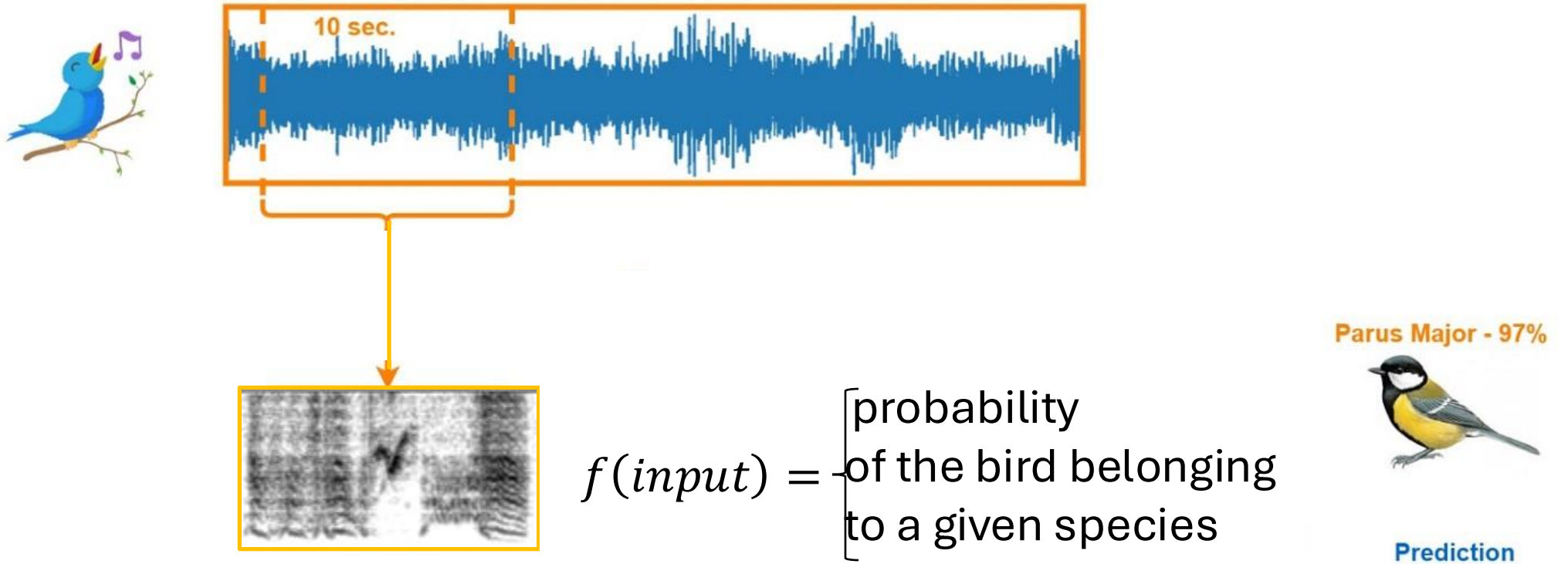


**Birdnet** translates sound into images  
sends the info to a **fitted function**  
that was trained to classify,  
and the result is sent out  
to your phone

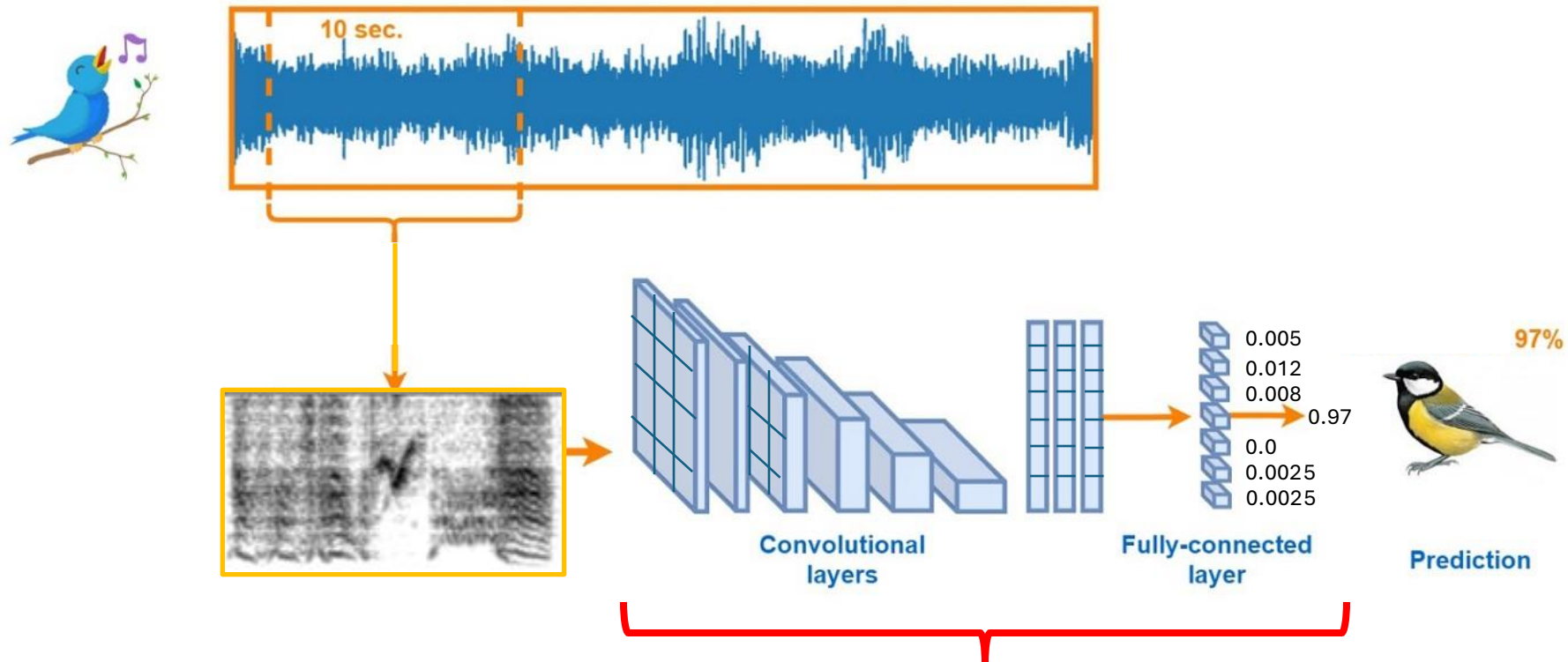
# What is inside the “brain” that classifies a species in birdnet ?

(demystifying AI)



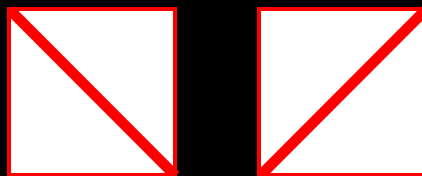
# What is inside the “brain” that classifies a species in birdnet ?

## (Demystifying AI)

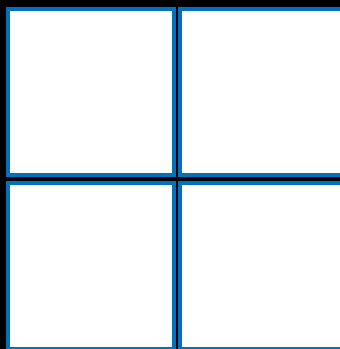


The computational device used to build this function is called  
**Neural network**

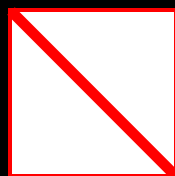
Sea un mundo con un alfabeto de dos símbolos



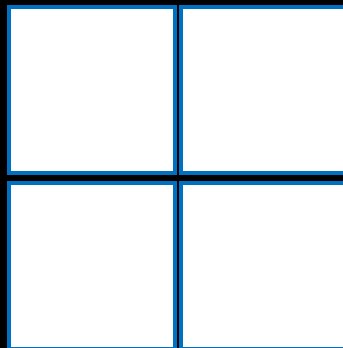
Y tenemos para representarlos, imagenes de 4 pixels



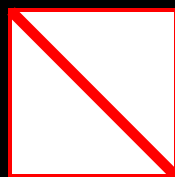
Para representar este simbolo



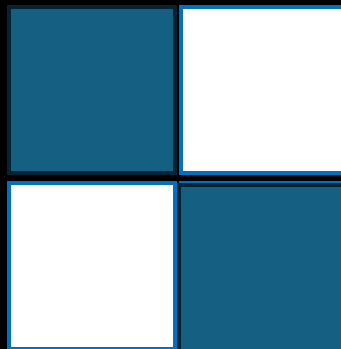
Con esta pantalla...



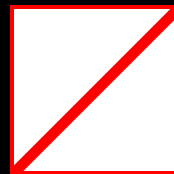
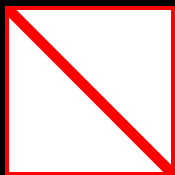
Para representar este simbolo



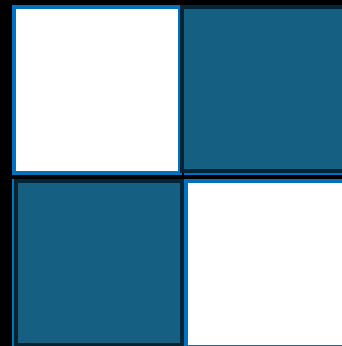
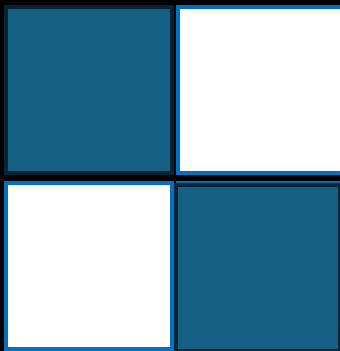
Marcamos los pixeles  
de la diagonal



Para representar este simbolo

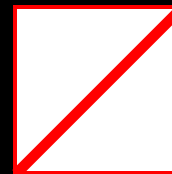
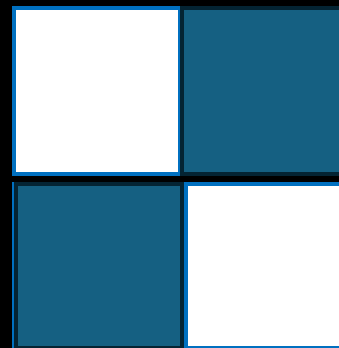
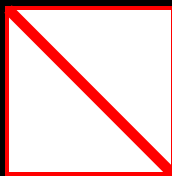
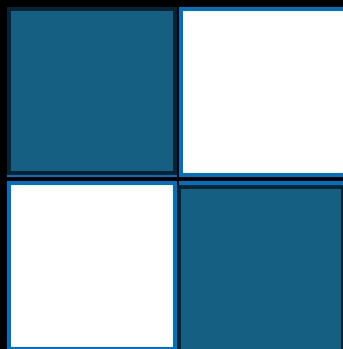


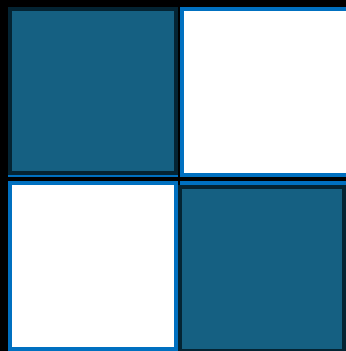
Marcamos los pixeles  
de la diagonal



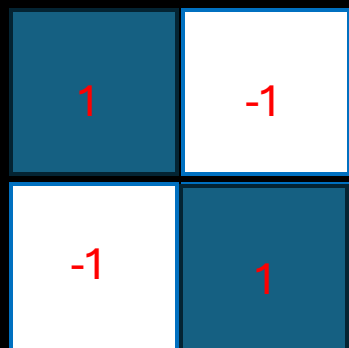


Ahora, queremos un algoritmo  
que, si le damos las imagenes,  
Identifiquen al simbolo.



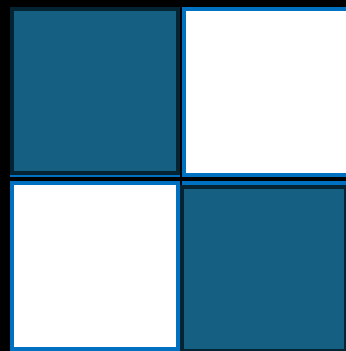


Traducimos  
a numeros

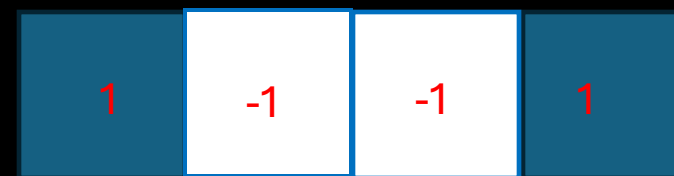
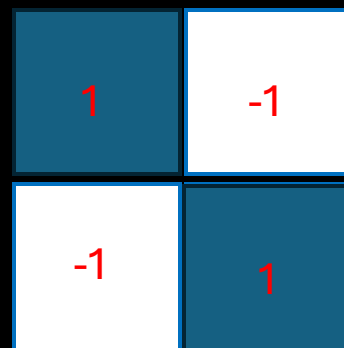


$(1, -1, -1, 1)$

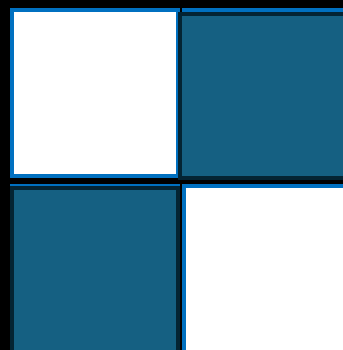
Traducimos  
a un vector



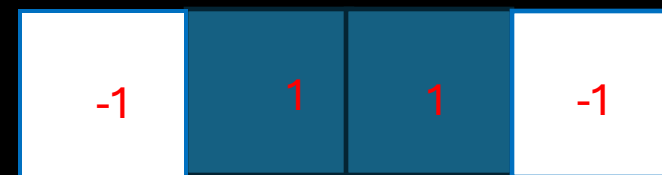
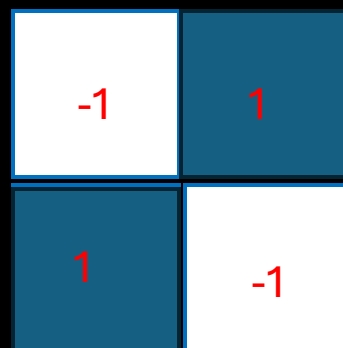
Traducimos  
a numeros



$(1, -1, -1, 1)$

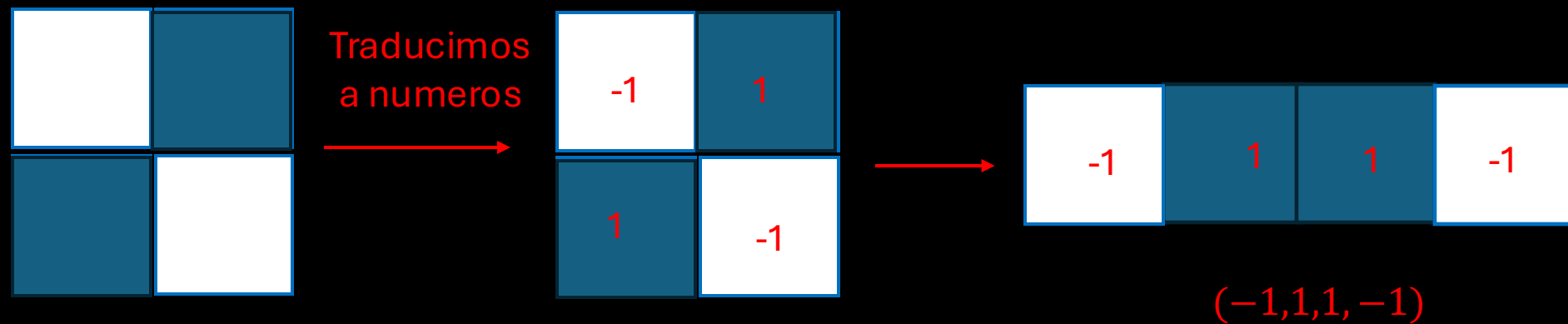
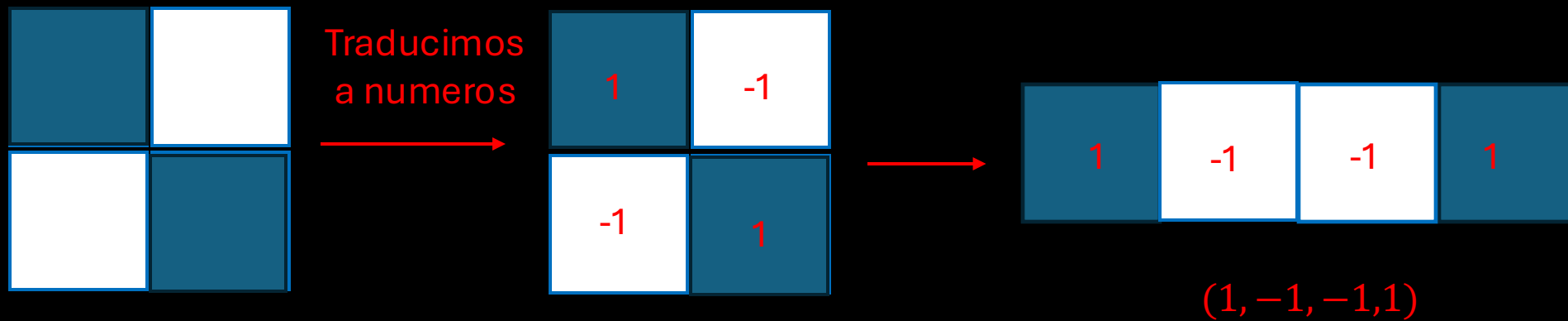


Traducimos  
a numeros

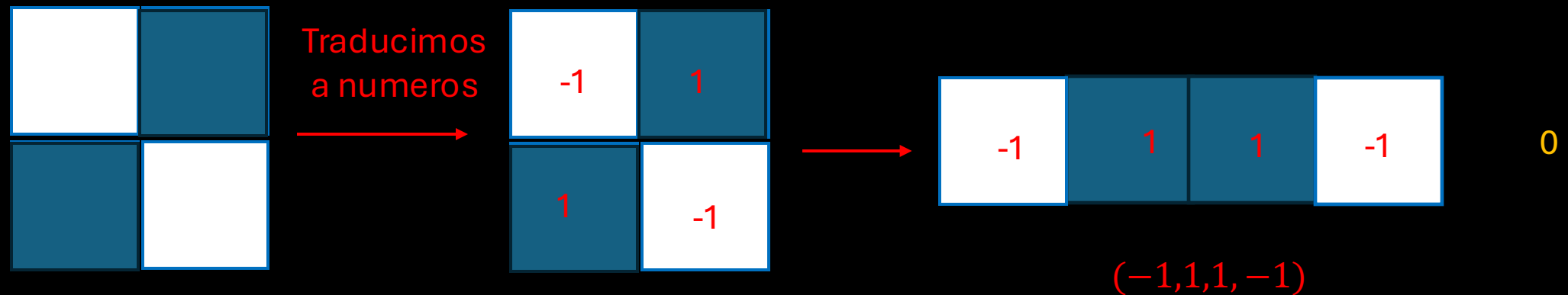
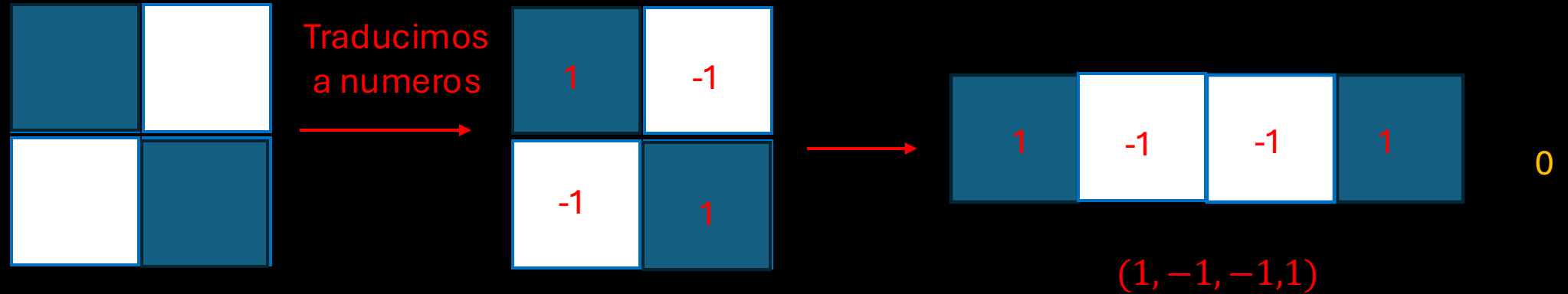


$(-1, 1, 1, -1)$

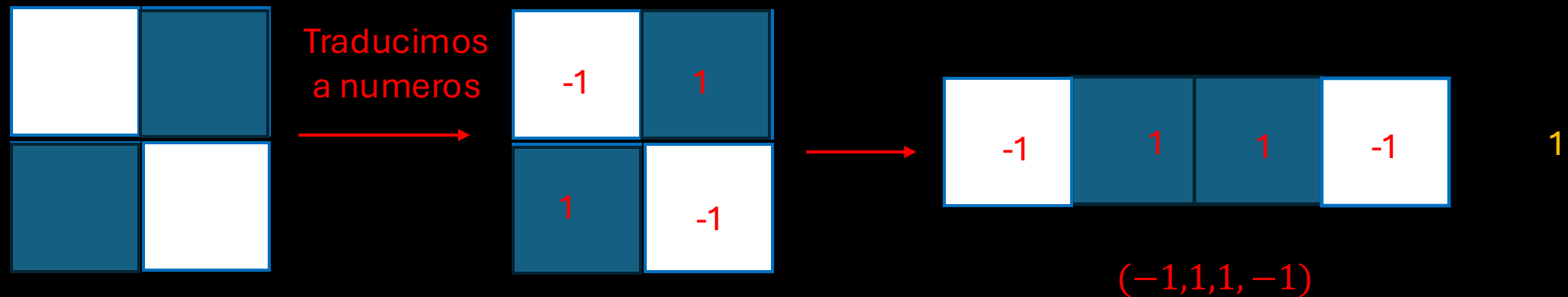
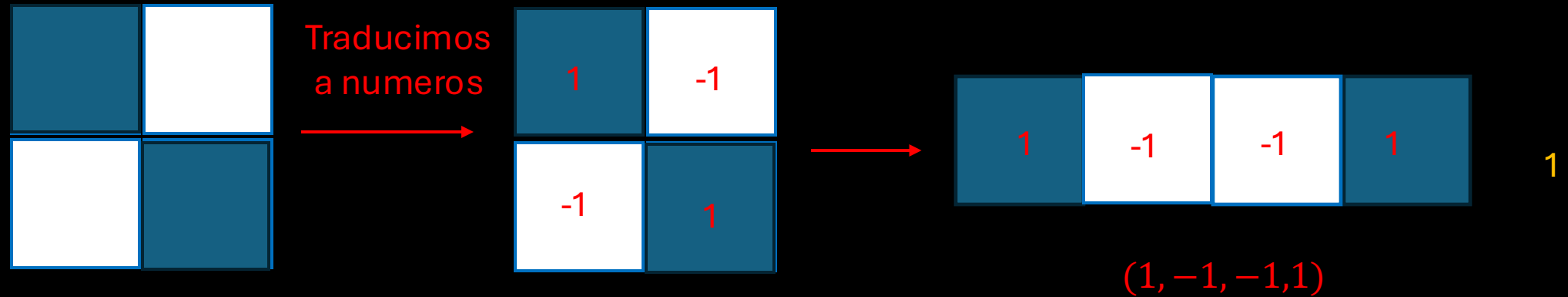
Podemos definir una operacion sobre estos numeros  
para poder distinguir/separar los vectores?



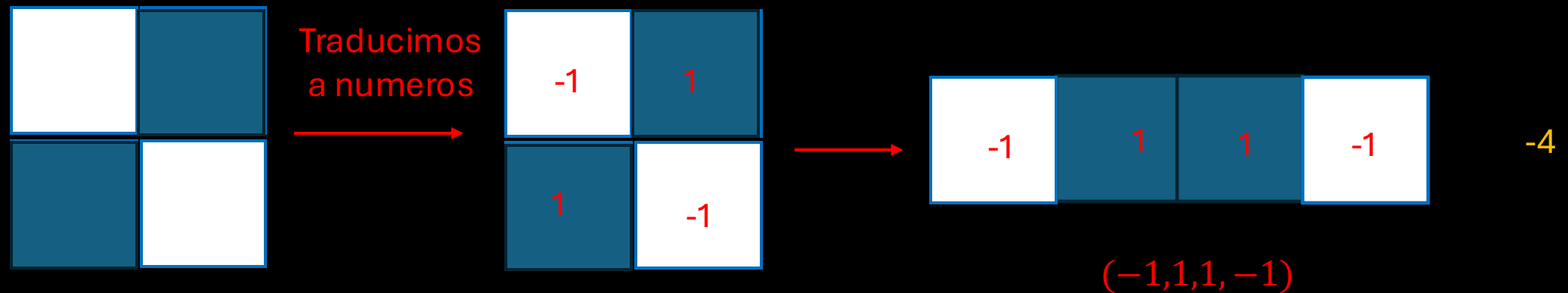
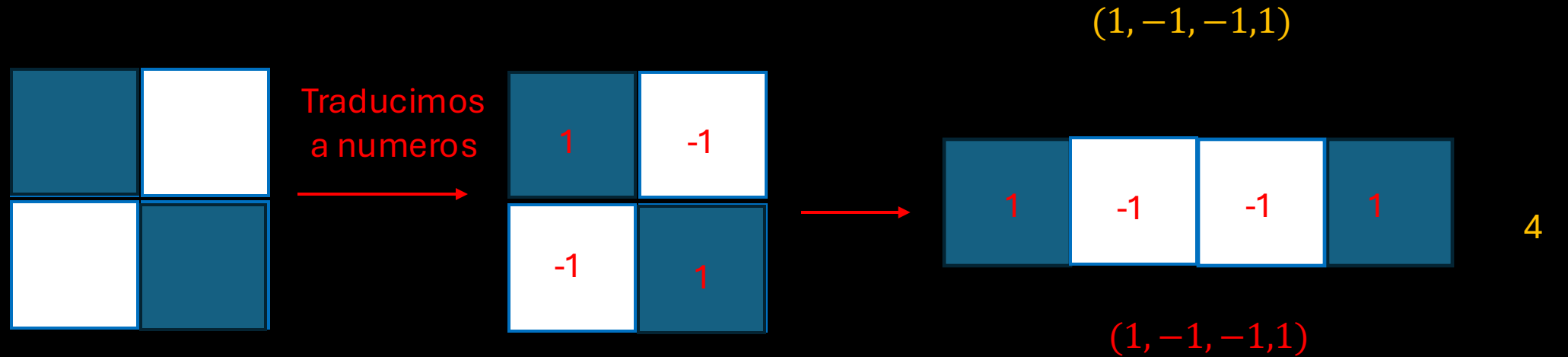
Podemos definir una operacion sobre estos numeros  
para poder distinguir/separar los vectores? Sumar componentes?

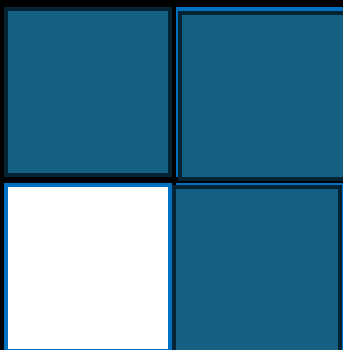


Podemos definir una operacion sobre estos numeros  
para poder distinguir/separar los vectores? **multiplicar componentes?**



Podemos definir una operacion sobre estos numeros  
para poder distinguir/separar los vectores? Producto escalar con un vector particular?





$$(1, 1, -1, 1) \quad \begin{pmatrix} 1 \\ -1 \\ -1 \\ 1 \end{pmatrix} \quad 2$$

Un numero “cercano” a 4,  
que refleja que el patron es una diagonal  
”a la izquierda” mal dibujada



Como elegimos este vector?

$$\begin{pmatrix} 1 \\ -1 \\ -1 \\ 1 \end{pmatrix}$$

Como nos damos cuenta que con este “filtro”  
Ibamos a separar bien a nuestros dos vectores?

Podríamos haber intentado con este

$$\begin{pmatrix} 1 \\ 1 \\ 1 \\ 1 \end{pmatrix}$$

Pero ya vimos que con ese no se podían distinguir.  
Daban cero los productos escalares con ambos vectores  
(lo llamamos “sumar las componentes”)

Como se busca el vector ideal para hacer el producto escalar, y separar,  
es ir cambiando de a poco  
y ver como va cambiando la diferencia de productos escalares

$$\begin{pmatrix} 1 \\ 1 \\ 1 \\ 1 \end{pmatrix}$$

Haciendo los productos  
con este no va muy bien

$$\begin{pmatrix} -1 \\ 1 \\ 1 \\ 1 \end{pmatrix}$$

peor

$$\begin{pmatrix} 1 \\ -1 \\ 1 \\ 1 \end{pmatrix}$$

mejor

$$\begin{pmatrix} 1 \\ 1 \\ -1 \\ 1 \end{pmatrix}$$

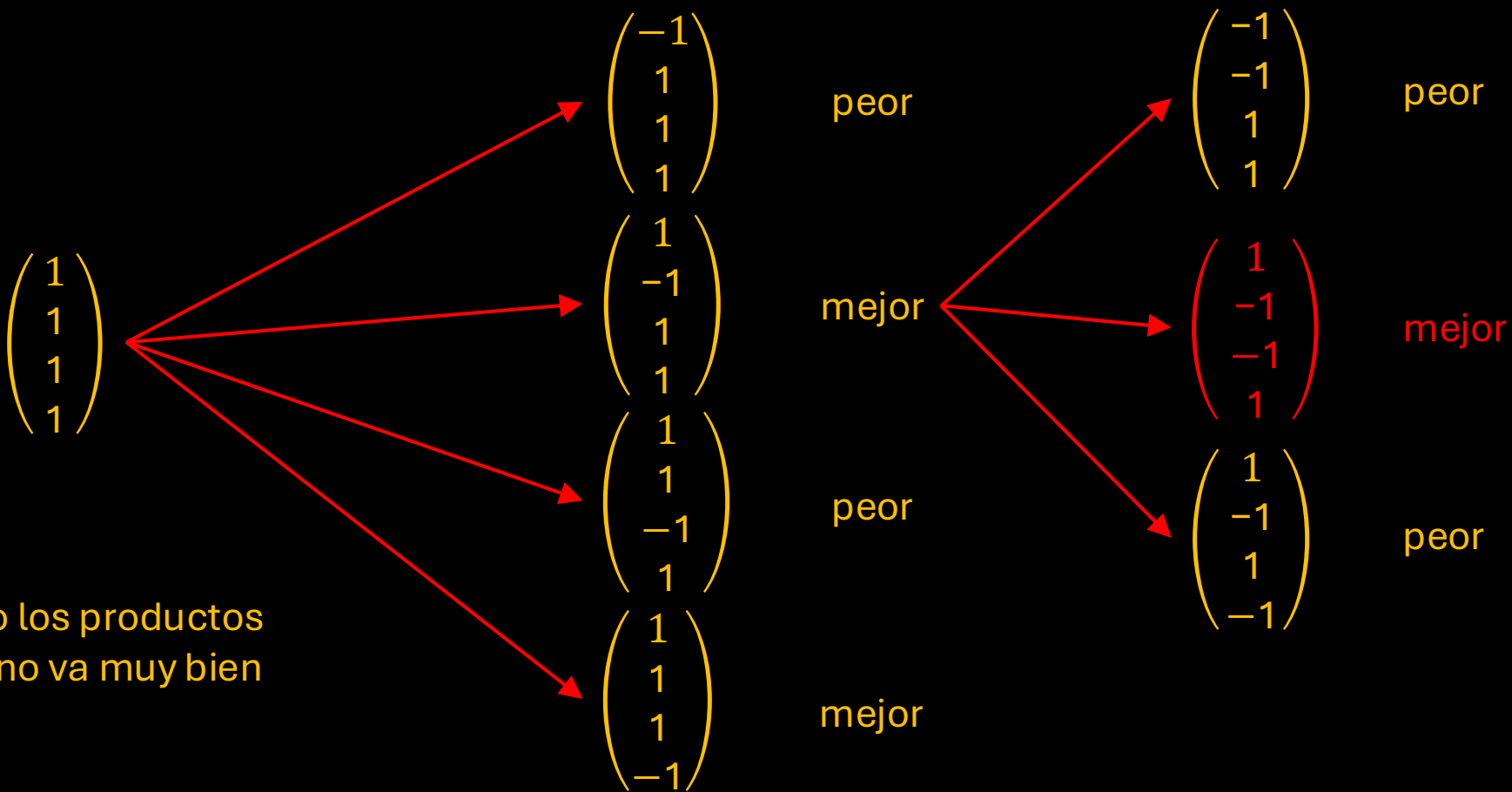
peor

$$\begin{pmatrix} 1 \\ 1 \\ 1 \\ -1 \end{pmatrix}$$

mejor

No obvio

Como se busca el vector ideal para hacer el producto escalar, y **separar**,  
es ir cambiando de a poco  
y ver como va cambiando la diferencia de productos escalares

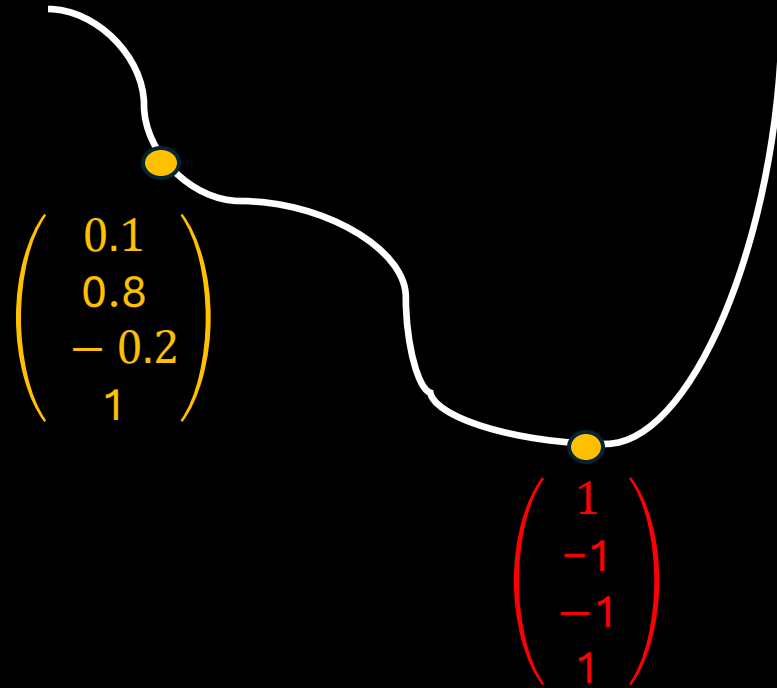


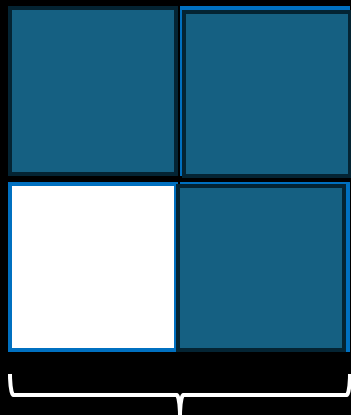
Haciendo los productos  
con este no va muy bien

No obvio

## Metodo de gradient descent

Errores al intentar separar

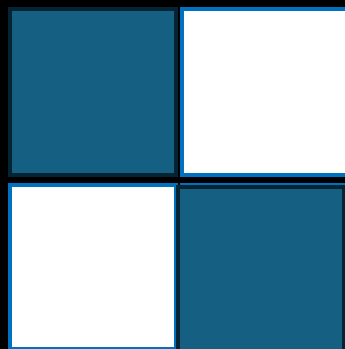




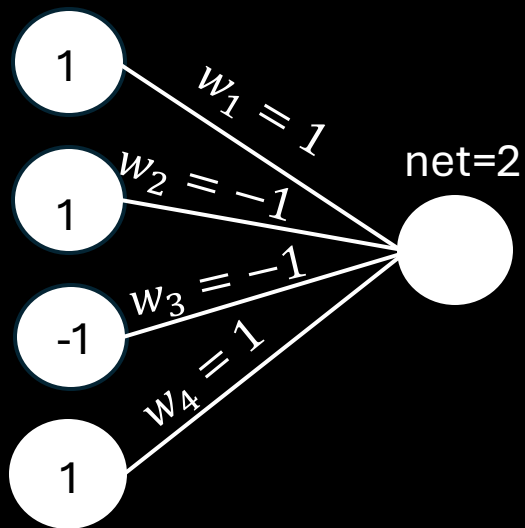
patron

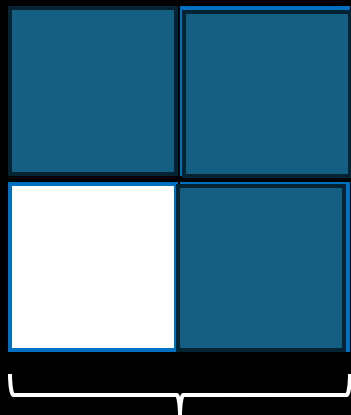
(1,1,-1,1)

$$\begin{pmatrix} 1 \\ -1 \\ -1 \\ 1 \end{pmatrix}$$



filtro

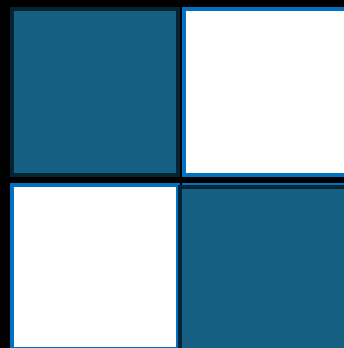




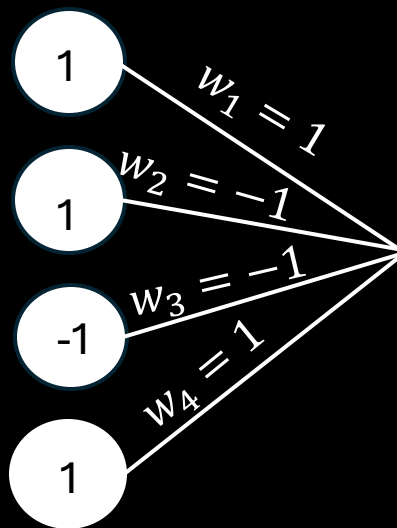
patron

(1,1,-1,1)

$$\begin{pmatrix} 1 \\ -1 \\ -1 \\ 1 \end{pmatrix}$$



filtro



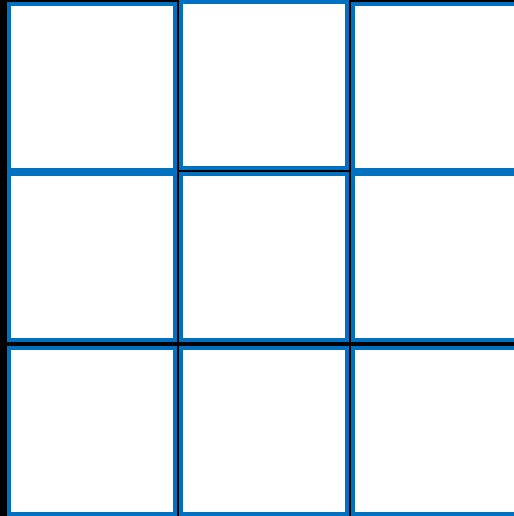
net=2

Si bias=3

Entonces,  
output=0

Elegir filtro, es elegir pesos

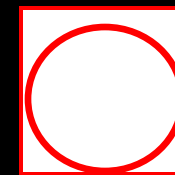
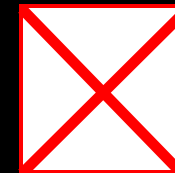
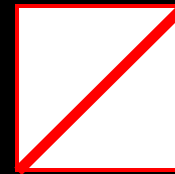
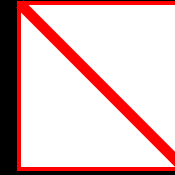
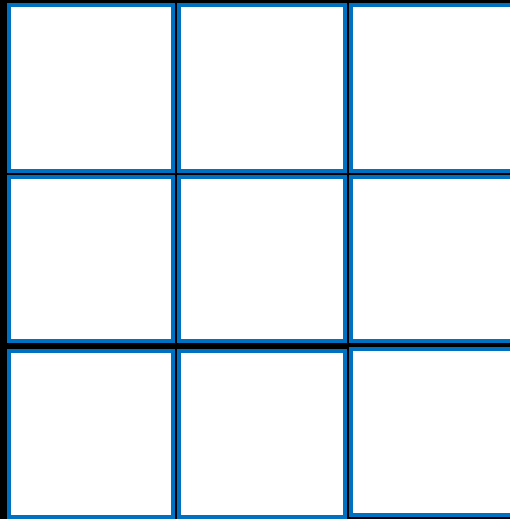
Complejifiquemos el mundo



Mas resolucion para las pantallas

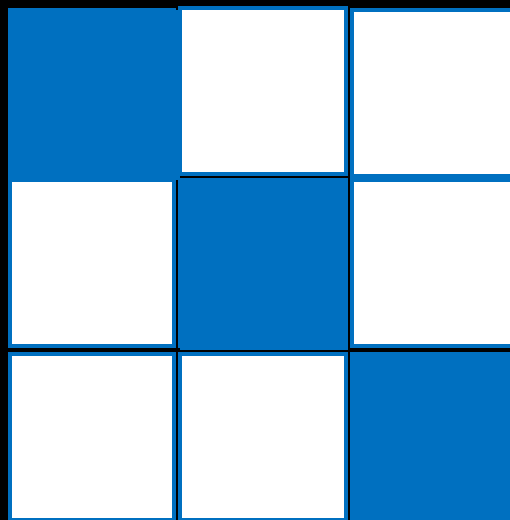
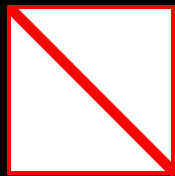


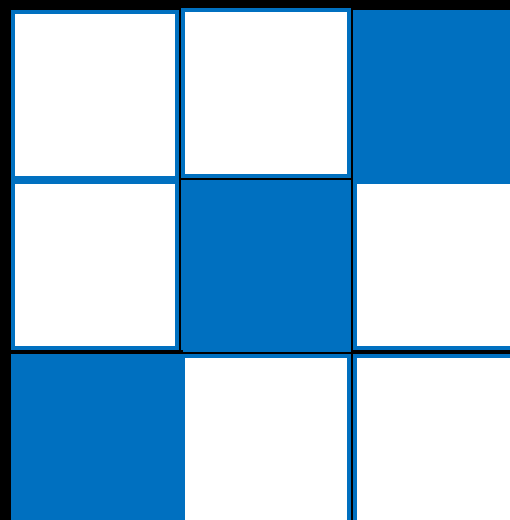
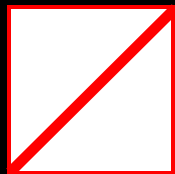
Complejifiquemos el mundo

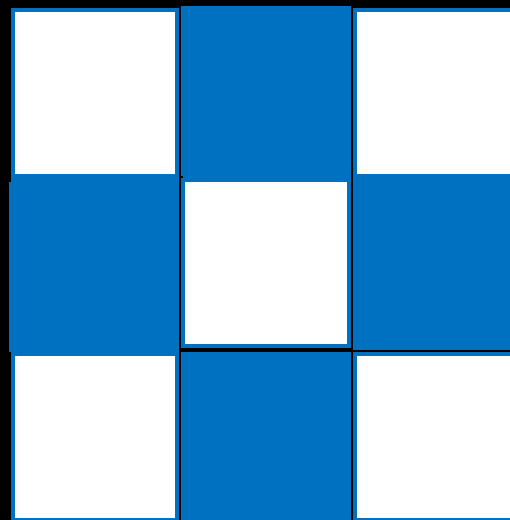
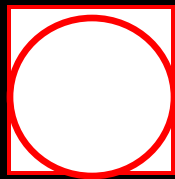


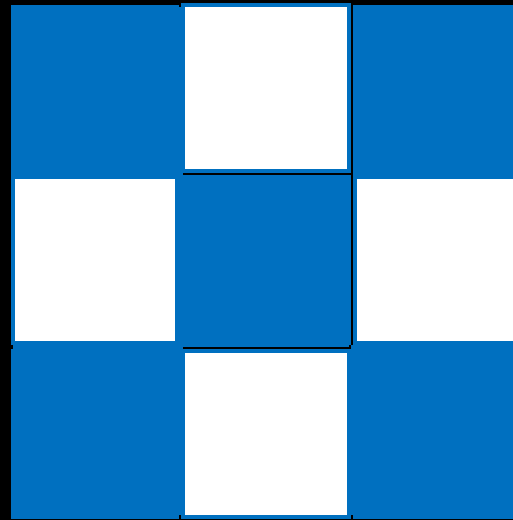
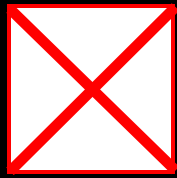
Mas resolucion para las pantallas

Mas simbolos



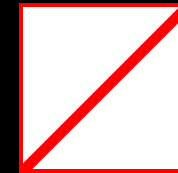
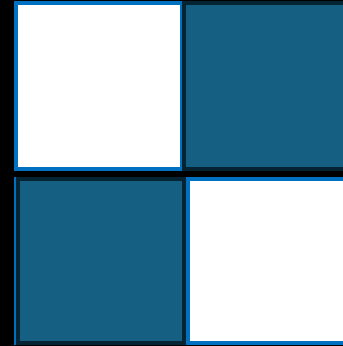
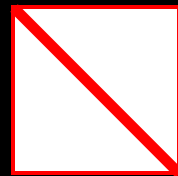
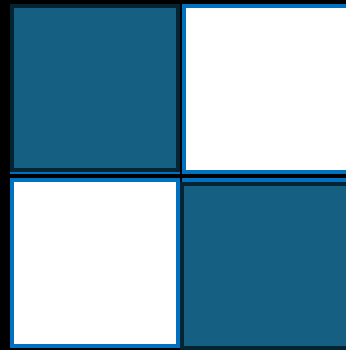








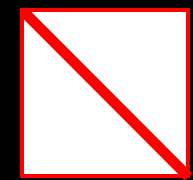
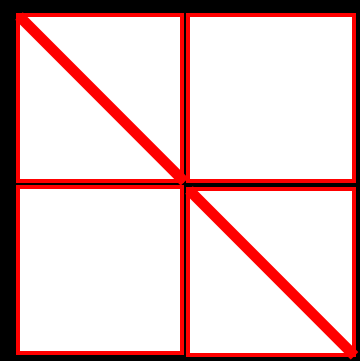
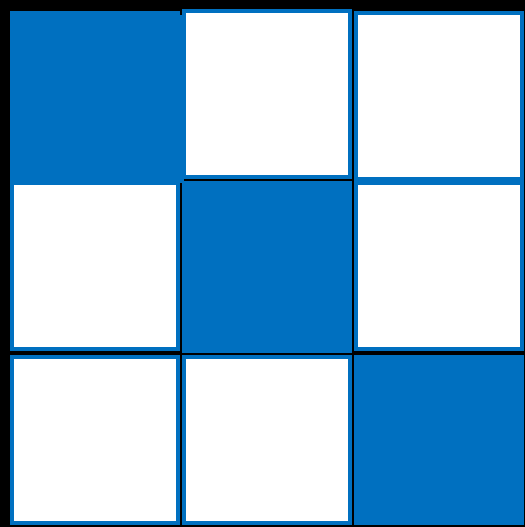
Vimos como separar estos dos patrones



Podemos usarlos para armar los nuevos simbolos?

Primero, la idea general

Reconociendo trocitos de patron

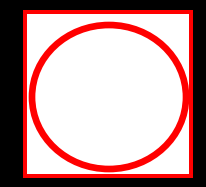
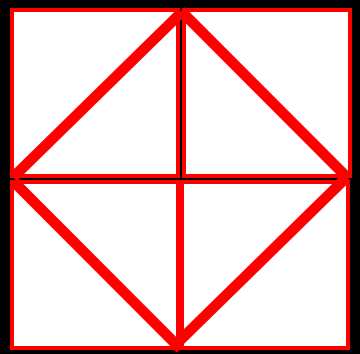
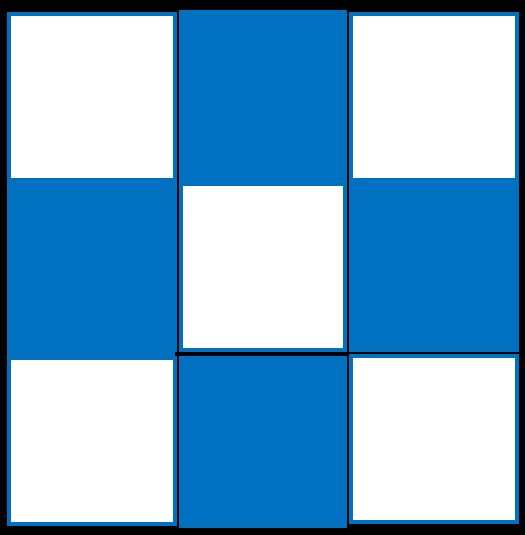


Luego asociaremos este patron  
a un simbolo



Primero, la idea general

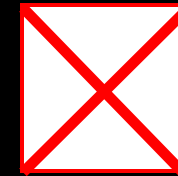
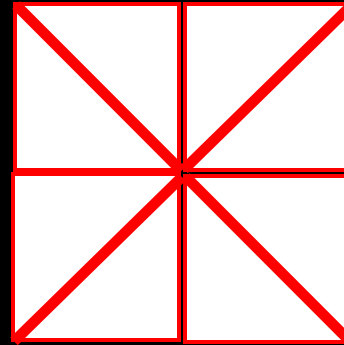
Reconociendo trocitos de patron



Luego asociaremos este patron  
a un simbolo

Primero, la idea general

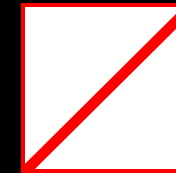
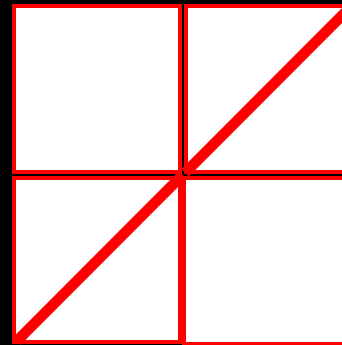
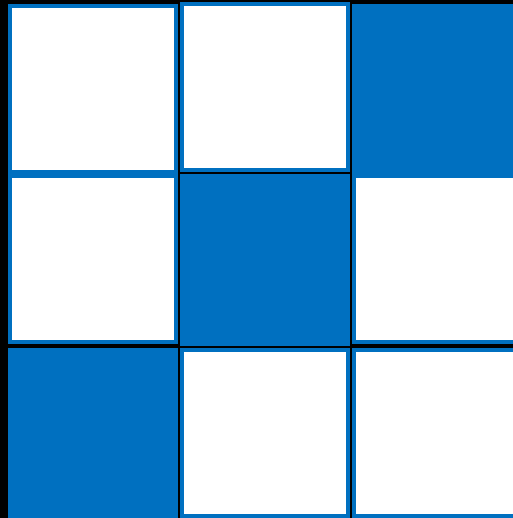
Reconociendo trocitos de patron



Luego asociaremos este patron  
a un simbolo

Primero, la idea general

Reconociendo trocitos de patron  
(Convolution layer  
Y pooling)



Luego asociaremos este Patrón  
a un símbolo

(Fully connected  
Layer)

Como lo hacemos?

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



$(-1 \ 1 \ 1 \ -1) \leftarrow$

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

$\rightarrow (-1 \ 1 \ 1 \ -1)$

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

→ (1 - 1 - 1 1)

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

→ (-1 1 1 - 1)

Como lo hacemos?

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



$(1 \ -1 \ -1 \ 1) \leftarrow$

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

$\rightarrow (-1 \ 1 \ 1 \ -1)$

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

→ (-1 1 1 -1)

→ (1 -1 -1 1)

Como lo hacemos?

Como lo hacemos?

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



$(-1 \ 1 \ 1 \ -1) \leftarrow$

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

$$(-1 \ 1 \ 1 \ -1) \begin{pmatrix} -1 \\ 1 \\ 1 \\ -1 \end{pmatrix}$$

|   |  |
|---|--|
| 4 |  |
|   |  |



Me fijo si reconozco este simbolo  
 analizando trocitos como analice las  
 cosas en el mundo de dos simbolos




|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

→ (1 - 1 - 1 1)

|   |    |
|---|----|
| 4 | -4 |
|   |    |

$$(1 \ -1 \ -1 \ 1) \begin{pmatrix} -1 \\ 1 \\ 1 \\ -1 \end{pmatrix}$$

Me fijo si reconozco este simbolo   
 analizando trocitos como analice las  
 cosas en el mundo de dos simbolos

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

|    |    |
|----|----|
| 4  | -4 |
| -4 |    |

$(1 \ -1 \ -1 \ 1) \leftarrow$

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

$(1 \ -1 \ -1 \ 1) \begin{pmatrix} -1 \\ 1 \\ 1 \\ -1 \end{pmatrix}$

Me fijo si reconozco este simbolo  
 analizando trocitos como analice las  
 cosas en el mundo de dos simbolos



|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

→ (1 -1 -1 1)

|    |    |
|----|----|
| 4  | -4 |
| -4 | 4  |

$$(-1 \ 1 \ 1 \ -1) \begin{pmatrix} -1 \\ 1 \\ 1 \\ -1 \end{pmatrix}$$

Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



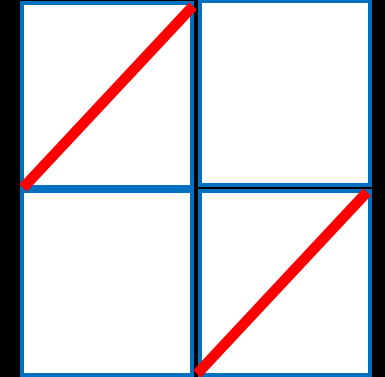
|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

→ (1 - 1 - 1 1)

Pongamos threshold en 3,  
Para “reconocer” el simbolo

|    |    |
|----|----|
| 4  | -4 |
| -4 | 4  |



Me fijo si reconozco este simbolo  
analizando trocitos como analice las  
cosas en el mundo de dos simbolos



|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| 1  | -1 |
| -1 | 1  |

|    |    |
|----|----|
| -4 | 4  |
| 4  | -4 |

|  |  |
|--|--|
|  |  |
|  |  |

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

|    |    |
|----|----|
| 4  | -4 |
| -4 | 4  |

|  |  |
|--|--|
|  |  |
|  |  |

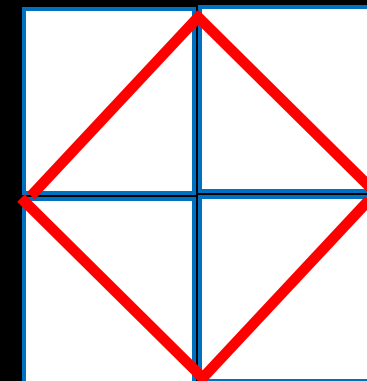
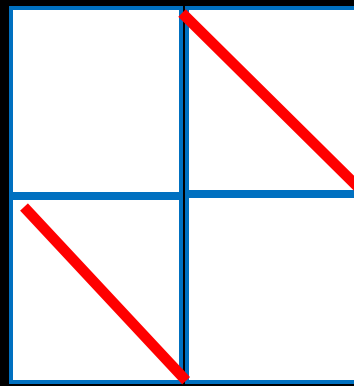
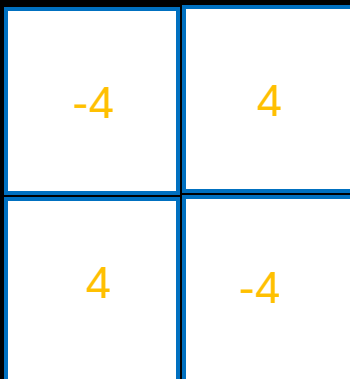
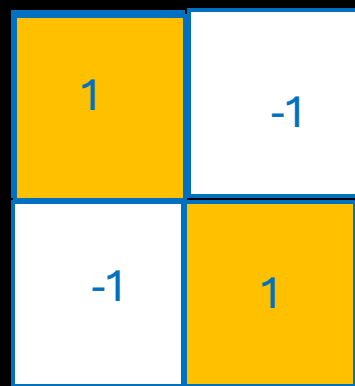
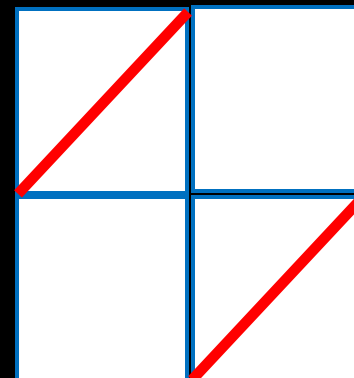
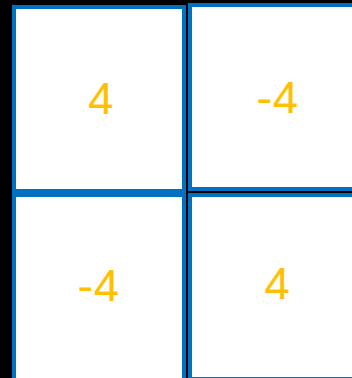
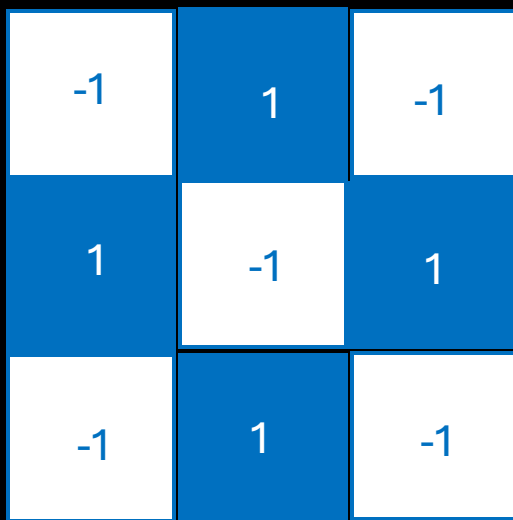
|    |    |
|----|----|
| 1  | -1 |
| -1 | 1  |

|    |    |
|----|----|
| -4 | 4  |
| 4  | -4 |

|  |  |
|--|--|
|  |  |
|  |  |

|  |  |
|--|--|
|  |  |
|  |  |

Capa convolucional  
(producto escalar con filtros)



via umbrales declara encontrar  
lo que buscaban los filtros

|    |    |    |
|----|----|----|
| -1 | 1  | -1 |
| 1  | -1 | 1  |
| -1 | 1  | -1 |

|    |    |
|----|----|
| -1 | 1  |
| 1  | -1 |

|    |    |
|----|----|
| 4  | -4 |
| -4 | 4  |

|  |  |
|--|--|
|  |  |
|  |  |

|    |    |
|----|----|
| 1  | -1 |
| -1 | 1  |

|    |    |
|----|----|
| -4 | 4  |
| 4  | -4 |

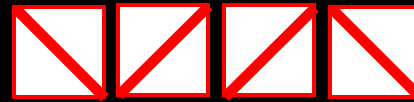
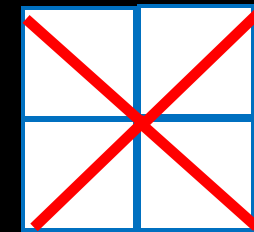
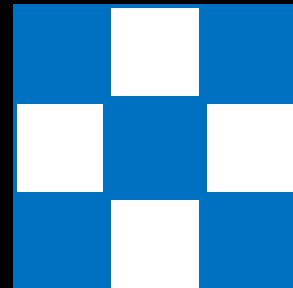
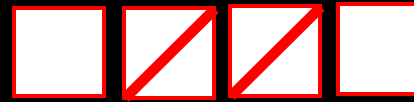
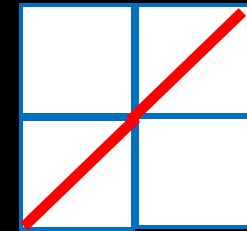
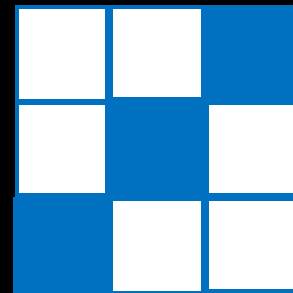
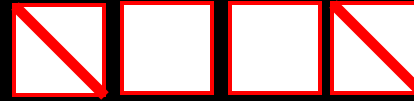
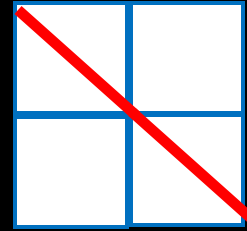
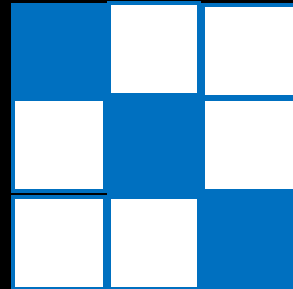
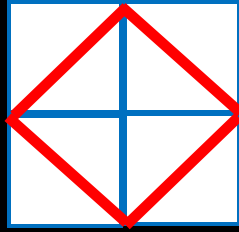
|  |  |
|--|--|
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|--|--|
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|  |  |

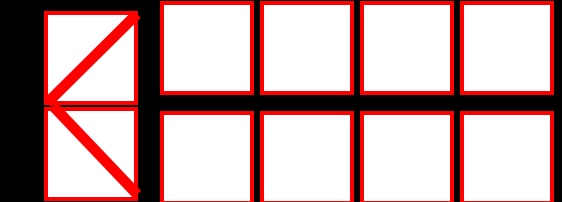
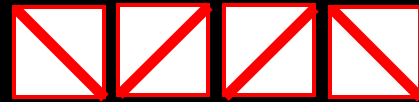
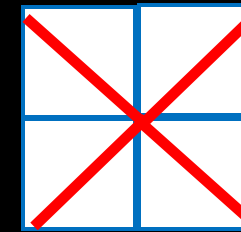
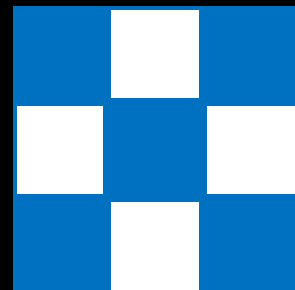
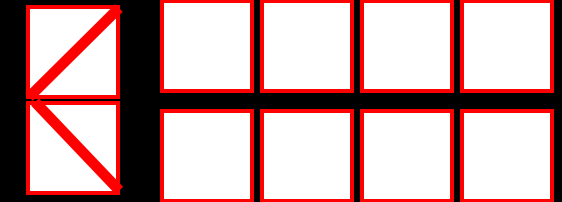
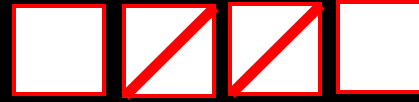
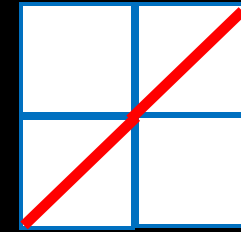
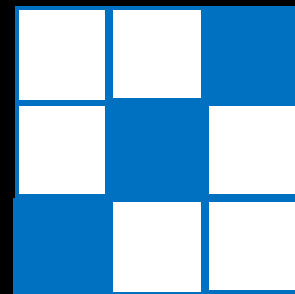
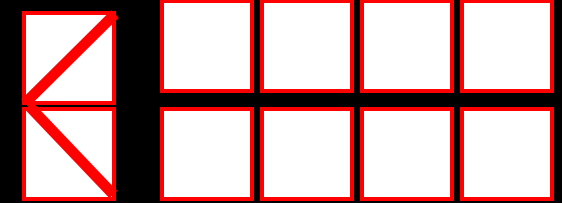
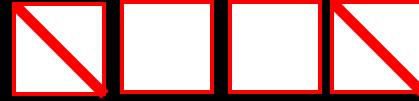
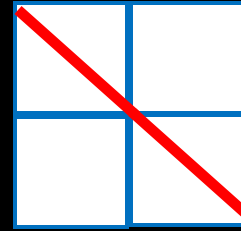
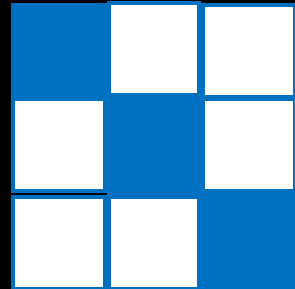
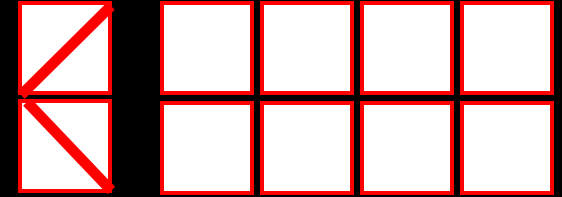
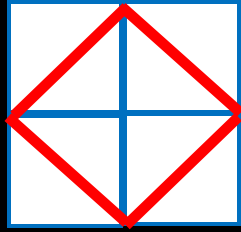
Finalmente se combina todo lo que  
Se encontro parcilmente al filtrar



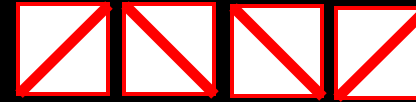
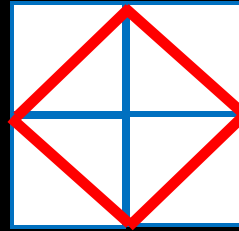
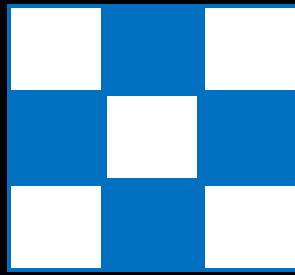
extendidas las podemos representar asi



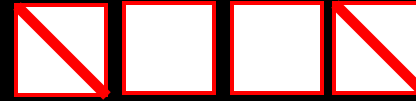
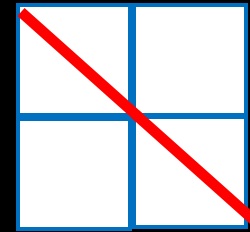
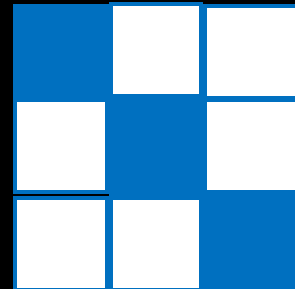
Y matricialmente, en función de  
como estaba presente el filtro



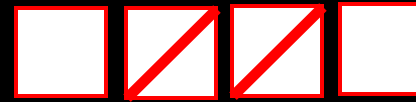
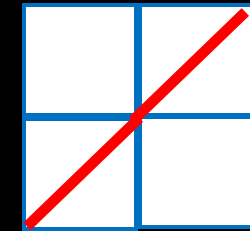
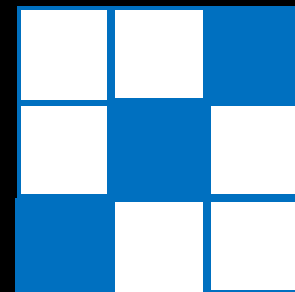
Ponemos 1 si esta el simbolo, -1 si no



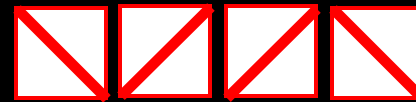
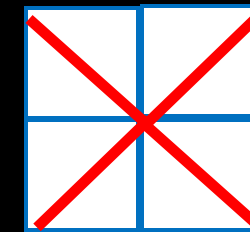
|  |     |     |     |    |
|--|-----|-----|-----|----|
|  | 1.  | -1. | -1. | 1  |
|  | -1. | 1.  | 1.  | -1 |



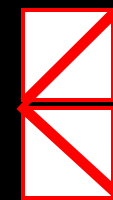
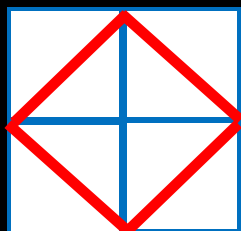
|  |     |     |     |    |
|--|-----|-----|-----|----|
|  | -1. | -1. | -1. | -1 |
|  | 1.  | -1. | -1. | 1  |



|  |     |     |     |    |
|--|-----|-----|-----|----|
|  | -1. | 1.  | 1.  | -1 |
|  | -1. | -1. | -1. | -1 |

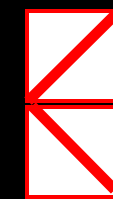
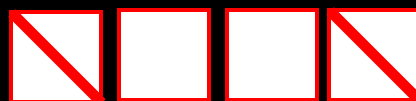
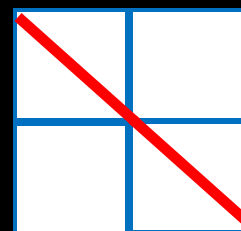


|  |     |     |     |    |
|--|-----|-----|-----|----|
|  | -1. | 1.  | 1.  | -1 |
|  | 1.  | -1. | -1. | 1  |



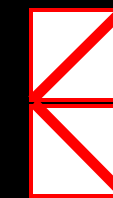
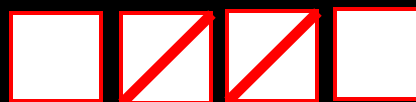
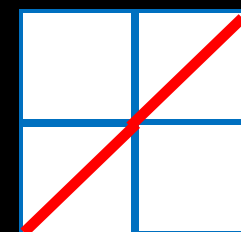
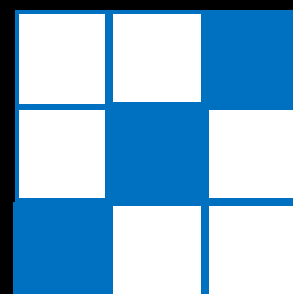
Filtro para la  $\circ$

|     |     |     |    |
|-----|-----|-----|----|
| 1.  | -1. | -1. | 1  |
| -1. | 1.  | 1.  | -1 |



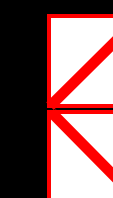
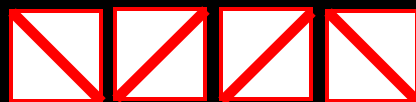
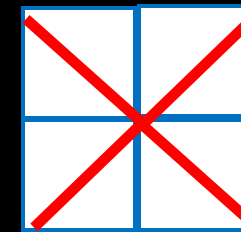
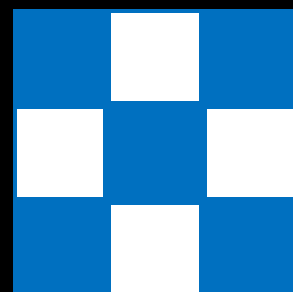
Filtro para la diagonal ↘

|     |     |     |    |
|-----|-----|-----|----|
| -1. | -1. | -1. | -1 |
| 1.  | -1. | -1. | 1  |



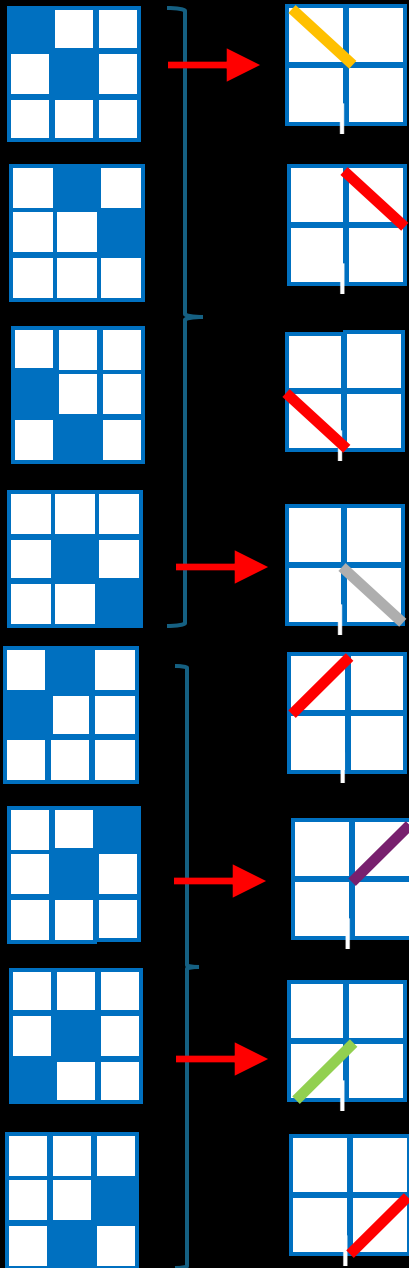
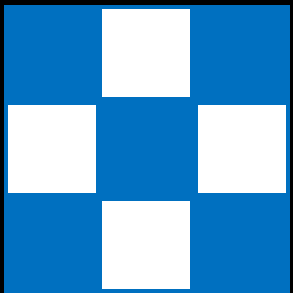
Filtro para la diagonal ↗

|     |     |     |    |
|-----|-----|-----|----|
| -1. | 1.  | 1.  | -1 |
| -1. | -1. | -1. | -1 |



Filtro para la  $\times$

|     |     |     |    |
|-----|-----|-----|----|
| -1. | 1.  | 1.  | -1 |
| 1.  | -1. | -1. | 1  |



|  |     |     |     |    |
|--|-----|-----|-----|----|
|  | 1.  | -1. | -1. | 1  |
|  | -1. | 1.  | 1.  | -1 |

|     |     |     |    |
|-----|-----|-----|----|
| 1.  | -1. | -1. | 1  |
| -1. | 1.  | 1.  | -1 |

x 8

|     |     |     |    |
|-----|-----|-----|----|
| -1. | 1.  | 1.  | -1 |
| 1.  | -1. | -1. | 1  |

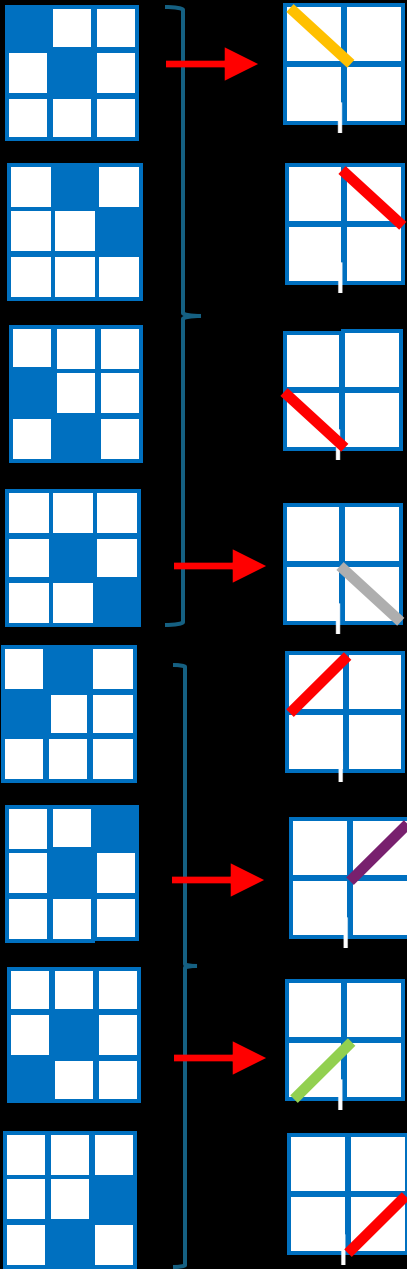
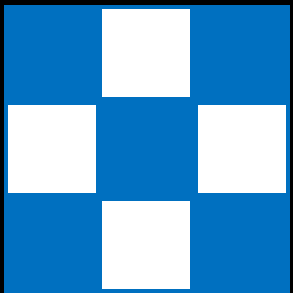
O -8

|     |     |     |   |
|-----|-----|-----|---|
| -1. | -1. | -1. | 1 |
| 1.  | 1.  | 1.  | 1 |

/ 4

|     |     |     |    |
|-----|-----|-----|----|
| 1.  | -1. | -1. | 1  |
| -1. | -1. | -1. | -1 |

\ 4



1. -1. -1. 1  
-1. 1. 1. -1

1. -1. -1. 1  
-1. 1. 1. -1

x 8

-1. 1. 1. -1  
1. -1. -1. 1

O -8

-1. -1. -1. 1  
1. 1. 1. 1

/ 4

1. -1. -1. 1  
-1. -1. -1. -1

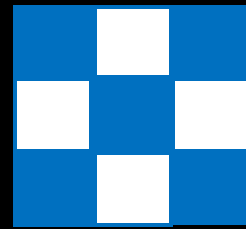
\ 4

$\times$  (1,0,0,0)  
 $\times$  (1,0,0,0)  
 $\times$  (1,0,0,0)  
 $\times$  (1,0,0,0)  
 $\circ$  (0,1,0,0)  
 $\circ$  (0,1,0,0)  
 $\circ$  (0,1,0,0)

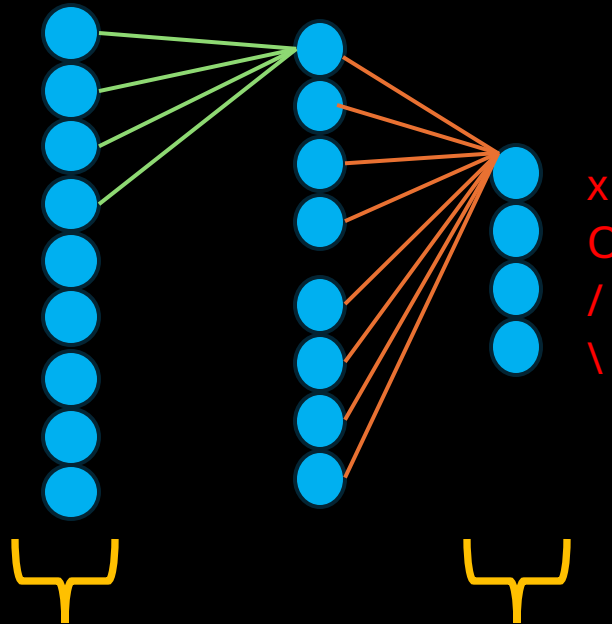


Conjunto de  
entrenamiento

Representaciones  
según los filtros



|     |     |     |    |
|-----|-----|-----|----|
| 1.  | -1. | -1. | 1  |
| -1. | 1.  | 1.  | -1 |



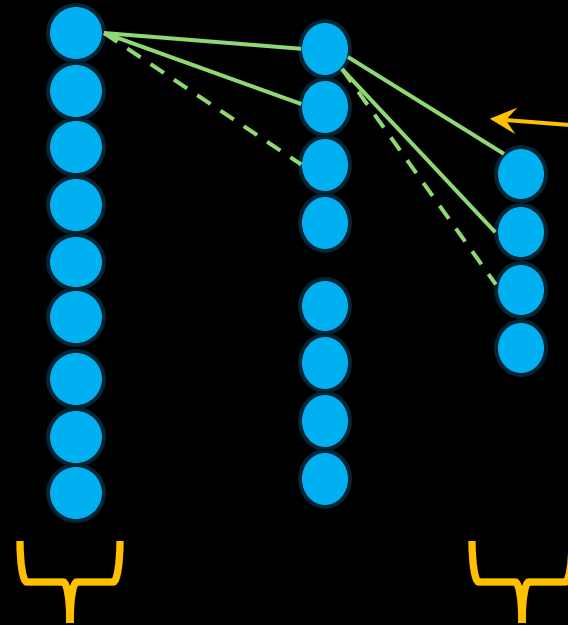
Cada unidad lleva el código de  
uno de los pixels de la imagen

Cada unidad lleva la probabilidad  
de que el input corresponda a uno  
de los símbolos

|   |           |
|---|-----------|
| X | (1,0,0,0) |
| 2 | (1,0,0,0) |
| X | (1,0,0,0) |
| X | (1,0,0,0) |
| 0 | (0,1,0,0) |
| 0 | (0,1,0,0) |
| 0 | (0,1,0,0) |



Conjunto de  
entrenamiento

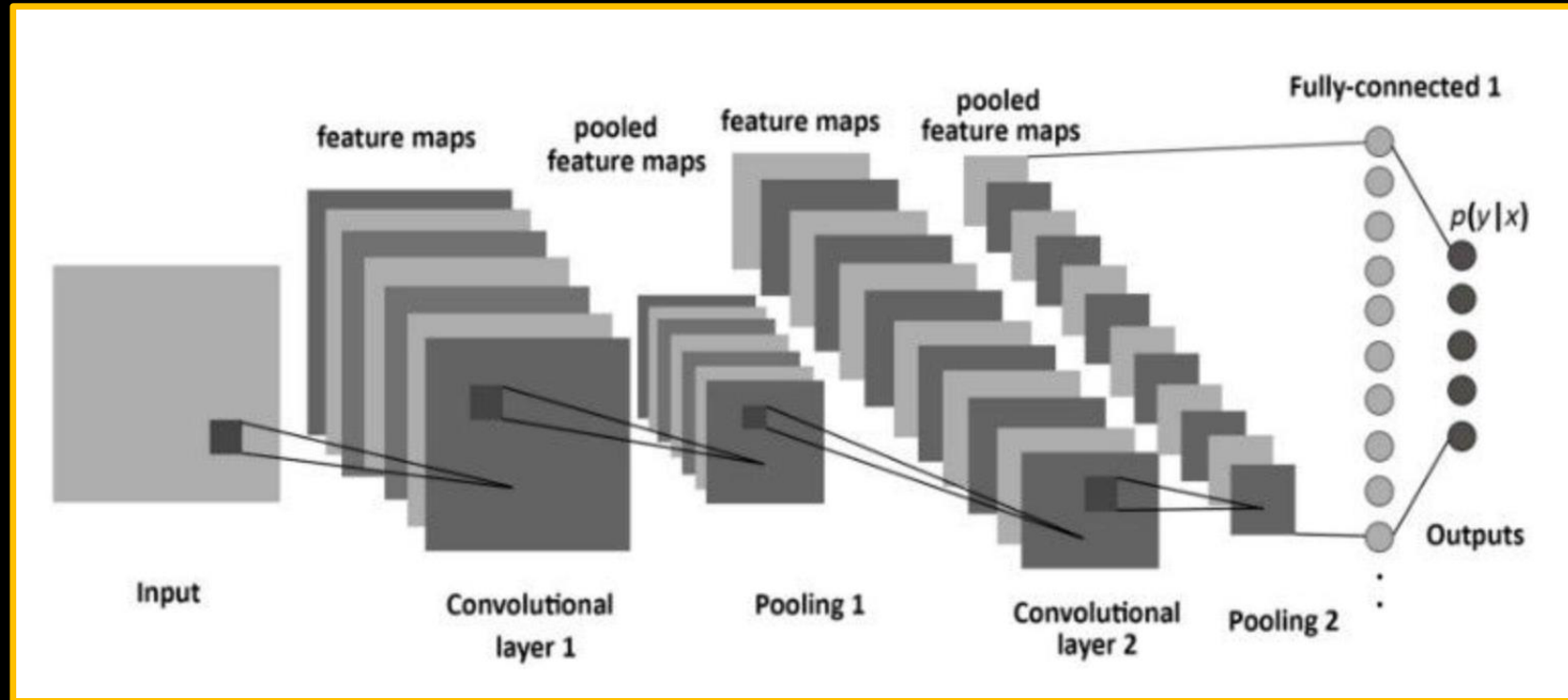


Los pesos de las conexiones,  
Inicialmente tienen valores aleatorios.  
Y se van modificando de modo de  
poder reproducir las clasificaciones del  
conjunto de entrenamiento

Cada unidad lleva el código de  
uno de los pixels de la imagen

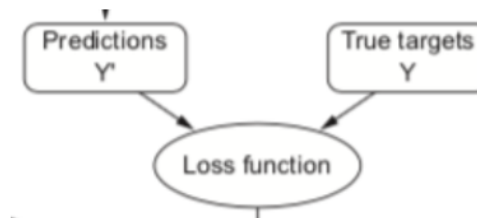
Cada unidad lleva la probabilidad  
de que el input corresponda a uno  
de los símbolos





Lo que hemos analizado es una de las capas que se usan para procesar imagenes complejas

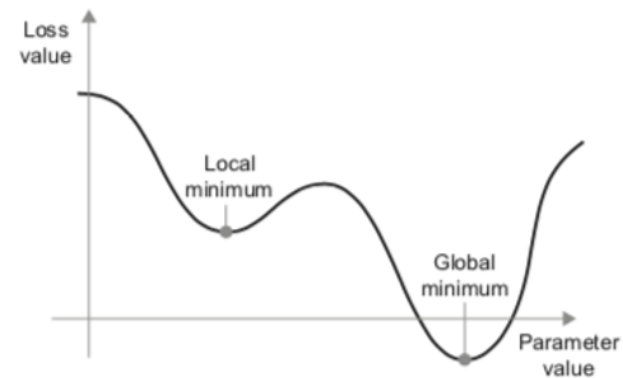
Y el esquema de ajuste (búsqueda de parámetros), es el mismo para todas estas arquitecturas.



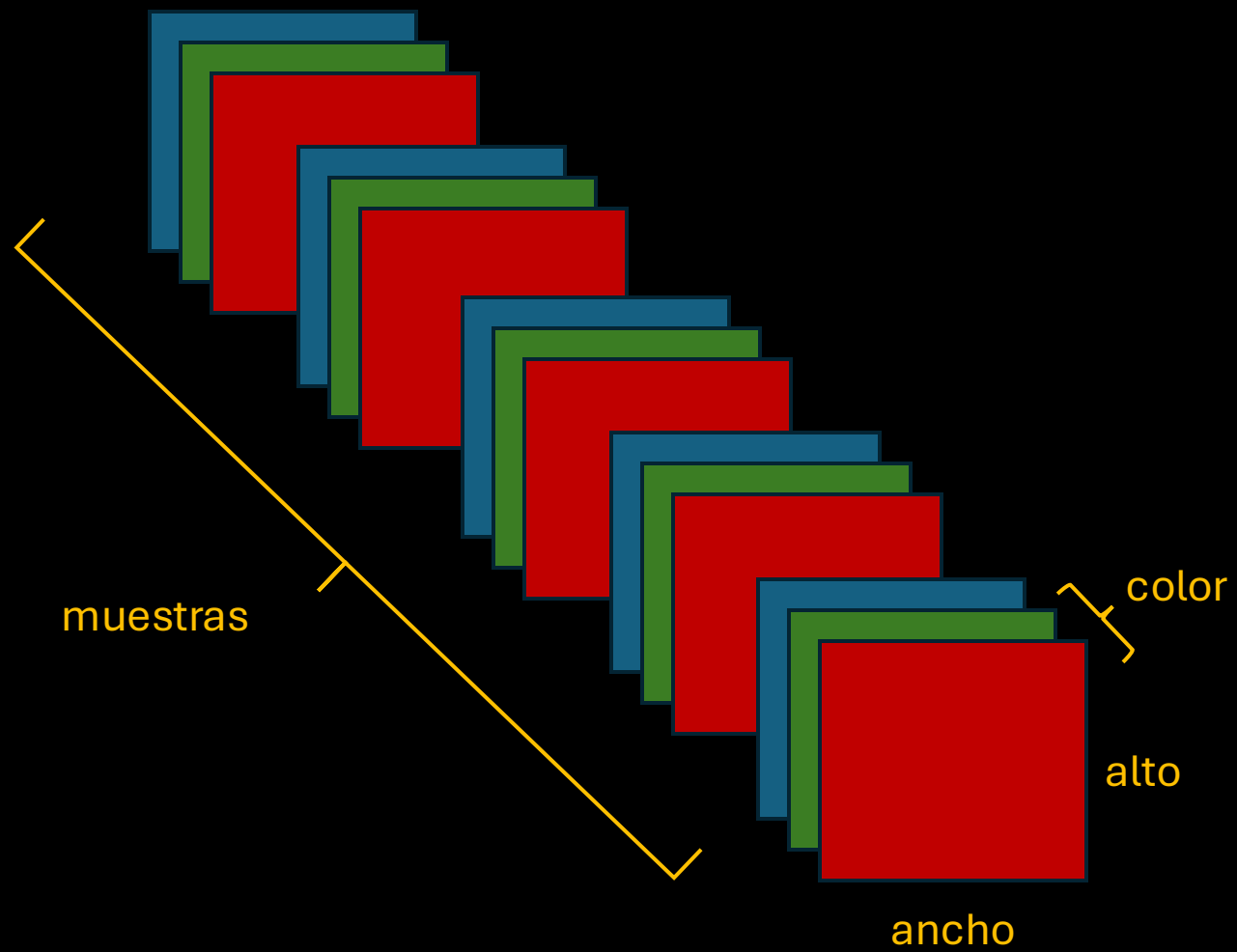
Y lo emplea para calcular los cambios en la red:

$$\Delta W_{ij} = -\eta \frac{\partial E}{\partial W_{ij}},$$

Con la idea de encontrar un mínimo en el cual  $\Delta W_{ij} = 0$ , resulta que



## Formatos de los datos



**Batch:** conjunto de ejemplos de entrenamiento que se procesan juntos antes de actualizar los pesos del modelo

**Epoch:** Una época es cuando el modelo ha pasado por todo el conjunto de datos una vez.

#### Tipos de Procesamiento:

- **Batch Gradient Descent:** Usa todo el dataset para calcular el gradiente antes de actualizar los pesos (lento, pero más preciso).
- **Stochastic Gradient Descent (SGD):** Usa un solo ejemplo por iteración
  - (rápido, pero más ruidoso).
- **Mini-Batch Gradient Descent:** Usa pequeños lotes de datos en cada
  - iteración (balance entre precisión y velocidad).

## ◆ Formato de los Datos en Redes Convolucionales

En **Keras** (y TensorFlow), las imágenes suelen representarse con la forma:

(batch size, height, width, channels)

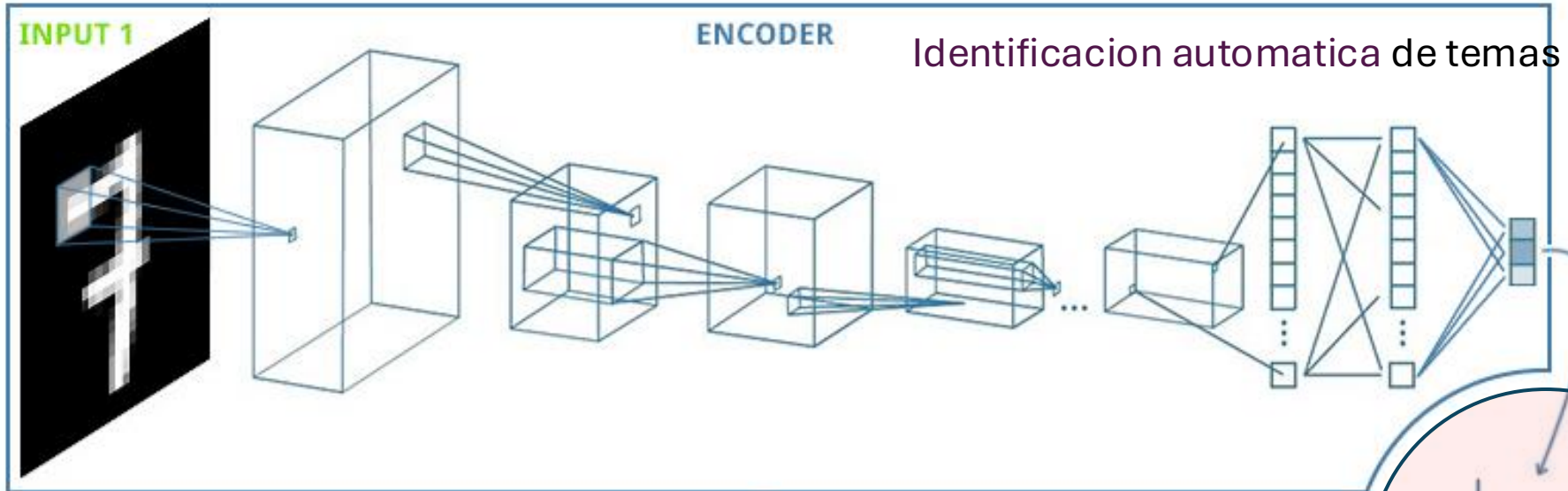
Donde:

- **batch size**: número de imágenes procesadas simultáneamente en cada paso del entrenamiento.
- **height**: altura de la imagen en píxeles.
- **width**: ancho de la imagen en píxeles.
- **channels**: número de canales de color (1 para blanco y negro, 3 para RGB, etc.).

## ◆ ¿Dónde se define el batch size?

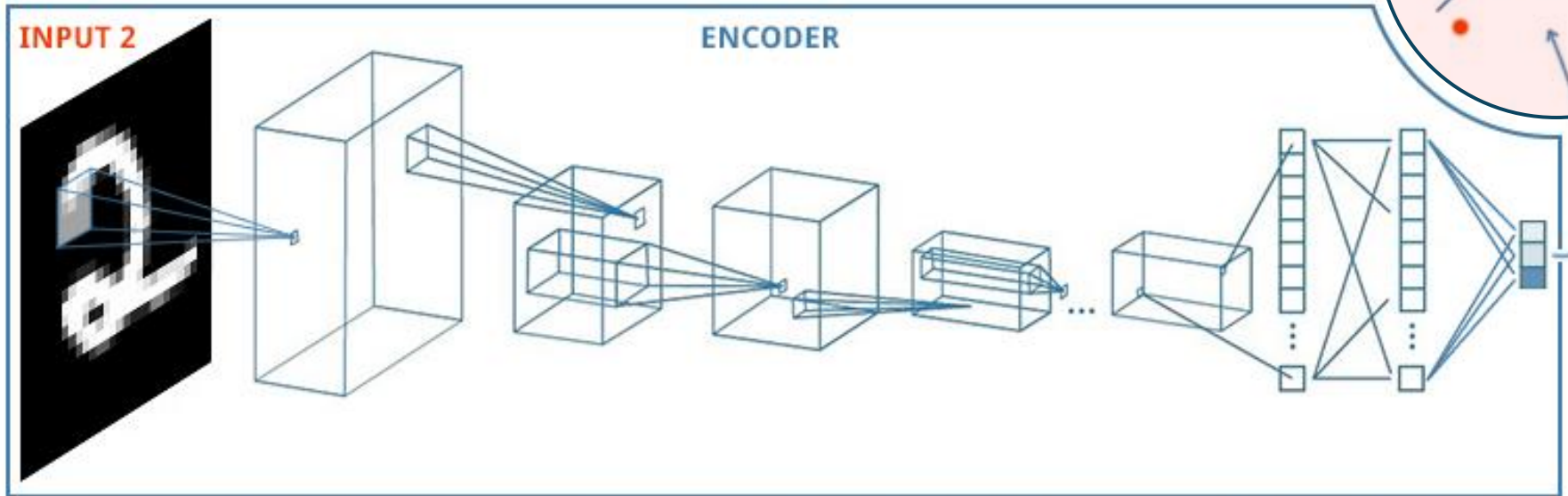
El **batch size** **NO** se especifica en la arquitectura de la red, sino en la función que entrena el modelo, como `model.fit()`, `model.predict()` o `model.evaluate()`.

Siamese  
Networks  
define a  
metric



Comparten  
pesos y sesgos

Espacio  
de embedding



INPUT

CONVOLUCIONAL + RELU

POOLING

CONVOLUCIONAL + RELU

POOLING

...

APLANADO

FC + RELU

FC + None

Extracción de *features*

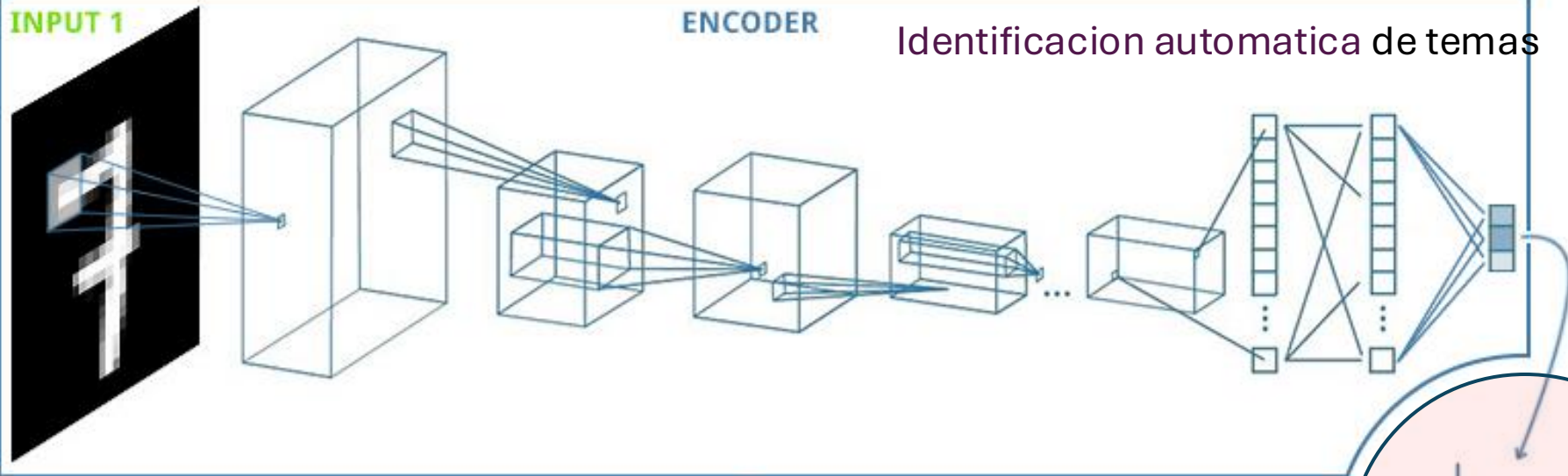
Embedding

Tomas Bossi

INPUT 1

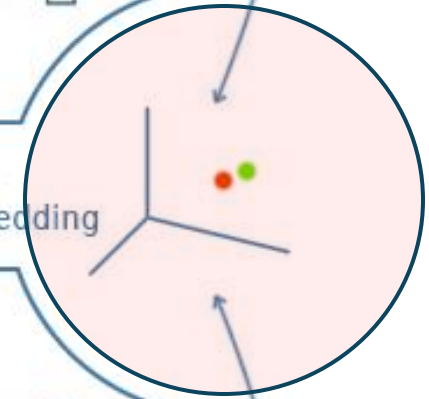
ENCODER

Identificación automática de temas



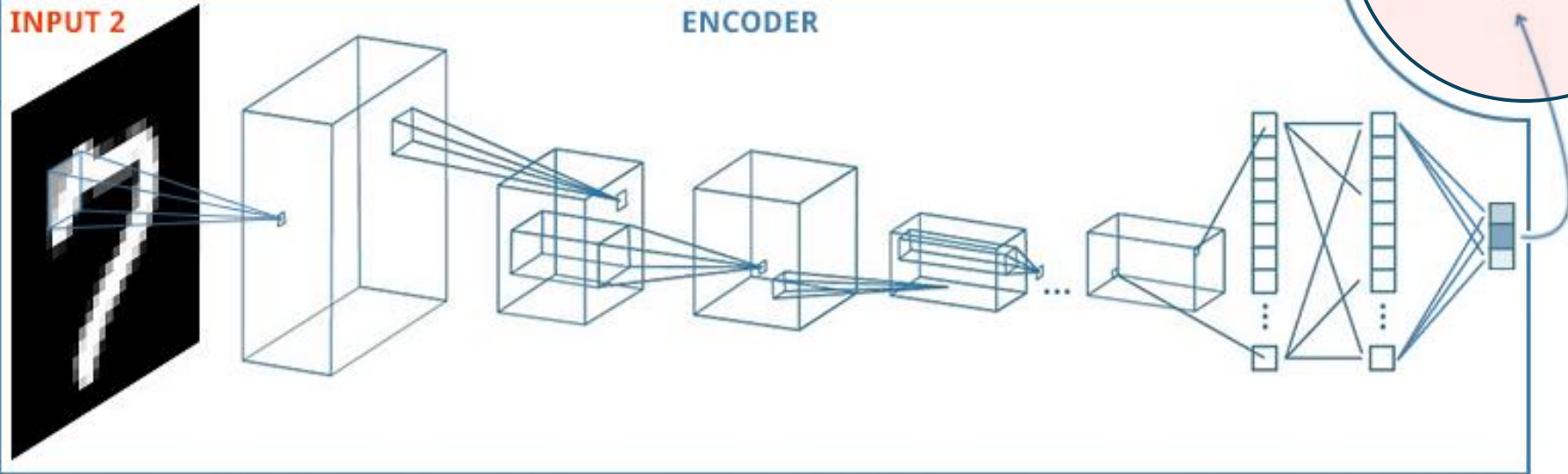
Comparten  
pesos y sesgos

Espacio  
de embedding



INPUT 2

ENCODER



INPUT

CONVOLUCIONAL + RELU

POOLING

CONVOLUCIONAL + RELU

POOLING

...

APLANADO

FC + RELU

FC + None

Extracción de *features*

Embedding



Como la pandemia nos dejo varados cerca del **Parque Pereyra Iraola (reserva de biodiversidad, NU)**  
*Zonotrichia capensis* (**oscino**, pero que aprende tipicamente un solo canto)



Alex Martinez



2022



Con Roberto Bistel  
Y Alex Martinez

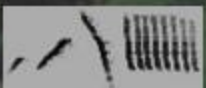
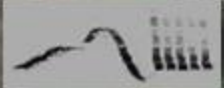
Google

El Rocio De LAURENT



2022

tema trino



Arroyo San Juan

Cno. Gral. Manuel Belgrano

Cno. Gral. Manuel Belg  
C. 403

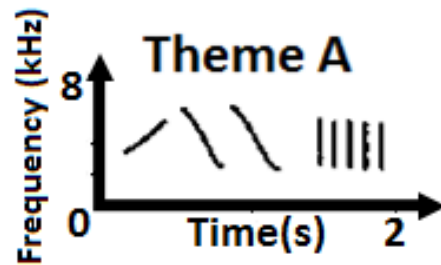
Google

El Rocio De LAURENT

Con Roberto Bistel  
Y Alex Martinez

# Not the first one to get stuck close to the parque Pereyra

Sketched handwritten notes by Nottebohm,  
in **1966**



Theme A

Theme B

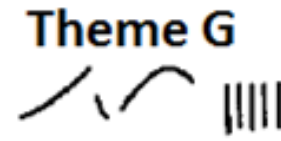
Theme C



Theme D



Theme E



Theme G

Theme H



Theme J



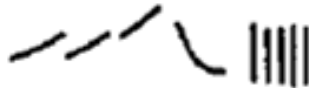
Theme K



Theme L



Theme M



Theme N



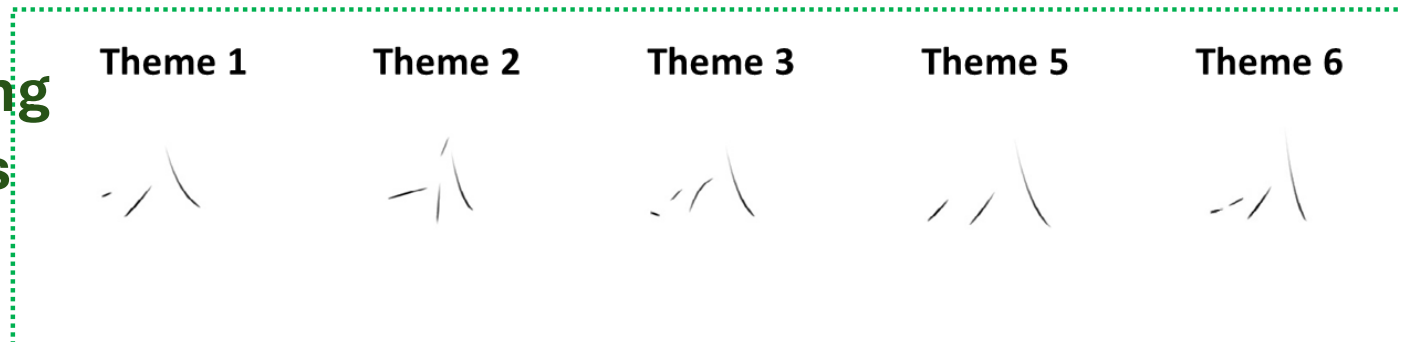
Is it what we find today?

Using dynamics... to generate surrogate synthetic songs and train a network

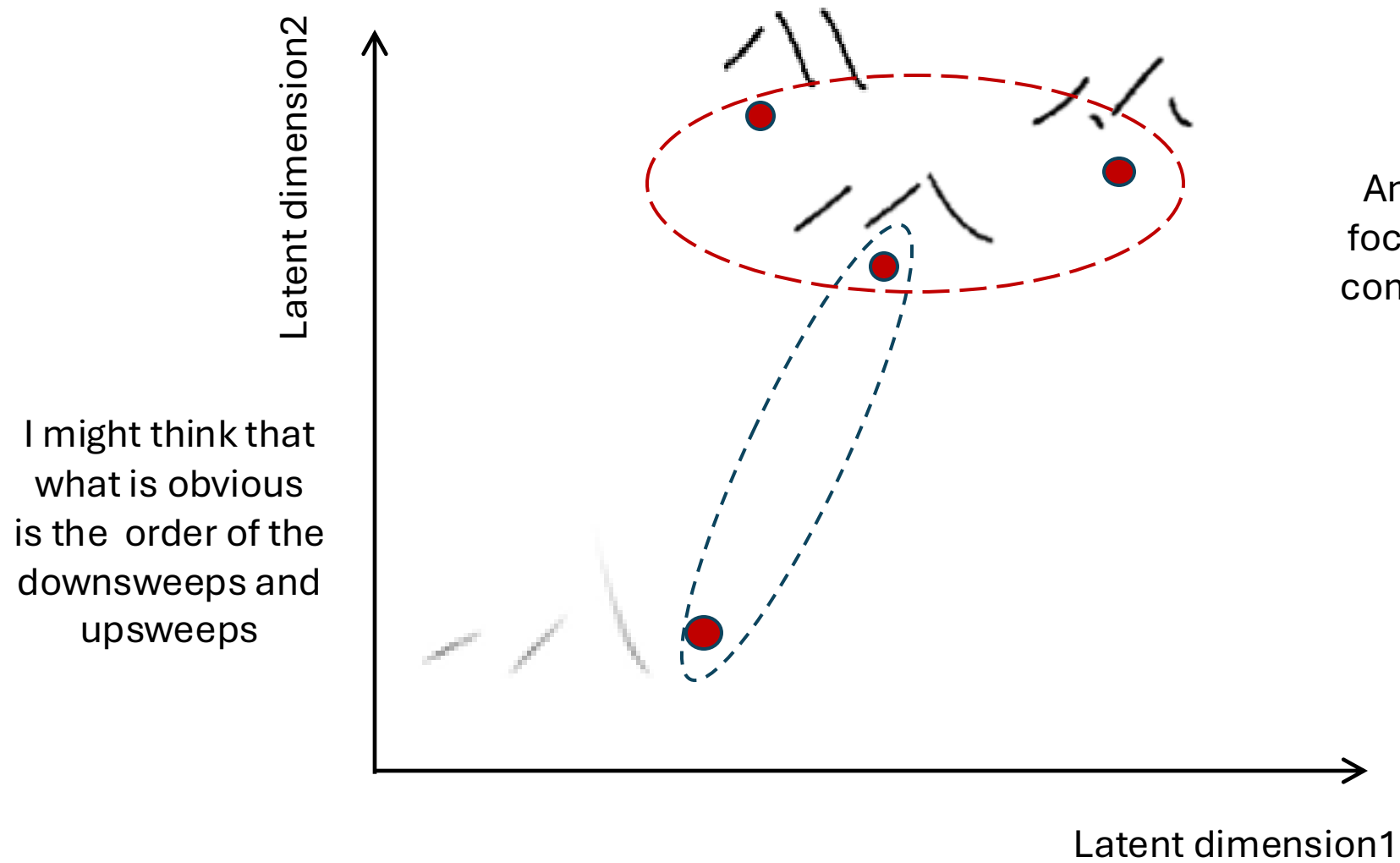
**Synthetic songs that  
copy what was found  
in 2020**



**Synthetic songs bringing  
back to “life” the songs  
from the sixties**



Why did I re synthesized the songs from the sixties?

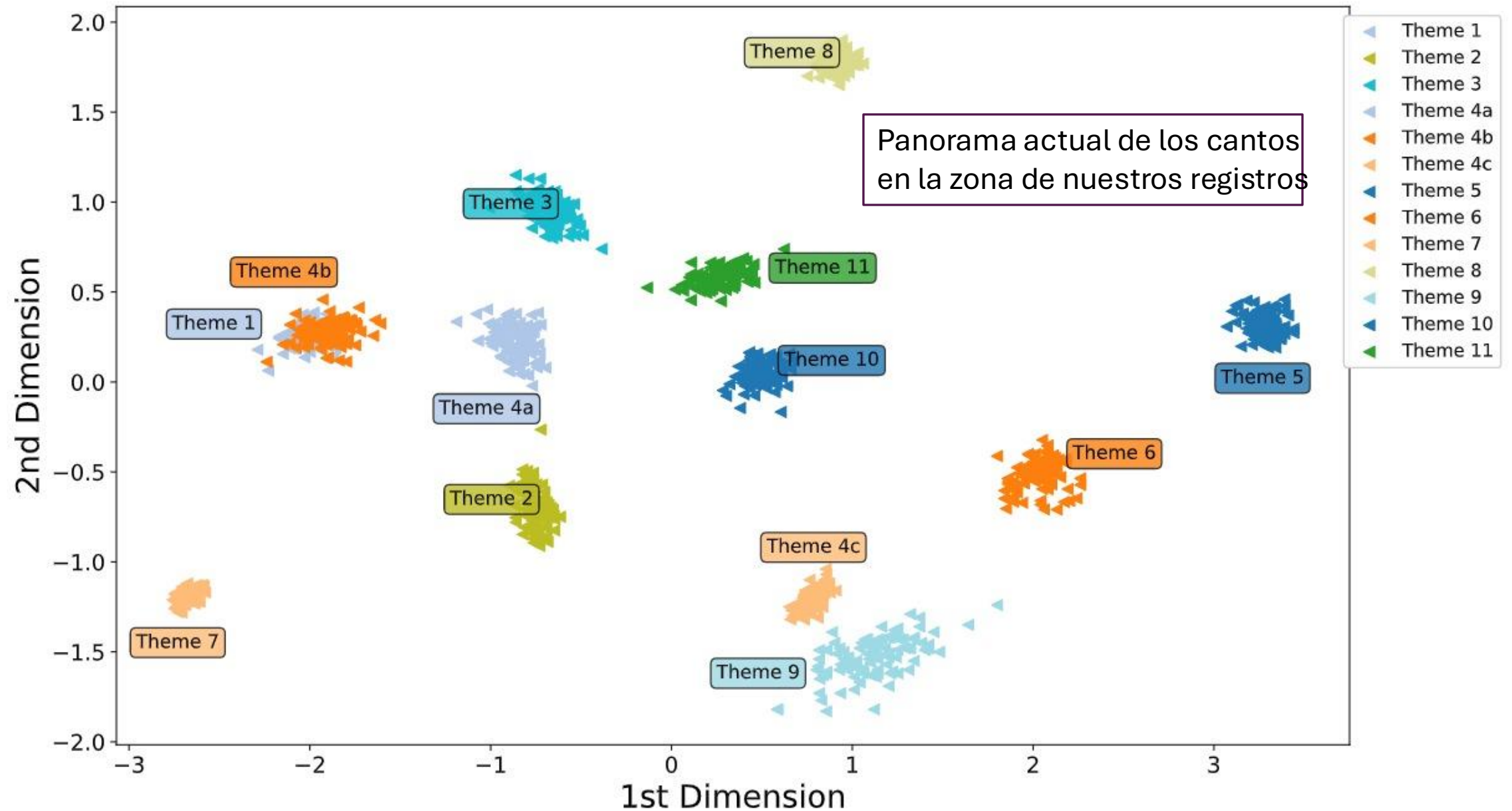


And the network might focus on whether it is a computed sonogram or a handwritten note.

Data preparation, data preparation, data preparation



So we trained a network to distinguish the synthetic songs that copy the 2020 songs



And processed with it the songs from 1966, re synthesized...

