



Analizando el Impacto de Modelos Preentrenados con Deep Learning en Tareas de Visión Artificial



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Inputs



Classes

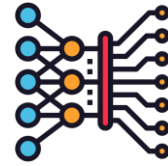
cat, dog, bird

Zero-Shot Image Classification Model

Output

Cat	0.664
Dog	0.329
Bird	0.008

DEEP LEARNING



1

Recopilación y preprocesado de datos

2

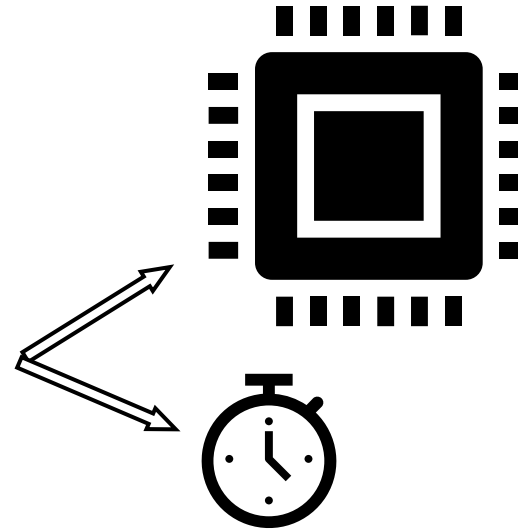
Selección del modelo

3

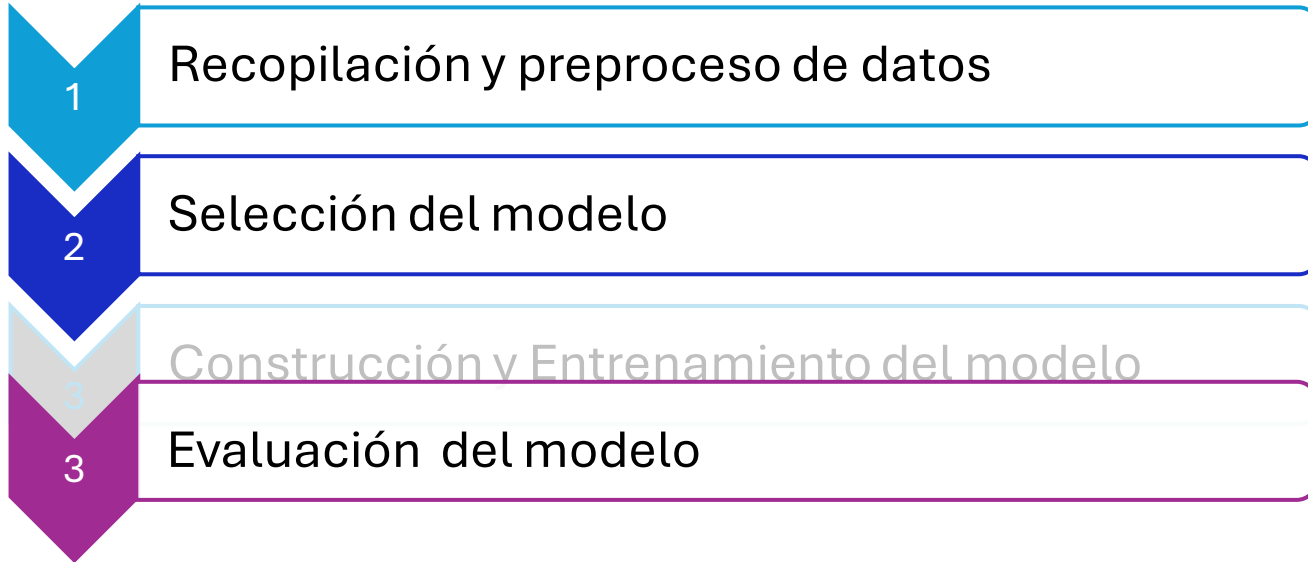
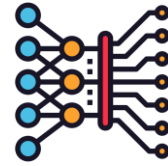
Construcción y Entrenamiento del modelo

4

Evaluación del modelo

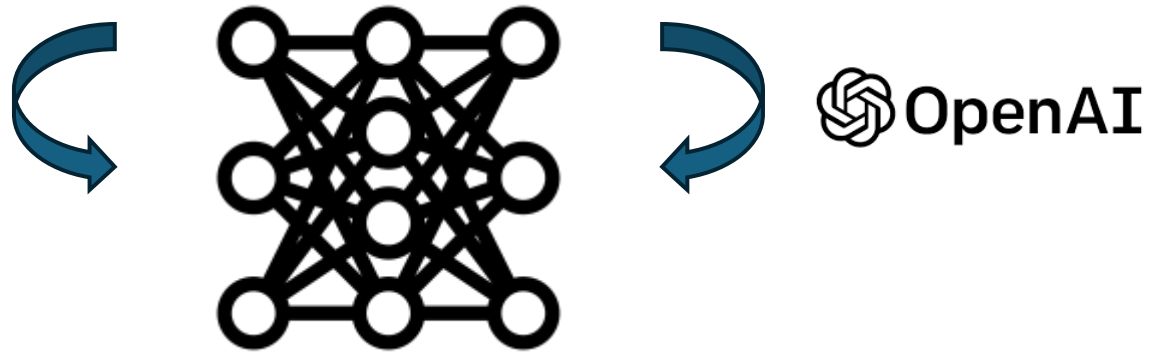


DEEP LEARNING

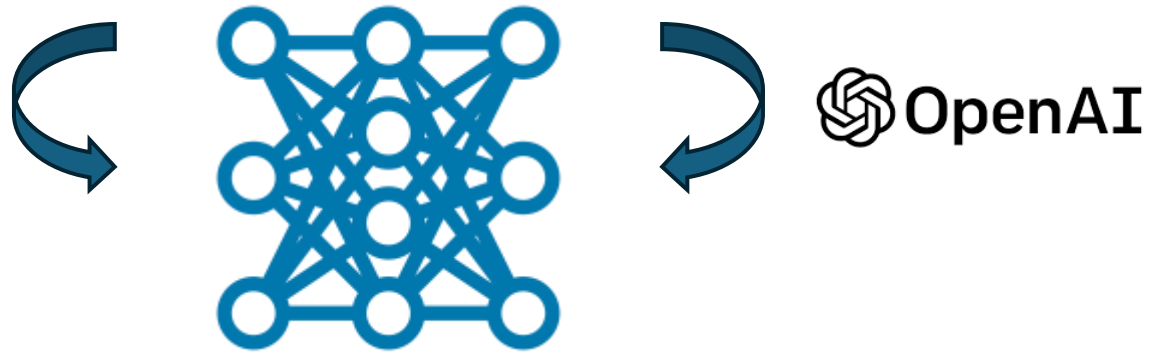


FEW SHOT LEARNING + MODELOS PRE-ENTRENADOS

MODELOS PREENTRENADOS



MODELOS PREENTRENADOS



MODELOS PREENTRENADOS



Imagen nunca vista



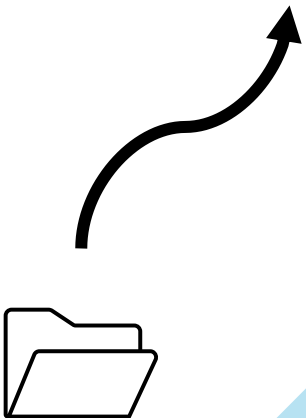
Output

(Imagen)

(Etiquetas)



“Shark, Dolphin, Lizard, Giraffe”



Upload Your Image

Select Label Set:

Upload an Image:

**Classify with Custom Labels
(only CLIP)**

Write Your Own Labels (comma-separated):

Upload an Image:



➡ **Shark**



Upload Your Image

Select Label Set:

Upload an Image:

**Classify with Custom Labels
(only CLIP)**

Write Your Own Labels (comma-separated):

Upload an Image:

Upload Your Image

Select Label Set:

CIFAR-10



Upload an Image:

Seleccionar archivo

N...o

Classify Image

Classify with Custom Labels (only CLIP)

Write Your Own Labels (comma-separated):

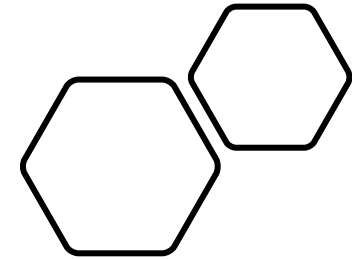
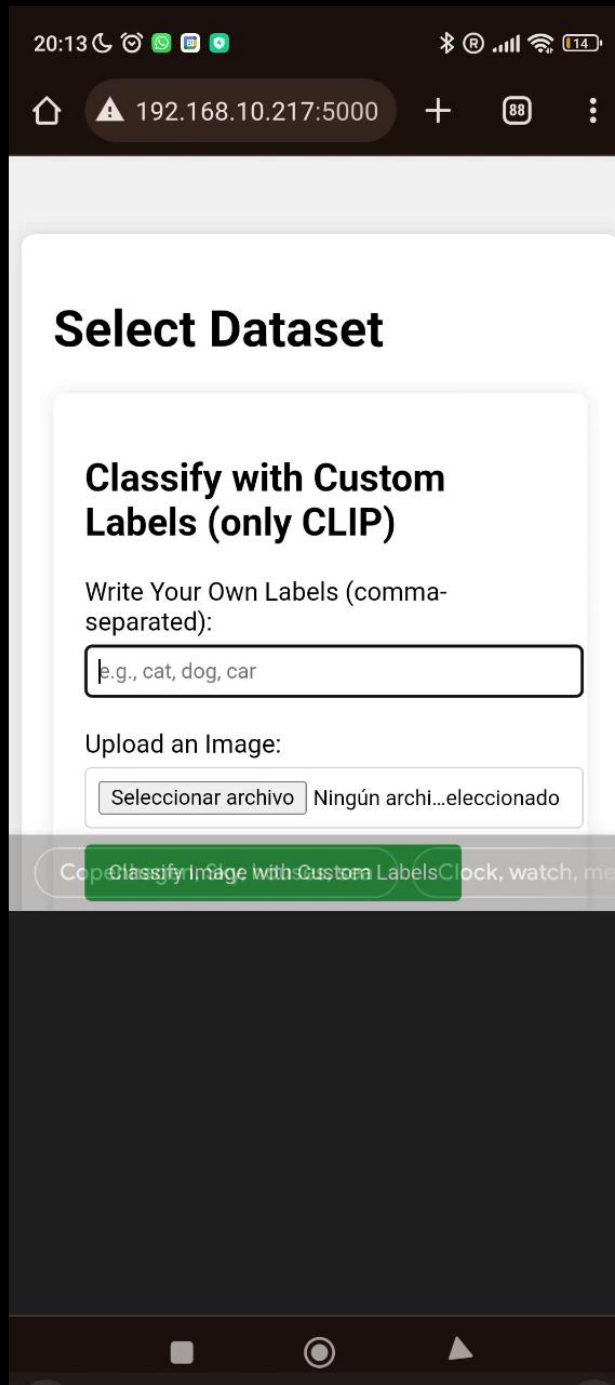
e.g., cat, dog, car

Upload an Image:

Seleccionar archivo

N...o

Classify Image with Custom Labels



IMAGENET

14,197,122 images, 21841 synsets indexed
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ImageNet Large Scale Visual Recognition Challenge (ILSVRC)

2009

2012

2017

2021

LLMs?

Deep Neural Networks
CNN – Alex Net

Transformers
Attention is All You Need

 OpenAI

CLIP
Contrastive
Language-Image
Pre-training

ResNet

VGG

(Visual Geometry Group)



Actual: **truck**

ResNet Predictions:

dog - 62.21%

deer - 11.75%

frog - 9.89%

Classification Time:
1.05 seconds

VGG Predictions:

deer - 99.85%

truck - 0.09%

cat - 0.06%

Classification Time:
0.18 seconds

Clip Predictions:

truck - 86.43%

ship - 6.7%

automobile - 4.23%

Classification Time:
0.18 seconds



Actual: **truck**

ResNet Predictions:

truck - 85.08%

horse - 7.78%

frog - 3.95%

Classification Time:
0.92 seconds

VGG Predictions:

cat - 99.98%

horse - 0.02%

dog - 0.0%

Classification Time:
0.17 seconds

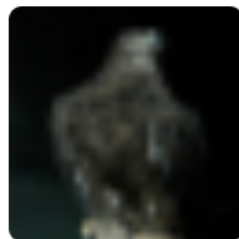
Clip Predictions:

truck - 98.33%

automobile - 1.14%

ship - 0.25%

Classification Time:
0.16 seconds



Actual: **bird**

ResNet Predictions:

deer - 52.94%

dog - 37.04%

truck - 4.75%

Classification Time:
0.9 seconds

VGG Predictions:

deer - 99.91%

horse - 0.08%

airplane - 0.01%

Classification Time:
0.17 seconds

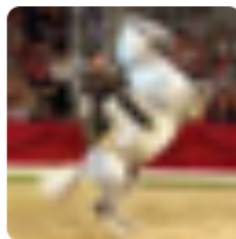
Clip Predictions:

bird - 87.8%

frog - 3.83%

dog - 2.54%

Classification Time:
0.16 seconds



Actual: **horse**

ResNet Predictions:

horse - 99.7%

ship - 0.2%

airplane - 0.07%

Classification Time:
0.9 seconds

VGG Predictions:

automobile - 99.99%

bird - 0.01%

deer - 0.0%

Classification Time:
0.17 seconds

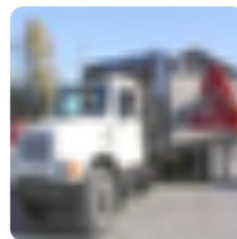
Clip Predictions:

horse - 47.57%

bird - 16.12%

airplane - 12.05%

Classification Time:
0.16 seconds



Actual: **truck**

ResNet Predictions:

ship - 35.13%

horse - 31.73%

cat - 24.35%

Classification Time:
0.94 seconds

VGG Predictions:

truck - 100.0%

deer - 0.0%

frog - 0.0%

Classification Time:
0.18 seconds

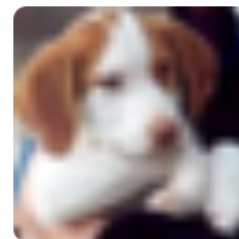
Clip Predictions:

truck - 96.84%

automobile - 2.62%

ship - 0.26%

Classification Time:
0.19 seconds



Actual: **dog**

ResNet Predictions:

airplane - 98.07%

truck - 1.87%

dog - 0.02%

Classification Time:
0.91 seconds

VGG Predictions:

dog - 100.0%

automobile - 0.0%

cat - 0.0%

Classification Time:
0.16 seconds

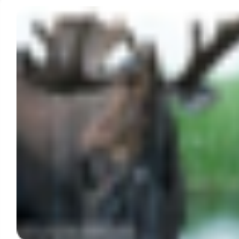
Clip Predictions:

dog - 90.29%

frog - 1.91%

airplane - 1.67%

Classification Time:
0.16 seconds



Actual: **deer**

ResNet Predictions:

bird - 88.43%

frog - 3.82%

dog - 3.57%

Classification Time:
0.9 seconds

VGG Predictions:

truck - 100.0%

automobile - 0.0%

ship - 0.0%

Classification Time:
0.16 seconds

Clip Predictions:

deer - 94.29%

horse - 4.62%

bird - 0.39%

Classification Time:
0.16 seconds



Actual: **automobile**

ResNet Predictions:

truck - 82.73%

bird - 13.68%

cat - 3.47%

Classification Time:
0.89 seconds

VGG Predictions:

bird - 100.0%

horse - 0.0%

automobile - 0.0%

Classification Time:
0.16 seconds

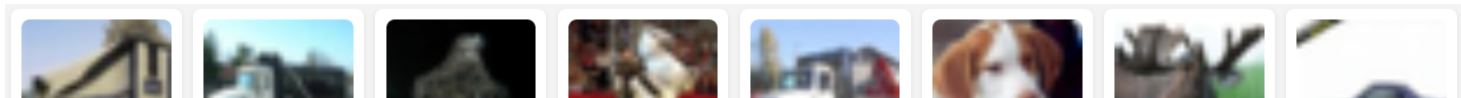
Clip Predictions:

automobile - 86.17%

truck - 8.32%

ship - 2.07%

Classification Time:
0.16 seconds



Classification Results

Accuracy

ResNet Accuracy: 20.0%
VGG Accuracy: 20.0%
Clip Accuracy: 100.0%

Top-3 Accuracy

ResNet Top-3 Accuracy: 30.0%
VGG Top-3 Accuracy: 40.0%
Clip Top-3 Accuracy: 100.0%

F1 Score

ResNet F1 Score: 11.85%
VGG F1 Score: 12.86%
Clip F1 Score: 100.0%



automobile - 4.23%	ship - 0.25%	dog - 2.54%	airplane - 12.05%	ship - 0.26%	airplane - 1.67%	bird - 0.39%	ship - 2.07%
Classification Time: 0.18 seconds	Classification Time: 0.16 seconds	Classification Time: 0.16 seconds	Classification Time: 0.16 seconds	Classification Time: 0.19 seconds	Classification Time: 0.16 seconds	Classification Time: 0.16 seconds	Classification Time: 0.16 seconds

Select Dataset for Classification

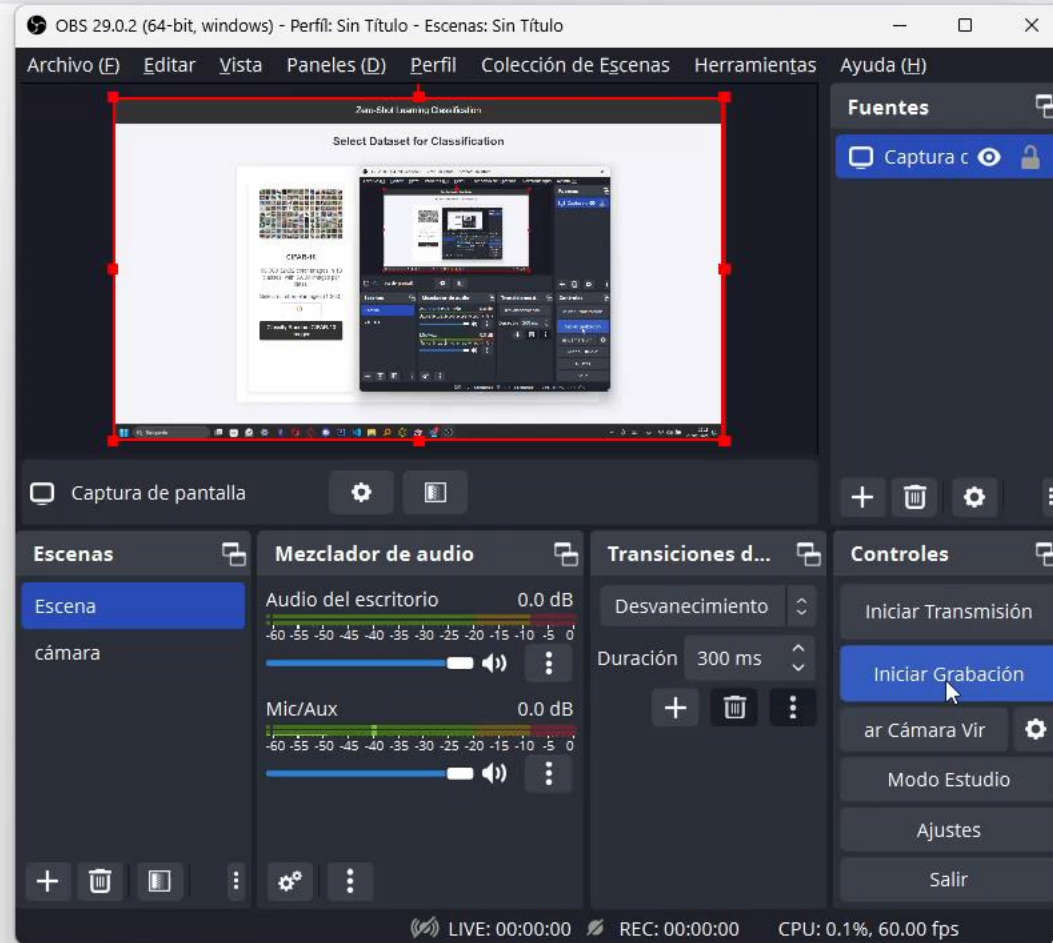


CIFAR-10

60,000 32x32 color images in 10 classes, with 6,000 images per class.

Select number of images (1-200):

Classify Random CIFAR-10 Images



Back

Classification Results

Accuracy

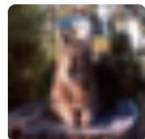
ResNet Accuracy: 10.0%
VGG Accuracy: 8.5%
Clip Accuracy: 86.5%

Top-3 Accuracy

ResNet Top-3 Accuracy: 30.5%
VGG Top-3 Accuracy: 28.0%
Clip Top-3 Accuracy: 98.0%

F1 Score

ResNet F1 Score: 9.88%
VGG F1 Score: 8.31%
Clip F1 Score: 86.37%



Actual: cat



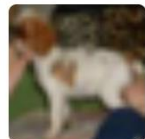
Actual: ship



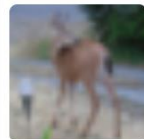
Actual: bird



Actual: airplane



Actual: dog



Actual: deer



Actual: bird



Actual: frog



Actual: ship

Accuracy

ResNet Accuracy: 10.0%
VGG Accuracy: 8.5%
Clip Accuracy: 86.5%

Top-3 Accuracy

ResNet Top-3 Accuracy: 30.5%
VGG Top-3 Accuracy: 28.0%
Clip Top-3 Accuracy: 98.0%

F1 Score

ResNet F1 Score: 9.88%
VGG F1 Score: 8.31%
Clip F1 Score: 86.37%

Back

Classification Results

Accuracy

ResNet Accuracy: 10.0%
VGG Accuracy: 8.0%
Clip Accuracy: 6.0%

Top-3 Accuracy

ResNet Top-3 Accuracy: 29.5%
VGG Top-3 Accuracy: 29.5%
Clip Top-3 Accuracy: 29.5%

F1 Score

ResNet F1 Score: 9.73%
VGG F1 Score: 7.84%
Clip F1 Score: 4.36%



Actual: Dress



Actual: Trouser



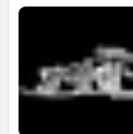
Actual: Pullover



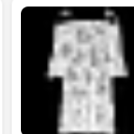
Actual: T-shirt/top



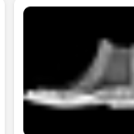
Actual: Pullover



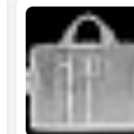
Actual: Sandal



Actual: Dress



Actual: Ankle boot



Actual: Bag

200 imágenes de
FASHION MNIST

Accuracy

ResNet Accuracy: 10.0%
VGG Accuracy: 8.0%
Clip Accuracy: 6.0%

Top-3 Accuracy

ResNet Top-3 Accuracy: 29.5%
VGG Top-3 Accuracy: 29.5%
Clip Top-3 Accuracy: 29.5%

F1 Score

ResNet F1 Score: 9.73%
VGG F1 Score: 7.84%
Clip F1 Score: 4.36%

