



UNIVERSIDADE DA CORUÑA

***Aplicación de técnicas de
Inteligencia Artificial e IoT
a la vida real***

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- Propuesta de modelado híbrido
- Métodos utilizados
- Aplicaciones



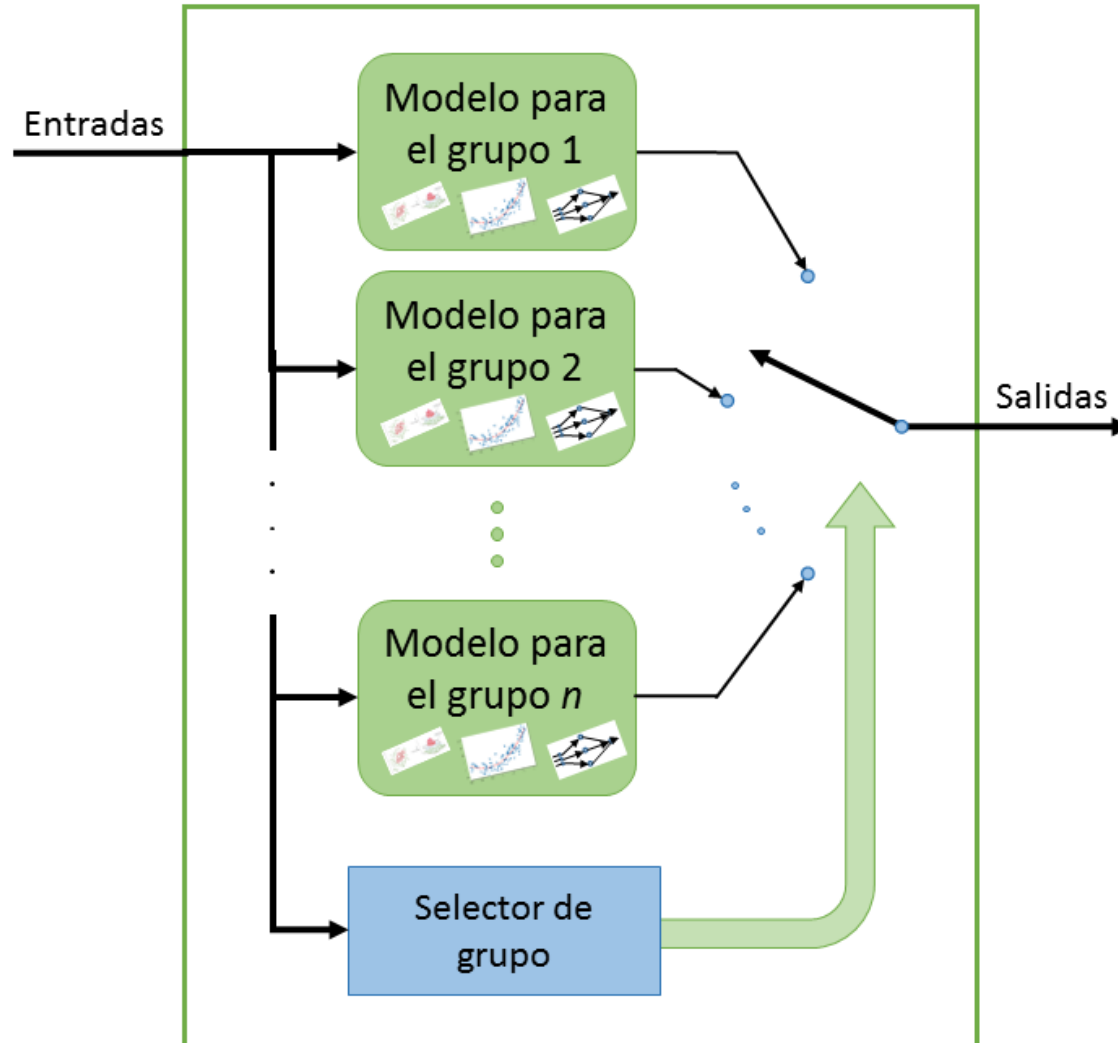
- Propuesta de modelado híbrido



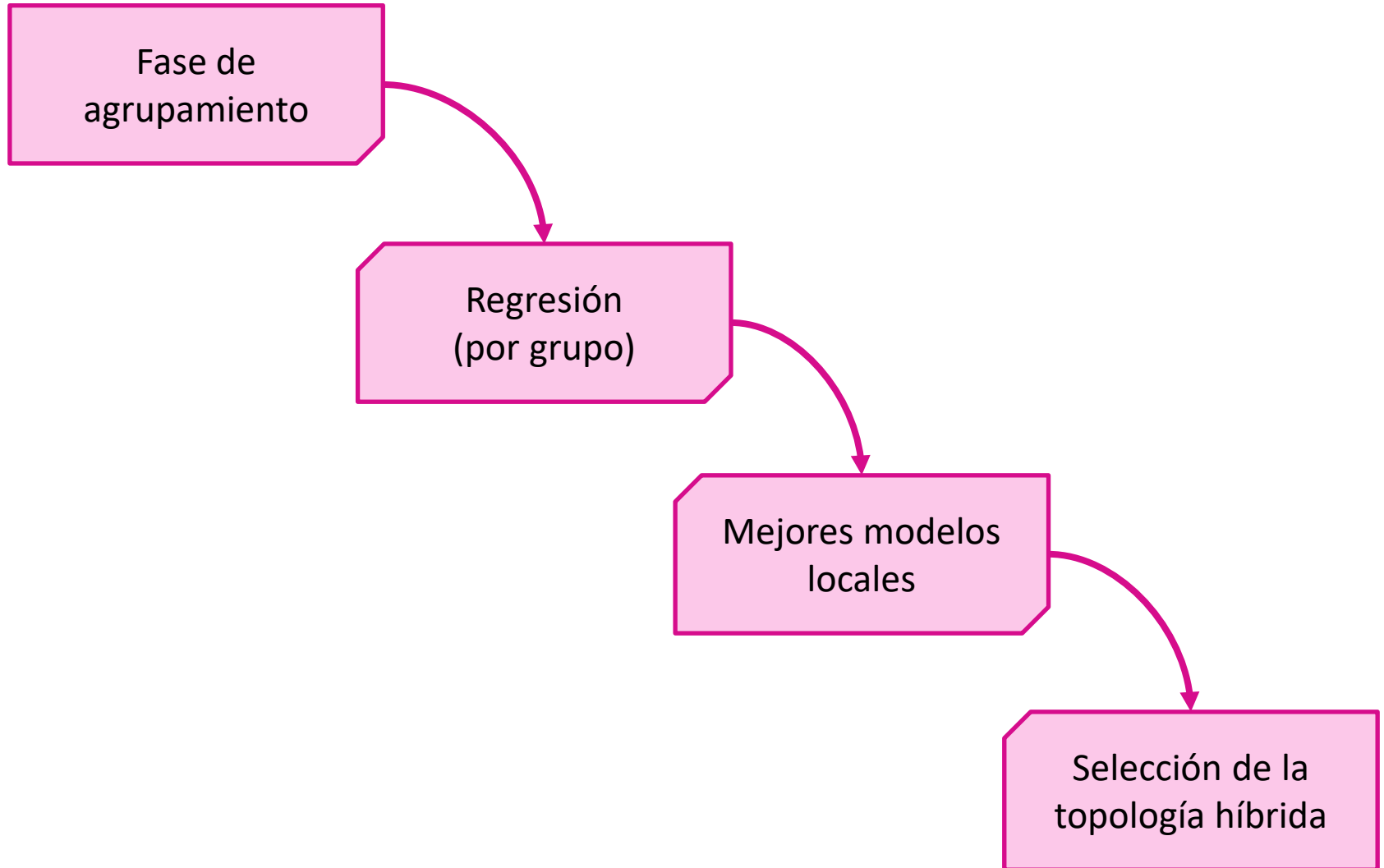
Modelado híbrido



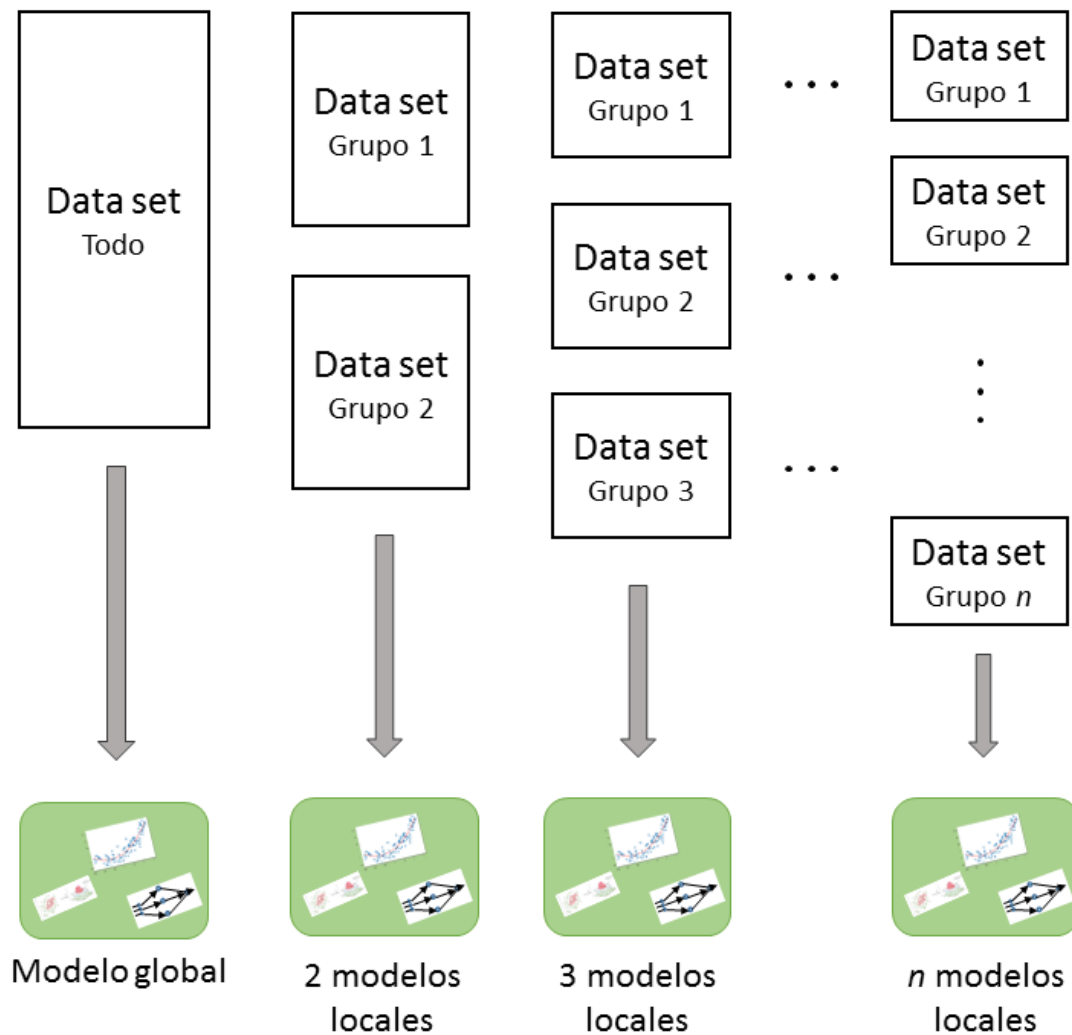
Modelado híbrido



Modelado híbrido



Modelo híbrido



Modelo híbrido

	Modelos locales				
	Grupo 1	Grupo 2	Grupo 3	Grupo 4	Grupo 5
Global					
Híbrido 2 grupos					
Híbrido 3 grupos					
Híbrido 4 grupos					
Híbrido 5 grupos					



$$MSE = \frac{1}{n} \sum_{i=1}^n (y_{i_{modelo}} - y_{i_{real}})^2$$

$$NMSE = \frac{1}{n} \sum_{i=1}^n \frac{(y_{i_{modelo}} - y_{i_{real}})^2}{y_{i_{modelo}} \cdot y_{i_{real}}}$$

$$MAE = \frac{1}{n} \sum_{i=1}^n |y_{i_{modelo}} - y_{i_{real}}|$$

$$MAPE = \frac{1}{n} \sum_{i=1}^n \left| \frac{y_{i_{modelo}} - y_{i_{real}}}{y_{i_{real}}} \right|$$

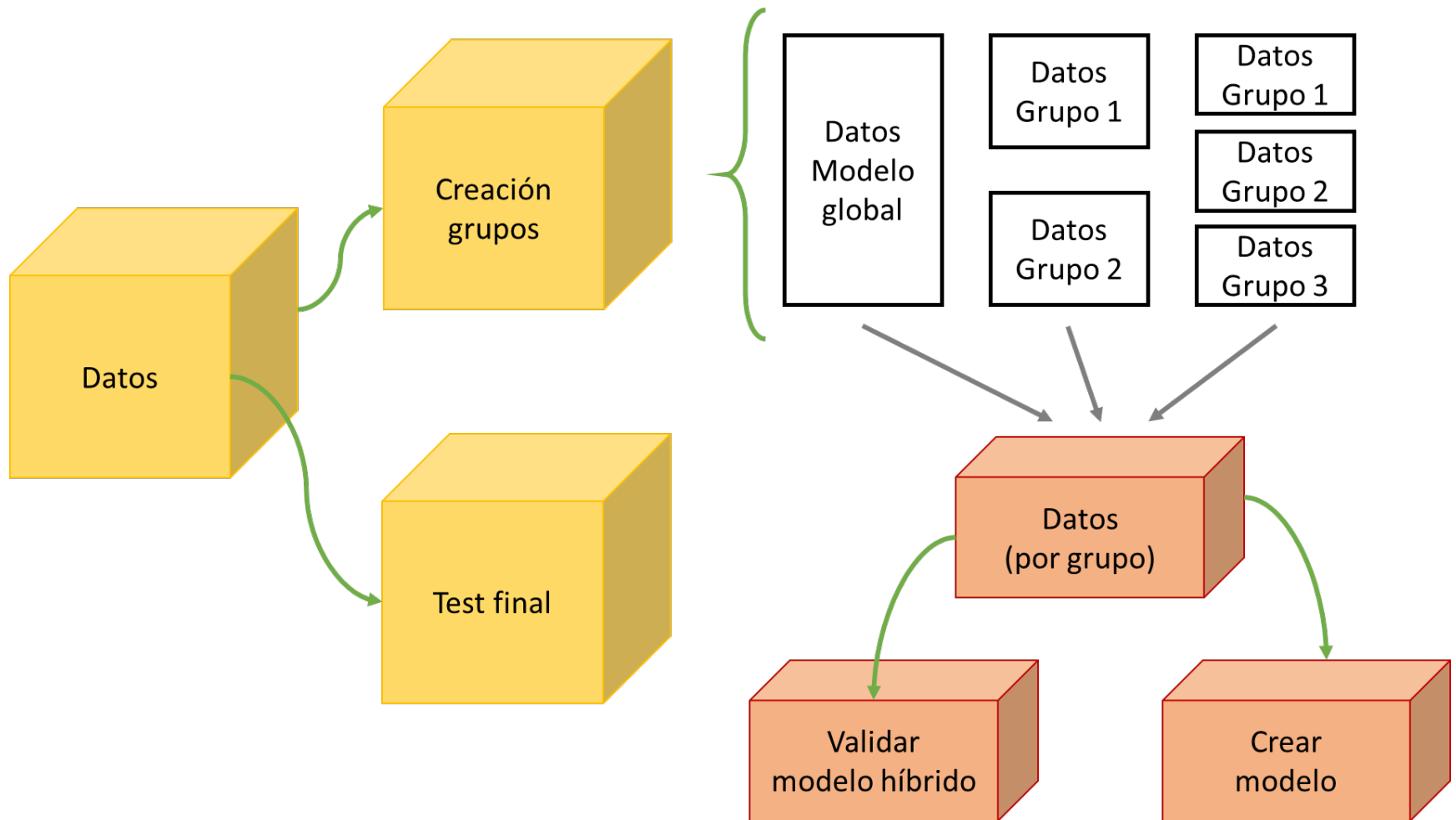


Modelo híbrido

	Modelos locales				
	Grupo 1	Grupo 2	Grupo 3	Grupo 4	Grupo 5
Global	ANN-12				
Híbrido 2 grupos	LS-SVR	ANN-2			
Híbrido 3 grupos	Poly-2	ANN-5	LS-SVR		
Híbrido 4 grupos	ANN-5	ANN-3	ANN-4	LS-SVR	
Híbrido 5 grupos	LS-SVR	LS-SVR	ANN-6	ANN-7	ANN-6



Modelo híbrido



- Propuesta de modelado híbrido
- Métodos utilizados



Métodos utilizados

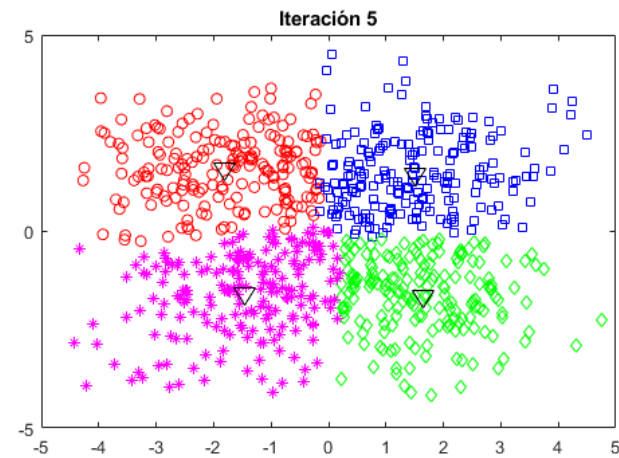
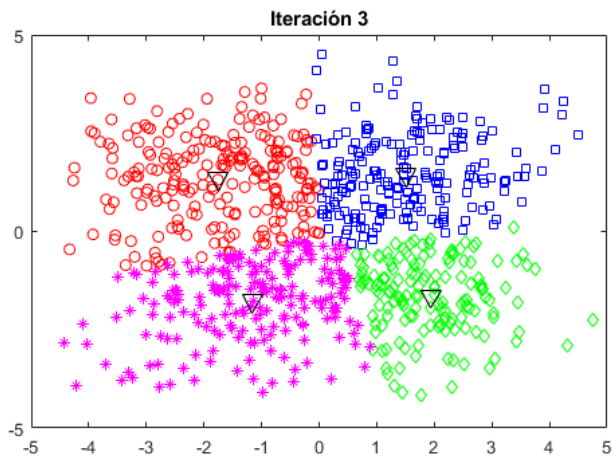
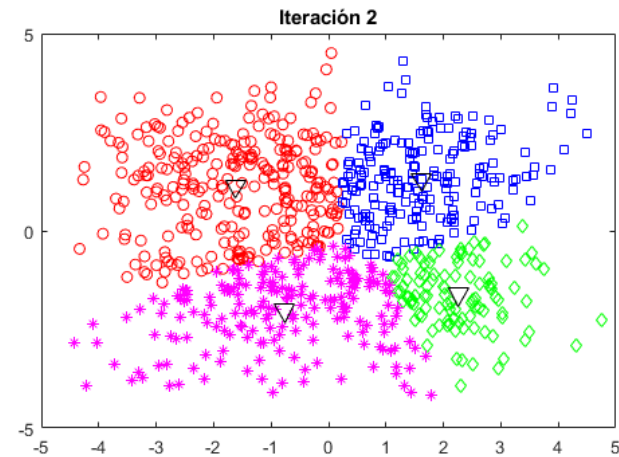
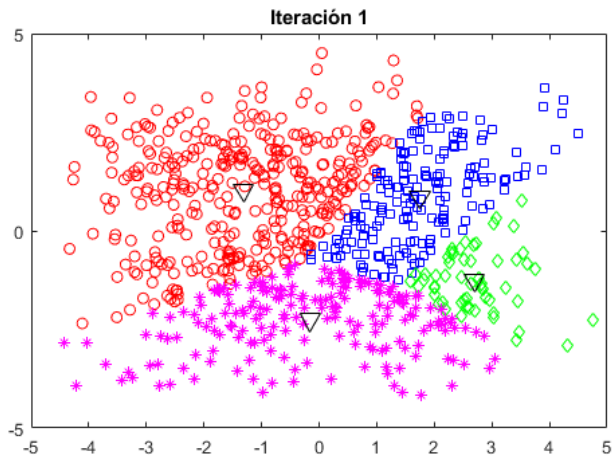
- Agrupamiento
- Regresión
- Validación
- Elección del modelo



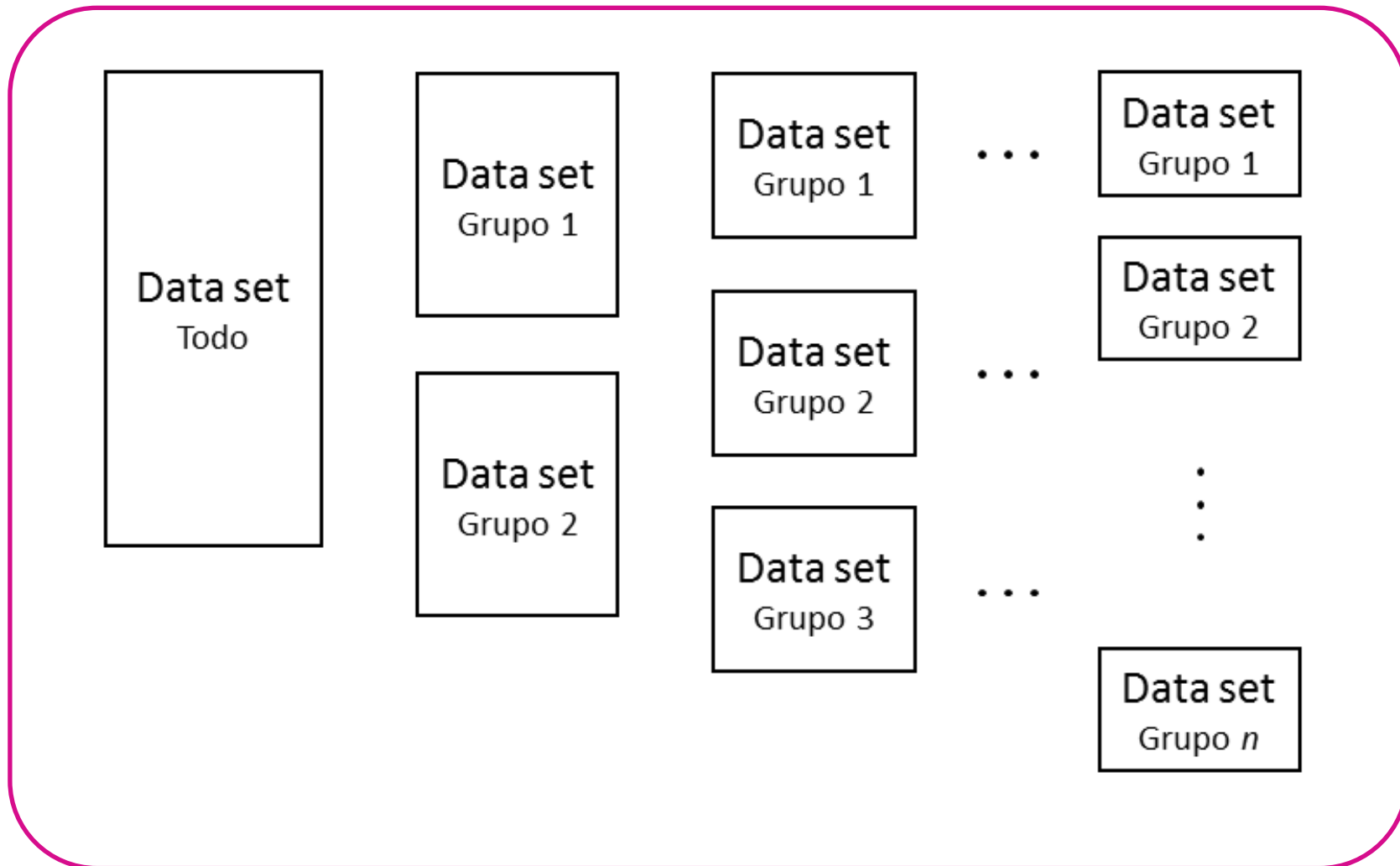
Agrupamiento – K-Means



Agrupamiento – K-Means



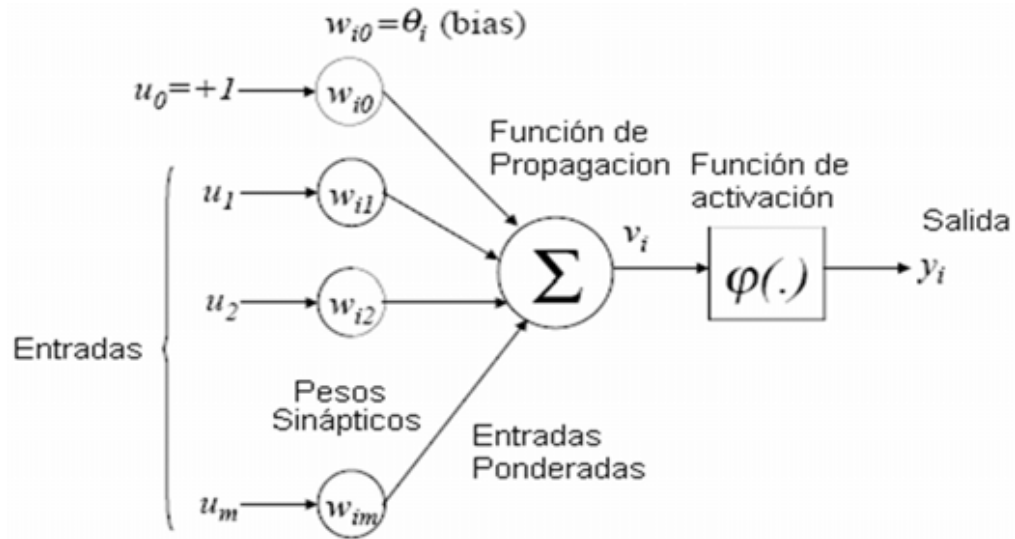
Agrupamiento – K-Means



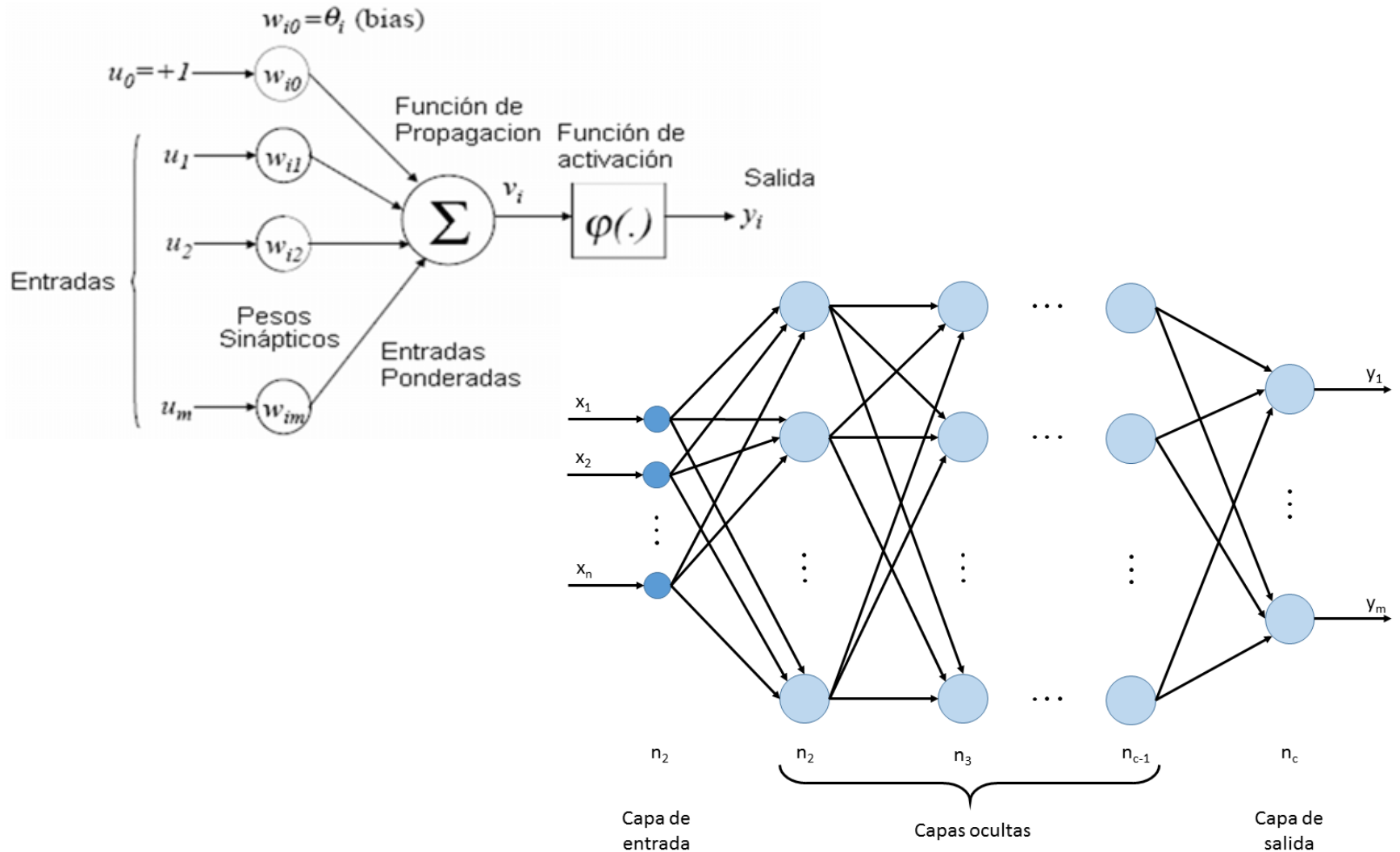
Regresión



Regresión – Redes neuronales artificiales



Regresión – Redes neuronales artificiales

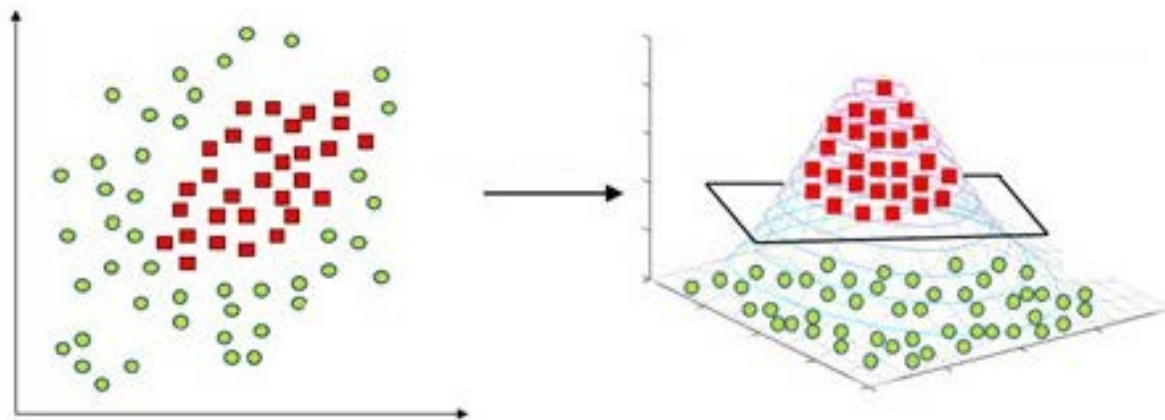
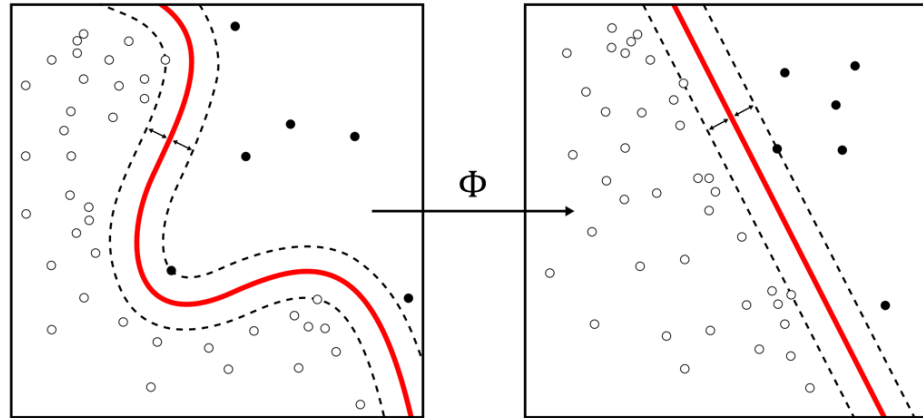


Regresión – Máquinas de vectores soporte



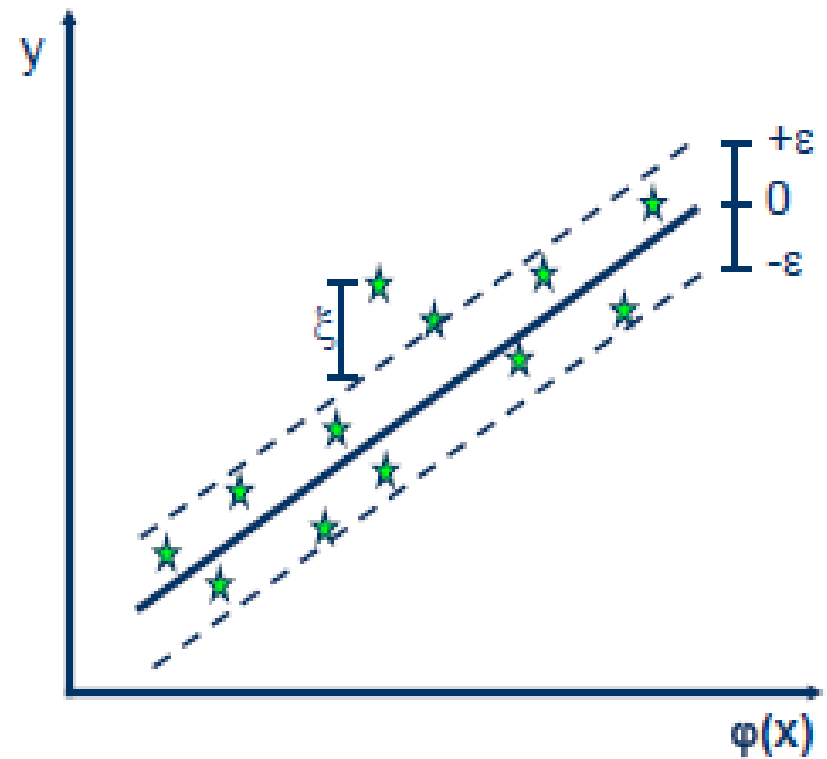
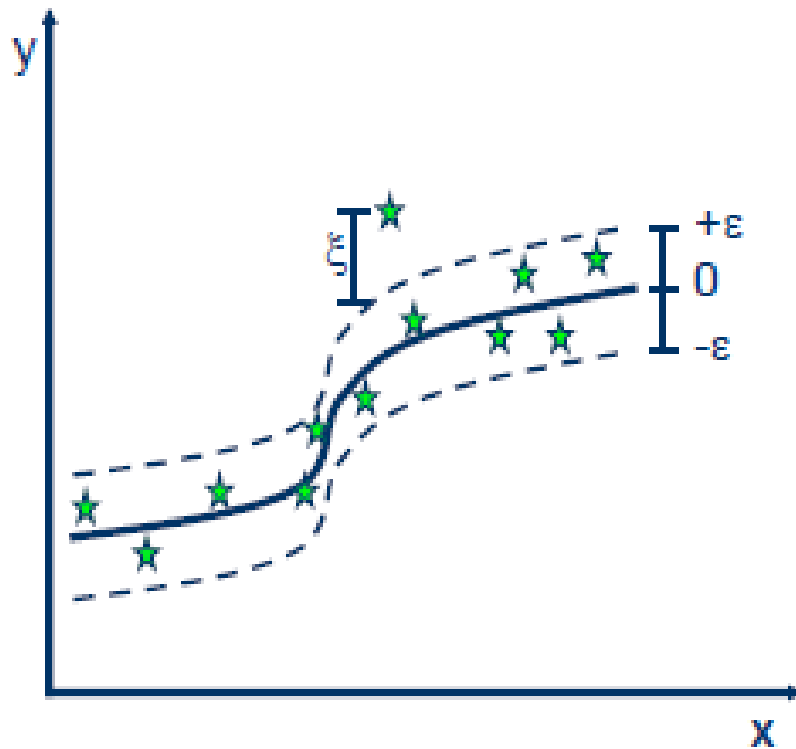
Regresión – Máquinas de vectores soporte

$$\Phi : X \rightarrow F$$



Regresión – Máquinas de vectores soporte

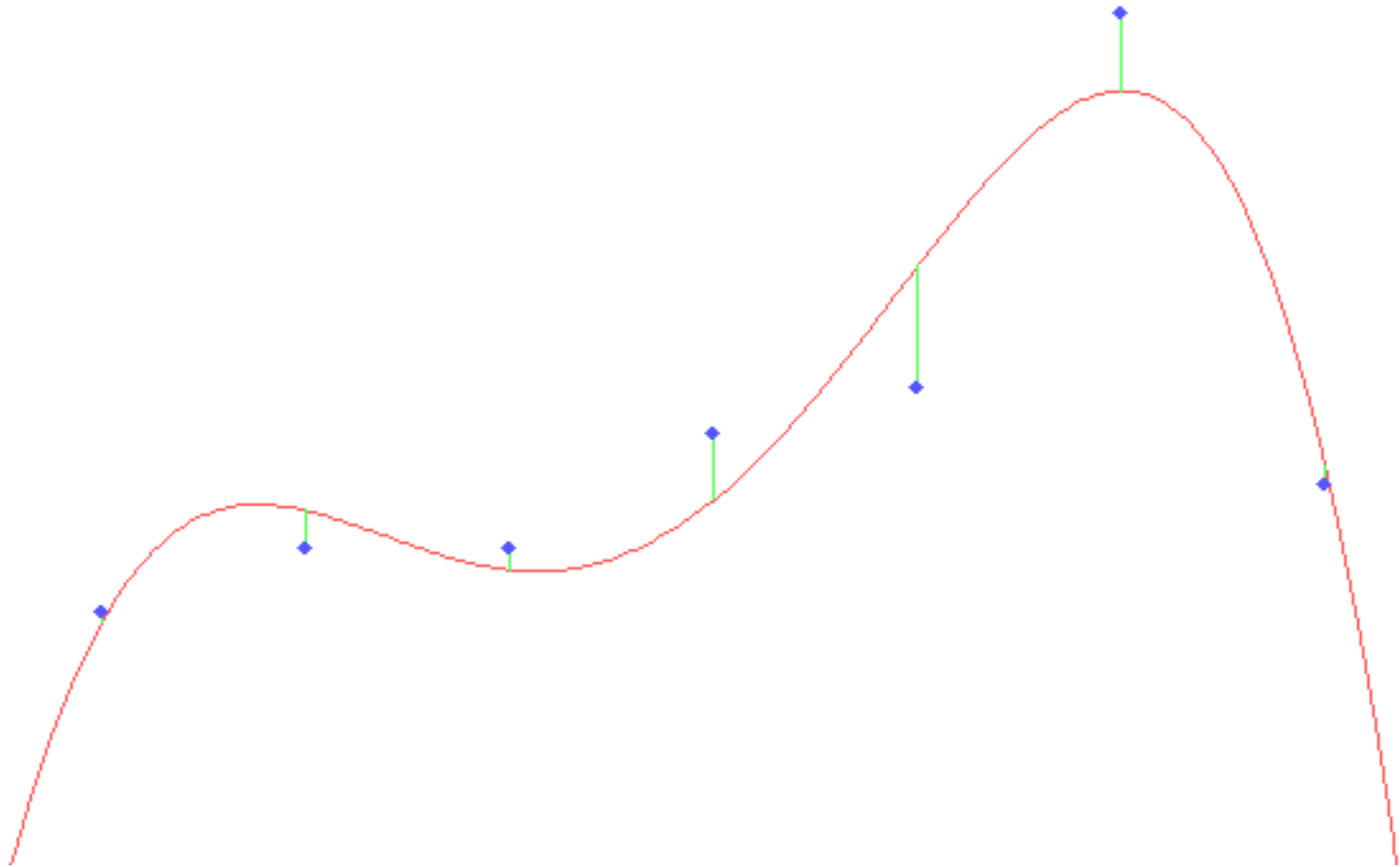
$$\Phi : X \rightarrow F$$



Regresión – Regresión polinomial

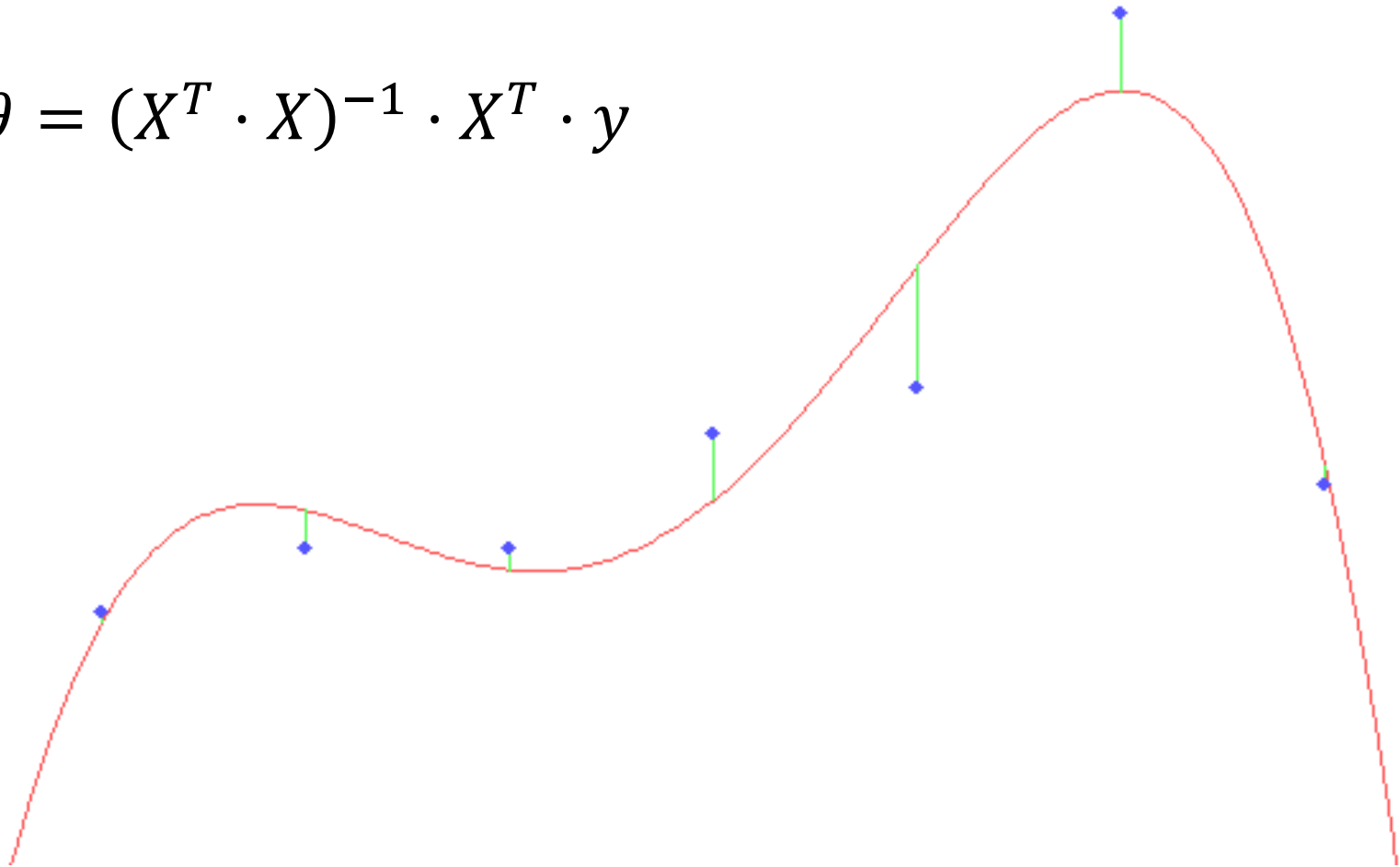


Regresión – Regresión polinomial



Regresión – Regresión polinomial

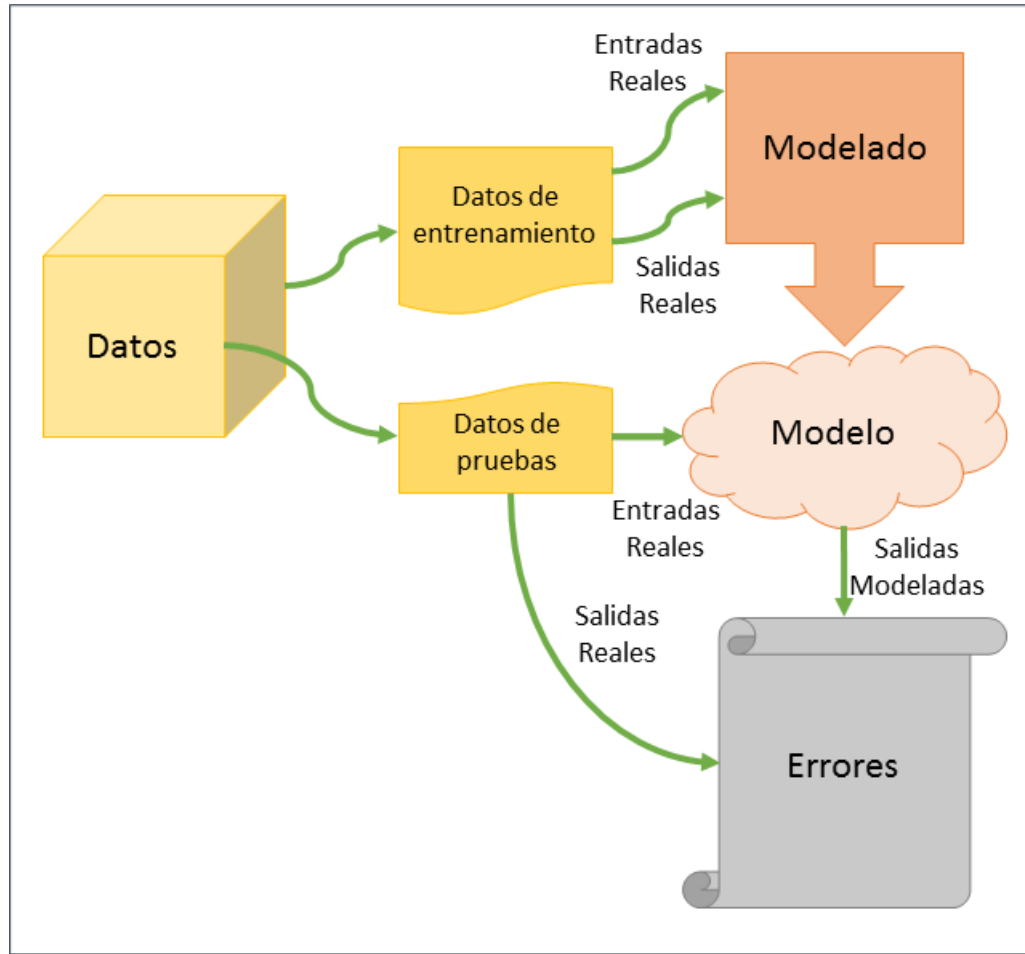
$$\theta = (X^T \cdot X)^{-1} \cdot X^T \cdot y$$



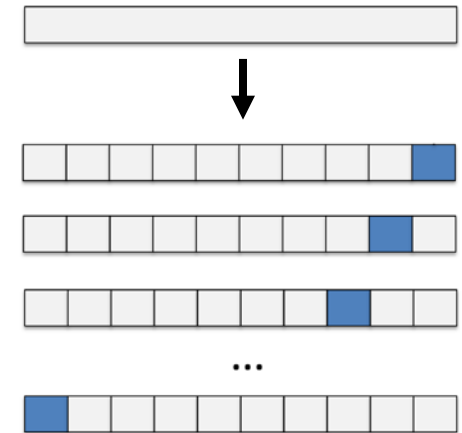
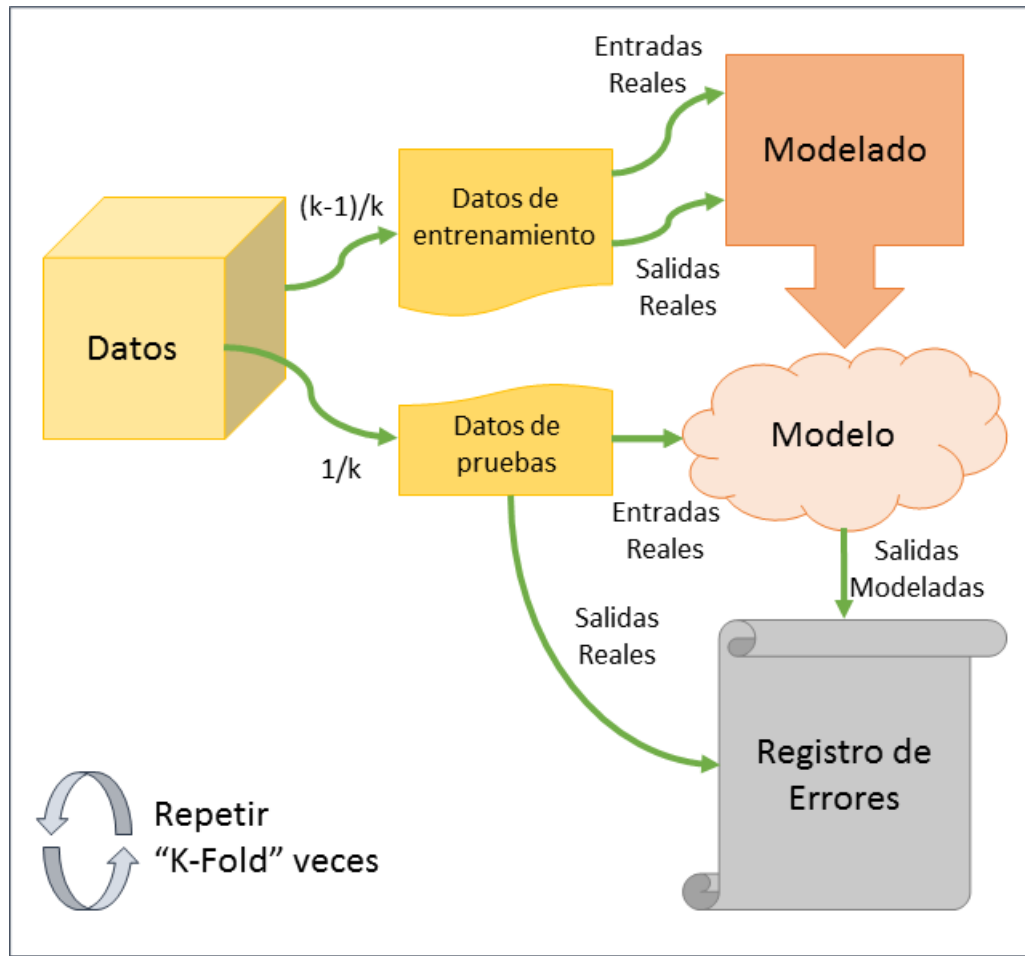
Validación



Validación – Hold Out



Validación – Cross Validation



Elección del modelo de regresión



- Validación con Hold Out
 - Redes neuronales artificiales
 - Diferente número de neuronas en la capa oculta
 - Máquinas de vectores soporte
 - Regresión polinomial
 - Diferentes grados del polinomio
- Error de cada modelo



- Validación con Cross Validation
 - Redes Neuronales Artificiales
 - K - Diferente número de neuronas en la capa oculta
 - K - Máquinas de soporte vectorial
 - Regresión polinomial
 - K - Diferentes grados del polinomio
- Error de cada modelo



Elección del modelo de regresión

- Validación
- Error de cada modelo
- Mejor modelo
- Entrenamiento del modelo con todos los datos



- Propuesta de modelado híbrido
- Métodos utilizados
- Aplicaciones



- Hybrid intelligent system to perform fault detection on BIS sensor during surgeries
- Power cell SOC modelling for intelligent virtual sensor implementation
- Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife
- Fuel cell hybrid model for predicting hydrogen inflow through energy demand
- Hybrid intelligent system to predict the individual academic performance of engineering students



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



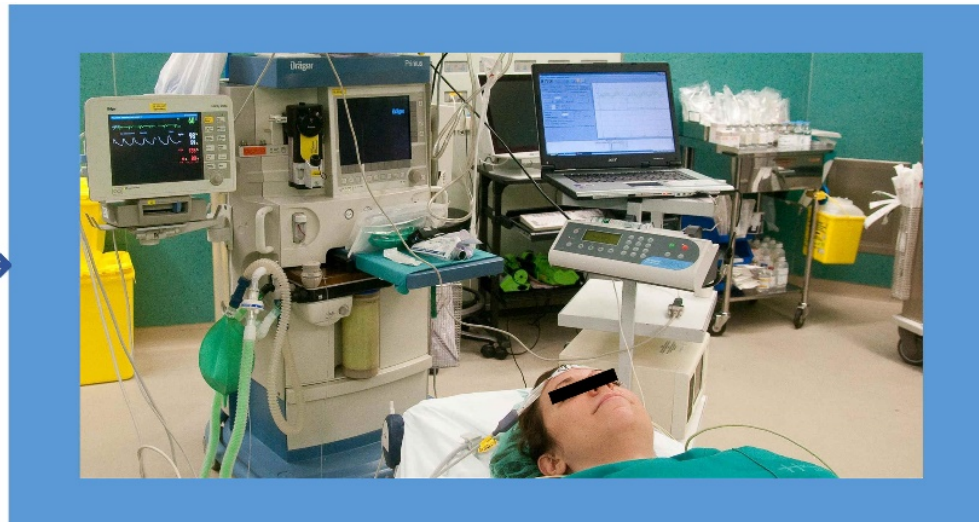
Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



Propofol drug
(mg/kg/h) →

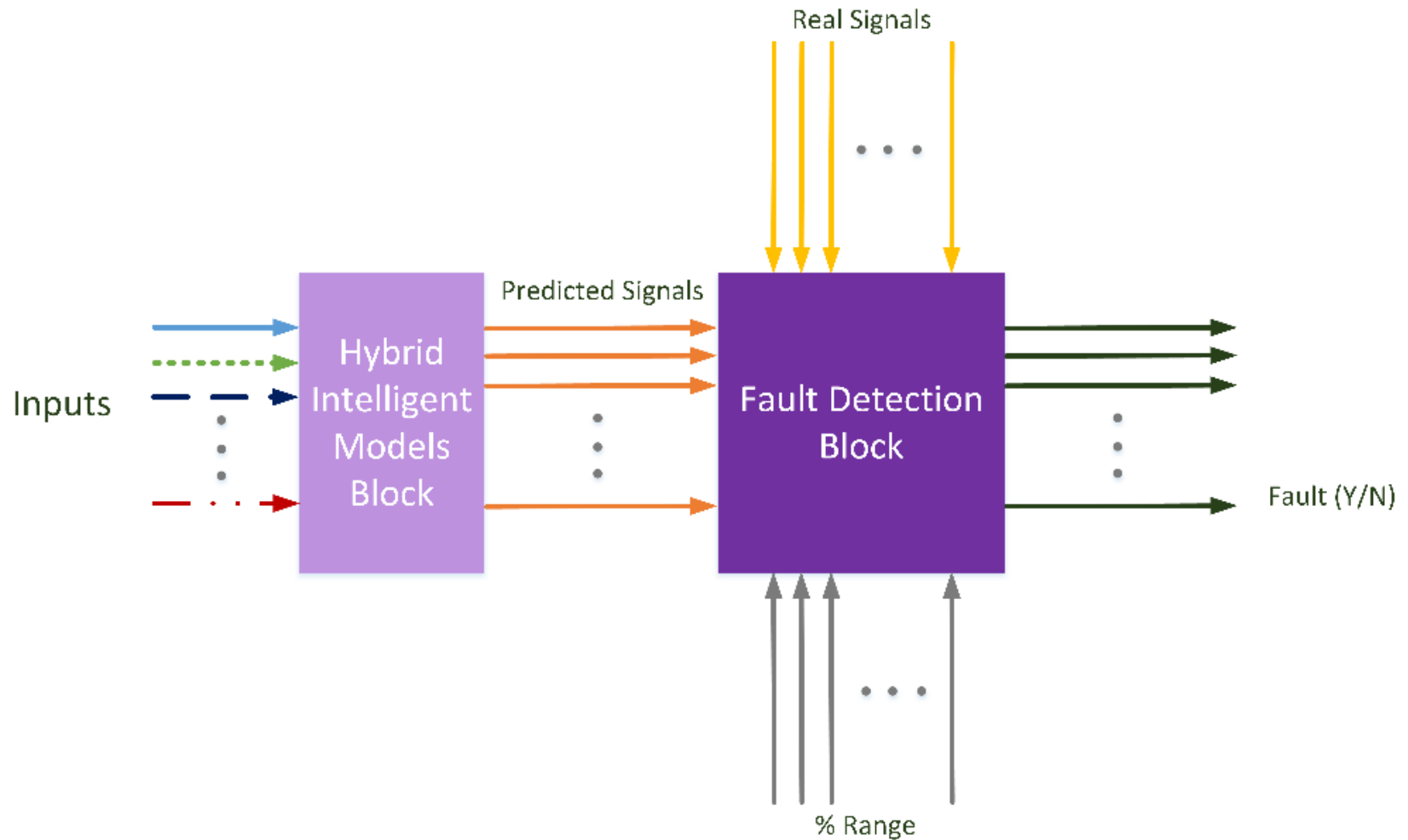


→ EMG Signal
(Volts)

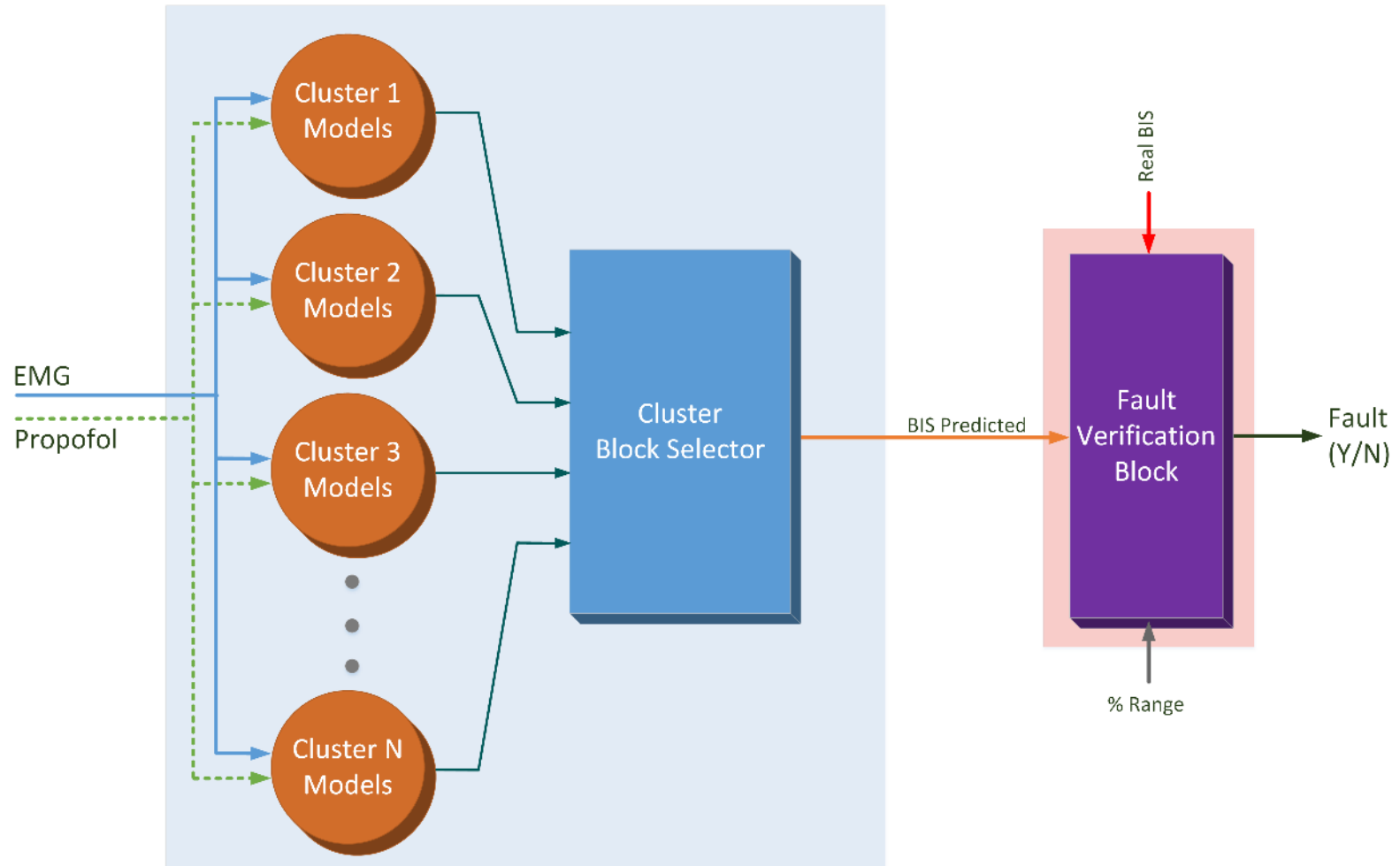
→ BIS Signal
[0-100]



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries

- 50 pacientes
- 42.788 muestras

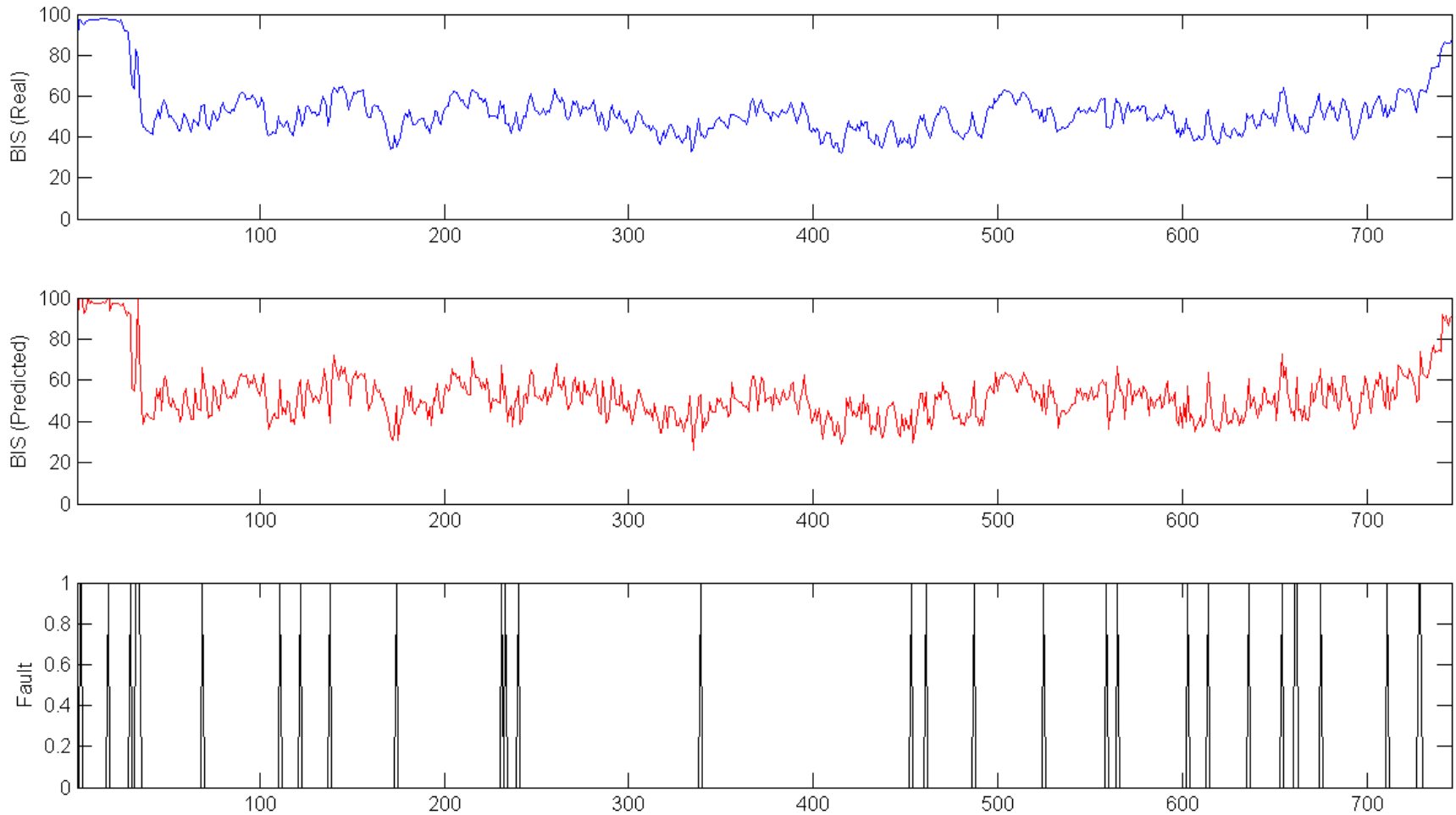
	Grupo 1	Grupo 2
Global	100%	
Híbrido 2 grupos	0,8%	99,2%

	Grupo 1	Grupo 2
Global	0,8531	
Híbrido 2 grupos	$8,1 \cdot 10^{-4}$	0,4129

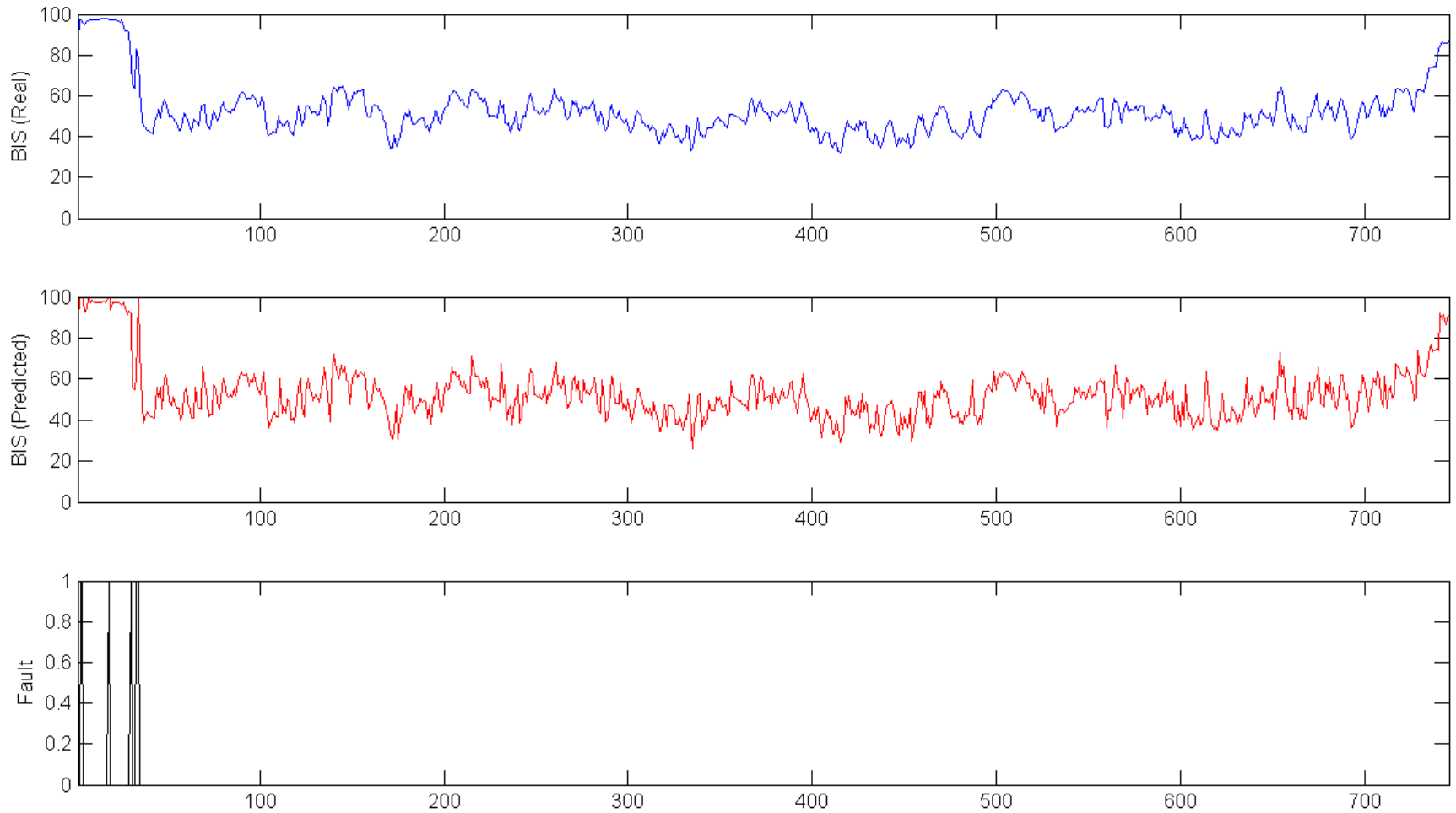
	Grupo 1	Grupo 2
Global	ANN-6	
Híbrido 2 grupos	ANN-2	ANN-9



Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



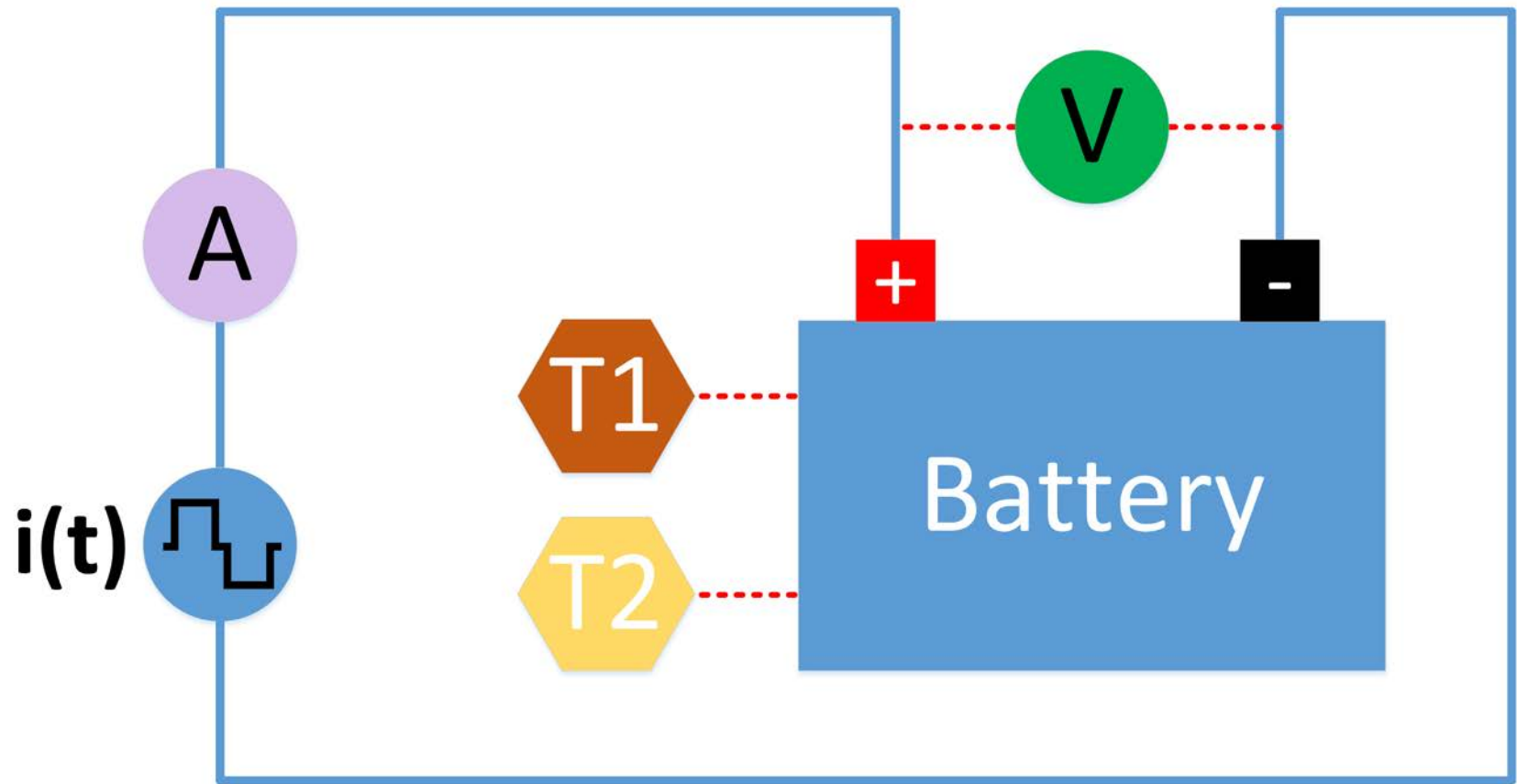
Hybrid intelligent system to perform fault detection on BIS sensor during surgeries



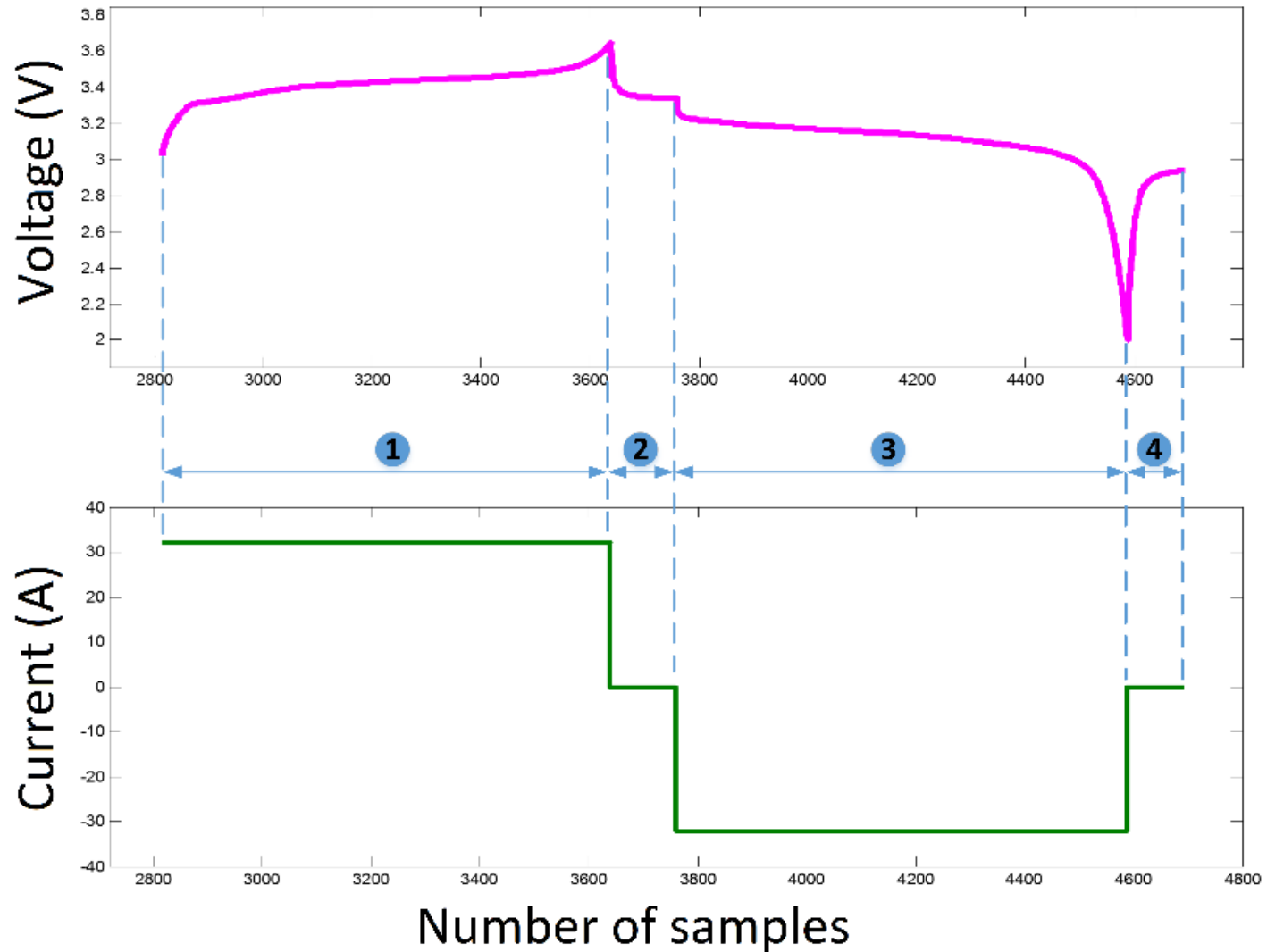
Power cell SOC modelling for intelligent virtual sensor implementation



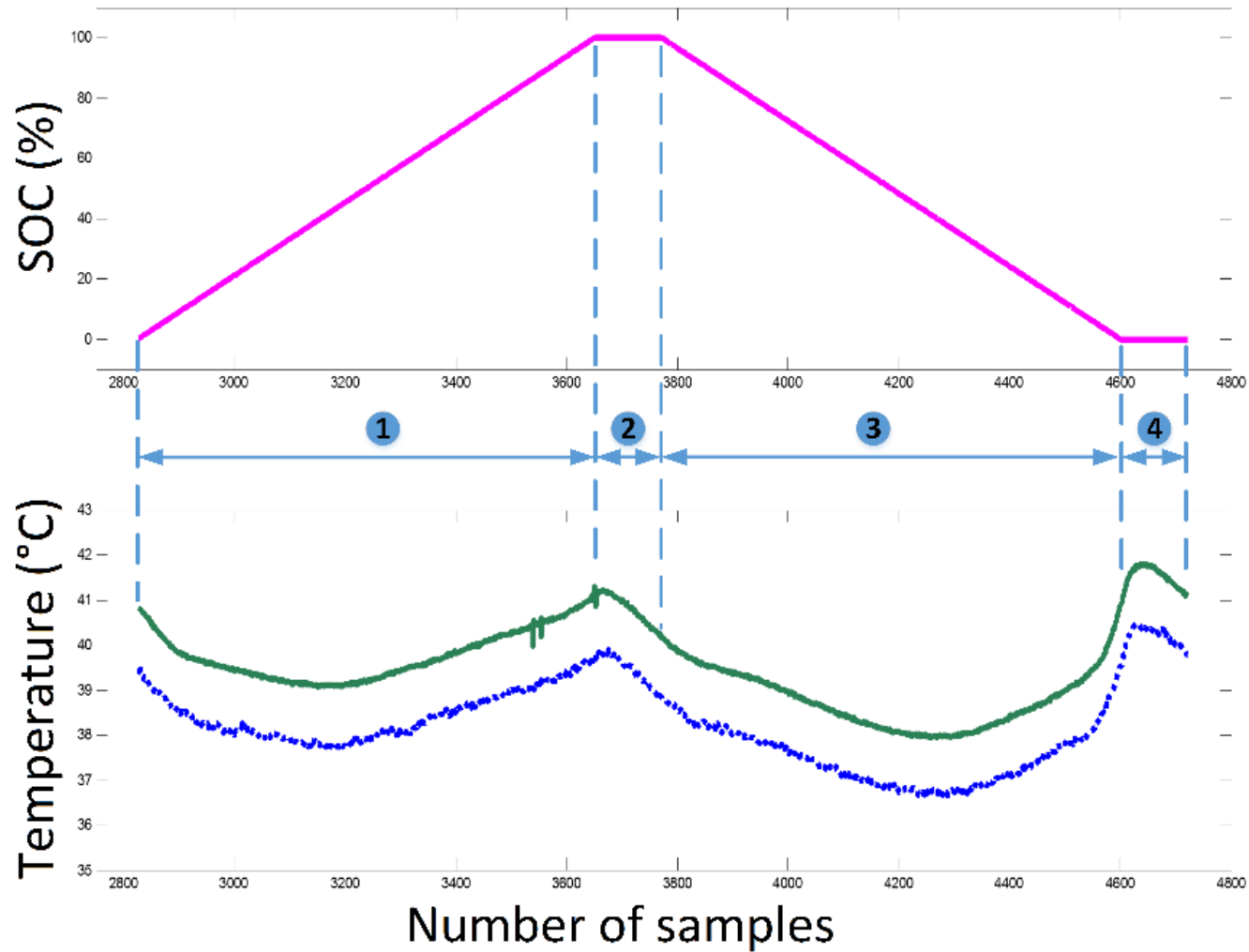
Power cell SOC modelling for intelligent virtual sensor implementation



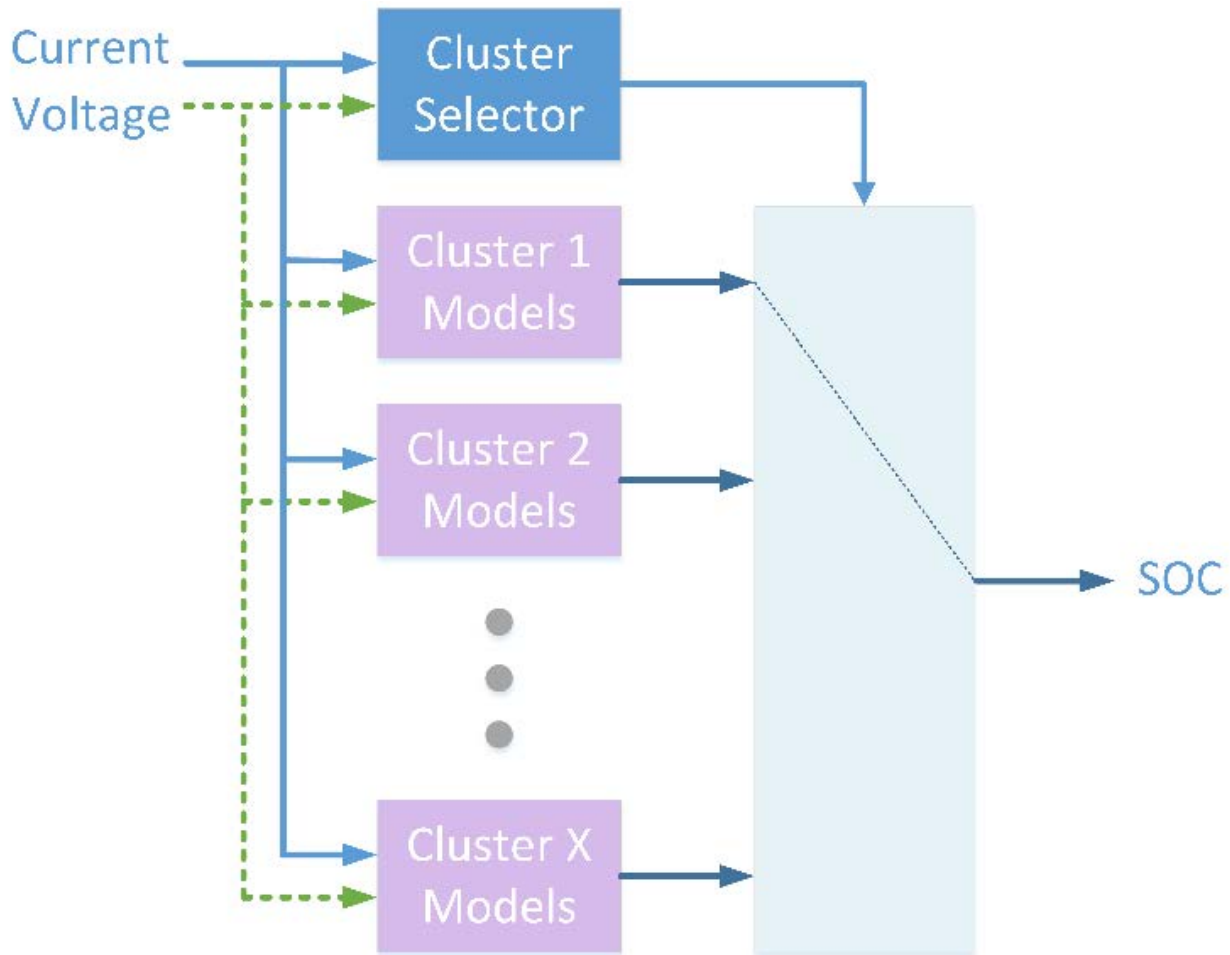
Power cell SOC modelling for intelligent virtual sensor implementation



Power cell SOC modelling for intelligent virtual sensor implementation



Power cell SOC modelling for intelligent virtual sensor implementation



Power cell SOC modelling for intelligent virtual sensor implementation

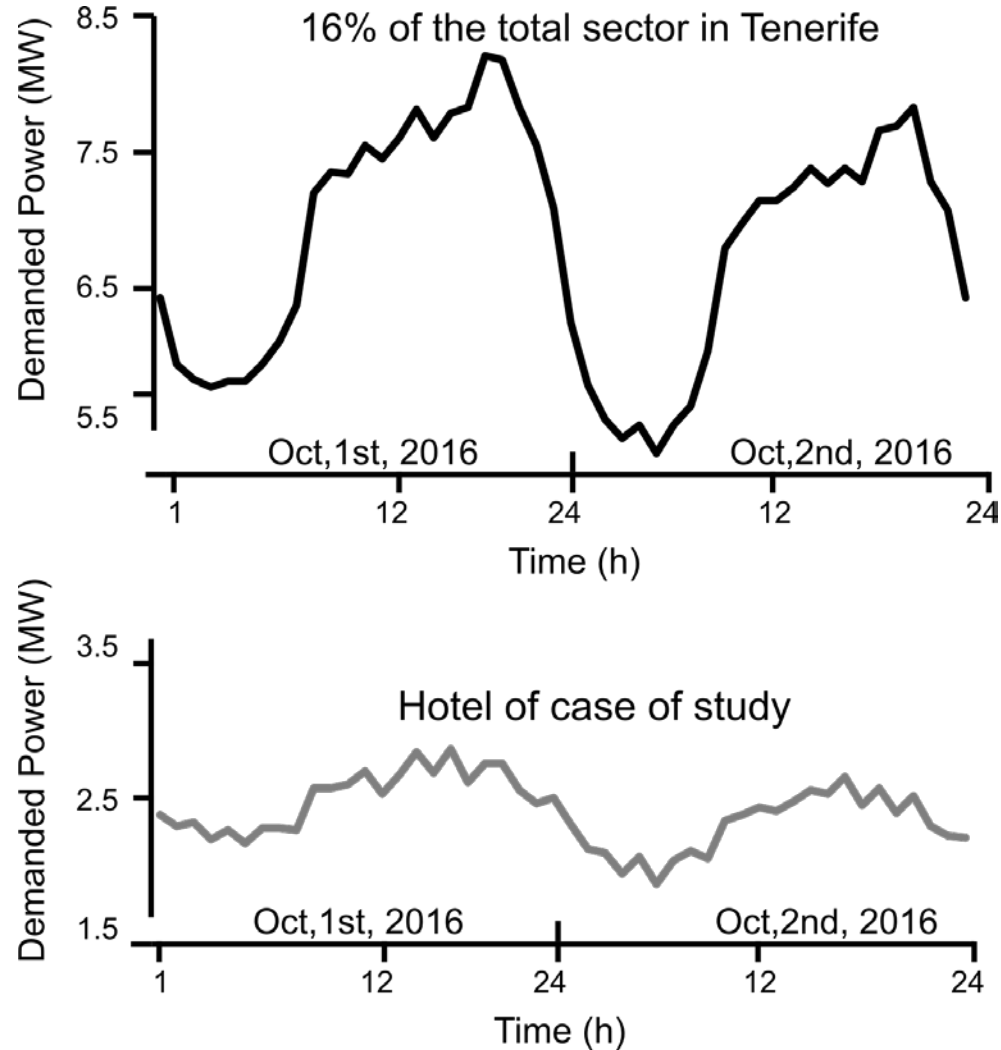
	Carga	Reposo	Descarga	Reposo
Muestras	6.619	1.089	7.451	1.211
ANN	0,1094	0,0921	0,4767	0,0917
Poly	23,997	0,0904	17,814	0,0930
LS-SVR	0,1392	0,0902	0,5052	0,0865
	ANN-10	LS-SVR	ANN-8	LS-SVR



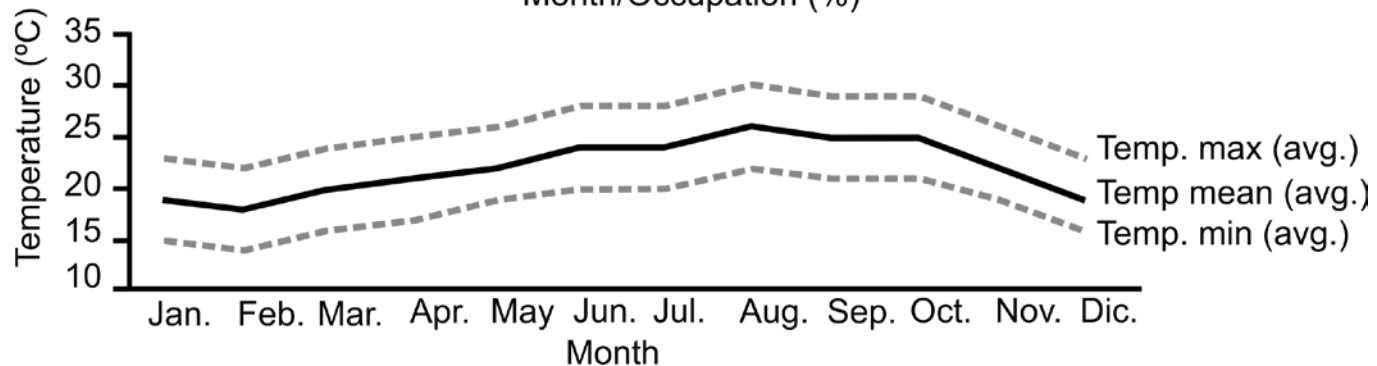
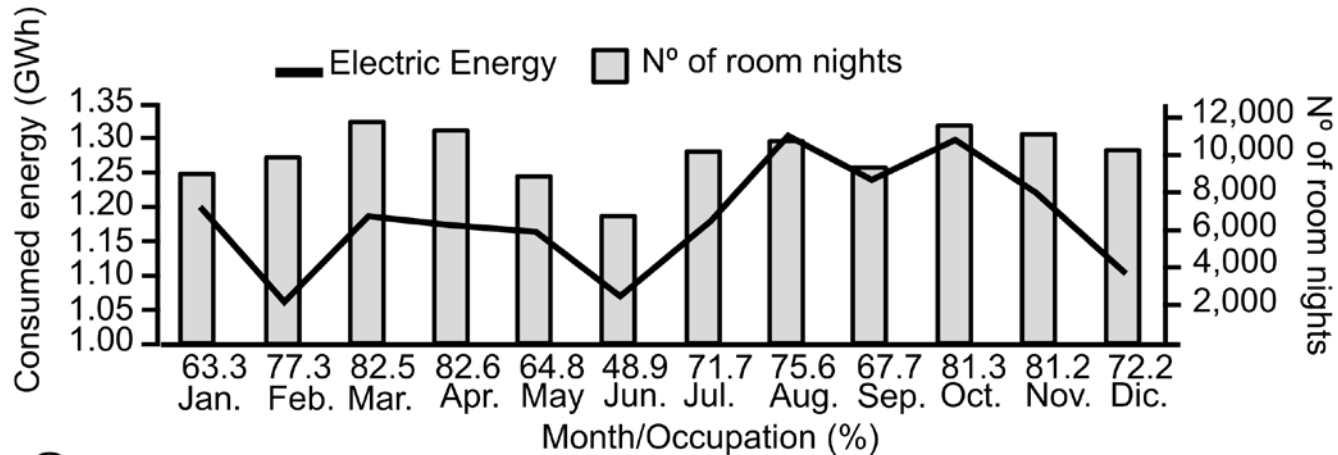
Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife



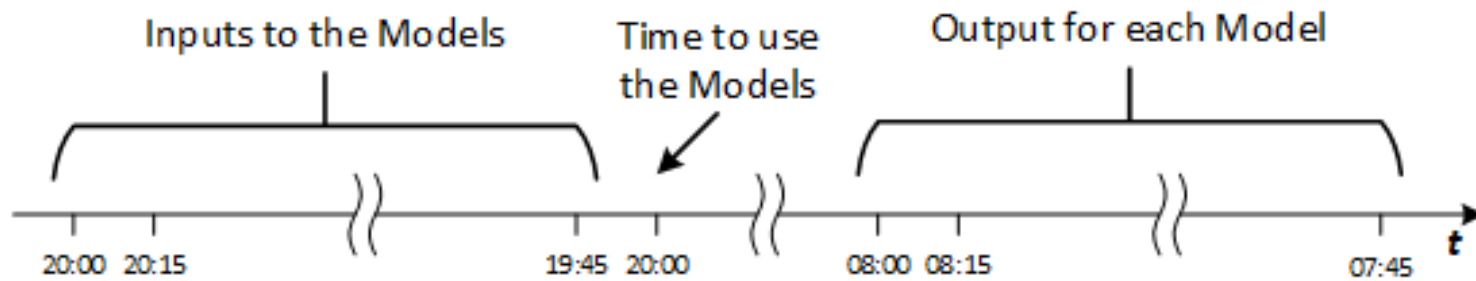
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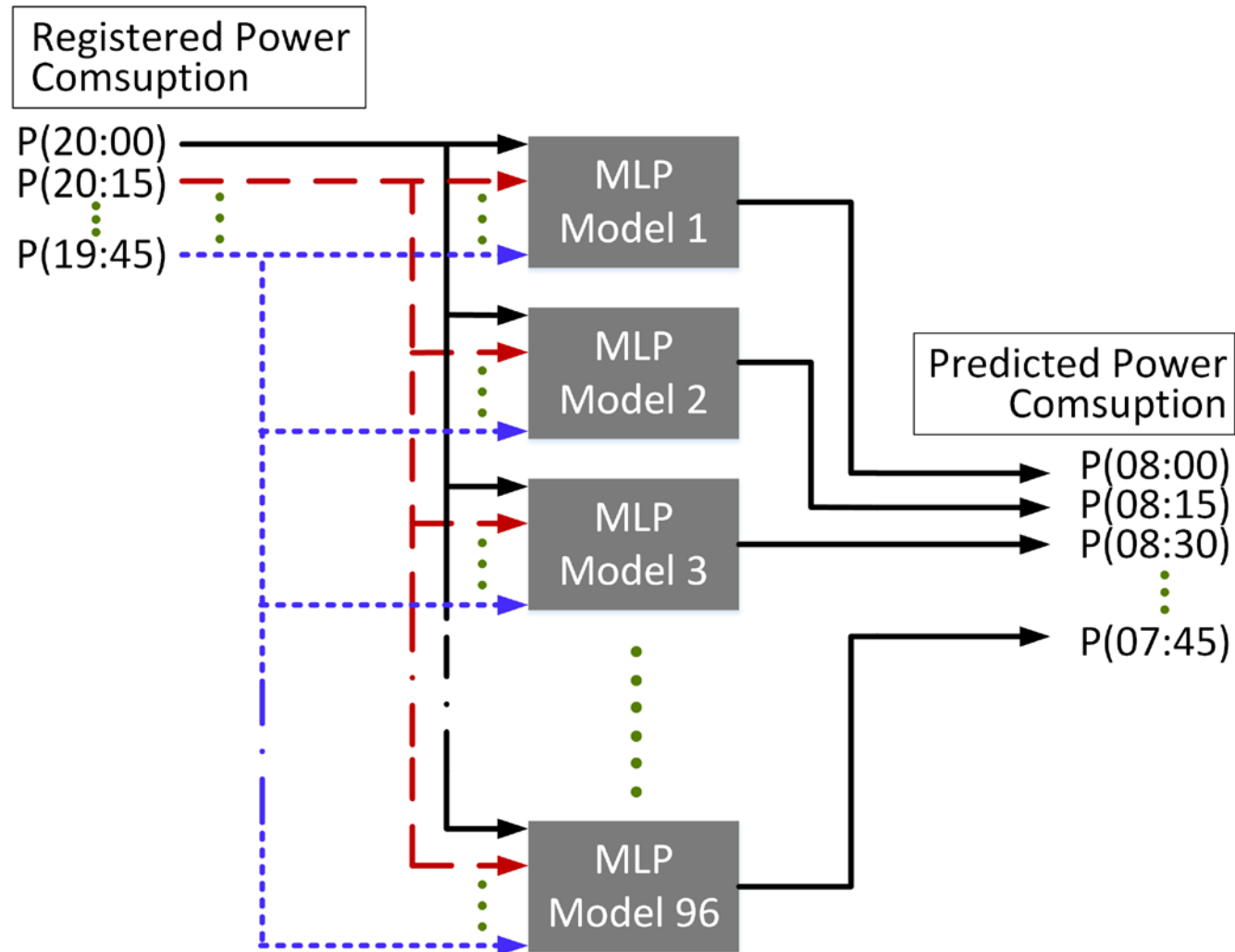
Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife



Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife



Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife

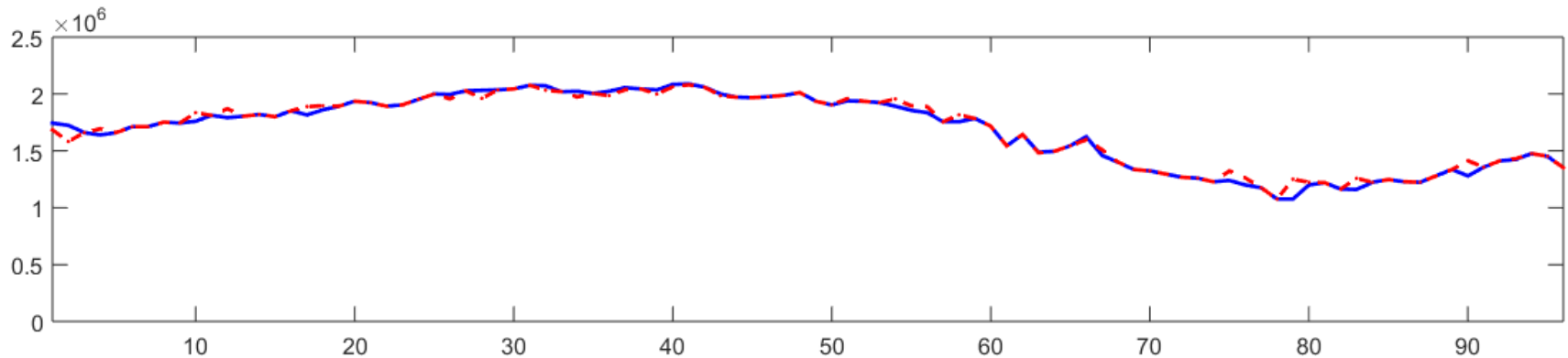
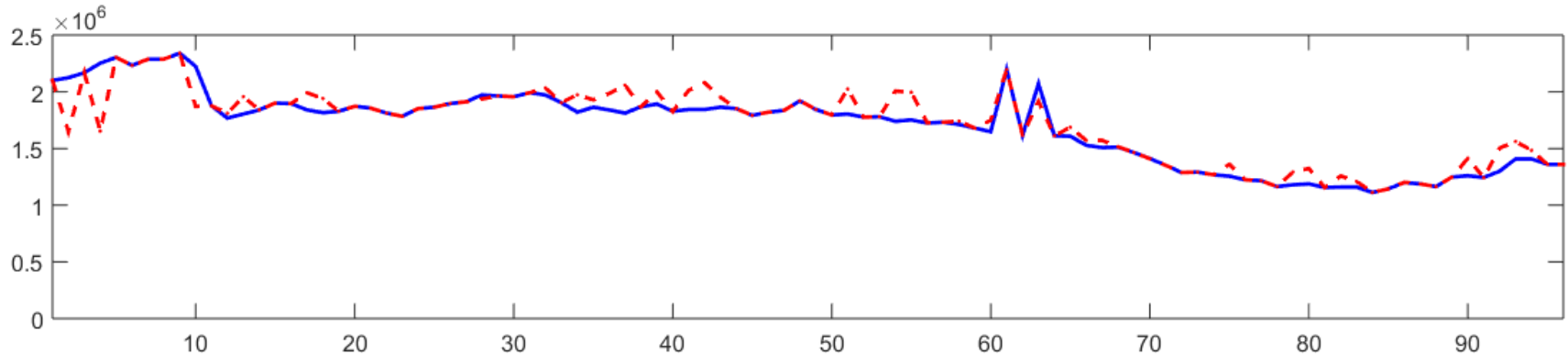


Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife

	MAE	MSE	Max.
Day 1	5.7391e+4	1.4214e+10	5.9734e+5
Day 2	2.3342e+4	2.7553e+9	2.1512e+5
Day 3	2.3618e+4	2.9911e+9	2.2468e+5
Day 4	1.9649e+4	2.0681e+9	2.0361e+5
Day 5	1.0874e+4	7.9320e+9	1.6466e+5
Day 6	1.8274e+4	1.5006e+9	1.7438e+5
Day 7	3.9412e+4	5.6905e+9	2.2109e+5
Day 8	1.7507e+4	1.4570e+9	1.5210e+5
Mean	2.6258e+4	3.9337e+9	2.4412e+5



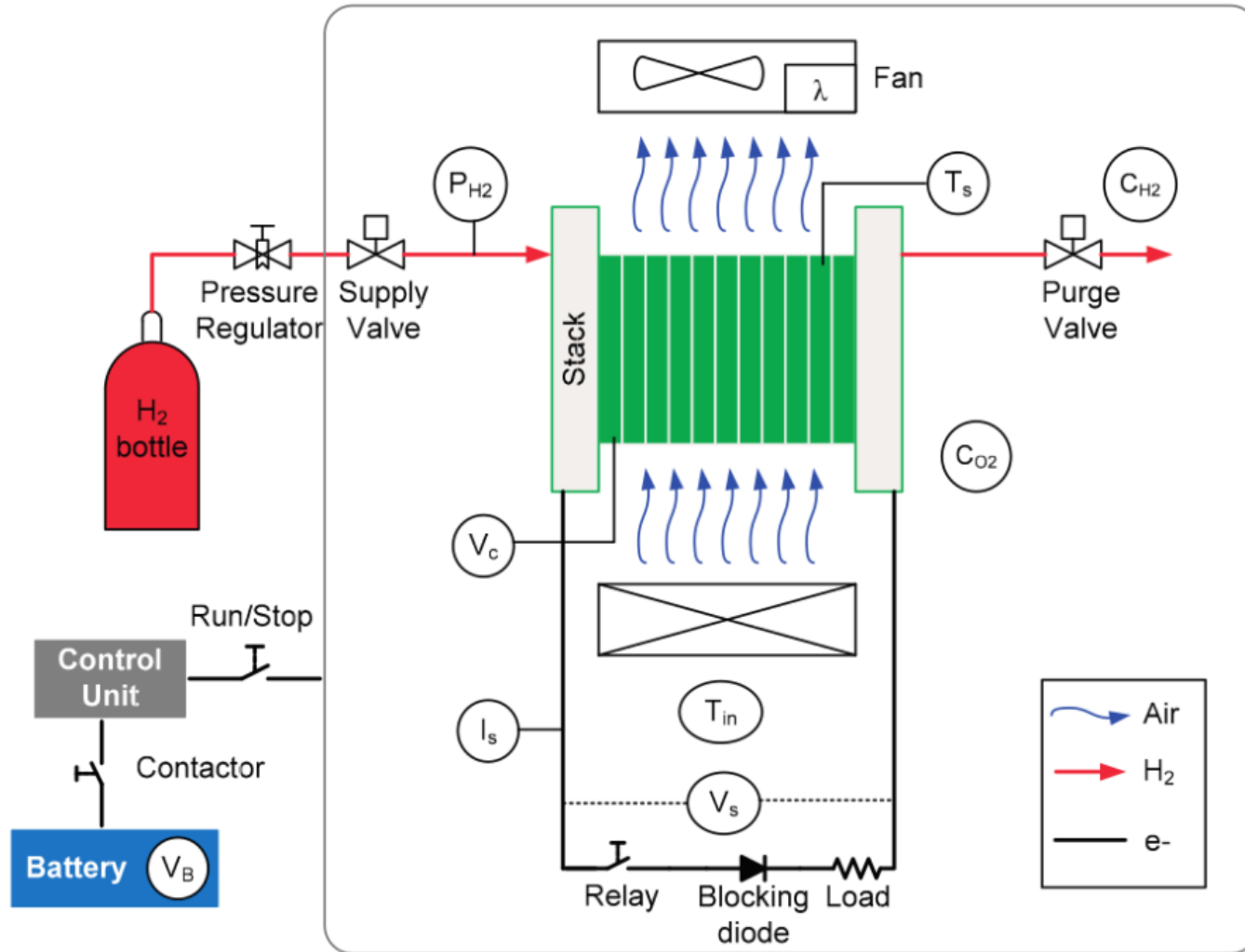
Prediction of the energy demand of a hotel using an artificial intelligence-based model: Luxury hotel in Tenerife



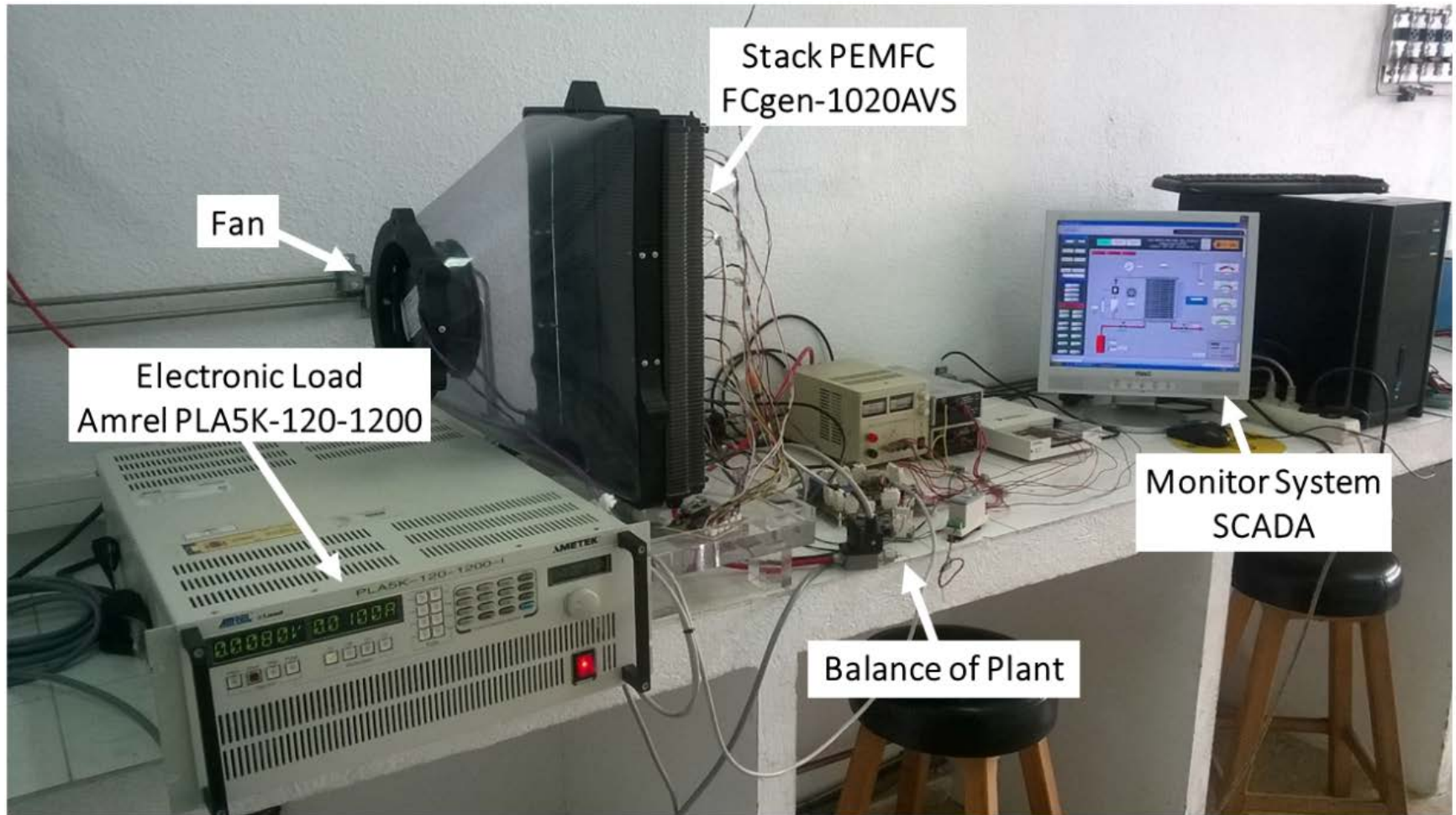
Fuel cell hybrid model for predicting hydrogen inflow through energy demand



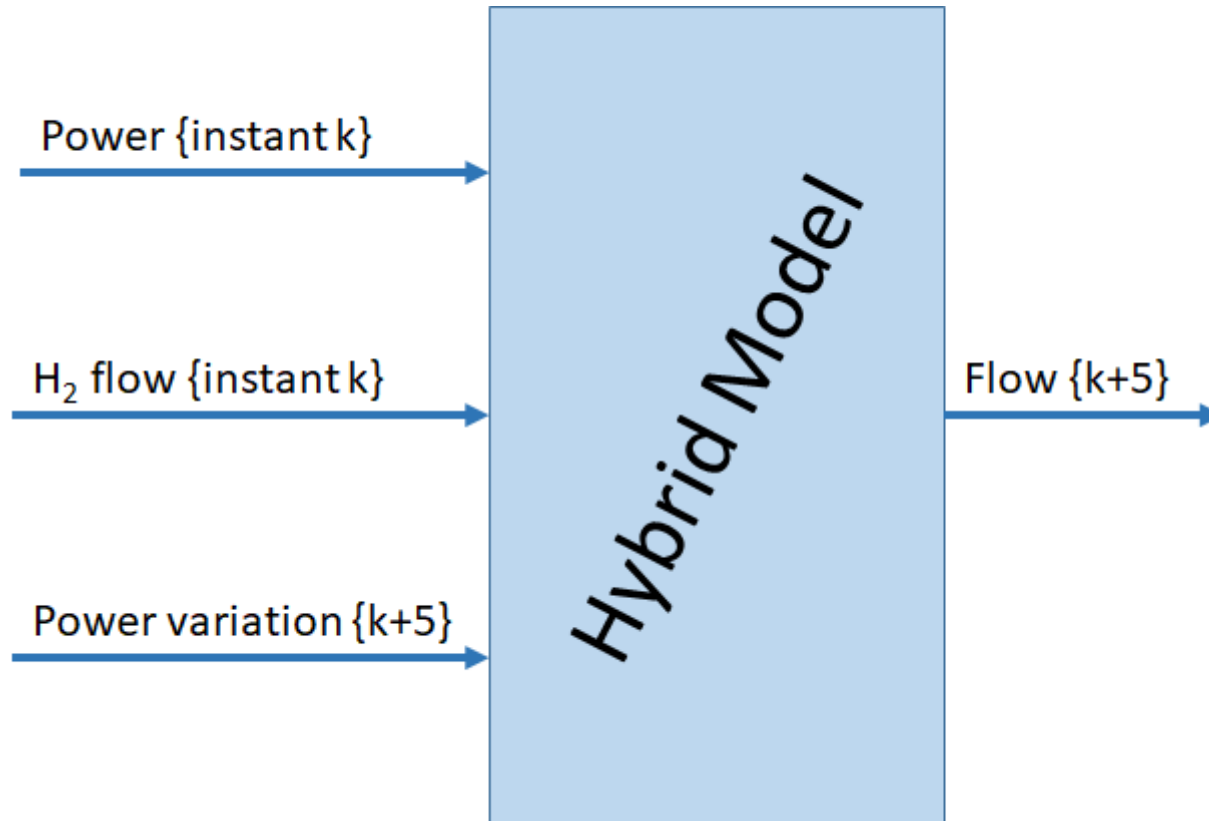
Fuel cell hybrid model for predicting hydrogen inflow through energy demand



Fuel cell hybrid model for predicting hydrogen inflow through energy demand



Fuel cell hybrid model for predicting hydrogen inflow through energy demand



Fuel cell hybrid model for predicting hydrogen inflow through energy demand

	CI-1	CI-2	CI-3	CI-4	CI-5	CI-6	CI-7	CI-8	CI-9	CI-10
Global	0.0123									
Hybrid 2	0.0108	0.0149								
Hybrid 3	0.0111	0.0130	0.0091							
Hybrid 4	0.0089	0.0073	0.0114	0.0122						
Hybrid 5	0.0269	0.0120	0.0054	0.0068	0.0124					
Hybrid 6	0.0269	0.0149	0.0121	0.0053	0.0072	0.0095				
Hybrid 7	0.1104	0.0026	0.0138	0.0123	0.0053	0.0069	0.0095			
Hybrid 8	0.1104	0.0027	0.0069	0.0092	0.0140	0.0121	0.0053	0,0071		
Hybrid 9	0.1104	0.0029	0.0199	0.0049	0.0069	0.0092	0.0108	0.0054	0.0069	
Hybrid 10	0.1104	0.0069	0.0027	0.0162	0.0040	0.0068	0.0094	0.0068	0.0122	0.0054

	CI-1	CI-2	CI-3	CI-4	CI-5	CI-6	CI-7	CI-8	CI-9	CI-10
Global	ANN12									
Hybrid 2	ANN14	Poly1								
Hybrid 3	ANN14	ANN12	ANN13							
Hybrid 4	ANN11	ANN11	Poly1	ANN11						
Hybrid 5	Poly1	Poly2	Poly1	ANN12	ANN11					
Hybrid 6	Poly2	ANN13	Poly2	Poly1	ANN14	ANN13				
Hybrid 7	Poly1	ANN11	ANN13	Poly1	Poly1	ANN15	ANN11			
Hybrid 8	Poly1	ANN15	ANN13	ANN14	ANN11	Poly2	Poly1	ANN14		
Hybrid 9	Poly1	ANN13	ANN11	ANN15	ANN15	ANN15	ANN13	Poly1	ANN15	
Hybrid 10	Poly1	ANN15	ANN14	ANN11	ANN15	ANN13	ANN12	ANN14	Poly1	Poly1



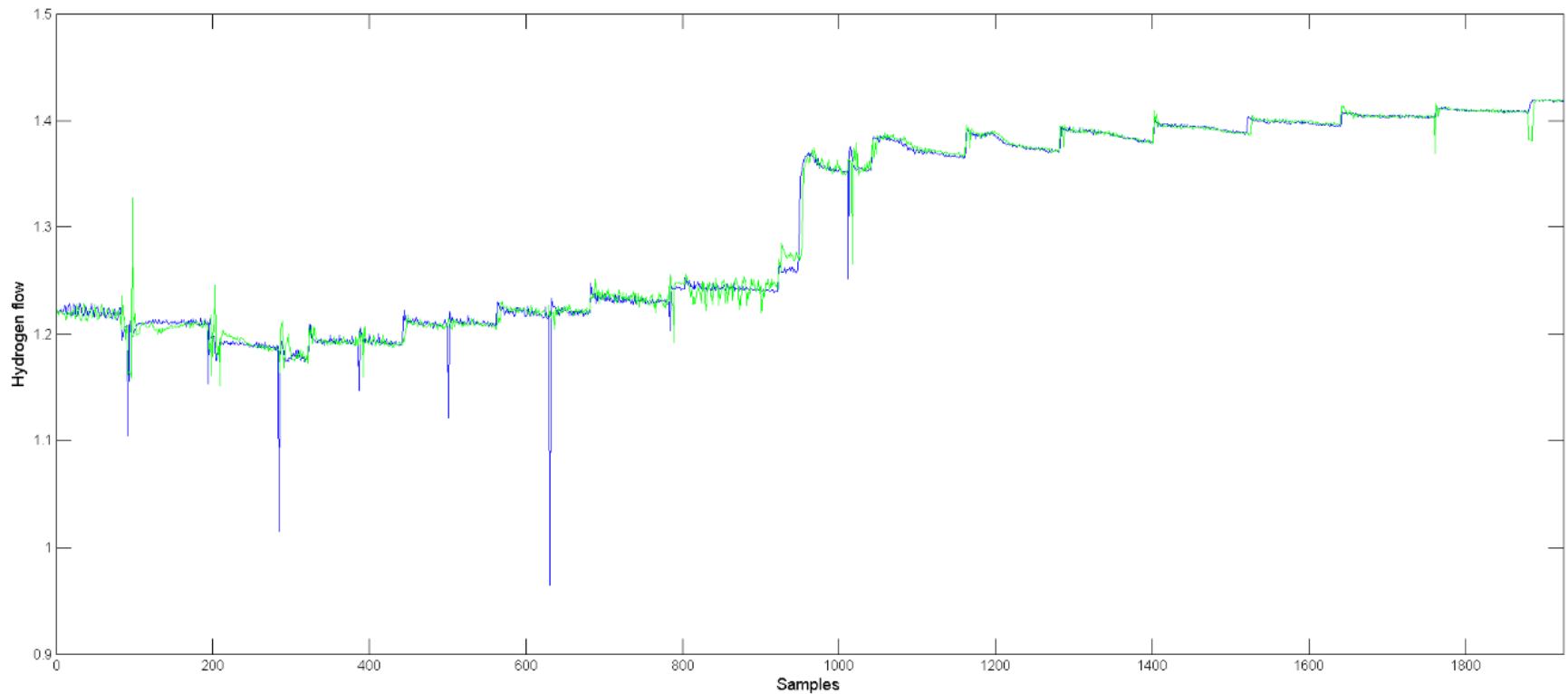
Fuel cell hybrid model for predicting hydrogen inflow through energy demand

Global	Hybrid Model (Local Models)								
	2	3	4	5	6	7	8	9	10
0.1403	0.1405	0.1466	0.2567	0.6253	0.9691	0.3424	0.1204	0.2638	0.2015



Fuel cell hybrid model for predicting hydrogen inflow through energy demand

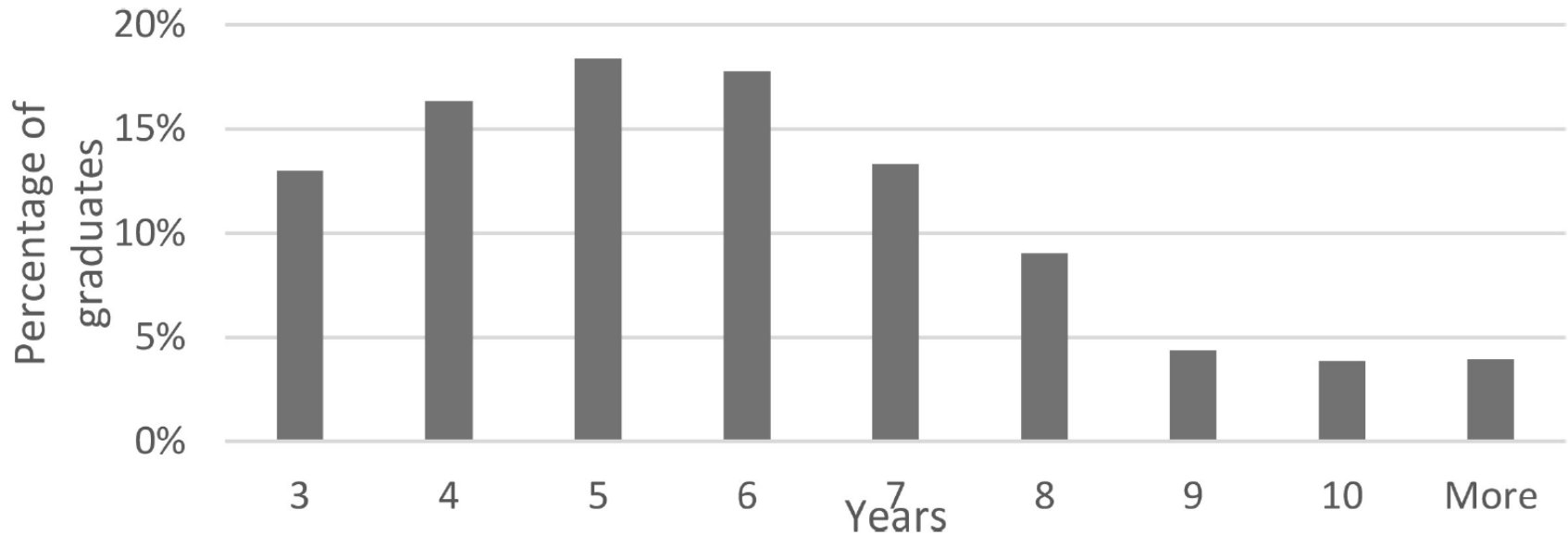
Global	Hybrid Model (Local Models)									
	2	3	4	5	6	7	8	9	10	
0.1403	0.1405	0.1466	0.2567	0.6253	0.9691	0.3424	0.1204	0.2638	0.2015	



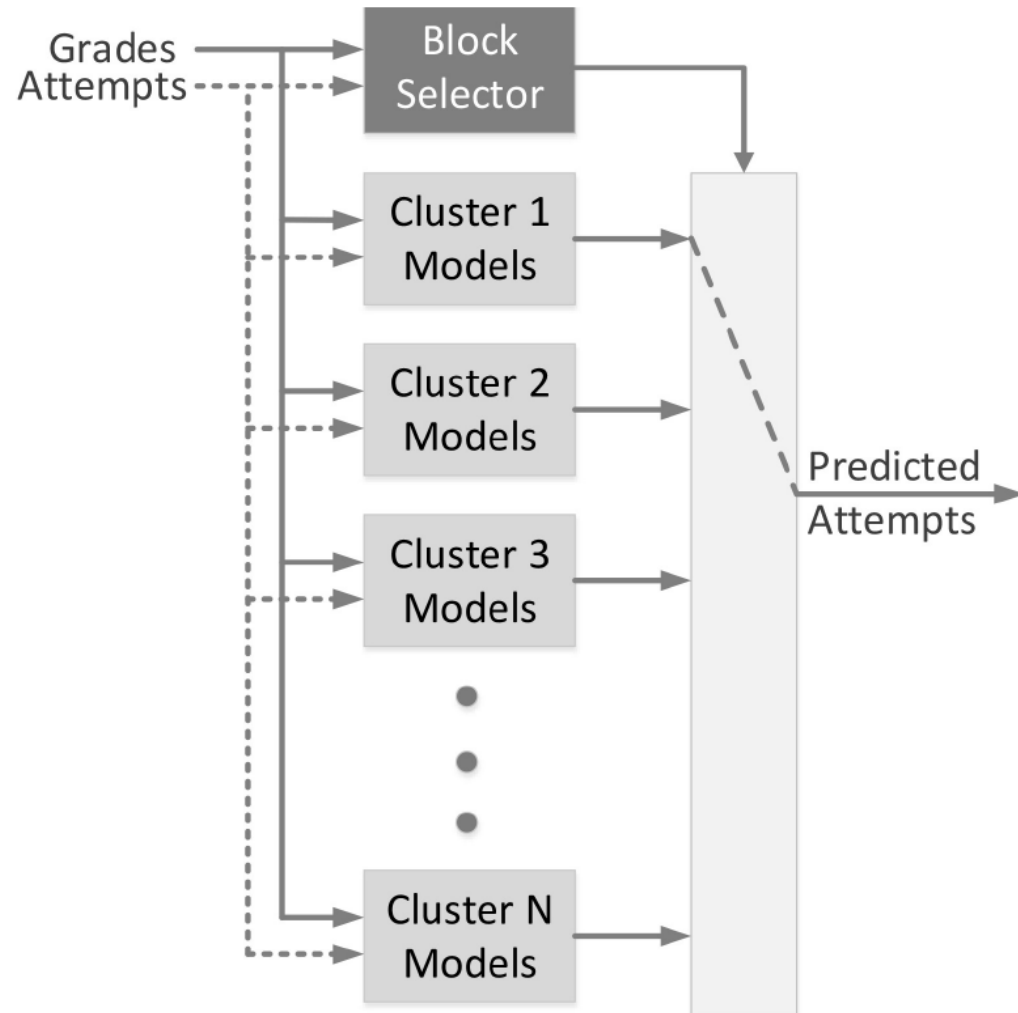
Hybrid intelligent system to predict the individual academic performance o engineering students



Hybrid intelligent system to predict the individual academic performance o engineering students



Hybrid intelligent system to predict the individual academic performance o engineering students



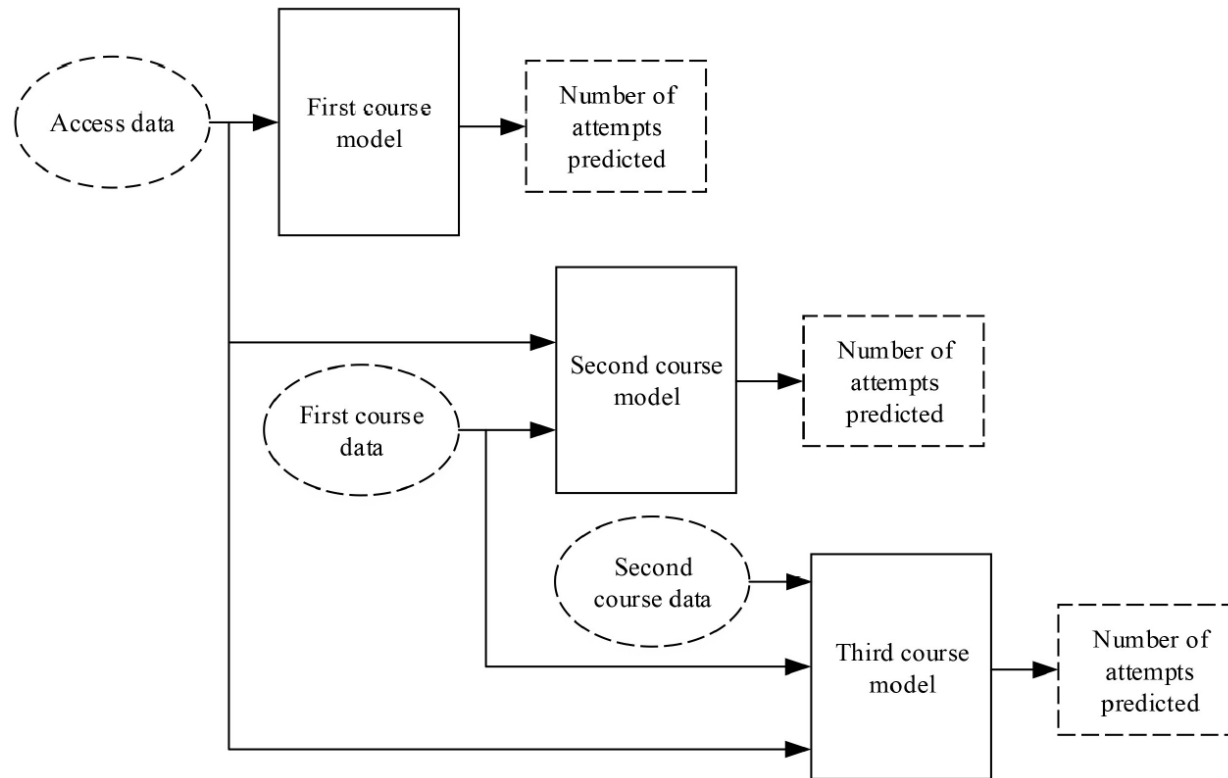
Hybrid intelligent system to predict the individual academic performance of engineering students

Academic Record							
Student code	Access method	Admission grade	Subject 1		...	Subject n	
			Grade	Attempts		Grade	Attempts
22002	H. school	7.5	8.5	1		6	2
32002	A. degree	7.0	5.0	3		8.0	1

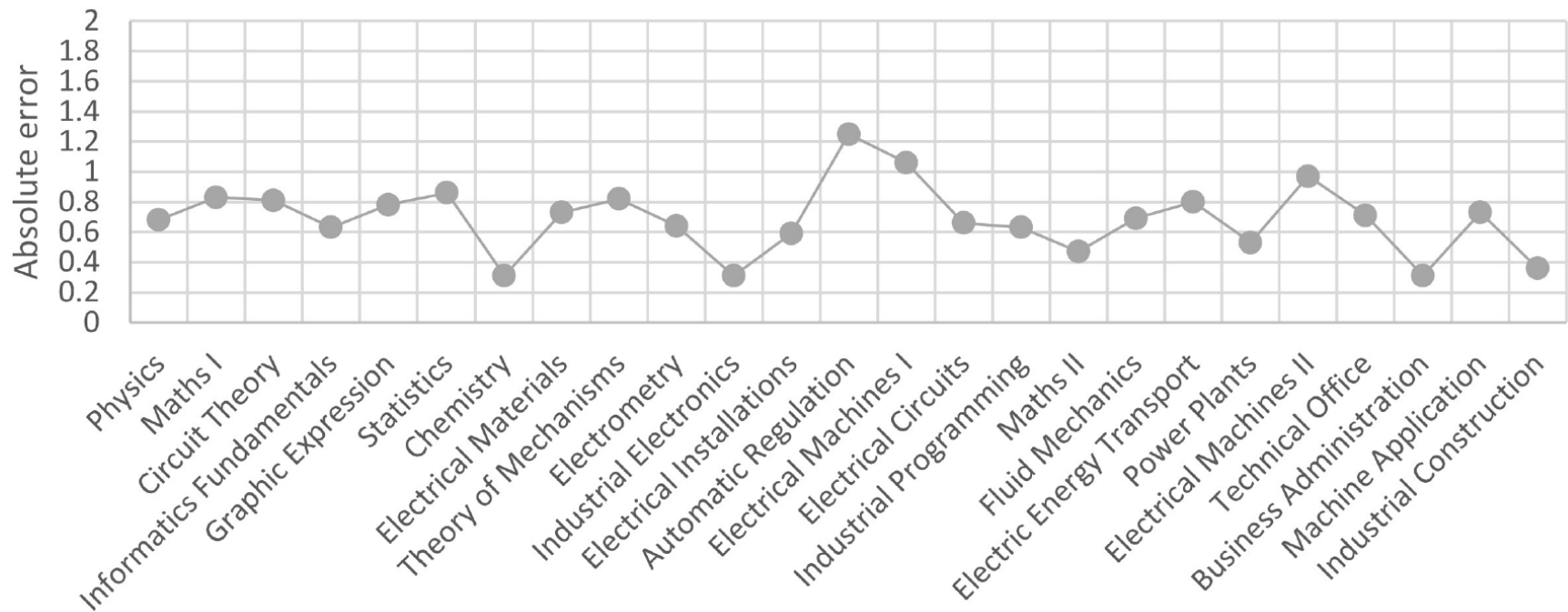


Hybrid intelligent system to predict the individual academic performance of engineering students

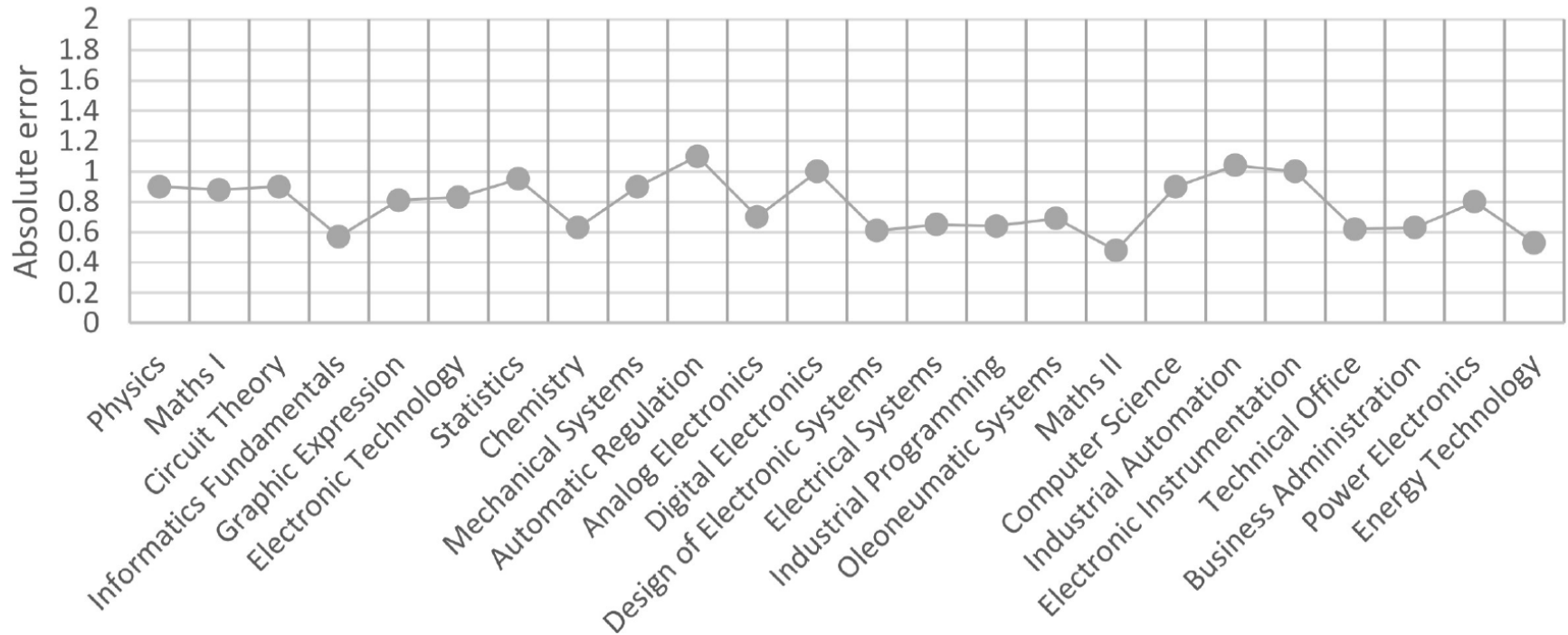
Academic Record							
Student code	Access method	Admission grade	Subject 1		...	Subject n	
			Grade	Attempts		Grade	Attempts
22002	H. school	7.5	8.5	1		6	2
32002	A. degree	7.0	5.0	3		8.0	1



Hybrid intelligent system to predict the individual academic performance o engineering students



Hybrid intelligent system to predict the individual academic performance of engineering students





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Turno de preguntas

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