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# An Approach for Optimal Coordination of Over-Current Relays in Microgrids with Distributed Generation

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Abstract: The ever increasing presence of renewable distributed generation (DG) in microgrids is imposing new challenges in protection coordination. The high penetration of renewable DG enables microgrids to operate under different topologies, giving rise to bidirectional power flows and in consequence, rendering traditional coordination approaches inappropriate to guarantee network security. This paper proposes an approach for the optimal coordination of directional over-current relays (OCRs) in microgrids that integrate renewable DG and feature several operational modes. As a main contribution, the characteristic curves of directional OCRs are considered to be decision variables, instead of fixing a single type of curve for all relays as considered in previous works. The proposed approach allows for the selection of several IEC and IEEE curves which combination results in the best protection coordination. Several tests were carried out on an IEC benchmark microgrid in order to show the applicability of the proposed approach is able to find lower operation approaches evidenced that the proposed approach is able to find lower operation times and, at the same time, guarantee the suitable operation of protections under different condition faults and operational modes.

**Keywords:** distributed generation; distribution networks; microgrids; power system protection; over-current relay coordination

# 1. Introduction

Nowadays, the rapid incorporation of renewable DG in modern distribution networks (DNs) has introduced new paradigms to the traditional energy generation scheme. Basically, for high standards of quality, energy management, and efficiency; DG has been configured into microgrids that favor the rapid use of renewable energy resources. Such incorporation brings along new challenges for engineers and designers around the world [1,2].

The protection coordination problem ine of these challenges. DG changed the traditional configuration of unidirectional power flows in DNs where there is only a single generation bus. With the presence of DG, there are multiple generation buses that produce bidirectional power flows and variable short circuit levels [3]. In general terms, new protection systems must guarantee the stability of the protection scheme not only under intermittent DG units and loads, but also under the possibility of switching between grid-connected and islanded modes [4,5].

Directional over-current relays (OCRs) have been used in traditional DNs, and they are presented as a promissory alternative for the protection of microgrids [6,7]. Nonetheless, their suitable

incorporation and optimal coordination in microgrids remains a research topic [8]. In this context, it is of paramount importance the incorporation of new approaches in the planing and designing of coordination schemes aiming to high standards of velocity, selectivity, and reliability [9].

Several approaches for improving the protection coordination in microgrids have been reported in the specialized literature. In [10], an approach for OCRs coordination for grid-connected and islanded operational modes is proposed. This approach takes into account changes in network topology due to line or generation outages. In [11], a protection coordination scheme for microgrids is proposed by utilising the commonly used numerical directional OCRs with single and dual settings. The authors in [12] simultaneously incorporate a multi-objective particle swarm optimization (PSO) technique and a decision tool for coordinating OCRs in microgrids. In [13], an adaptive protection coordination scheme is developed based on a machine-learning approach. The authors modelled a hybrid artificial neural network and a support vector machine approach for modifying protection settings while guaranteeing the reliability of the network. In [14], the authors implemented a protection coordination with smart electronic devices and a communication channel; this for obtaining real-time system information and updating relays settings.

Recently, there have been some studies regarding the optimal protection coordination problem in microgrids, which relay on a better setting of the characteristics for standard and non-standard curves. In [15], a new constraint regarding the plug setting multiplier (PSM) is proposed for improving the coordination of directional OCRs in microgrids. This constraint is also incorporated in [16], using a non-standard curve for enhancing the performance of OCRs protection. In [17], the authors considered the upper limit of the PSM as a variable, changing the traditional paradigm in which it is seen as a fixed limit. Additionally, the constraint proposed in [15] was included considering a normal inverse current curve for all relays. In [18], the coordination of directional OCRs in microgrids is carried out for grid-connected and islanded modes while considering different IEC characteristic curves for each relay.

This paper proposes a new model for OCRs coordination in microgrids that takes multiple operational modes and DG into account. As a novelty, the proposed model considers the characteristic curves of the relays as decision variables, which differentiates it from other works that consider a single type of curve for all relays [15–18]. As can be seen from the literature review, several models and solution techniques have been used to solve the optimal coordination of OCRs in microgrids. In this sense, our paper complements the research of [18] which only takes into account some IEC curves by introducing both IEC and IEEE standard curves [19,20]. The proposed approach also considers the constraint proposed in [15] regarding the PSM. These features enlarge the solution space of the coordination problem and allow for finding better solutions. Several tests were performed on a benchmark IEC microgrid when considering four operational modes. To prove the effectiveness of the proposed approach, the results were compared with those that were reported in [15-17]. In all operational modes, the proposed approach was able to find a better coordination scheme. Furthermore, the proposed approach can be used in order to obtain a coordination with multiple parameters for each operational mode or a single set of parameters that are suitable for all operational modes. Table 1 shows the features of other research works in the field, evidencing the knowledge gap in the existing literature that is filled by the proposed approach.

Reference	Multiple Parameters	Single Set of Parameters	PSM Constraint	IEC Curves	IEEE Curves
[11]	-	Х	-	-	-
[18]	Х	Х	-	Х	-
[14]	Х	-	-	-	-
[12]	-	Х	Х	-	-
[10]	Х	Х	-	-	-
[15,16]	Х	-	Х	-	-
[17]	Х	Х	Х	-	-
[Proposed]	Х	Х	Х	Х	Х

Table 1. Optimal coordination of OCRs in microgrids (knowledge gap).

This paper is organized, as follows: Section 2 presents the problem formulation, Section 3 shows the genetic algorithm used to solve the coordination problem, Section 4 presents the results, and Section 5 concludes and summarizes the most relevant aspects of the research.

#### 2. Mathematical Formulation

#### 2.1. Objective Function

Equation (1) illustrates the objective function (OF) which consists on minimizing the operation time of the OCRs while ensuring coordination between main and back up relays. m and n are the number of relays and faults in the system, respectively; while,  $t_{if}$  corresponds to the operation time of relay i when fault f takes place.

$$OF = Min \sum_{i=1}^{m} \sum_{f=1}^{n} t_{if}$$

$$\tag{1}$$

#### 2.2. Coordination Criteria

The coordination between main and back up relays is enforced by constraint (2). When a fault takes place, both of the relays identify the fault occurrence. However, it must be guaranteed that the main relay is tripped first. This is achieved by defining a coordination time interval *CTI* which is the time difference between the tripping of the main and back up relays. In this case,  $t_{jf}$  is the operation time of the backup relay *j* when fault *f* occurs, and  $t_{if}$  is the operation time of the primary relay *i*, for the same fault. The yypical *CTI* values are within the range of 0.2 to 0.5 s. The *CTI* considered in this study is 0.3 for comparative purposes. Equation (3) indicates the operating time limits of the OCRs. In this case,  $t_{imin}$  and  $t_{imax}$  are the minimum and maximum operating time of relay *i*, respectively.

$$t_{if} - t_{if} \ge CTI \tag{2}$$

$$t_{imin} \le t_{if} \le t_{imax} \tag{3}$$

#### 2.3. Relay Characteristic

Equation (4) accounts for the type of standard characteristic curve (IEC or IEEE), where *A*, *B*, and *C* are constant parameters of the curve,  $TMS_i$  is the time multiplier setting of relay *i*, and  $PSM_{if}$  is the ratio between the fault current  $I_{fi}$  and the pick up current  $ipickup_i$  given by Equation (5). This ratio must be between minimum ( $PSM_{imin}$ ) and maximum ( $PSM_{imax}$ ) limits, as indicated by constraint (6).

$$t_{if} = \frac{A.TMS_i}{PSM_{if}^B - 1} + C \tag{4}$$

$$PSM_{if} = \frac{I_{fi}}{ipickup_i} \tag{5}$$

$$PSM_{imin} \le PSM_{if} \le PSM_{imax} \tag{6}$$

#### 2.4. Bonds on the TMS and Pick up Current for Each Relay

In the conventional approach of protection coordination, the *TMS* is the main decision variable. Equation (7) represents the minimum and maximum limits of *TMS* for relay *i* given by  $TMS_{imin}$  and  $TMS_{imax}$ , respectively. Similarly, Equation (8) represents lower and upper limits of the pickup current *ipickup<sub>i</sub>*, denoted as *ipickup<sub>imin</sub>* and *ipickup<sub>imax</sub>*, respectively.

$$TMS_{imin} \le TMS_i \le TMS_{imax} \tag{7}$$

$$ipickup_{imin} \leq ipickup_i \leq ipickup_{imax}$$
 (8)

#### 2.5. New Constraint Considering Standard Curves

Equation (9) represents the selection of the IEC/IEEE standard characteristic curve. The curve setting of a relay provides information regarding the type of characteristic curve to be followed by that particular relay. In this case, *StandarCurve<sub>i</sub>* is the select standard characteristic curve of the primary relay *i*. In this Equation,  $\Omega_c$  represents the set of standard curves that are available in the relay.

$$StandarCurve_i \in \Omega_c \tag{9}$$

#### 3. Methodology

The optimal coordination of OCRs given by (1)-(9) is a non-convex optimization problem that involves discrete and continuous decision variables. Non-convex optimization problems may have multiple locally optimal solutions and it can take a lot of time to identify whether the problem has no solution at all or whether the solution found is globally optimal. There are multiple solution techniques that can be applied in order to solve the optimization problem that is given by (1)-(9). The most suitable among them belong to the set of metaheuristic techniques, since they are able to tackle non-convex optimization problems and find high-quality solutions in relatively low computational time. In this case, the proposed optimization problem was solved by a conventional genetic algorithm (GA) that wasimplemented in Matlab. It is worth mentioning that the main contribution of this paper considers the characteristic curves of OCRs as decision variables of the coordination problem, and not the solution technique as such. In this sense, hybrid versions of GA such as its combination with simulated annealing [21,22] have proven to outperformed its conventional version and might be the subject of future research. Genetic algorithms mimic the process of natural selection, starting with an initial population of solution candidates that must pass through several stages of selection, crossover, and mutation. Other metaheuristics, such as particle swarm optimization [23] and differential evolution [24], have also been applied for solving the optimal coordination of protections. Furthermore, GAs have been successfully applied in the coordination of OCRs, as presented in [18,25,26].

#### 3.1. Initial Population

The starting point of a GA is a set of candidate solutions or population. Every candidate solution (or individual) is represented by a vector that contains the proposed values of the decision variables. In this case, each individual is represented with a vector that indicates the settings of *TMS* and *StandarCurve<sub>i</sub>* for each relay; therefore, the length of a candidate solution is twice the number of relays in the network. The initial population is randomly generated while taking the limits of the decision variables into account. Figure 1 depicts an example of a candidate solution.

TMS Relay 1	TMS Relay 2	 TMS Relay n	StandarCurve Relay 1	StandarCurve Relay 2	 StandarCurve Relay n
0,05	1	 0,9	IEC SI	IEC LTI	 IEEE I

Fi	gure	1.	Examp	le of	a	cand	id	late	sol	lutior	۱.
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#### 3.2. Fitness Evaluation

Once a set of solution candidates is generated, it is necessary to evaluate the quality of such possible solutions. This is known as the stage of fitness evaluation. In this case, the objective function (given by Equation (1)) that is associated with every solution candidate is evaluated and they are sorted from best to worst. Figure 2 depicts the process of fitness evaluation.

				OF: Time	(s
TMS Relay 1 TMS Relay 2	TMS Relay n	StandarCurve Relay 1	StandarCurve Relay 2 Standar	rCurve Relay <i>n</i>	
1,2 1	0,9	IEC SI	IEEE EI	IEEE I → 13,4	
			•		
TMS Relay 1 TMS Relay 2	TMS Relay n	StandarCurve Relay 1	StandarCurve Relay 2 Standa	rCurve Relay <i>n</i>	
0,05 2	2 0,9	IEEE VI	IEC LTI	IEEE I → 14,7	
TMS Relay 1 TMS Relay 2	TMS Relay n	StandarCurve Relay 1	StandarCurve Relay 2 Standar	rCurve Relay <i>n</i>	
0,05 1	0,2	IEC SI	IEC LTI	IEEE VI → 15,2	
			1 1 1		
TMS Relay 1 TMS Relay 2	TMS Relay n	StandarCurve Relay 1	StandarCurve Relay 2 Standa	rCurve Relay <i>n</i>	
2 1	2,5	IEEE EI	IEC SI	IEEE I → 20,2	

Figure 2. Fitness evaluation.

# 3.3. Selection and Crossover

The idea behind the selection step is guaranteeing that the fittest individuals have greater chance to pass on their genes into the next generation. In this case, a tournament selection was implemented. In every tournament, two individuals of the current population are randomly chosen and the best one is selected for the crossover stage. In this later stage, the selected individuals act as parents which exchange their information to produce new solution candidates. The crossover is performed at a random position of the vector and it is illustrated in Figure 3.



Figure 3. Example of crossover.

# 3.4. Mutation and New Generation

The mutation stage allows for the GA to eventually escape from locally optimal solutions and adds diversification to the algorithm. In this step, one of the offspring generated in the crossover is randomly selected and a small variation is performed in one of its variables. Such variation is performed within the variable limits to avoid the creation of unfeasible solutions. Figure 4 depicts an example of this state. Once the mutation process is finished, the fittest individuals are selected from the combined population of parents and offspring. In this stage, half of the individuals are discarded in order to preserve the size of the initial population. The process continues until a given number of generations is reached or until a maximum number of interactions has been evaluated without any improvement of the OF.





#### 4. Tests and Results

Several tests were carried out in the benchmark IEC microgrid that is depicted in Figure 5 for showing the applicability of the proposed approach. The data of this system are available in [27]. This microgrid integrates DG and features four operational modes (OMs), as indicated in Table 2. In OM1, all DG units are off and the demand is supplied only through the main grid. In OM2, the demand can be supplied through the main grid and the DG units, since all of them are available. In OM3, DG3 and DG4 are off and the load can be supplied through the main grid as well as through DG1 and DG2, which are available. Finally, in OM4 the load is only supplied with the DG units and the microgrid operates in off-grid mode.

The test system was implemented in DIgSILENT PowerFactory when considering five three-phase line failures (F1 to F5). In this case, F1 represents a fault on line DL-5; F2 and F3 are failures on lines DL-4 and DL-2, respectively; F4 represents a fault on DL-1 line; and, F5 represents a fault on DL-3 line. All of the calculations and tests were performed in accordance with the IEEE 242 standard, which is widely used for coordination of over-current protections [28].

The results that were obtained with the proposed approach were compared with those reported in [15–17], adjusting their same short-circuit levels and considering their same transformation ratios of current transformers *RCT* and starting currents  $i_{pickup}$ , please see Table 3.

IEEE 242 Standard [28] recommends a coordination time interval of (*CTI*) of at least 0.2 s. In this work, we adopted a *CTI* of 0.3 s for performing a comparative analysis with [15–17], which use IEC normal inverses curves. The relays of the microgrid are labeled with numbers ranging from 1 to 15 preceded by the letter "R". In this case, the letters "P" and "B" were added to the label in order to differentiate main and backup relays, respectively. Figure 5 shows the location of each relay.

After running several tests with the GA, the parameters that yield the best results correspond to a population of 100 individuals, a crossing rate of 0.7, and a mutation rate of 0.3. The maximum number of generations was set to 1000. Additionally, in all scenarios under analysis, CB-LOOP1 and CB-LOOP2 were considered to be open.

<b>Operational Mode</b>	Grid	DG1	DG2	DG3	DG4
OM1	on	off	off	off	off
OM2	on	on	on	on	on
OM3	on	on	on	off	off
OM4	off	on	on	on	on

Table 2. Microgrid operational modes.

Relay	RCT	i <sub>pickup</sub>
R1	400	0.50
R2	400	0.50
R3	400	0.50
R4	400	0.50
R5	400	0.50
R6	400	0.50
R7	1200	1.00
R8	400	0.50
R9	400	0.50
R10	400	0.50
R11	400	0.65
R12	400	0.50
R13	400	0.88
R14	400	0.65
D1E	100	0 55



Figure 5. Benchmark IEC micro-grid.

#### 4.1. Results for OM1

In OM1, the microgrid is connected to the main supply, while all of the DG units are disconnected. Table 4 presents the results that were obtained with the proposed model and the ones reported in [15–17] for comparative purposes. The *TMS* and *StandarCurve<sub>i</sub>* are presented for each relay as well as the sum of the operating times for all relays T(s), which represents the OF of the problem. Note that the proposed model obtained better operating times, which ensures coordination between main and backup OCRs. In this case, the relays presented different types of characteristic curves

*StandarCurve<sub>i</sub>*. Table 5 presents the operating times of main and backup relays for each fault. In all cases, the proposed model presented lower operating times than those presented in [15,16]. For faults F1, F2, and F5, the proposed model also presents lower operating times than those presented in [17]. Nevertheless, for faults F3 and F4, the proposed approached presented slightly higher operation times when compared with [17].

Relay	TMS <sub>i</sub> (Curve) [15]	<i>TMS<sub>i</sub></i> (Curve) [16]	<i>TMS<sub>i</sub></i> (Curve) [17]	TMS <sub>i</sub> (Curve) [Proposed]
R1	_	_	-	-
R2	0.128 (IEC NI)	0.1283 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC EI)
R3	-	-	-	-
R4	0.256 (IEC NI)	0.2591 (IEC NI)	0.1787 (IEC NI)	0.2306 (IEEE MI)
R5	-	-	-	-
R6	0.391 (IEC NI)	0.4024 (IEC NI)	0.3223 (IEC NI)	0.7715 (IEC STI)
R7	0.335 (IEC NI)	0.2895 (IEC NI)	0.2060 (IEC NI)	0.0500 (IEEE I)
R8	-	-	-	-
R9	-	-	-	-
R10	0.1283 (IEC NI)	0.1283 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC EI)
R11	-	-	-	-
R12	0.1320 (IEC NI)	0.0101 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R13	-	-	-	-
R14	-	-	-	-
R15	-	-	-	-
T(s)	7.53	6.64	4.99	4.19

 Table 4. Coordination parameters for OM1.

Table 5. C	peration	times	for	OM1.
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Fault	Relays	[15]	[ <mark>16</mark> ]	[17]	[Proposed]
F1	RP1	-	-	-	-
	RP2	0.29	0.303	0.1165	0.0118
	RB4	0.59	0.606	0.4165	0.3117
	RB13	-	-	-	-
F2	RP3	-	-	-	-
	RP4	0.58	0.54	0.3732	0.3063
	RB1	-	-	-	-
	RB6	0.86	0.84	0.6732	0.6247
	RB15	-	-	-	-
F3	RP5	-	-	-	-
	RP6	0.88	0.72	0.5819	0.6247
	RB7	1.18	1.02	0.8819	0.9372
	RB8	-	-	-	-
	RB15	-	-	-	-
F4	RP8	-	-	-	-
	RP12	0.29	0.2	0.1044	0.0405
	RB5	-	-	-	-
	RB7	1.59	1.37	0.9786	1.01
	RB11	-	-	-	-
F5	RP9	-	-	-	-
	RP10	0.29	0.28	0.1165	0.0118
	RB6	0.91	0.88	0.7514	0.3118
	RB14	-	-	-	-
	RB15	-	-	-	-

# 4.2. Results for OM2

In OM2, the load can be supplied by both the DG units and the main grid. Table 6 presents the parameters obtained for the OCRs coordination. The *TMS* and *StandarCurve*<sub>i</sub> are presented for each relay as well as the sum of the operating times for all relays, denoted as T(s). Note that the proposed

approach considers different characteristic curves for the relays and the total operation time T(s) is lower than the one reported in [15–17] (these last ones only consider the IEC NI curve). Table 7 shows the operating times of the main and backup relays for each fault. In all cases, the proposed model presented lower operating times than those that were reported in [15,16]. When comparing with [17] the proposed model shows lower operation time for three of the five faults under consideration (F1, F2, and F5). Nevertheless, for faults F3 and F4, the operation time of the proposed approach is higher. In this case, for F3 and F4, the proposed model presented better operating times for all main relays, except for RP6 and RP8, respectively.

Relay	<i>TMS<sub>i</sub></i> (Curve) [15]	<i>TMS<sub>i</sub></i> (Curve) [16]	<i>TMS<sub>i</sub></i> (Curve) [17]	TMS <sub>i</sub> (Curve) [Proposed]
R1	0.173 (IEC NI)	0.1736 (IEC NI)	0.1370 (IEC NI)	0.38928 (IEEE EI)
R2	0.132 (IEC NI)	0.1391 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R3	0.086 (IEC NI)	0.0868 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R4	0.265 (IEC NI)	0.2782 (IEC NI)	0.1891 (IEC NI)	0.4205 (IEC STI)
R5	0.172 (IEC NI)	0.1720 (IEC NI)	0.1148 (IEC NI)	0.3939 (IEEE EI)
R6	0.397 (IEC NI)	0.4010 (IEC NI)	0.3198 (IEC NI)	0.8186 (IEC STI)
R7	0.338 (IEC NI)	0.2839 (IEC NI)	0.2439 (IEC NI)	0.2725 (IEC SI)
R8	0.265 (IEC NI)	0.2226 (IEC NI)	0.1911 (IEC NI)	0.6055 (IEEE EI)
R9	0.069 (IEC NI)	0.0695 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEEE SI)
R10	0.132 (IEC NI)	0.1413 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R11	0.280 (IEC NI)	0.2437 (IEC NI)	0.2175 (IEC NI)	0.4523 (IEC STI)
R12	0.132 (IEC NI)	0.1503 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R13	0.194 (IEC NI)	0.1936 (IEC NI)	0.1669 (IEC NI)	0.7462 (IEC STI)
R14	0.116 (IEC NI)	0.1159 (IEC NI)	0.0998 (IEC NI)	0.1715 (IEEE EI)
R15	0.186 (IEC NI)	0.1704 (IEC NI)	0.1359 (IEC NI)	0.2968 (IEEE MI)
T(s)	19.18	17.48	13.66	12.48

Table 6. Coordination parameters for OM2.

Table 7. Operation times for OM2.

Fault	Relays	[15]	[ <mark>16</mark> ]	[17]	[Proposed]
F1	RP1	0.56	0.55	0.4454	0.2858
	RP2	0.29	0.299	0.1078	0.0405
	RB4	0.59	0.59	0.4078	0.3405
	RB13	0.86	0.86	0.7454	0.5858
F2	RP3	0.29	0.29	0.1723	0.0302
	RP4	0.6	0.52	0.3556	0.3405
	RB1	0.59	0.58	0.4723	0.3301
	RB6	0.9	0.82	0.6556	0.6629
	RB15	0.89	0.82	0.6556	0.6406
F3	RP5	0.45	0.45	0.3039	0.186
	RP6	0.9	0.7	0.5618	0.6629
	RB7	1.19	1.0	0.8618	0.9628
	RB8	1.0	1.0	0.8618	0.9629
	RB15	0.97	0.97	0.7775	0.7386
F4	RP8	1.0	0.94	0.8229	0.8467
	RP12	0.29	0.29	0.0995	0.0405
	RB5	0.6	0.59	0.3995	0.3405
	RB7	1.74	1.44	1.25	1.4
	RB11	1.23	1.23	1.12	1.14
F5	RP9	0.29	0.25	0.2152	0.1792
	RP10	0.29	0.29	0.1059	0.0405
	RB6	0.95	0.95	0.7668	0.3405
	RB14	0.59	0.57	0.5152	0.4792
	RB15	1.22	1.22	0.9755	0.8976

#### 4.3. Results for OM3

In this operational mode, the microgrid is connected to the main supply network working together with DG1 and DG2, while DG3 and DG4 are disconnected. The OCR coordination parameters obtained with the GA are presented in Table 8. The *TMS* and *StandarCurve<sub>i</sub>* are presented for each relay as well as the sum of the operating times for all relays, denoted as T(s). Note that different characteristic curves were adopted by the relays with the proposed approach and the operation time T(s) is lower than the one reported in [15–17], which considered a single characteristic curve *StandarCurve<sub>i</sub>*. Table 9 shows the operating times of the main and backup relays for each fault. In all cases, the proposed model presented lower operating times than the ones reported in [15]. When comparing with [16] and [17], the proposed approach was able to find better coordination times in four out of the five faults (only in F3 the coordination times were higher).

Relay	<i>TMS<sub>i</sub></i> (Curve) [15]	<i>TMS<sub>i</sub></i> (Curve) [16]	<i>TMS</i> <sub><i>i</i></sub> (Curve) [17]	TMS <sub>i</sub> (Curve) [Proposed]
R1	-	-	-	-
R2	0.092 (IEC NI)	0.092 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R3	-	-	-	-
R4	0.227 (IEC NI)	0.227 (IEC NI)	0.1855 (IEC NI)	0.4205(IEC STI)
R5	0.087 (IEC NI)	0.090 (IEC NI)	0.0608 (IEC NI)	0.0553 (IEEE EI)
R6	0.356 (IEC NI)	0.362 (IEC NI)	0.3232 (IEC NI)	0.8408 (IEC STI)
R7	0.312 (IEC NI)	0.264 (IEC NI)	0.2027 (IEC NI)	0.6669 (IEEE MI)
R8	0.207 (IEC NI)	0.207 (IEC NI)	0.1925 (IEC NI)	0.6184 (IEEE EI)
R9	-	-	-	-
R10	0.0847 (IEC NI)	0.084 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R11	0.2626 (IEC NI)	0.231 (IEC NI)	0.2186 (IEC NI)	0.463 (IEC STI)
R12	0.1320 (IEC NI)	0.145 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R13	-	-	-	-
R14	-	-	-	-
R15	0.1670 (IEC NI)	0.154 (IEC NI)	0.1373 (IEC NI)	0.2968 (IEEE MI)
T(s)	14.04	12.67	10.71	10.49

Fault	Relays	[15]	[ <b>16</b> ]	[17]	[Proposed]
F1	RP1	-	-	-	-
	RP2	0.200	0.200	0.1107	0.0405
	RB4	0.508	0.502	0.4107	0.3405
	RB13	-	-	-	-
F2	RP3	-	-	-	-
	RP4	0.508	0.44	0.3625	0.3405
	RB1	-	-	-	-
	RB6	0.807	0.74	0.6625	0.6809
	RB15	0.800	0.73	0.6625	0.6406
F3	RP5	0.42	0.42	0.2878	0.2109
	RP6	0.80	0.63	0.5677	0.6809
	RB7	1.10	0.93	0.8677	0.9808
	RB8	1.10	0.93	0.8677	0.9808
	RB15	0.84	0.78	0.6958	0.6670
F4	RP8	1.05	0.89	0.8286	0.8621
	RP12	0.29	0.298	0.1025	0.0450
	RB5	0.67	0.64	0.4025	0.3406
	RB7	1.52	1.28	0.9899	0.1.3117
	RB11	1.35	1.19	1.1286	1.1622
F5	RP9	-	-	-	-
	RP10	0.19	0.19	0.1107	0.0405
	RB6	0.83	0.84	0.7551	0.3405
	RB14	-	-	-	-
	RB15	1.10	0.99	0.9030	0.8317

Table 9. Operation times for OM3.

#### 4.4. Results for OM4

In this case, the microgrid operates in islanded mode and the load is supplied by the DG units. Table 10 presents the results of the OCRs coordination obtained with the GA. As with the previous operational modes, the proposed approach presents better operating time T(s) when compared with the results that were reported in [15–17]. Table 11 shows the operating times of main and backup relays for each fault. Note that, in all cases, the proposed model presents lower operation times than those that were reported in [15–17].

Relay	<i>TMS<sub>i</sub></i> (Curve) [15]	<i>TMS<sub>i</sub></i> (Curve) [16]	<i>TMS</i> <sub><i>i</i></sub> (Curve) [17]	<i>TMS<sub>i</sub></i> (Curve) [Proposed]
R1	0.173 (IEC NI)	0.1730 (IEC NI)	0.1370 (IEC NI)	0.3892 (IEEE EI)
R2	0.105 (IEC NI)	0.1050 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R3	0.086 (IEC NI)	0.0860 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R4	0.211 (IEC NI)	0.2110 (IEC NI)	0.1571 (IEC NI)	0.5289 (IEC EI)
R5	0.209 (IEC NI)	0.2090 (IEC NI)	0.1552 (IEC NI)	0.8621 (IEEE EI)
R6	0.181 (IEC NI)	0.1812 (IEC NI)	0.1510 (IEC NI)	0.2426 (IEEE MI)
R7	-	-	-	-
R8	0.247 (IEC NI)	0.2476 (IEC NI)	0.2176 (IEC NI)	0,4999 (IEEE EI)
R9	0.069 (IEC NI)	0.0695 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R10	0.112 (IEC NI)	0.1124 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R11	0.264 (IEC NI)	0.2645 (IEC NI)	0.2395 (IEC NI)	0.4311 (IEEE EI)
R12	0.104 (IEC NI)	0.1050 (IEC NI)	0.0500 (IEC NI)	0.0500 (IEC STI)
R13	0.193 (IEC NI)	0.1930 (IEC NI)	0.1669 (IEC NI)	0.1011 (IEC STI)
R14	0.115 (IEC NI)	0.1159 (IEC NI)	0.0998 (IEC NI)	0.1037 (IEEE EI)
R15	0.177 (IEC NI)	0.1771 (IEC NI)	0.1476 (IEC NI)	0.6299 (IEC STI)
T(s)	15.56	15.56	12.63	8.96

Table 10. Coordination parameters for OM4.

Table 11. Operation times for OM4.

Fault	Relays	[15]	[ <mark>16</mark> ]	[17]	[Proposed]
F1	RP1	0.56	0.56	0.4454	0.2858
	RP2	0.29	0.29	0.1400	0.0244
	RB4	0.59	0.59	0.4400	0.3244
	RB13	0.86	0.86	0.7454	0.5858
F2	RP3	0.29	0.29	0.1723	0.0302
	RP4	0.55	0.55	0.4121	0.2347
	RB1	0.59	0.59	0.4723	0.3301
	RB6	0.85	0.85	0.7121	0.5347
	RB15	0.85	0.85	0.7121	0.5347
F3	RP5	0.55	0.55	0.4106	0.2626
	RP6	0.81	0.81	0.6809	0.5163
	RB7	-	-	-	-
	RB8	1.10	1.10	0.9809	0.8162
	RB15	1.01	1.01	0.8447	0.6357
F4	RP8	1.06	1.06	0.9367	0.7203
	RP12	0.29	0.29	0.1426	0.0248
	RB5	0.59	0.59	0.4426	0.3249
	RB7	-	-	-	-
	RB11	1.37	1.37	1.2367	1.0204
F5	RP9	0.29	0.29	0.2152	0.0378
	RP10	0.29	0.29	0.1330	0.0231
	RB6	1.00	1.00	0.8707	0.6284
	RB14	0.59	0.59	0.5152	0.3379
	RB15	1.00	1.00	0.9706	0.7316

## 4.5. Results Considering All Operational Modes Simultaneously

So far, a different set of coordination parameters for the OCRs has been obtained for each OM in the previous sections. However, the proposed approach can also be used to obtain a single set of coordination parameters that are suitable for all OMs. Table 12 shows the set of coordination parameters, obtained with the proposed GA, which is suitable for all OMs. The results that were obtained with the proposed approach were compared with those reported in [17]. The *TMS* and *StandarCurve*<sub>i</sub> are presented for each relay as well as the sum of the operating times for all relays T(s) for all OMs which represents the OF of the problem. Note that the proposed model was able to reach better operating times, ensuring coordination between main and backup OCRs. In this case, the relays presented different types of characteristic curves *StandarCurve*<sub>i</sub>, Table 13 presents the operation times of the main and backup relays for each fault. In this case, the coordination between main and back up relays is also guaranteed.

Table 12. Coordination parameters considering all OMs simultaneously.

Relay	$TMS_i$ (Curve) [17]	TMS <sub>i</sub> (Curve) [Proposed]
R1	0.1371 (IEC NI)	0.3892 (IEEE EI)
R2	0.0500 (IEC NI)	0.05 (IEEE MI)
R3	0.0500 (IEC NI)	0.05 (IEC STI)
R4	0.1892 (IEC NI)	0.4097 (IEEE MI)
R5	0.1552 (IEC NI)	2.4918 (IEEE SI)
R6	0.3007 (IEC NI)	0.9756 (IEC STI)
R7	0.2816 (IEC NI)	0.7509 (IEEE MI)
R8	0.3673 (IEC NI)	0.697 (IEEE EI)
R9	0.0500 (IEC NI)	0.05 (IEEE SI)
R10	0.0500 (IEC NI)	0.05 (IEC STI)
R11	0.3644 (IEC NI)	0.5443 (IEEE EI)
R12	0.0500 (IEC NI)	0.05 (IEC STI)
R13	0.1669 (IEC NI)	0.3443 (IEEE EI)
R14	0.0998 (IEC NI)	0.5269 (IEC STI)
R15	0.2042 (IEC NI)	0.5072 (IEEE MI)
T(s)	57.25	48.61

Table 13. Operation times for all operational modes (OMs) with a single set of parameters.

Fault	Relays	OM1	OM2	OM3	OM4
F1	RP1	-	0.2858	-	0.2858
	RP2	0.1569	0.1557	0.1557	0.1655
	RB4	0.4653	0.4557	0.4557	0.5360
	RB13	-	0.5858	-	0.5858
F2	RP3	-	0.0302	-	0.0302
	RP4	0.4557	0.4557	0.4557	0.5093
	RB1	-	0.3301	-	0.3301
	RB6	0.7900	0.79	0.79	0.8093
	RB15	-	0.1.0138	1.0138	1.0138
F3	RP5	-	0.2911	0.7589	0.2911
	RP6	0.79	0.79	0.7900	0.7733
	RB7	1.09	1.09	1.09	-
	RB8	-	1.09	1.09	1.0900
	RB15	-	1.1813	1.0590	1.1813
F4	RP8	-	0.9563	0.9563	0.9563
	RP12	0.0405	0.0405	0.0405	0.0248
	RB5	-	0.5397	1.3179	0.3249
	RB7	1.4257	1.5403	1.4626	-
	RB11	-	1.2563	1.2563	1.2563
F5	RP9	-	0.1792	-	0.1792
	RP10	0.0202	0.0405	0.0405	0.0231
	RB6	0.3942	0.4058	0.3951	0.9921
	RB14	-	0.4792	-	0.4792
	RB15	-	1.4531	1.3405	1.3405

Table 14 presents a comparison of operation times for different OMs using multiple and a single set of coordination parameters. In this case, operation times reported in columns 2 through 5 consider an independent set of parameters for each OM. Note that, for all OMs, the proposed approach presents lower operation times (column 5). On the other hand, the operation times presented in columns 6 and 7 are computed when considering a single set of parameters suitable for all OMs. Such single set of parameters results in different operation times depending on the OM of the microgrid. As expected, obtaining a single set of coordination parameters suitable for all OMs results in higher operation times, as shown in column 7. It is worth mentioning that references [15,16] do not present a single set of coordination parameters suitable for all OMs a direct comparison. Despite this fact, it can be noted that the proposed approach outperforms the results of [15,16] in OM1, OM2 and OM4. Reference [17] presents a single set of coordination parameters suitable for all OMs (column 6). In this case, the proposed approach also obtains better results.

		Multip	Single Set of Parameters				
<b>Operational Modes</b>	T(s) [15]	T(s) [16]	T(s) [17]	T(s) [Proposed]	T(s) [17]	T(s) [Proposed]	
OM1	7.53	6.64	4.99	4.19	5.59	5.62	
OM2	19.18	17.48	13.66	12.58	17.88	15.34	
OM3	14.04	12.67	10.71	10.49	15.81	14.46	
OM4	15.56	15.56	12.63	8.96	17.97	13.17	

Table 14. Total operation time for each OM.

# 5. Conclusions

Microgrids are becoming increasingly common in modern distribution networks. Because they feature different operational modes and usually integrate DG, new approaches for protection coordination must be sought in order to guarantee network security. This paper presented an approach for the optimal coordination of over-current relays in microgrids that integrate DG. The main feature that differentiates the proposed approach from other methodologies reported in the specialized literature lies in the fact that it allows for choosing the characteristic curve used by the main and back up relays among multiple options, which results in a more flexible approach for protection coordination. Several tests were carried out with a benchmark IEC microgrid that integrates DG and features different operational modes (OMs). The results obtained with the proposed approach evidenced that considering different characteristic curves results in lower operational times of the protection coordination. In all operational modes, the proposed approach presented better operational times. In OM1, the total operating time that was obtained with the proposed approach was 4.19 s, while the best one reported so far in the specialized literature was 4.99 s, which represents a time improvement of 16%. For OM2, the total coordination time that was obtained with the proposed approach was 12.48 s against 13.66 s (the best solution reported so far), representing a time improvement of 8.6%; analogously, the coordination time reduction in OM3 was 2%. Finally, the highest total coordination time improvement was obtained for OM4 with a time reduction of 29.2% with respect to the best time reported in the specialized literature. Additionally, for almost every of the five faults under consideration, the proposed approach was able to find better operational times.

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