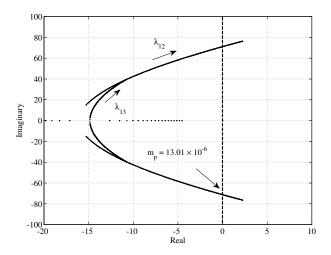


Figure 13: Table 3, case-6 : Rootlocus plot with variation in droop gain  $m_p$ 

#### 233 3.4. Determination of Pareto Front in an Islanded Microgrid

The locations of generators should depend on network losses and overall stability of the system. For multi-objective optimization of the DG network, Pareto optimal front should be identified. Data in Tables 2 and 3 are plotted and Pareto fronts (set of non dominated solutions) obtained between  $m_{p,max}$ vs. real power loss and  $n_{q,max}$  vs. reactive power loss (Figs. 15, 16 and 17, 18 respectively).

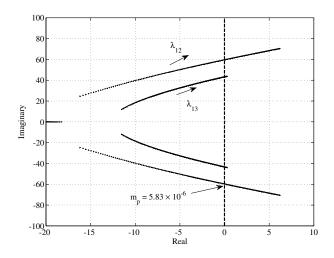


Figure 14: Table 3, case-20 : Rootlocus plot with variation in droop gain  $m_p$ 

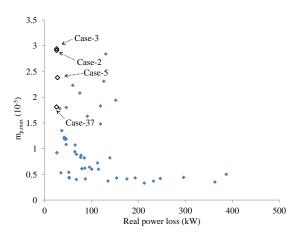


Figure 15: Real power loss vs.  $m_{p,max}$  for IEEE 33 bus system with three DGs - Pareto front shown in open boxes

- <sup>240</sup> Critical observations from Pareto fronts (for 33-bus system) are:
- Cases corresponding to Pareto fronts (shown in open box) obtained in Fig. 15 are 2, 3, 5 and 37.
- Cases corresponding to Pareto fronts (shown in open box) obtained in Fig. 16 are 2, 3 and 32.

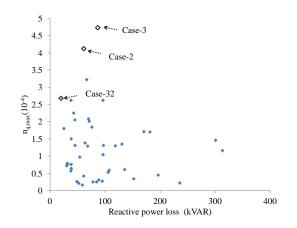


Figure 16: Reactive power loss vs.  $n_{q,max}$  for IEEE 33 bus system with three DGs - Pareto front shown in open boxes

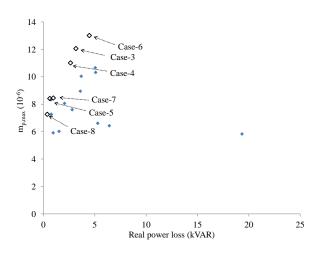


Figure 17: Real power loss vs.  $m_{p,max}$  for 22 bus APEPDCL network with three DGs -Pareto front shown in open boxes

Case-1 which represents optimal location of sources in a grid-connected system, does not lie on the Pareto front. This clearly indicates that the optimal placement of sources in a grid-connected microgrid is not optimal during islanding.

<sup>249</sup> Critical observations from Pareto fronts (for 22 bus practical system) are:

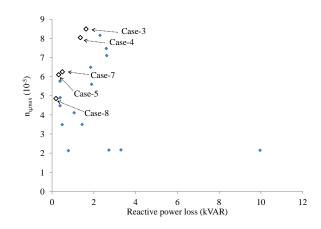


Figure 18: Reactive power loss vs.  $n_{q,max}$  for 22 bus APEPDCL network with three DGs - Pareto front shown in open boxes

- Cases corresponding to Pareto fronts (shown in open box) obtained in Fig. 17 are 3, 4, 5, 6, 7 and 8.
- Cases corresponding to Pareto fronts (shown in open box) obtained in Fig. 18 are 3, 4, 5, 7 and 8.
- Similar to the previous example, case -1 does not lie on the Pareto front.

• Cases 3, 4, and 6 have high stability margin and higher losses, while cases 5, 7, and 8 have low stability margin and low losses.

#### 258 4. Simulation - Time Domain Validation

Time domain simulation is performed on both the networks for validation of stability analysis. Simulation results for the three DG system (case -1 of Table 2) and for the practical network (case -1 of Table. 3) are shown in Fig. 19 and Fig. 20, respectively.

The system is stable and sharing power as per the droop law. The effect of higher value of droop parameter is investigated by changing the droop value (beyond  $m_{p,max}$ ). At time t = 2s for a higher value of  $m_p$  (>  $m_{p,max}$ ), power output of DGs is oscillating with increasing amplitude as shown in Fig. 19, which indicates that the system is now unstable.

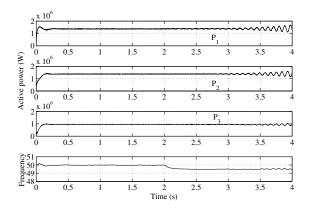


Figure 19: Real power output of DGs and system frequency in Std. IEEE 33 network

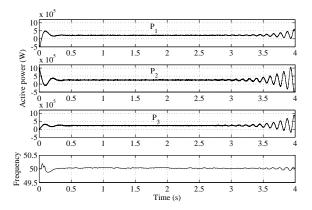


Figure 20: Real power output of DGs and system frequency in practical 22 bus distribution network

#### 268 5. Conclusion

The effect of location of droop-based sources on small signal stability, 269 transient response, and network losses in an islanded network is investigated. 270 A standard IEEE 33-bus network and a 22-bus practical distribution network 271 are chosen. A microgrid model is developed for both the networks with droop-272 based sources, network components, and loads for stability analysis. Higher 273 droop in DGs is desired for better power sharing and transient response. 274 Small signal stability is studied for various locations of DGs (two/three) by 275 varying the droop constant. From the stability study, it is found that a sys-276 tem optimized for losses in grid-connected mode may suffer from small signal 277

stability issues and poor transient response when in islanded configuration. The minimum distance between generators in the network also has an impact on small signal stability. For multi-objective optimization of the DG network, Pareto optimal front is identified. Results of small signal stability analysis are verified using time domain simulation in MATLAB for both the networks.

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