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This is an Accepted Manuscript of an article published by Elsevier in *Electric Power Systems Research*, Vol. 185, on August 2020, available at:
<https://doi.org/10.1016/j.epsr.2020.106398>
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Failure rates in distribution networks: estimation methodology and application

J. A. Clavijo-Blanco

*Escuela Superior de Ingeniería, Universidad de Cádiz, Avda. Universidad de Cádiz, 10,
Campus Universitario de Puerto Real, 11519, Cádiz*

J. A. Rosendo-Macías*

*Escuela Técnica Superior de Ingeniería, Universidad de Sevilla, Camino de los
Descubrimientos, s/n, 41092, Sevilla*

Abstract

Electric distribution companies have the responsibility of achieving the standards established by the respective regulating authorities in order to guarantee the highest quality of supply for their customers. To do so, they have to register all the electrical issues produced in the Distribution Network into a database. This paper uses this real database to make a statistical analysis of the failures that occur in distribution networks and identify the interruption causes, in order to estimate failure rates and improve the quality of electrical supply. These failure rates are used to calculate the failure probability of electrical feeders taking into account the different electrical components in them. The expected amount of failures of more than 350 feeders have been calculated and tested with the real database to prove the reliability of the method. This work also shows an application to evaluate the failure probability of alternative network configurations.

*Corresponding author.

Email address: rosendo@us.es (J. A. Rosendo-Macías)

22 Keywords:

23 Power system reliability, distribution networks, failure rates, electrical failure analysis,
24 breakdowns.

25 List of Abbreviations:

FLBS: Fuse load-break switches	OPI: Oil-paper insulation
IS: Isolation switches	SCED: Substation common electrical devices
LBS: Load break switch	TR: Transformers
M&PD: Maneuver and protection devices	TTI: Thermoplastic and thermosetting insulated cable
OL: Overhead lines	UC: Underground cables

26

27 **I. Introduction**

28 Due to the liberalization of the electrical sector and the establishment of new
29 regulation systems, distribution network operators have to cope with more liabilities. A
30 large proportion of these systems, have the intention to ensure a reasonable network
31 operation and, at the same time, provide the electrical supply sustainability with the
32 highest quality as far as possible [1] .

33 It is broadly known that the electrical supply is not always available to provide
34 the demand due to technical and economic issues. In fact, the main feature of a power
35 system is to supply the required energy efficiently with acceptable levels of quality and
36 sustainability. The quality supply embraces three important aspects: customer service,
37 electric wave quality and sustainability of supply. The last one is related with the
38 number of power cuts, which affect the service reliability or the ability of the power
39 system to provide a suited and secure electrical supply in any network point at any time,
40 [2]. To quantify these concepts, some international quality indexes are widely used, e.g.
41 in [3], such as ENS, AIT, SAIFI, SAIDI, ASAI, and those in [4] - [5] . Other indexes
42 such as TIEPI and NIEPI [6] are also used in countries as Spain. These indexes allow to

43 evaluate the evolution of the continuity of supply and implement proper corrective
44 action plans for the electrical network. Moreover, if these indexes trespass the permitted
45 thresholds, electric power distribution companies could be sanctioned with an economic
46 fine.

47 These indexes depend on the duration of the interruptions and their frequency,
48 which is largely studied in this paper. In order to estimate the number of interruptions in
49 a future period of time, it is necessary to know the expected failure rates of the different
50 components that could cause a power supply cut. Some references, like [7]-[8], estimate
51 the failure rate of an electrical component as:

$$52 \lambda = \frac{\#failures}{\#components * \#years} = \frac{1}{ETTF} \quad (1)$$

53

54 where ETTF is the expected time to failure.

55 Different authors have studied databases associated with continuity of supply [9]
56 and have shown the difficulty in having enough raw data to get reliable and meaningful
57 results, [7]. In general, failure rates of high voltage transmission lines seem to be based
58 on more representative data than in the case of medium voltage (MV) networks [10], in
59 which the reliability of their devices count only with a limited number of scientific
60 publications, [8].

61 Preventive maintenance is currently gaining more interest since it is considered
62 as an efficient alternative to improve the quality of supply. For example, references
63 [11]-[12]-[13] show, through real cases, that the study of utility databases are useful to
64 draw up periodic maintenance plans for the electric network or to estimate electrical
65 quality indices [14].

66 The paper presents an analysis of failure causes and a methodology to calculate
67 failure rates of the main equipment in a distribution network using the electrical utility
68 real databases. The so obtained failure rates improve failure predictions, not only
69 because of failure rates of aggregate components are obtained with smaller variation
70 ranges than in the generic bibliography [15], but also, because of a greater typology of
71 components can be considered. Since accuracy on the estimation on quality indices can
72 affect the compensation package for the electric utilities, as in Spain, real cases of
73 aggregate prediction have been tested in the paper, with successful result.

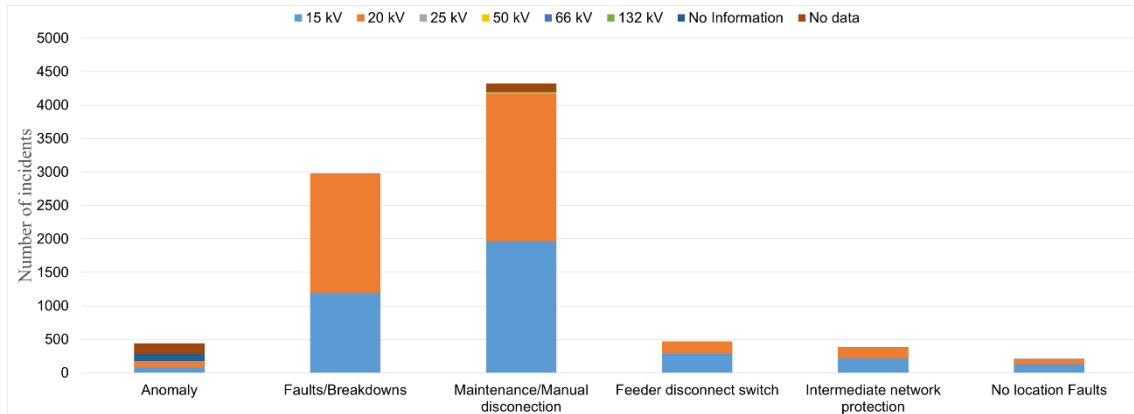
74 **II. Description of databases**

75 Two databases have been necessary for this paper, an incident database and a
76 network database. Both of them were analyzed during a collaboration scholarship
77 between the University of Seville and a major Spanish distribution company.

78 Spanish utilities are required by law to collect information about incidents
79 produced in their electrical network, which is saved in databases.

80 This paper makes use of unscheduled incidents occurred in the levels of 20 kV
81 and 15 kV in the city of Seville with duration greater than three minutes between years
82 2001 and 2013. These incidents were registered at two different centers: the Customer
83 Center and the Network Control Center, either from the SCADA system or manually
84 introduced.

85 Figure 1 shows the different incident types and the number of incidents
86 registered for each voltage level, in kV.



87

88 Figure 1: Record of incidents according to their nature

89 In this figure, the most frequent kinds of incidents are those caused by faults and
 90 maneuvers for supply restoration, which together make 83% of the total. However, all
 91 of them are explained by the fault incidents, since all the restoration maneuvers are
 92 originated by their corresponding faults.

93 Nevertheless, not only it is important to know the number of power outages, but
 94 it is also necessary to identify and characterize the faulty elements using the distribution
 95 network length, the numbers of MV/LV substations and transformers, and the amount
 96 of control and protection devices. These data are obtained from the network database
 97 available in 2013.

98 From the later database, the state of the MV electric network in 2013 was easily
 99 obtained; but the network status in the previous years was quite uncertain due to the
 100 growth and evolution in time of the network from 2001 to 2013. Although the database
 101 was upgraded while the network was growing, some data of this process had to be
 102 purged for the sake of consistency: contrasting available cartographic data with the city
 103 urban growth, and checking project documents, layouts and installations by experienced
 104 utility technicians.

105 TABLE 1: Medium voltage installation evolution. 2001-2013.

	2001	2002	2003	2004	2005	2006	2007	2008	2009	2010	2011	2012	2013
Underground cables (km)	1029	1043	1067	1081	1127	1118	1124	1126	1131	1146	1203	1236	1248
Overhead lines (km)	450	445	447	444	442	433	428	424	420	416	409	408	404
Transformers	3697	3727	3819	3881	3973	4102	4258	4431	4632	4736	4850	4641	4662
Isolating switches	878	867	872	865	861	843	832	826	818	809	796	795	783
Load-break switches	5607	5640	5785	5882	6023	6220	6467	6721	7006	7158	7327	7064	7098
Fuse load-break switches	2519	2533	2599	2642	2706	2795	2907	3020	3147	3214	3290	3176	3191

106

107 Table I shows the evolution in the amount of the most representative network
 108 components over the studied period of time. These data reveal a growing trend of all the
 109 components except for overhead lines and their associated switches, which are
 110 decreasing due to the gradual substitution by underground cables.

111 III. Analysis and data pooling

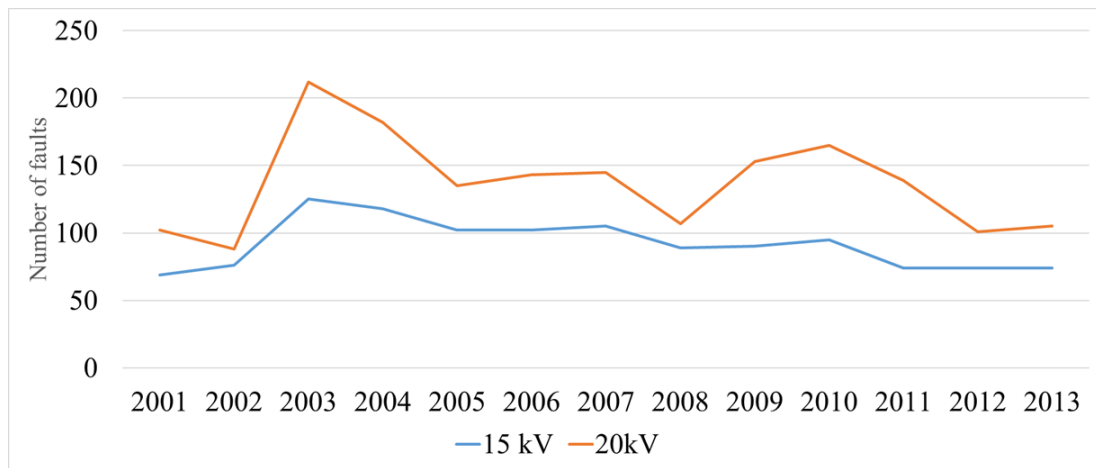
112 To be able to attribute a failure rate to a network sample or element cluster, this
 113 sample has to be representative in its population, which affects the way the electrical
 114 components can be grouped. This population is considered as the broader group where
 115 the statistical analysis results intend to be generalized. A representative sample should
 116 be an unbiased representation of what the population is like. For example, there is no
 117 sense in trying to assign annual failure rates to those components which are so specific
 118 in the whole network that did not have any failure during the study period, which could
 119 be considered as a case of data deficiency [16]. The common solution to data deficiency
 120 is data pooling, including these components as part of larger groups with more
 121 representative information.

122 In order to achieve proper representative samples while coping with population
 123 variability [16], it is required to know the relationships between the different

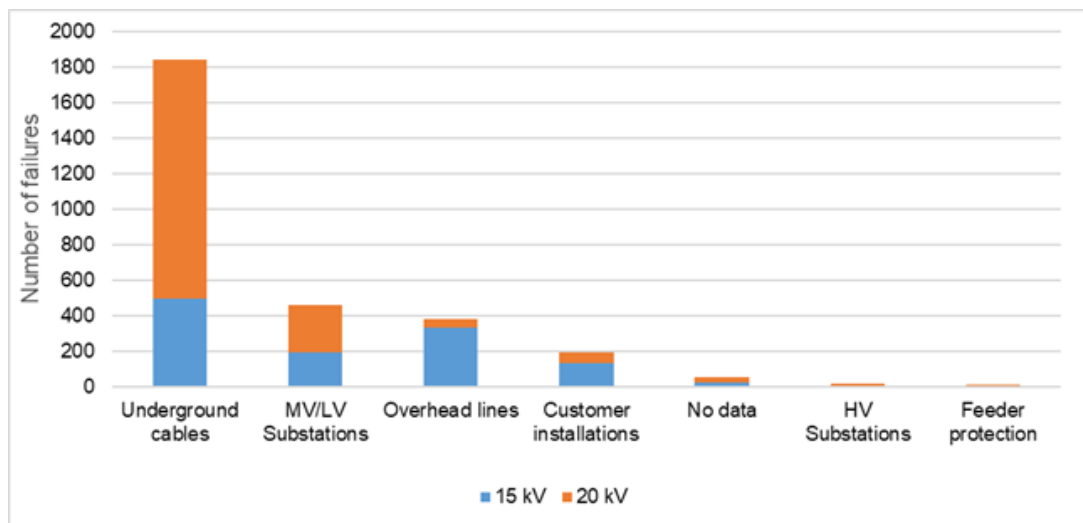
124 components to be clustered. For this purpose, this paper considers the functionality and
125 the voltage level.

126 From 2001 to 2013, a total of 2972 failures were registered in 15 and 20 kV.

127 Figure 2 shows the evolution of the number of annual failures in the network for each of
128 the two voltage levels and makes clear that more detailed clustering can be made. The
129 proposed groups are underground cables, overhead lines, MV/LV substations, customer
130 installations, feeder protection and MV substations. Figure 3 shows the same number of
131 failures but classified according to these groups for each voltage.



132
133 Figure 2: Number of faults produced in the network. 2001-2013.



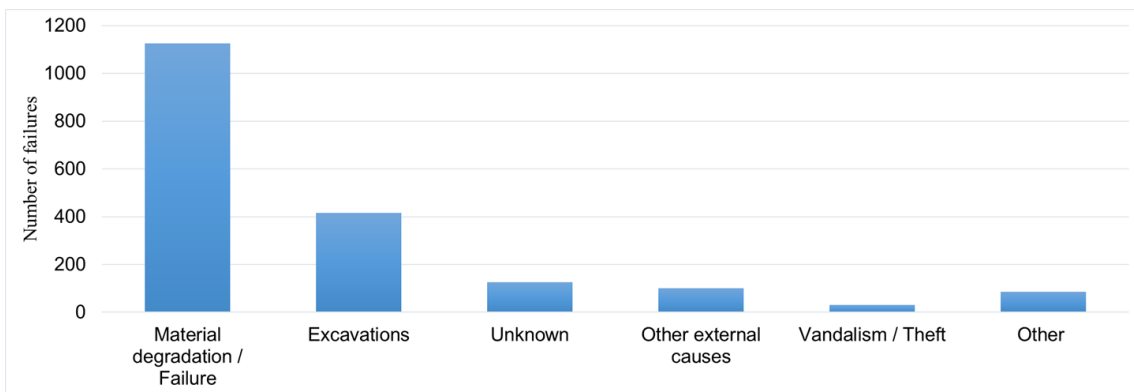
134
135 Figure 3: Number of failures according to electric MV network database groups.

136 From figure 3, it is clear that underground cables have most of the failures,
137 63.32% of the total. In this group, 26.87% of them are registered in 15 kV and 73.13%,
138 in 20 kV.

139 This study focusses on the three main groups (underground cables, MV/LV
140 substations and overhead lines) which already cover 90.54% of the failures and are
141 directly related to the electric network, not to the customer installation.

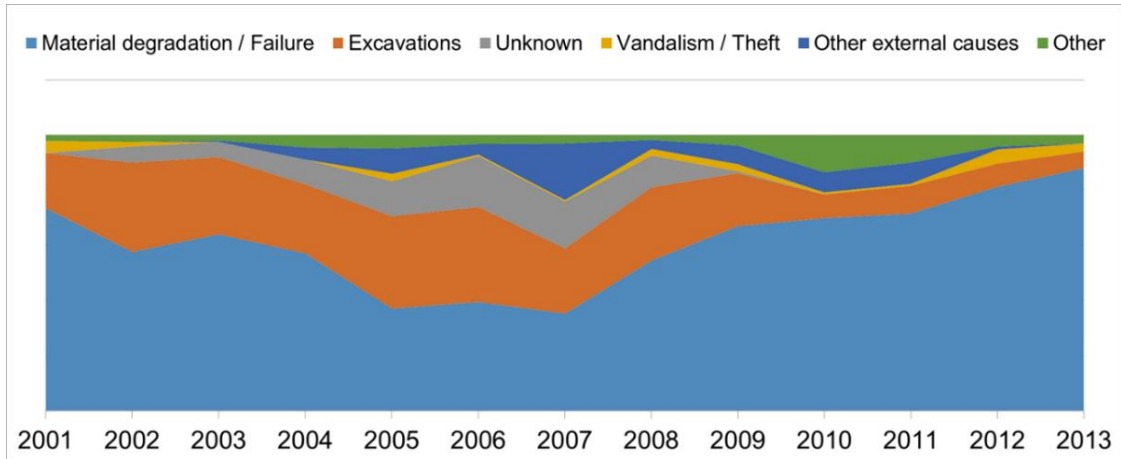
142 Underground cables

143 Failures in underground cables include failures along the cable and joints, and
144 are mainly caused by degradation of the isolation layer and excavation activities. Other
145 failure causes are related with animals, vandalism, maneuver failure, MV customers,
146 lack of maintenance, overvoltage, humidity, fire, rain and overloads. Figure 4 classifies
147 the failures in underground cables according to their causes, where material degradation
148 stands out with 59.78% of all the failures in this group. This percentage is even larger if
149 it is added the second more common cause, those failures made by construction work.



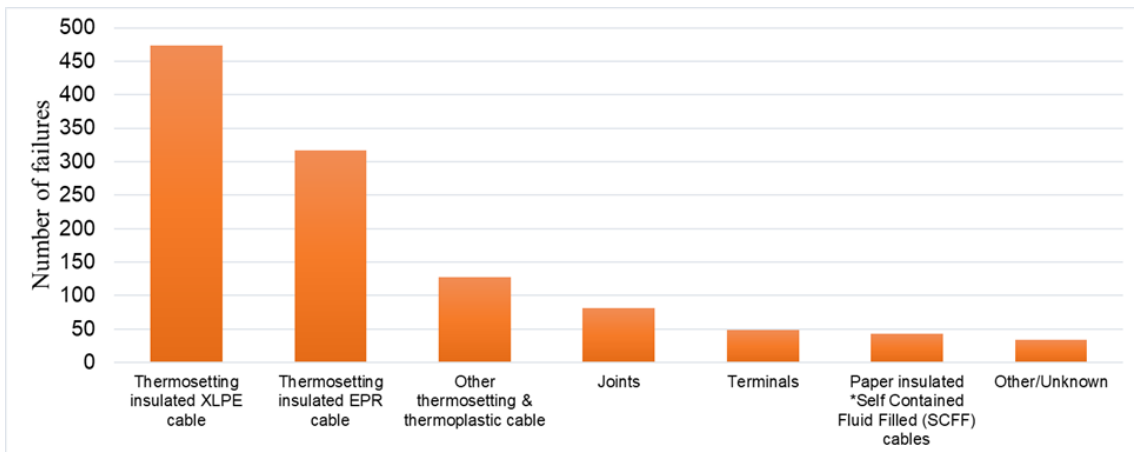
150
151 Figure 4: Underground cables failure groups. 2001 – 2013.

152 Figure 5 shows the evolution of such causes through the studied period showing
 153 that failures caused by excavators became of great relevance in the years before the
 154 2008 economic crisis, which were years of increased construction activity.



155
 156 Figure 5: Evolution of the failure causes in underground cables.

157 Figure 6 shows an analysis of the components of such material degradation.
 158 From this figure, it is clear that the cross-linked polyethylene cable (XLPE) is the
 159 component with more incidents caused by material degradation, 42%, which grows up
 160 to 85% if all the types of cables are grouped.

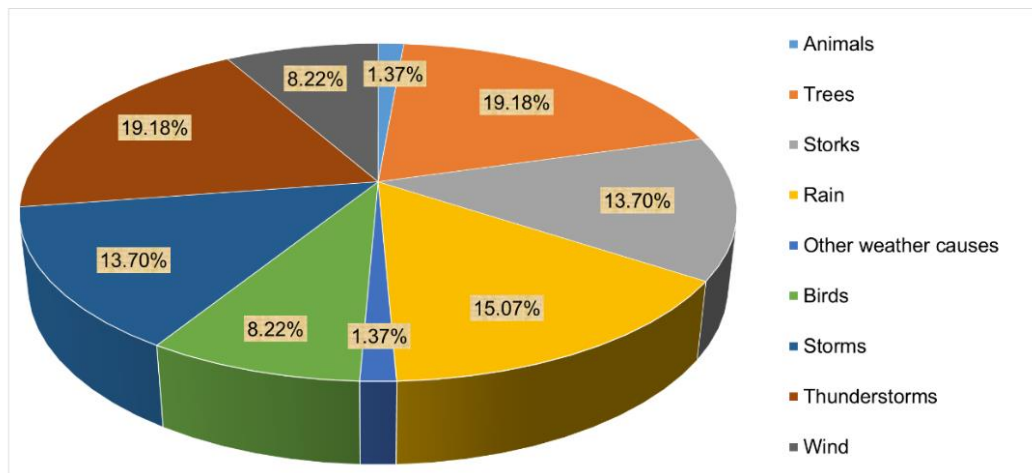


161
 162 Figure 6: Underground cable components affected by material degradation.

163 Overhead lines

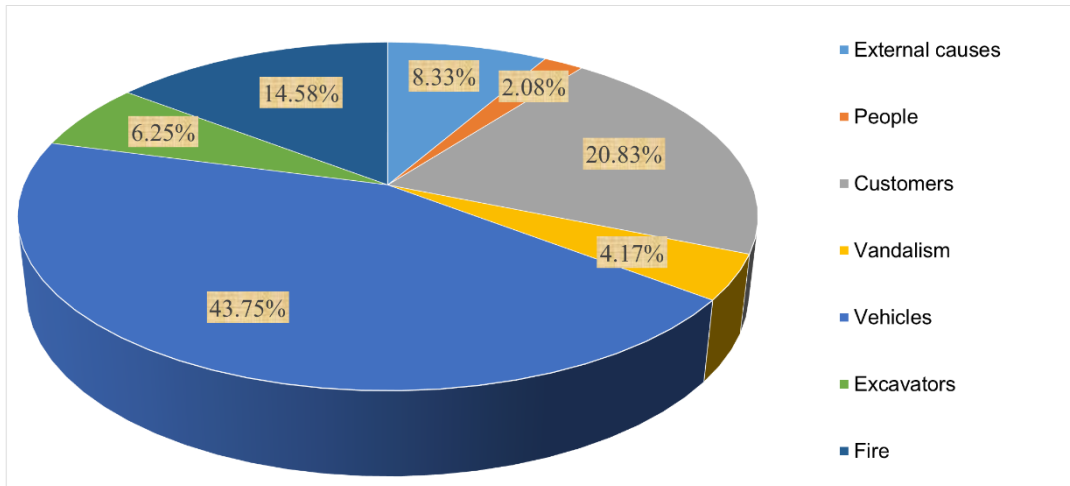
164 As seen in figure 3, the number of failures produced in overhead lines is 375, i.e.
 165 12.95% of the total. This group of failures contains failures in aerial conductors,
 166 insulators, towers, supports, connectors, lighting rods, jumpers, fuses and cable
 167 terminations. These failures can be caused by the action of nature, Fig. 7 , human
 168 beings, Fig. 8 , or material degradation, Fig. 9.

169 In these components, 20 kV overhead-lines have to be grouped together with 15
 170 kV lines, since the former ones do not show enough representativeness. Figure 7 shows
 171 the failure causes classified as the action of nature, where it can be seen that the weather
 172 conditions are the most common cause, with the 57.53% of the total, followed by
 173 animals, especially storks and other birds, with the 23.29% and finally tree branches,
 174 with the 19.18%.



175
 176 Figure 7. Failures caused by the action of nature in overhead lines. 2001-2013.

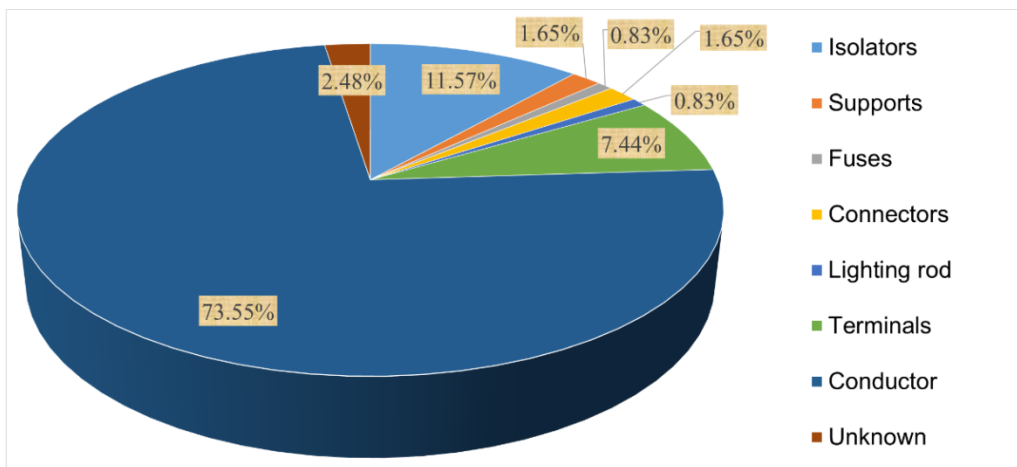
177 Figure 8 shows the failure causes classified as human actions, half of them are
 178 due to vehicles and excavators, either touching conductors or crashing into towers.



179

180 Figure 8: Failures caused by human action in overhead lines. 2001-2013.

181 Failure causes classified as material degradation are illustrated in Figure 9,
 182 showing that conductors are the most affected components, with 73% of all the causes
 183 in this group.



184

185 Figure 9. Failures caused by material degradation in overhead lines. 2001-2013.

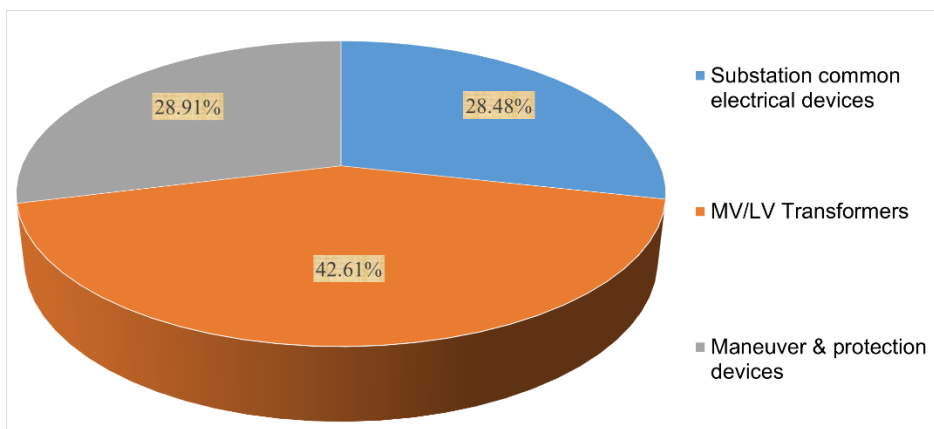
186 MV/LV substations

187 In MV/LV substations, failures can be caused by the action of the weather, flood,
 188 fire, thieving, overload, animals, lack of maintenance or material degradation, being the
 189 latter the most common cause of failure (54.06 %). Three groups of components in
 190 MV/LV substations have been considered with enough representativeness:

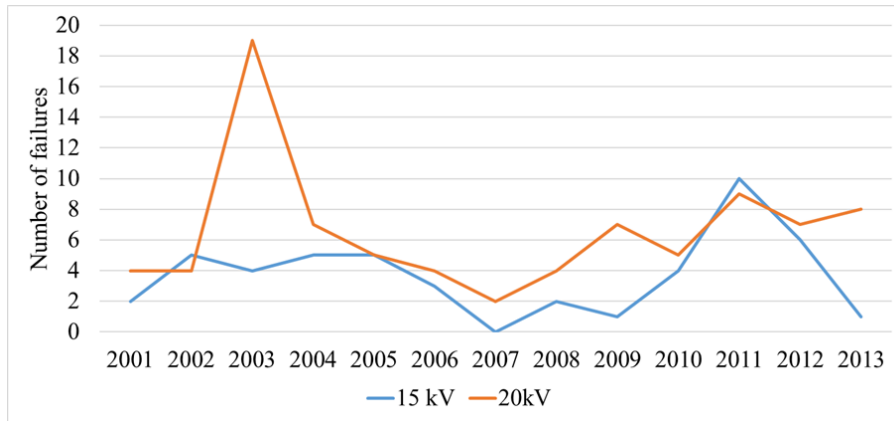
- 191 — Substation common electrical devices (SCED): this group contains failures
- 192 produced in all electrical devices in a MV/LV substation except those in
- 193 transformers, as isolators, busbars, jumper cables, grounding elements, lightning
- 194 rods, instrument transformers and connectors.
- 195 — MV/LV Transformers (TR): this group contains failures produced in
- 196 transformers, which can be pole mounted, pad mounted or any distribution
- 197 transformers connected to a feeder.
- 198 — Maneuver and protection devices (M&P): this group contains failures produced
- 199 in isolating switches (IS), load-break switch (LBS) and fuse load-break switches
- 200 (FLBS)

201 Figure 10 shows a comparison between the failures in these groups, where failures
 202 in MV/LV transformers is the main group, accounting for 42.61% of the total.

203 Figures 11, 12 and 13 show the evolution of failures produced by these three
 204 groups, distinguishing between two voltage levels, 15 kV and 20 kV. Figure 11 shows
 205 common electrical device failures, figure 12 shows MV/LV transformer failures and
 206 figure 13 the failures of maneuver and protection devices.

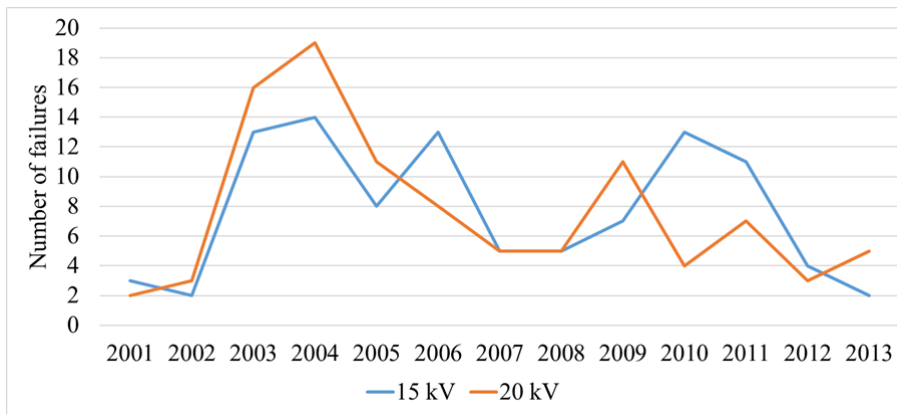


207
 208 Figure 10: Grouping of MV/LV substation failures. 2001 – 2013.



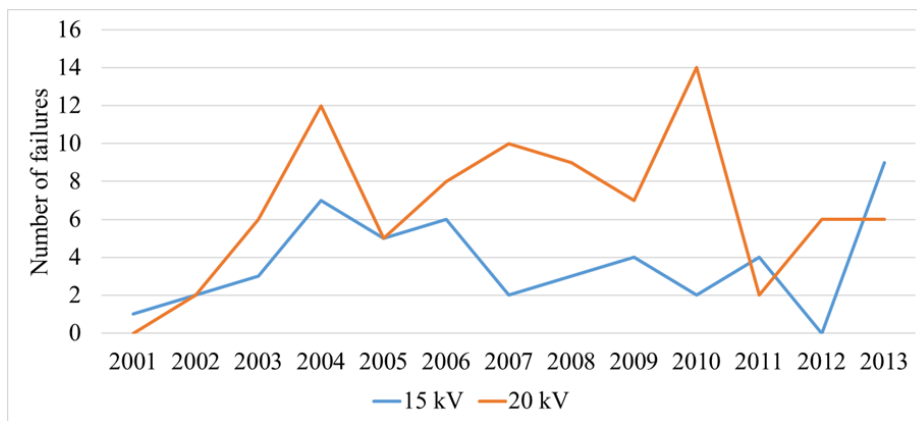
209

210 Figure 11: MV/LV substation failures due to common electrical devices. 2001-2013.



211

212 Figure 12: MV/LV transformer failures in MV/LV substations. 2001-2013.

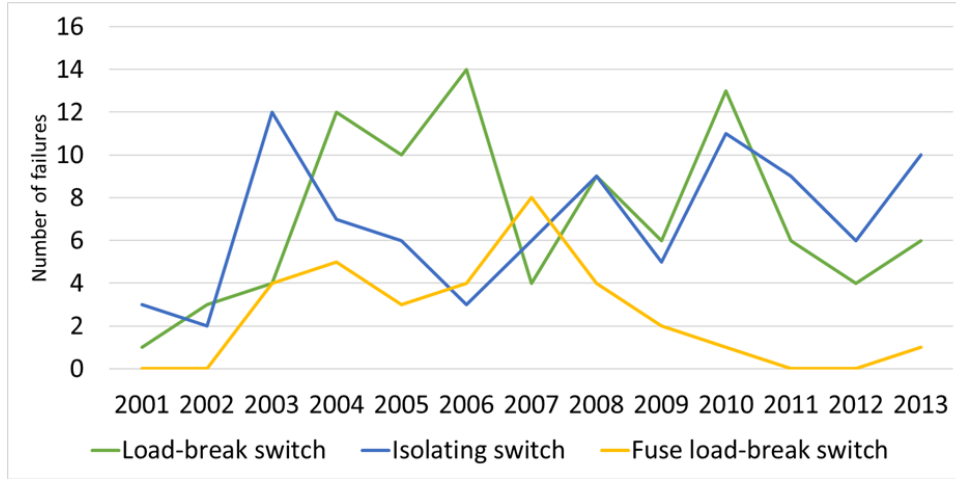


213

214 Figure 13: Maneuver and protection device failures in MV/LV substations. 2001-2013

215 Figure 14 makes a comparison of the number of failures of the different
 216 maneuver and protection devices in the MV network. It can be observed that the failures
 217 produced by isolating switches and load-breaker switches are the most common in the

218 studied period since they are the most used components in the operation of the
 219 distribution network.



220
 221 Figure 14: Comparison of maneuver and protection device failures in the MV network. 2001-
 222 2013

223 **IV. Failure rate calculation**

224 As stated above, representative element cluster i , either simple elements or
 225 element aggregations, have to be chosen in order to calculate their annual failure rates,
 226 λ_i , therefore, the following aggregations are proposed:

- 227 — Underground cables (UC)
 - 228 ○ Thermoplastic and thermosetting insulated cable (TTI) for 15 and for 20 kV
 - 229 ○ Oil-paper insulation (OPI) for 15 and for 20 kV
- 230 — Overhead lines (OL)
- 231 — MV/LV Substations (S)
 - 232 ○ MV/LV Transformers (TR) for 15 and for 20 kV
 - 233 ○ Substation Common electrical devices (SCED) for 15 and for 20 kV
- 234 — Maneuver and protection devices
 - 235 ○ Isolating switches (IS)
 - 236 ○ Load-break switches (LBS)
 - 237 ○ Fuse load-break switches (FLBS)

238 Data from 2001 to 2012 are used for failure rate calculation, while the data from
239 2013 are used for validation purpose. Depending on the kind of element or aggregation,
240 the generic expression for failure rates in (1) has to be adapted, that is, in the case of
241 lines or cables:

$$242 \lambda_i = \frac{\#faults \text{ in lines or cables}}{\text{total length (km)}} \quad (\text{failures/km}) \quad (2)$$

243 And in the case of electrical devices:

$$244 \lambda_i = \frac{\#faults \text{ in cluster } i}{\#elements \text{ in cluster } i} \quad (\text{failures/cluster}) \quad (3)$$

245 In the case of underground cables, failure rates for each voltage level are obtained
246 taking into account that only failures by material degradation are linked to the
247 respective voltage level.

248 Table II shows, for each element cluster i , the annual average value, $\bar{\lambda}_i$, the annual
249 maximum value, λ_{max} , and the annual minimum value, λ_{min} , of the failure rates of
250 period 2001-2012. Additionally, Table II includes relevant failure rates from [15] for
251 comparison purposes. But notice that the case of underground cables it not exactly
252 comparable with [15] since our failure rates do include failures in joints and connectors.
253 Also note that variation ranges in [15] are quite larger than those obtained from the
254 electrical utility databases.

255 An important issue is to know if annual failure rates are constant or show any trend in
256 the period studied. For this reason, a Laplace test has been applied according to [17] to
257 the elements in Table II. Results show that failure rates cannot be assumed as constant,
258 having, in some cases, a confidence for an upward or downward trend greater than 95%.
259 According with [15], a possible cause is the maintenance action planning, which can

260 vary the distribution of failures along the period of time. For this reason, authors have
 261 assumed the sample means in this table as appropriate estimators for predictions. Lower
 262 and upper bounds λ_L and λ_U for the 95% c.i. of $E(\lambda)$ are also included in this Table.

263 TABLE II. Analysis of annual failure rates

		Failure rates 2001-2012					Benchmarking [15]			
		λ_{min}	λ_L	$\bar{\lambda}$	λ_U	λ_{max}	λ_{min}	λ	λ_{max}	
Underground cables	15/20 kV	0.0777	0.1148	0.1335	0.1523	0.1902	0.0019	0.0435	0.3647	-/km
	TTI 15 kV	0.0235	0.0779	0.1026	0.1273	0.1670	-	-	-	-/km
	TTI 20 kV	0.0919	0.1254	0.1444	0.1635	0.1853	-	-	-	-/km
	OPI 15 kV	0.0469	0.0788	0.1218	0.1647	0.2823	-	-	-	-/km
	OPI 20 kV	0.0360	0.0800	0.1312	0.1824	0.2921	-	-	-	-/km
Overhead Lines	15/20 kV	0.0244	0.0419	0.0514	0.0609	0.0744	0.0124	0.0621	0.1864	-/km
Substation Common Electrical Devices	15/20 kV	0.0006	0.0020	0.0030	0.0040	0.0065	-	-	-	-/unit
	15 kV	0.0006	0.0017	0.0026	0.0034	0.0056	-	-	-	-/unit
	20 kV	0.0006	0.0021	0.0033	0.0045	0.0074	-	-	-	-/unit
Transformers	15/20 kV	0.0013	0.0023	0.0038	0.0053	0.0085	0.0010	0.0100	0.0500	-/unit
	15 kV	0.0011	0.0024	0.0038	0.0053	0.0079	-	-	-	-/unit
	20 kV	0.0013	0.0022	0.0038	0.0055	0.0100	-	-	-	-/unit
Load-Break Switches	15/20 kV	0.0002	0.0007	0.0011	0.0015	0.0023	0.0010	0.0030	0.0050	-/unit
	15 kV	0.0000	0.0005	0.0011	0.0016	0.0030	-	-	-	-/unit
	20 kV	0.0000	0.0006	0.0011	0.0017	0.0025	-	-	-	-/unit
Isolating Switches	15/20 kV	0.0023	0.0055	0.0079	0.0103	0.0138	0.0040	0.0140	0.1400	-/unit
	15 kV	0.0012	0.0054	0.0078	0.0103	0.0139	-	-	-	-/unit
	20 kV	0.0000	0.0000	0.0094	0.0200	0.0572	-	-	-	-/unit
Fuse Load-Break Switches	15/20 kV	0.0000	0.0003	0.0009	0.0015	0.0028	0.0010	0.0030	0.0050	-/unit
	15 kV	0.0000	0.0002	0.0006	0.0010	0.0021	-	-	-	-/unit
	20 kV	0.0000	0.0004	0.0011	0.0018	0.0032	-	-	-	-/unit

264
 265 Note that, failure rates of underground cables reported in [15] cover a wide range of
 266 values with an average slightly lower than that of overhead lines. However, those
 267 reported in this work, which include failures in cable elements such as joints, elbow
 268 connectors and cable terminations, result in considerably higher averages but in a
 269 narrower range.

270 According to this table, failure rate of TTI underground cables is very sensitive to the
 271 voltage, having the highest value for 20 kV and the lowest value for 15 kV. Among the
 272 failure rates of single units the isolating switches, commonly used in overhead lines,
 273 have the highest failure rates due to their exposure to atmospheric agents.

274 V. Validation of results

275 An important use of failure rates in Table II is to estimate the expected number
276 of failures in MV networks. This estimation can be made for each MV feeder and later
277 grouped to obtain the expected number of failures in the network fed by a single
278 distribution substation, or even the whole electric network of a region.

279 To validate the usability of these failure rates, the MV network in 2013 will be
280 used to compare the real number of failures with the estimated one using failure rates in
281 Table II.

282 The considered network is designed as weakly meshed, with typical urban rings,
283 but operated radially, with a circuit breaker at the head of each MV feeder. So, in each
284 feeder, the expected number of interruptions in a year can be estimated by

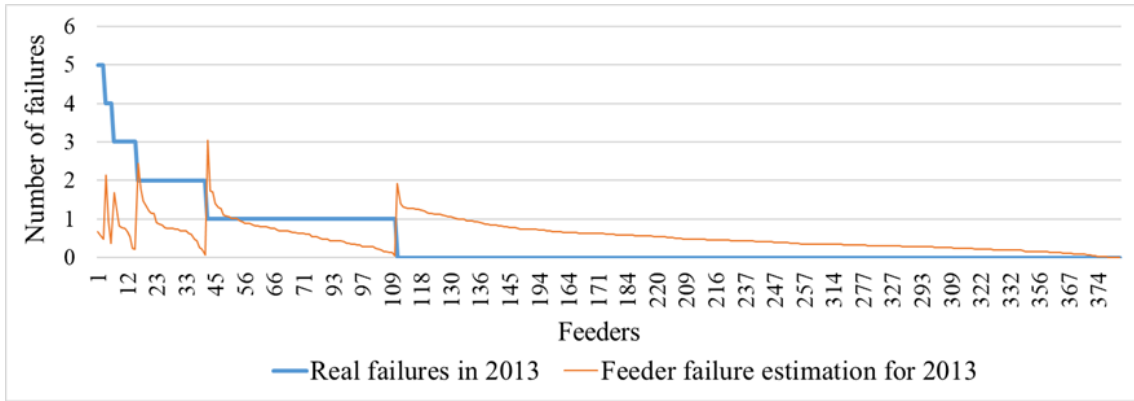
$$285 \quad NI = \sum_i \bar{\lambda}_{\text{LINE}_i} \cdot L_i + N_{TR} \cdot \bar{\lambda}_{TR} + N_S \cdot \bar{\lambda}_{\text{SCED}} + N_{IS} \cdot \bar{\lambda}_{IS} + N_{LBS} \cdot \bar{\lambda}_{LBS} + N_{FLBS} \cdot \bar{\lambda}_{FLBS} \quad (4)$$

286 Where:

- 287 — i is an index of the different line sections in the feeder
- 288 — L_i is the length of section i
- 289 — N_{TR} , N_S , N_{IS} , N_{LBS} and N_{FLBS} are the corresponding number of transformers
290 (TR), MV/LV substations (S), isolating switches (IS), load-break switches
291 (LBS) and fuse load-break switches (FLBS).

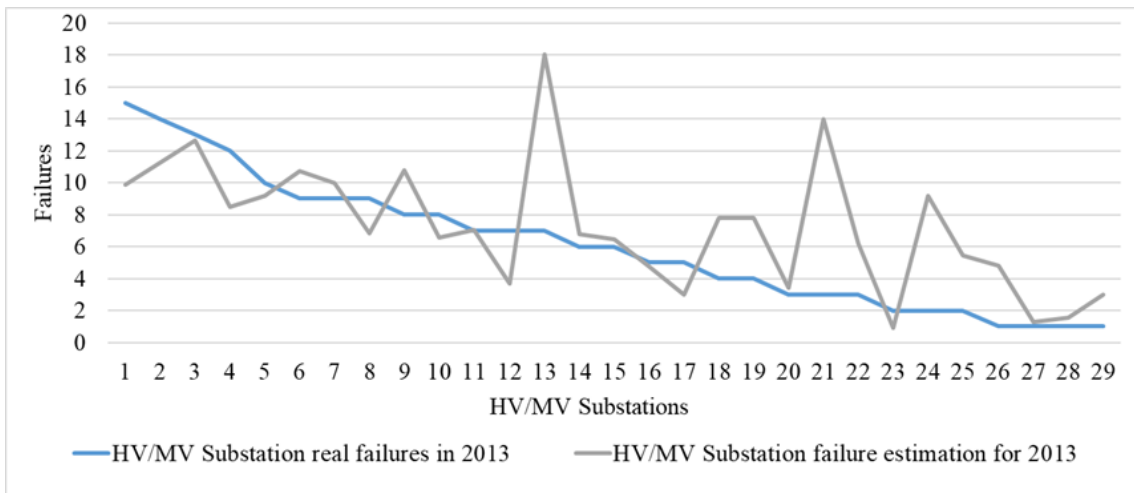
292 Using the average failure rates from 2001 to 2012, the expected number of failures
293 in 2013 has been estimated for a total of 383 feeders. Figure 15 shows these estimations
294 together with the real number of failures in each feeder in 2013, where feeder labels
295 have been chosen according, first, to the ranking of real data, and in case of a draw, to
296 the ranking of estimations.

297 As can be seen in such figure, there is a disagreement between estimated and
 298 real failures, which is even more clear in those feeders that have no real accidents in
 299 2013 but have an expected number of failures.



300
 301 Figure 15. Comparison between expected and real numbers of faults in each feeder in 2013.

302 However, if feeders are grouped by departing substation, a considerable
 303 improvement of the prediction is noticed. Feeders have been clustered in a total of 29
 304 substations, where the aggregated results are shown in figure 16.



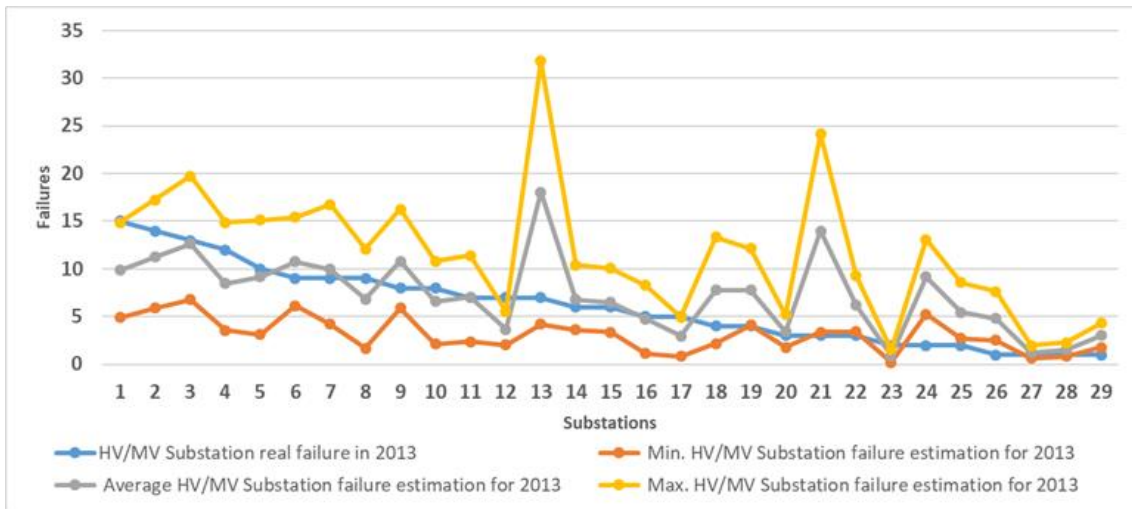
305
 306 Figure 16. Comparison between estimated and real failures grouped by substations.

307 Although there is still a small difference between estimated and real data, it can
 308 be seen that these predictions are closer to real data than feeder predictions showed

309 before. Moreover, if all estimated predictions are added, the number of total failures
 310 estimated in 2013 is 211 and the real one is 177, which shows good accuracy.

311 To achieve higher reliability in the estimations, beyond the average failure rates
 312 applied before, maximum and minimum failure rates, λ_i^{max} and λ_i^{min} , are obtained to
 313 estimate an interval where the number of real failures should be found. Using these
 314 failure rates our worst-case and best-case scenarios for 2013 are 339 and 91 failures
 315 respectively.

316 Figure 17 shows a comparison between real and estimated failures in 2013 based
 317 on $\bar{\lambda}_i$, λ_i^{max} and λ_i^{min} . It can be observed that in the majority of substations the real
 318 values are between the maximum and minimum estimated values.

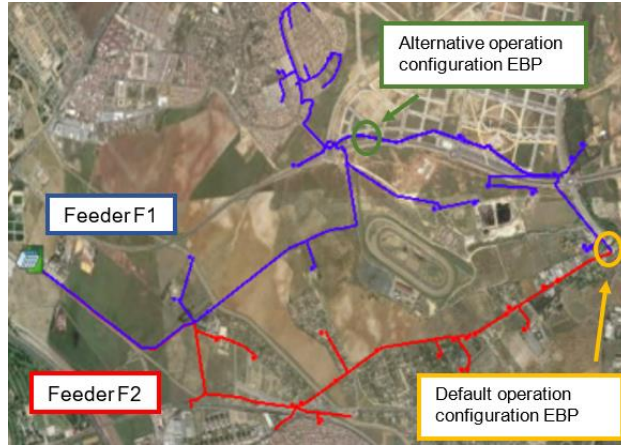


319
 320 Figure 17. Comparison of different estimated failure amounts in 2013

321 **VI. Application case**

322 As a practical application, the failure rates obtained above are used in a case with two
 323 feeders, F1 and F2, fed by a substation in a ring arrangement. Both feeders are radially
 324 operated and share an open load-break switch as electrical border point. Figure 18
 325 shows the default operation configuration in which feeder F1 consists of underground

326 cable with cross-linked polyethylene cable (XLPE), and F2 is mostly an overhead
327 feeder.



328
329 Figure 18. Application case: feeders F1 and F2

330 The expected number of faults in each feeder has been estimated by clustering
331 all the electrical feeder components according to Table II and using their respective
332 failures rates $\bar{\lambda}_i$, resulting in 2.849 and 0.772 failures/year respectively. If a lower
333 number of expected faults in F1 is required, the proposed alternative border point
334 location could be used to shorten feeder F1 at the cost of worsening F2, resulting in
335 1.909 and 1.712 failures/year respectively. With this methodology, the expected
336 number of faults of a whole distribution network can be obtained and used to assess its
337 quality of supply by estimating the System Average Interruption Frequency Index
338 (SAIFI) during a period of time [3], [14].

339 VII. Conclusions

340 This paper reports the analysis of incident and network databases of 383 feeders
341 from an electrical distribution company in order to estimate element failure rates
342 adapted to the components in the databases, obtaining narrower variation ranges than in
343 the bibliography. Data deficiency has been faced using data pooling, by adopting up to

344 18 electrical component clusters with enough representativeness. Annual failure rates
345 of these clusters have been estimated and validated through their ability to predict the
346 aggregated number of failures of the studied network.

347 Finally, the estimated failure rates have been used in a case with two feeders in a
348 ring arrangement to illustrate the estimation of their numbers of faults and the
349 optimization of the electrical border point location.

350 The knowledge of detailed failure rates as presented in this paper allows the
351 distribution companies for better planning and operation when the quality of supply is
352 considered.

353 **Acknowledgment**

354 The authors want to thank the financial and technical support of ENDESA RED in the
355 framework of the chair ENDESA RED-University of Seville and the cooperation of
356 Luis Pérez-Morla Berrocal, as manager of the operation department of ENDESA.

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