



# XSICEL 2021

Transición energética en la 4ta revolución industrial



Universidad  
Tecnológica  
de Pereira



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DE COLOMBIA

# Events automatic simulation in microgrids for the training and validation of protection devices

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- II. Events automatic system structure in microgrids**
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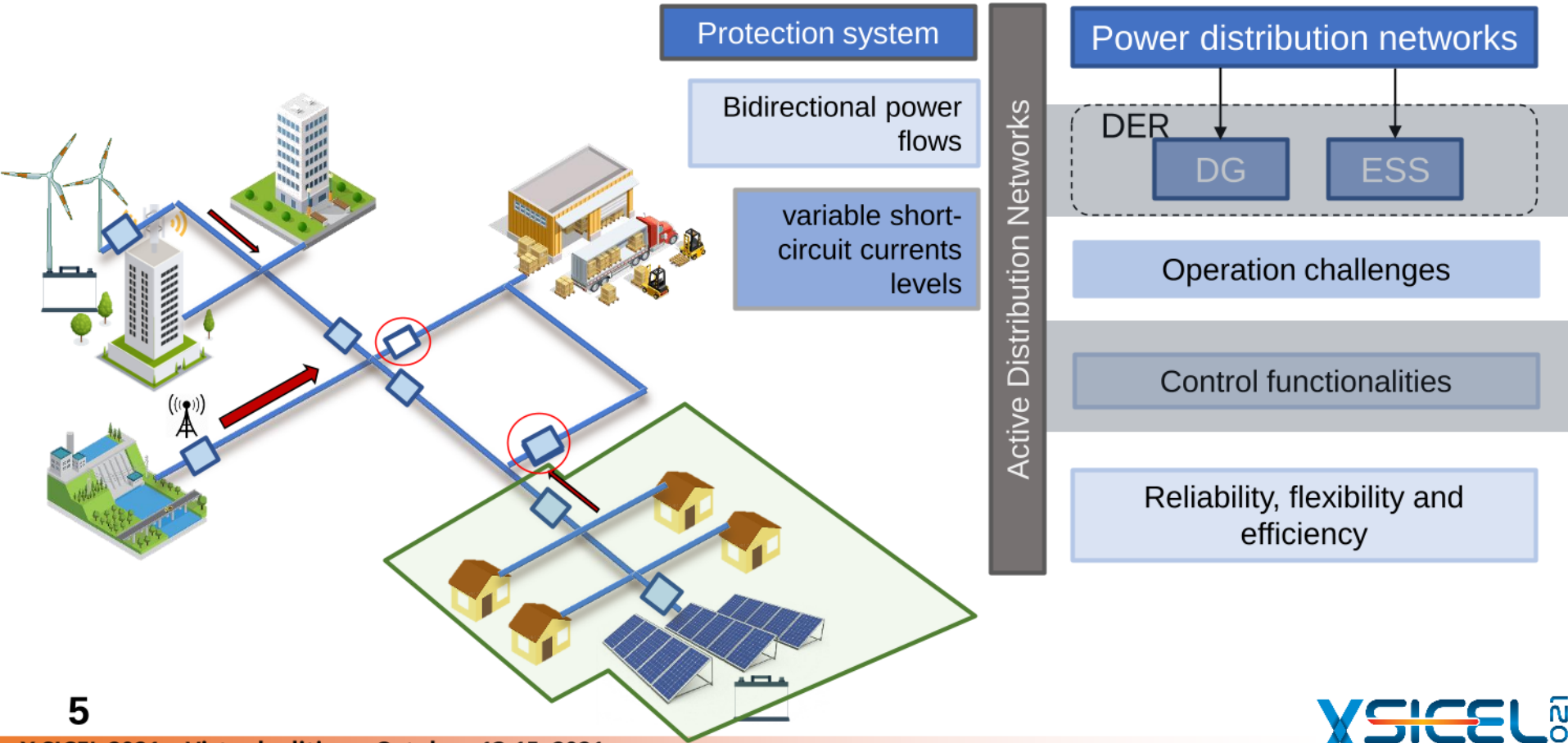
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# I. Introduction



# I. Introduction

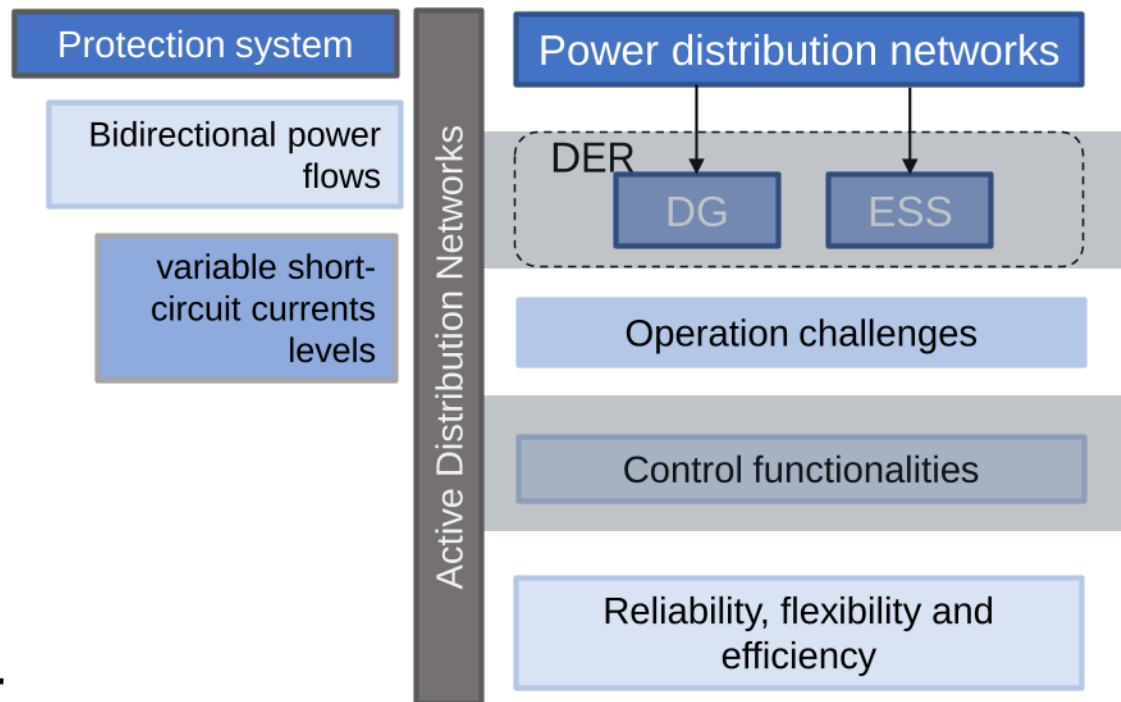
How to protect an ADN/MG considering All their operational condition?



Development of adaptive protection strategies



It requires exhaustive simulations in the MG of faults and normal operation conditions, that include topological changes, load variation, DER connection/disconnection, among others.



**Events automatic simulation in microgrids for the training and validation of protection devices**

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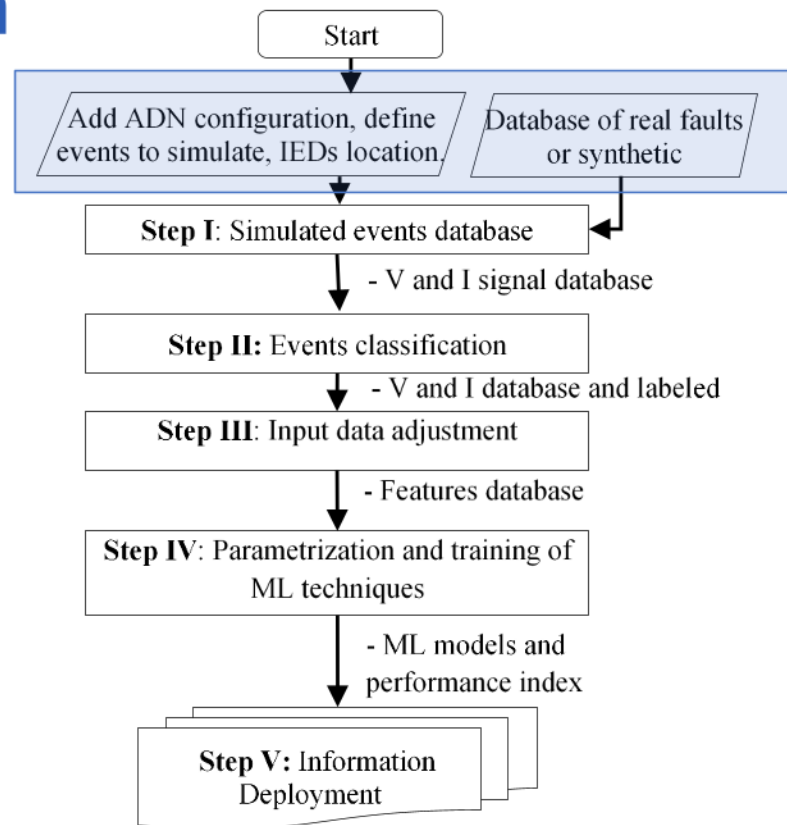
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## II. Events automatic system structure in microgrids

### Step 0: Initial settings

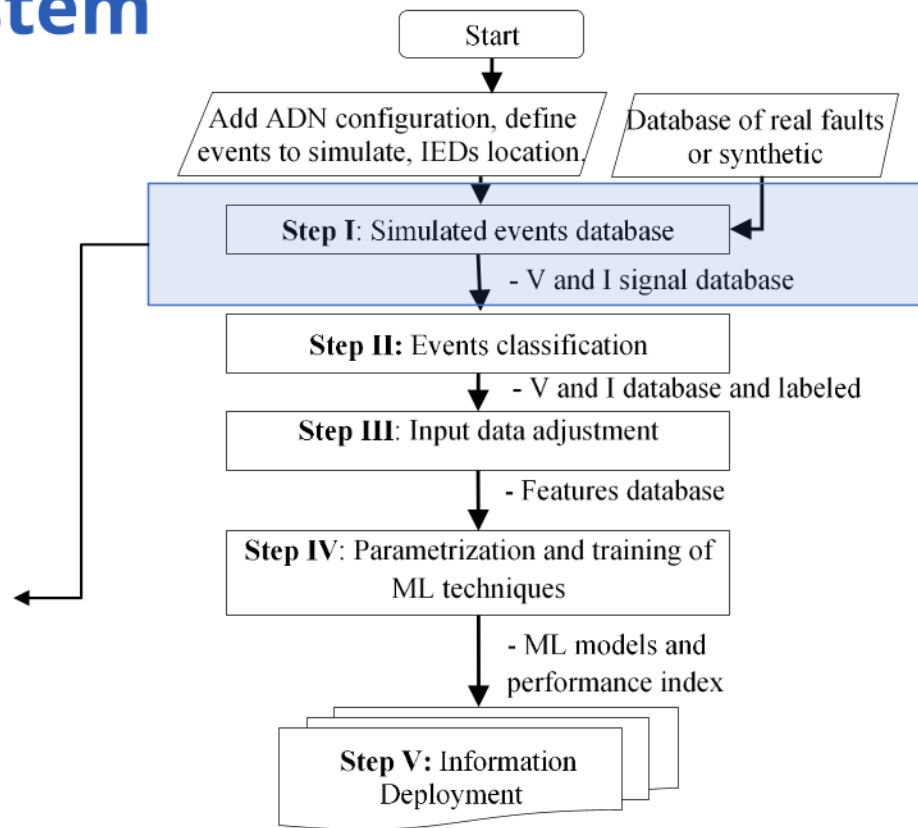
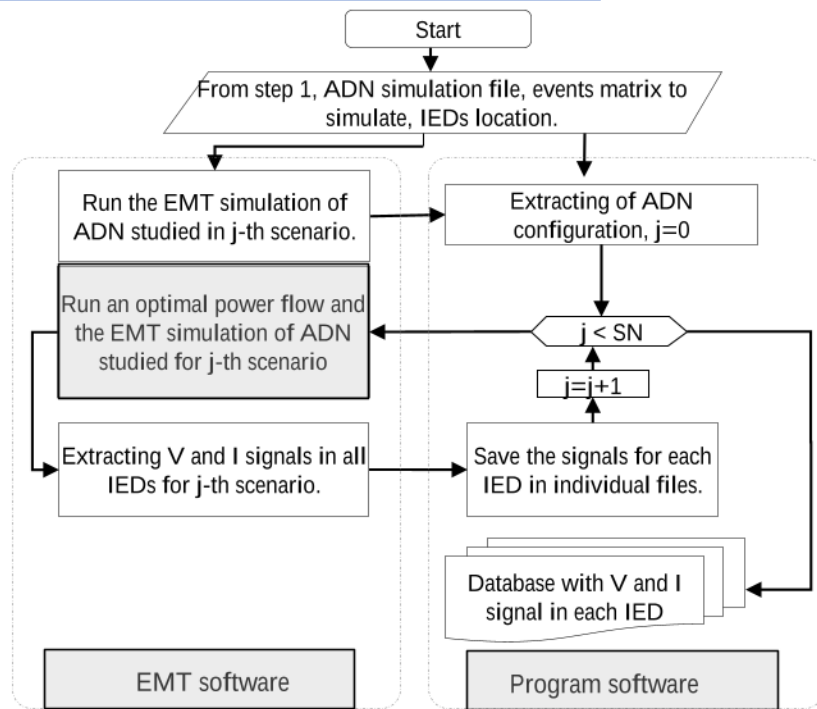
- Simulation time ( $t_T$ )
- Sampling frequency ( $f_m$ )
- EMT simulation file of the ADN under study
- Equipment to connect / disconnect  
(lines for reconfigurations, intermittence of DER)
- Short-circuit conditions  
(fault types, fault location, fault resistances)





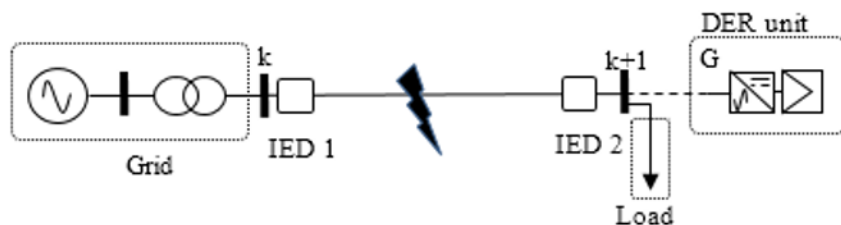
## II. Events automatic system structure in microgrids

### Step I: Events simulation

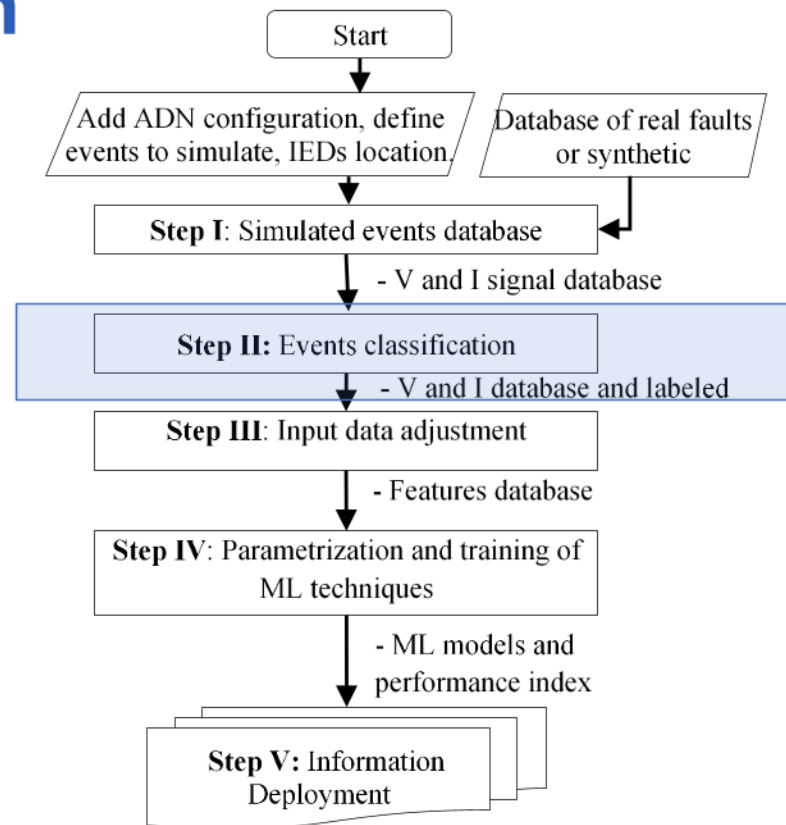


## II. Events automatic system structure in microgrids

### Step II: Events classification

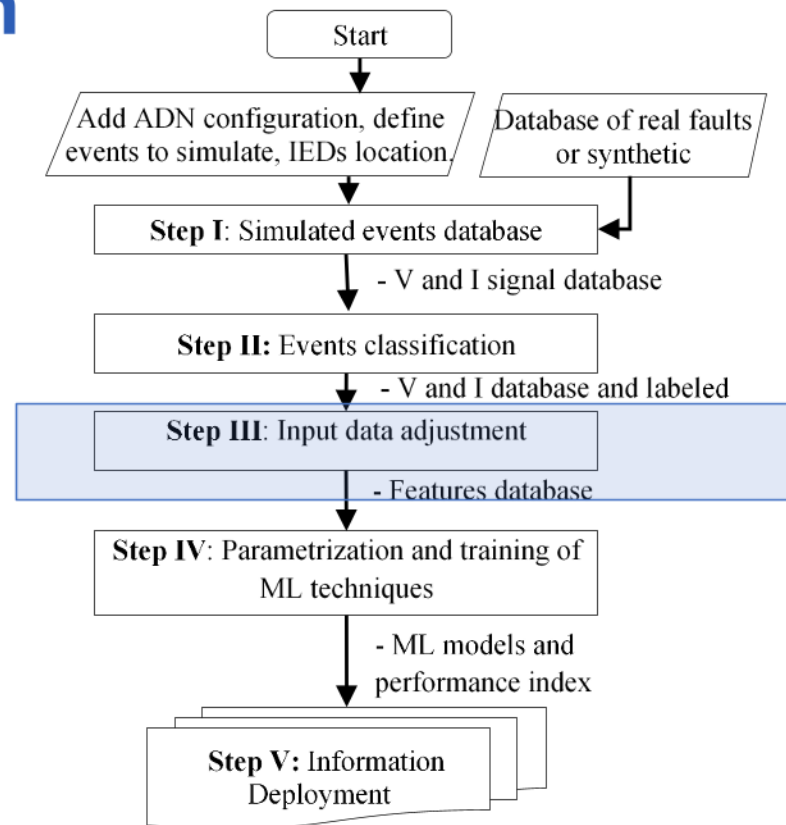
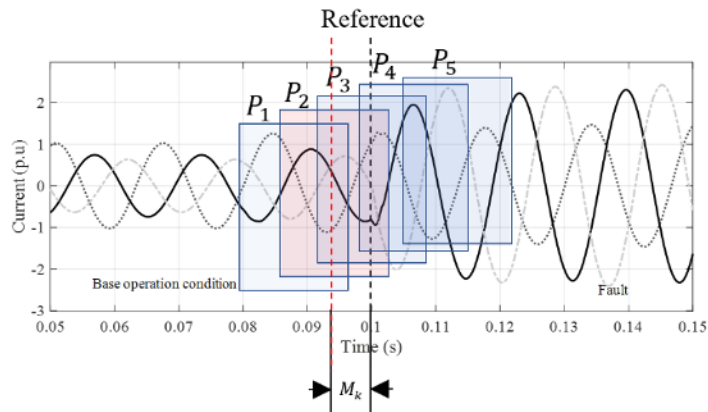


Event	Operation condition	IED	State
1	Fault in the middle of the line and DG connected	IED 1	Faulted
		IED 2	Faulted
2	Fault in the middle of the line and DG disconnected	IED 1	Faulted
		IED 2	No faulted



# II. Events automatic system structure in microgrids

## Step III: Input data adjustment

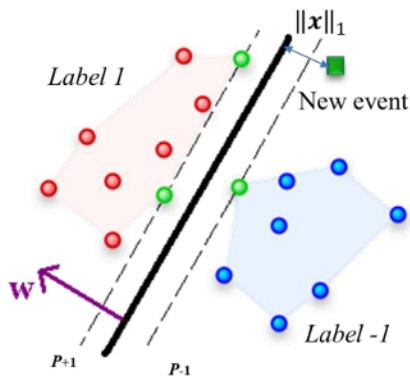


Item	Features	Description
1-3	Magnitude of voltage in each phase	$ V _k$
4-6	Angle of voltage in each phase	$\theta V_k$
7-9	Magnitude of current in each phase	$ I _k$
10-12	Angles of current in each phase	$\theta I_k$

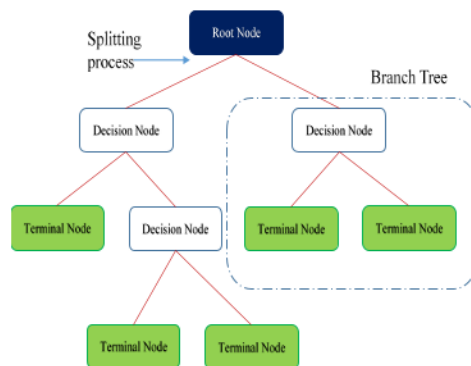
## II. Events automatic system structure in microgrids

### Step IV: Parametrization and training of ML techniques

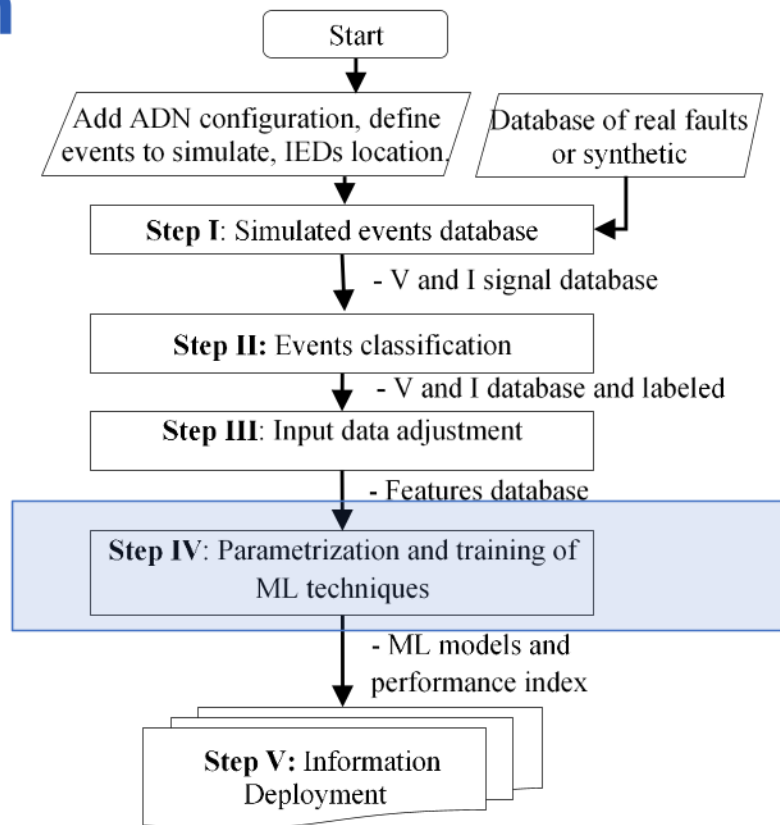
Support Vector Machines (SVM)



Decision Tree (DT)

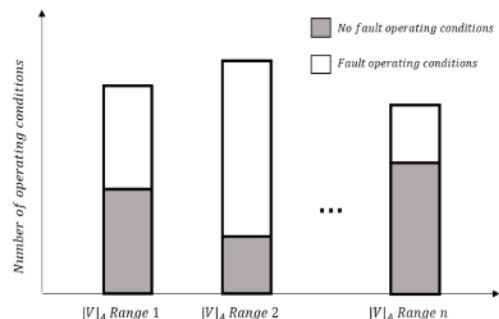


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## II. Events automatic system structure in microgrids

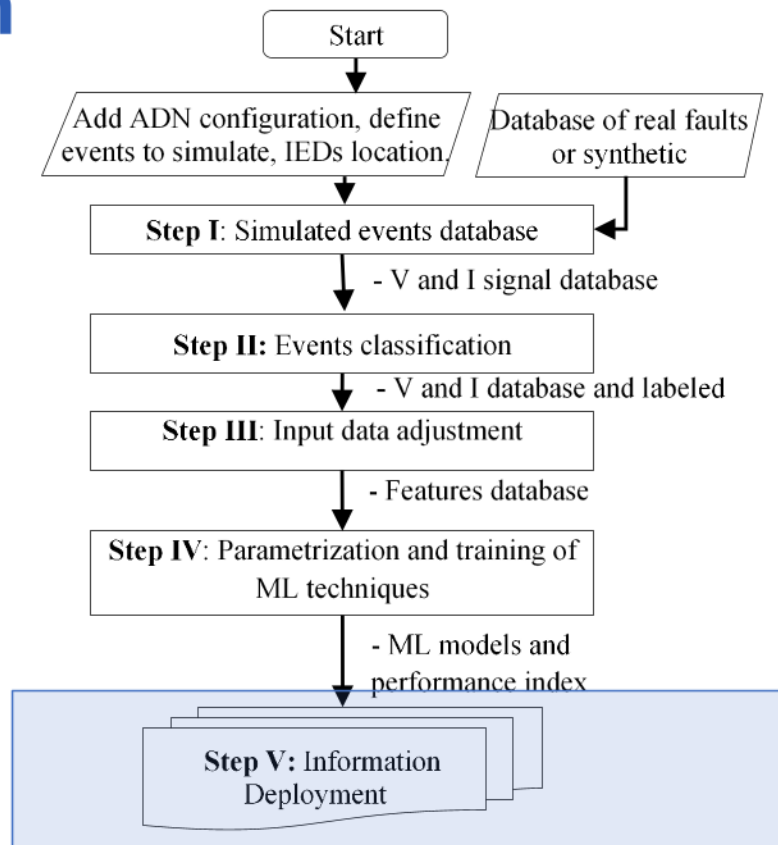
### Step V: Information Deployment



True Label	No Fault	A	B
	Fault	C	D
		No Fault	Fault
		Predicted Label	

$$A_{cc} = \left[ \frac{\text{Scenarios well classified}}{\# \text{ total Scenarios}} \right] * 100\%$$

$$D_{ep} = \left[ \frac{\text{Fault Scenarios well classified}}{\# \text{ Total Fault Scenarios}} \right] * 100\%$$



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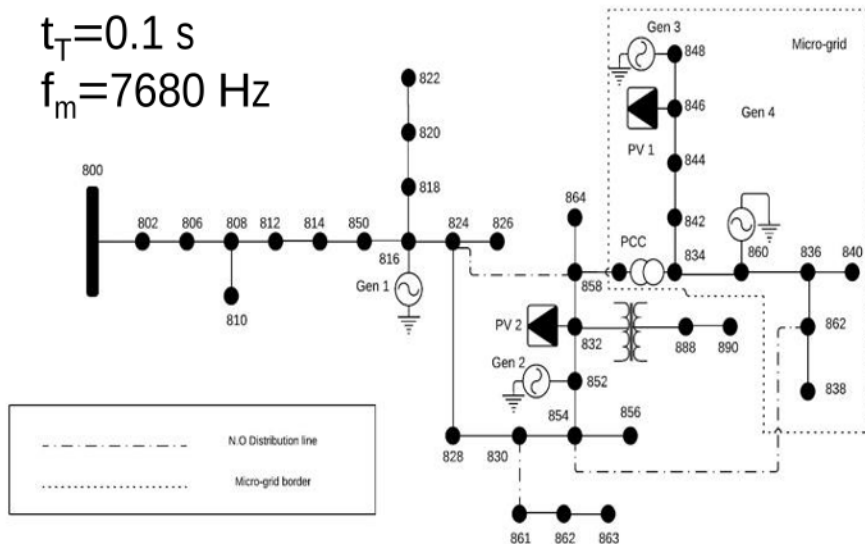
# III. Application of system for development of protection strategies

## A. Case study

Step 0: Initial settings

$$t_T = 0.1 \text{ s}$$

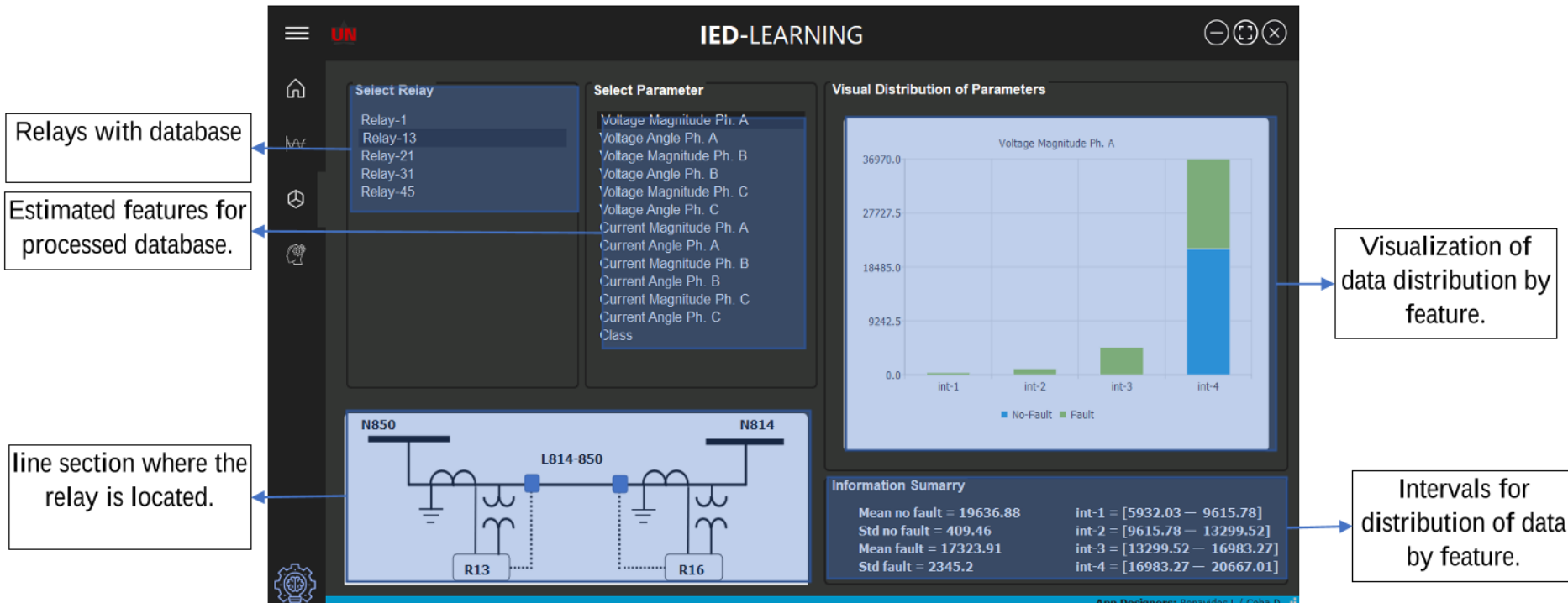
$$f_m = 7680 \text{ Hz}$$



Analyzed scenarios	Factors	Levels
Fault scenarios	Fault Resistance	0 - 20 $\Omega$ and 40 $\Omega$
	Fault type	A-g, AB and ABC
	Load variation	[40-55] [85-100] [100-120] %
	Topology changes	Scenario 1 to 6
	Generation cut-off	All the generators are working DG <sub>1</sub> out DG <sub>2</sub> out DG <sub>3</sub> out
No-fault scenarios	Fault location	25 three-phase distribution line
	Load variation	[40-55] [56-70] [71-85] [85-100] [100-120] %
	Generation cut-off	All the generators are working DG <sub>1</sub> out DG <sub>2</sub> out DG <sub>3</sub> out
	Topology changes	Scenario 1 to 6
	Location	ADN: IED-1, IED-13, IED-21 MG: IED-31, IED-45
IEDs	ML techniques	SVM, DT
	Number of windows	4
No-Fault		28320
Fault		72576

# III. Adaptive coordination algorithm

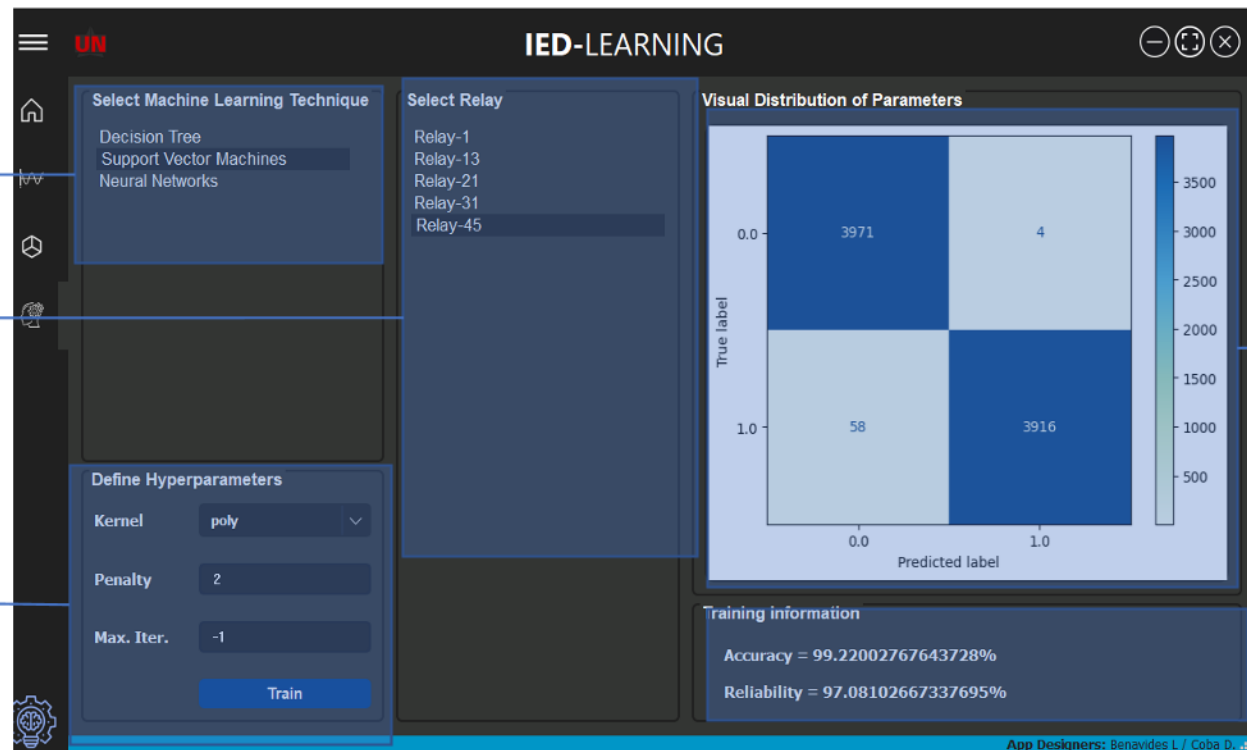
## B. Step I, II and III: Events simulation, classification and data adjustment





# III. Adaptive coordination algorithm

## B. Step I, II and III: Events simulation, classification and data adjustment



# III. Adaptive coordination algorithm

## B. Step I, II and III: Events simulation, classification and data adjustment

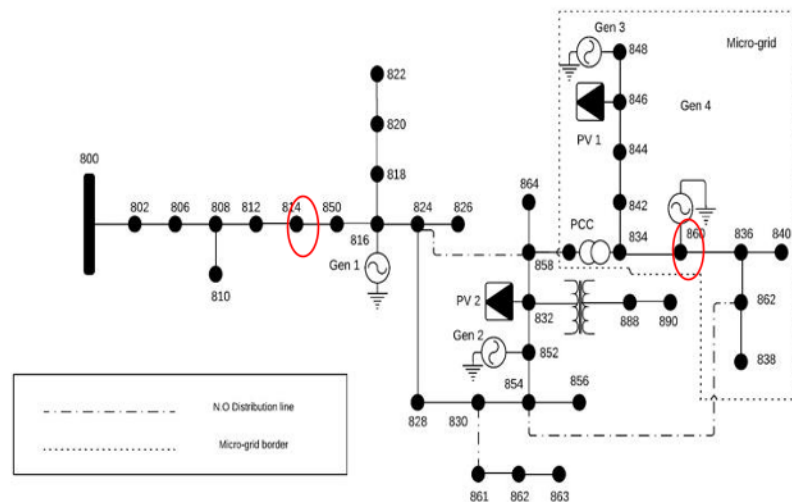
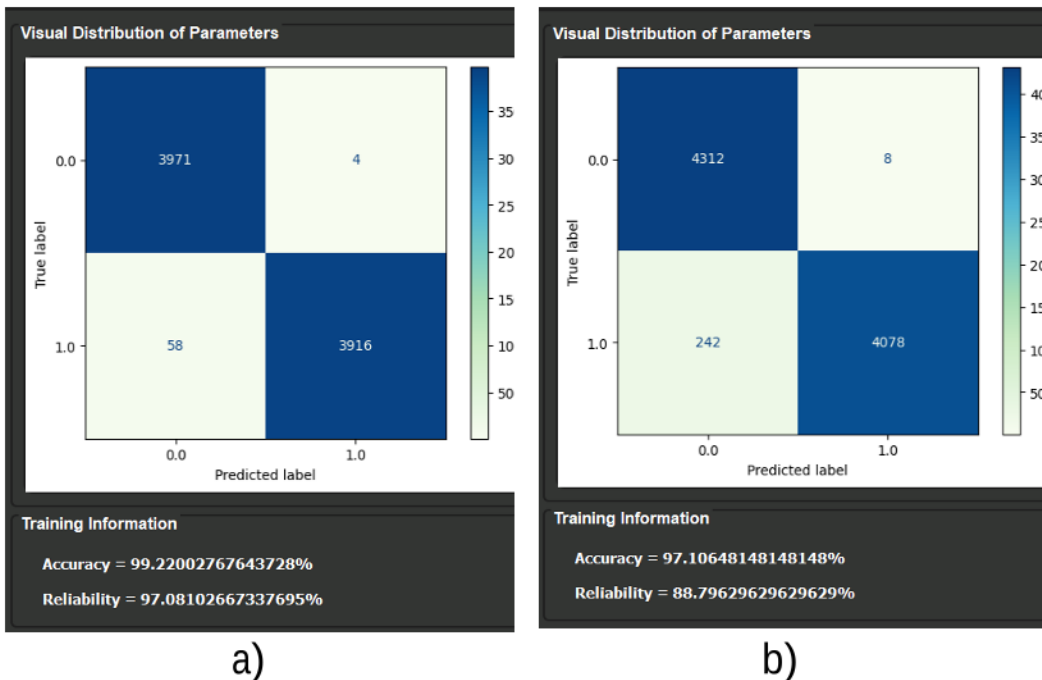


Fig. 14. ML Techniques Window – a) SVM – Relay 13, b) SVM – Relay 45

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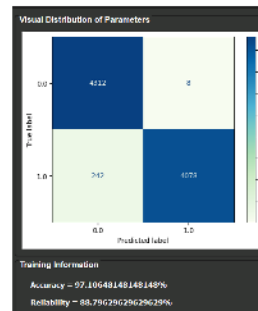
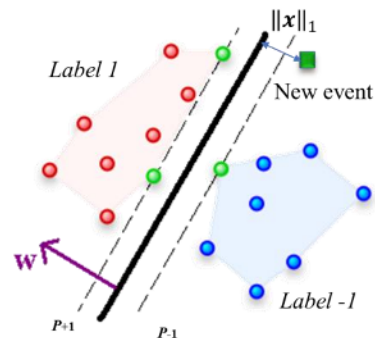
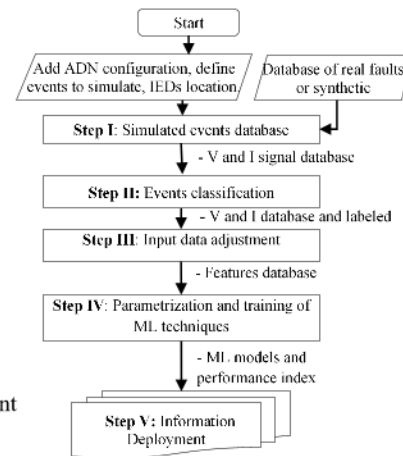
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# IV. Conclusions

This work presented an **EAS for ADN and micro-grids**, which was designed to automate the entire process that involves the **generation, training and validation of the IEDs** present in an active distribution network or a MG.

the EAS allows training the IEDS for different **machine learning techniques** with the main idea to find the best model that guarantee an outstanding **detection of faults**.

The results obtained with a SVM model presents an **accuracy above of 90%**.





# Thank you



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