## Redes Neuronales

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#### Variables del diseño

- Arquitectura
  - Capas
  - Neuronas
- Batch vs Incremental
- Factor de aprendizaje
- Épocas
- Modificaciones a backpropagation
  - η adaptativo
  - Momentum

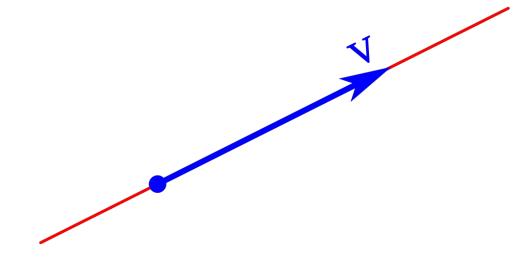
### Inicialización de los pesos

- Constante
- Constante que depende de las entradas
- Al azar dependiendo de las entradas
  - $\circ$  Media ( $\mu$ ) = 0
  - Desviación estándar (σ) = 1 / sqrt(#Entradas)



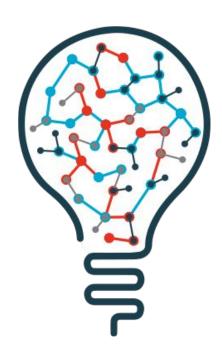
#### Normalización de la entrada

- f(x) = a + (x A) \* (b a) / (B A)
- Dividir por la norma



#### Métricas

- Error cuadrático medio
  - De aprendizaje
  - o De prueba
- Evolución del factor de aprendizaje



#### Mejoras utilizadas

η adaptativo

$$\Delta \eta = \begin{cases} +a & si \ \Delta E < 0 \\ -b\eta & si \ \Delta E > 0 \\ 0 & en \ otro \ caso \end{cases}$$

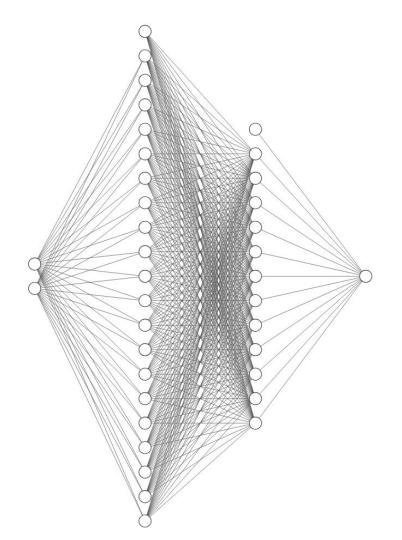
Momentum

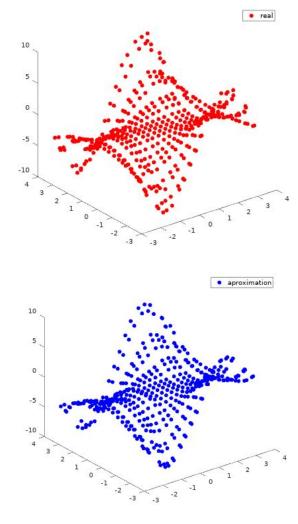
$$\Delta w_{pq}(t+1) = -\eta \frac{\partial E}{\partial w_{pq}} + \alpha \Delta w_{pq}(t)$$

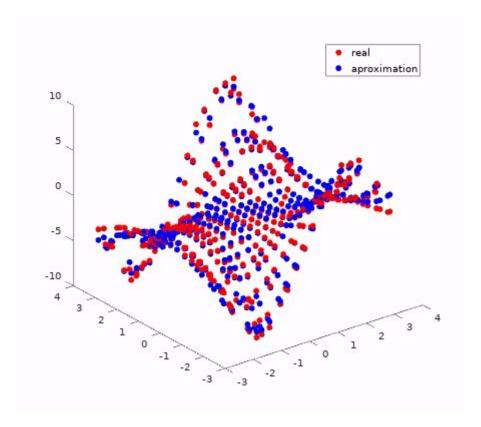
## Resultados

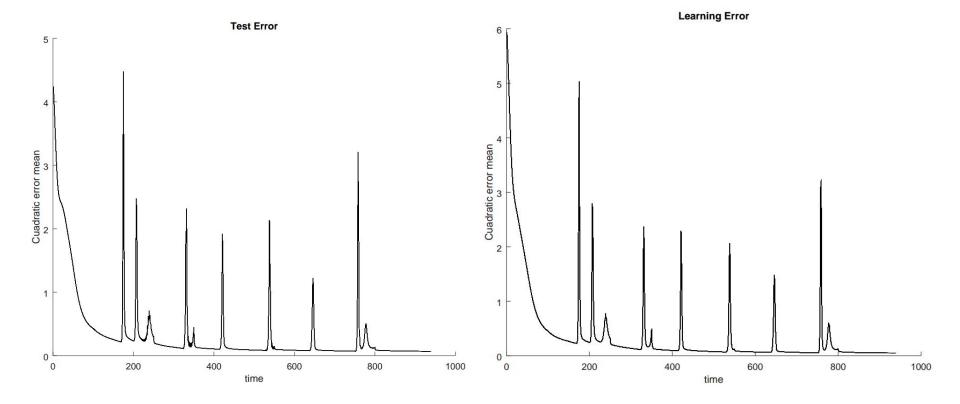
#### CONFIGURACIÓN

learningRate	0.0001
adaptiveLearningRate	1
timesLR	50
incLR	0.00005
decLR	0.25
momentum	Θ
momentumRate	0.9
maxError	0.05
epoch	1000
debugTimes	Inf
deltaWCalculation	batch
beta	1
gamma	Θ
function	tanh
betaLast	1
gammaLast	Θ
functionLast	linear
learningSamplePercentage	0.7
testingSample	terrain02.data
qtyNeuronsInLayer1	2
qtyNeuronsInLayer2	20
qtyNeuronsInLayer3	10
qtyNeuronsInLayer4	1

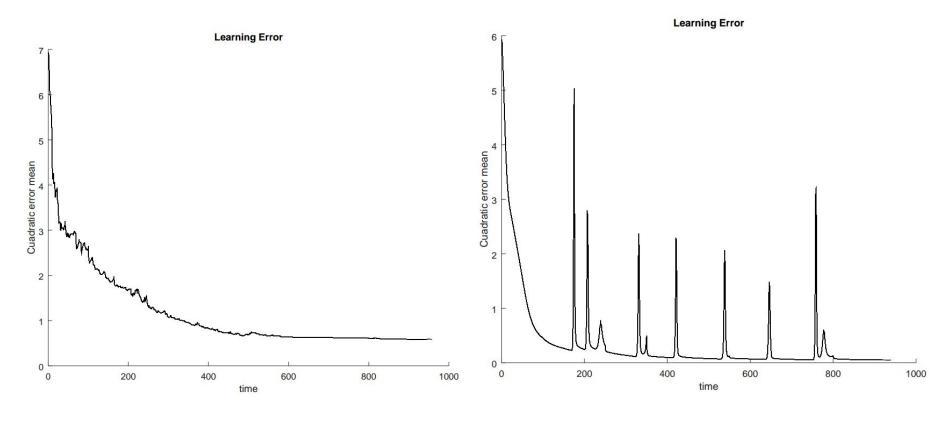






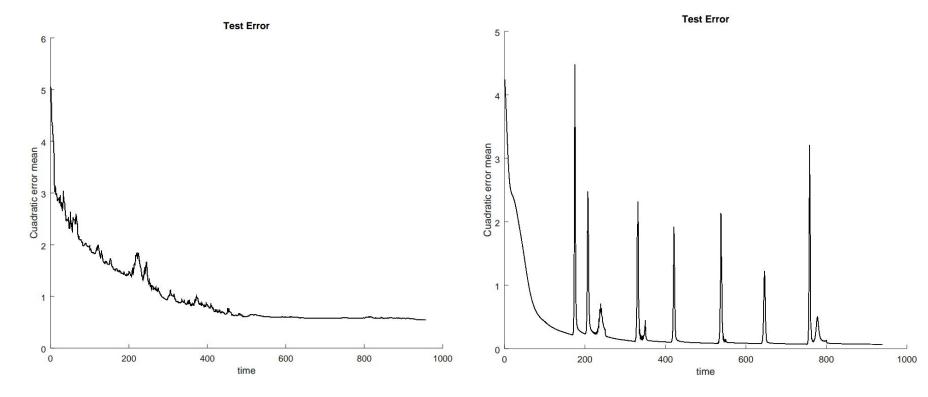


Test Error = 0.067393



Incremental

Batch

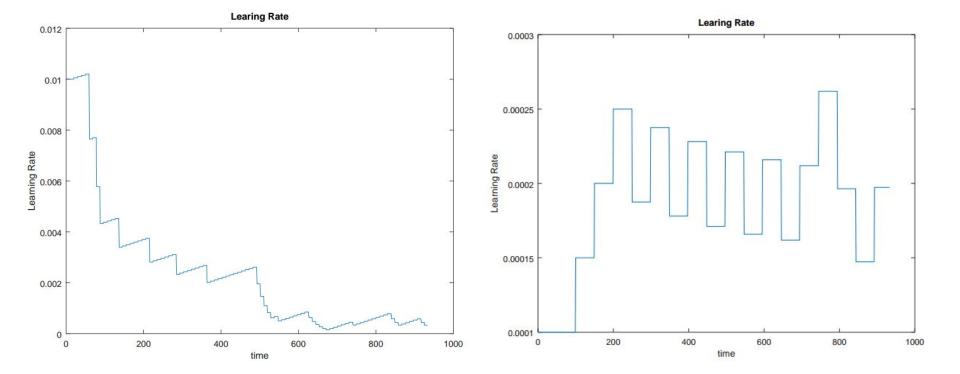


Incremental

Test Error = 0.54764

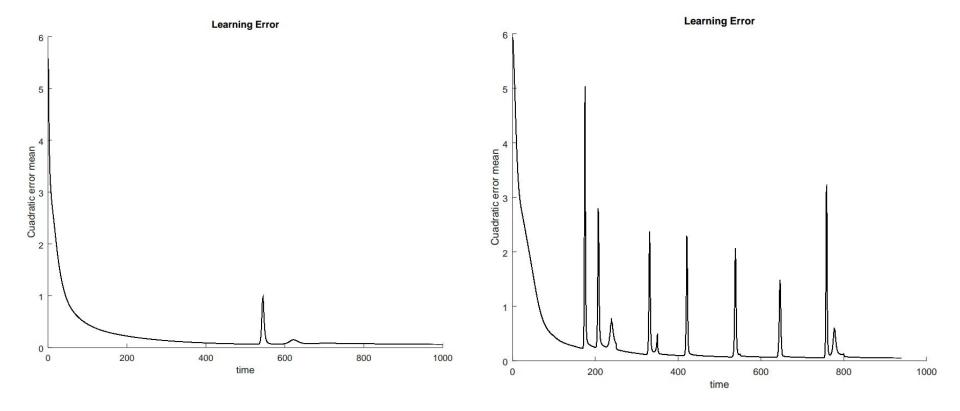
Batch

Test Error = 0.067393



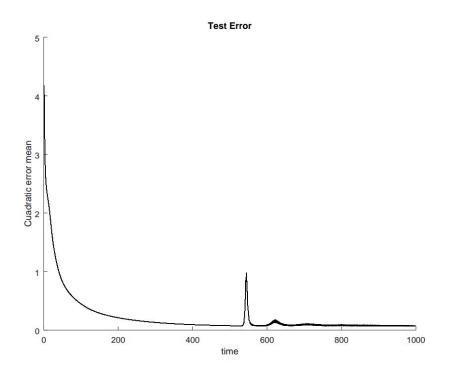
Incremental

Batch



**Constant** learning rate & without Momentum

Adaptive learning rate & without Momentum



5 r Cuadratic error mean 200 400 600 800 1000 time

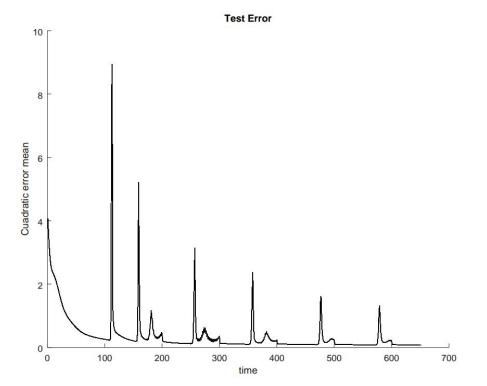
**Test Error** 

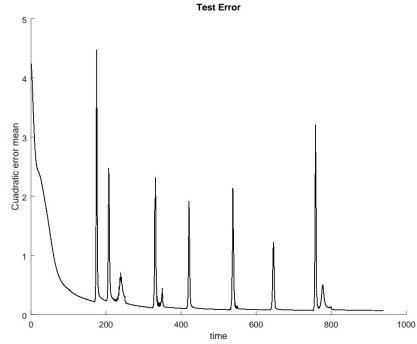
**Constant** learning rate & without Momentum

Adaptive learning rate & without momentum

Test Error = 0.068420

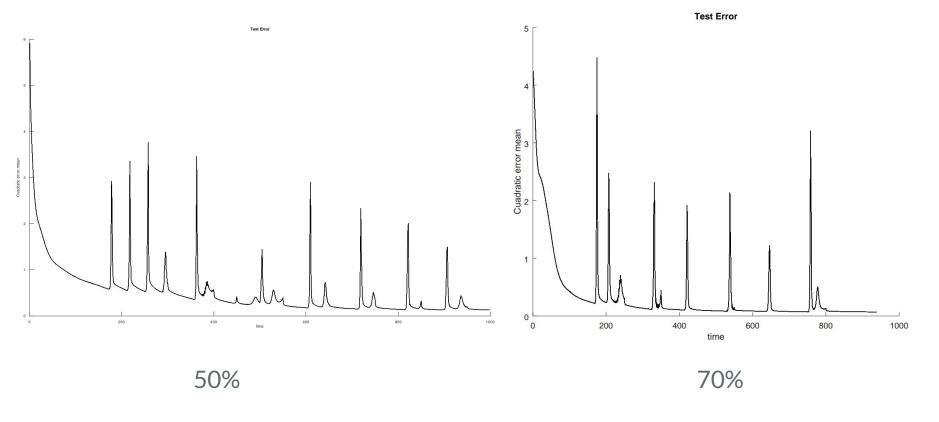
Test Error = 0.067393





With momentum

Without momentum



Test Error = 0.13105

Test Error = 0.067393

# ¿Preguntas?