



Image Caption Generator

Redes Neuronales para el Análisis de Series Temporales
Diplomatura de Especialización en Inteligencia Artificial
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Integrantes...



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Image Captioning



Caption: Two dogs are playing on the snow

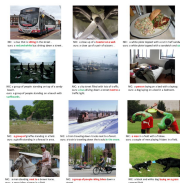


Caption: A basketball player with white uniform is dribbling the ball

Solución a problemas reales...



Metodología

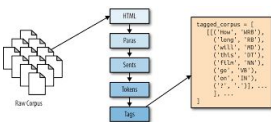


Paso 1

Selección de Dataset

Paso 2

Pre-procesamiento de Captions.



Paso 3

Generación de Image Feature Vectors.

Paso 4

Generación de secuencias para entrenamiento

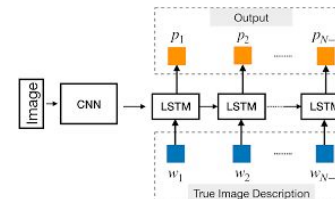
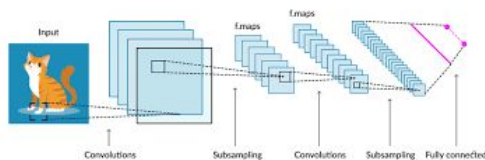
Xcaption (i)	Y (i)
<startseq>	two
<startseq> Two	dogs
<startseq> Two dogs	are
<startseq> Two dogs are	playing
<startseq> Two dogs are playing	on
<startseq> Two dogs are playing on	the
<startseq> Two dogs are playing on the	snow
<startseq> Two dogs are playing on the snow	<endseq>

Paso 5

Definición de Arquitectura.

Paso 6

Pruebas y resultados



Metodología



PUCP

1. Selección de DataSet

Flickr8K

1.14 GB

Inglés

Idioma

8091

imágenes



5

captions / imagen

Duplicados/Sin texto



34

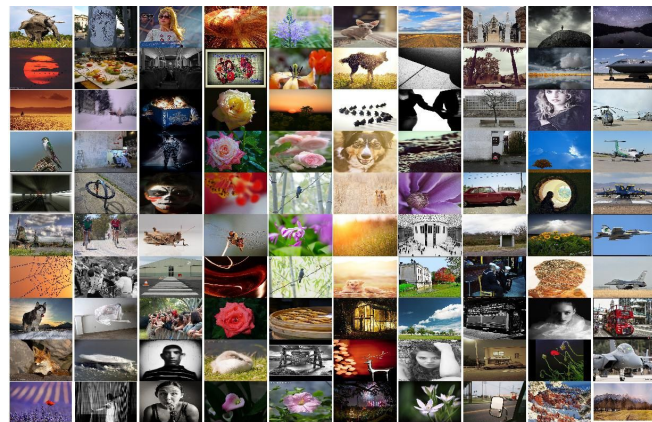
palabras

Longitud más grande
de caption



2232 palabras

Tamaño relevante de
vocabulario (> 1 palabra)



Metodología



PUCP

1. Selección de DataSet



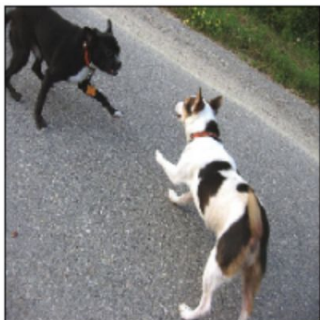
A little girl in a pink dress going into a wooden cabin .

A little girl climbing the stairs to her playhouse .

A little girl climbing into a wooden playhouse .

A girl going into a wooden building .

A child in a pink dress is climbing up a set of stairs in an entry way .



Two dogs on pavement moving toward each other .

Two dogs of different breeds looking at each other on the road .

A black dog and a white dog with brown spots are staring at each other in the street .

A black dog and a tri-colored dog playing with each other on the road .

A black dog and a spotted dog are fighting

5 captions / imagen

Metodología

2. Pre-procesamiento de Captions



- Generamos tokens.
- Eliminamos tokens de menos de 2 caracteres.
- Convertimos tokens a letras minúsculas.
- Eliminamos tokens numéricos.
- Concatenamos los tokens para formar nuevamente textos.
- Agregamos inicio y fin de secuencia a los textos.

```
['startseq dog is shaking off water endseq',  
 'startseq dog shakes his head endseq',  
 'startseq dog shakes off water endseq',  
 'startseq dog shakes off water and gets contorted endseq',  
 'startseq the dog is shaking water off of his body endseq']
```

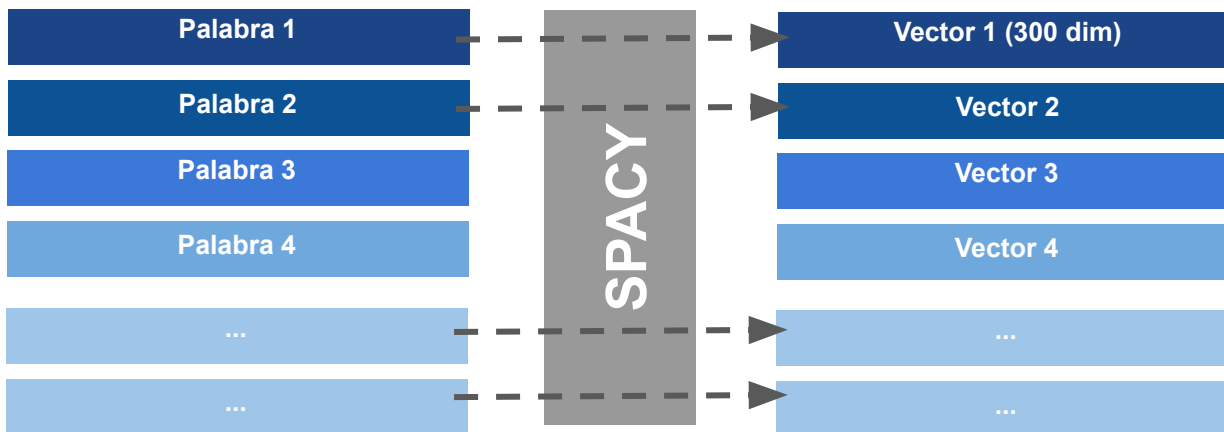

Metodología

2. Pre-procesamiento de Captions



- Generamos **matriz de vectores** en base a la palabras del vocabulario relevante y el Word Embedding empleado.

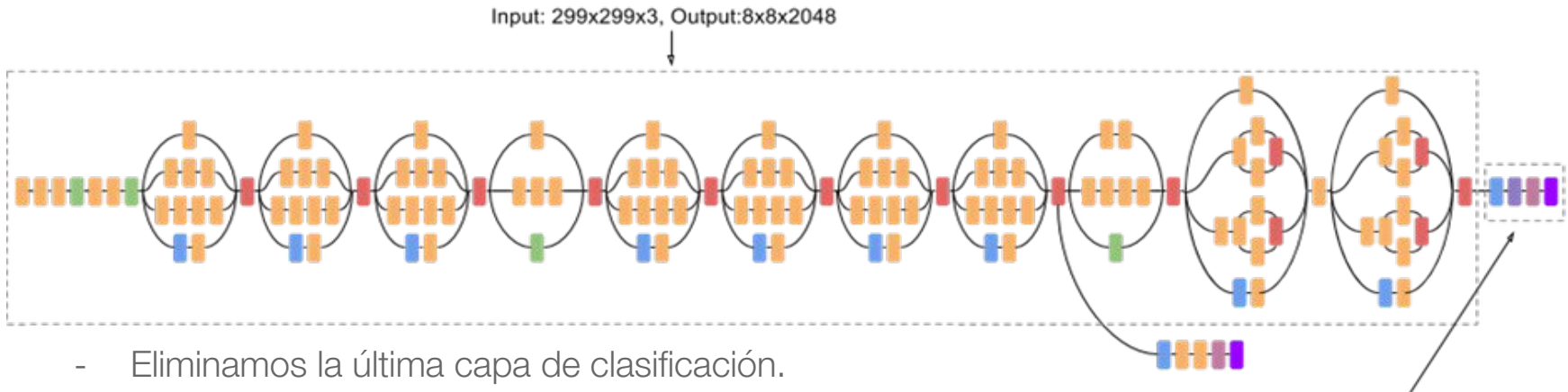
```
nlp = spacy.load("en_core_web_md")
```



Metodología

3. Generación de Feature Vectors

InceptionV3



- Eliminamos la última capa de clasificación.
- Resultando finalmente con vectores de 2048.
- Almacenamos vectores en “.pkl”.

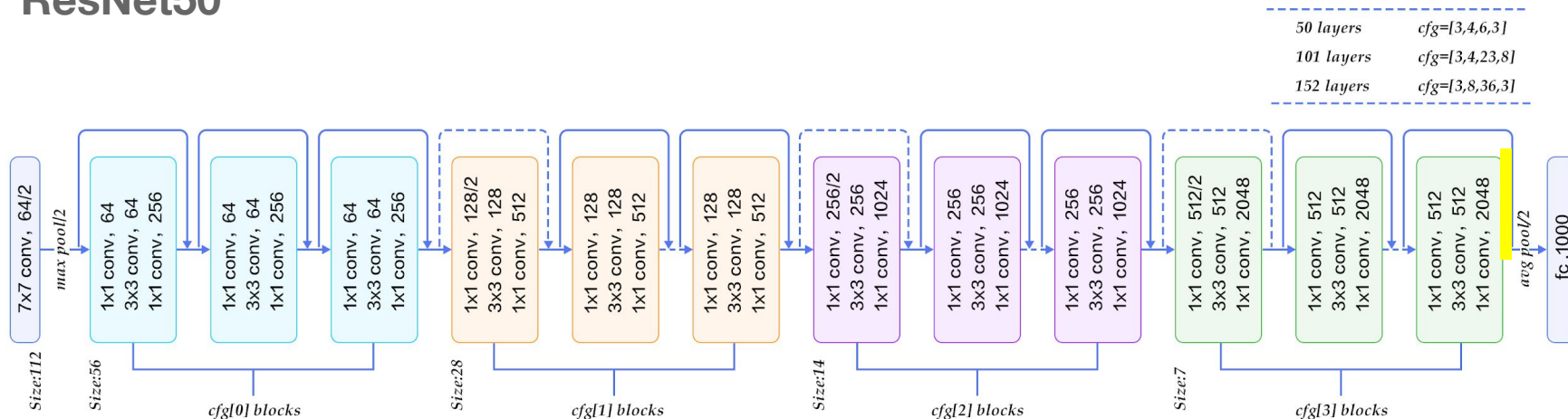
Final part: 8x8x2048 -> 1001

```
(array([0.25931156, 0.49846658, 0.21638362, ..., 0.12265647, 0.02689273,
        0.31099927], dtype=float32), (2048,))
```

Metodología

3. Generación de Feature Vectors

ResNet50



- Eliminamos la última capa de clasificación.
- Resultando finalmente con vectores de 2048.
- Almacenamos vectores en “.pkl”.

Metodología

4. Generación de secuencias para entrenamiento

Caption: Two dogs are playing on the snow

<startseq> Two dogs are playing on the snow <endseq>

Dividimos la
secuencia en
tramos



img_123456.jpg

Xcaption (i)	Y (i)
<startseq>	two
<startseq> Two	dogs
<startseq> Two dogs	are
<startseq> Two dogs are	playing
<startseq> Two dogs are playing	on
<startseq> Two dogs are playing on	the
<startseq> Two dogs are playing on the	snow
<startseq> Two dogs are playing on the snow	<endseq>

Metodología

4. Generación de secuencias para entrenamiento

Caption: Two dogs are playing on the snow

<startseq> Two dogs are playing on the snow **<endseq>**

word to index



img_123456.jpg

Xcaption (i)	Y (i)
9	7
9, 7	2
9, 7, 2	1
9, 7, 2, 1	4
9, 7, 2, 1, 4	3
9, 7, 2, 1, 4, 3	6
9, 7, 2, 1, 4, 3, 6,	5
9, 7, 2, 1, 4, 3, 6, 5	8

Metodología

4. Generación de secuencias para entrenamiento

Caption: Two dogs are playing on the snow

<startseq> Two dogs are playing on the snow <endseq>

zero's
padding



img_123456.jpg

Xcaption (i)	Y (i)
9, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	7
9, 7, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	2
9, 7, 2, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	1
9, 7, 2, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	4
9, 7, 2, 1, 4, 0, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	3
9, 7, 2, 1, 4, 3, 0, 0, 0, 0, 0, 0, 0, 0, , 0, 0	6
9, 7, 2, 1, 4, 3, 6, 0, 0, 0, 0, 0, 0, 0, , 0, 0	5
9, 7, 2, 1, 4, 3, 6, 5, 0, 0, 0, 0, 0, 0, , 0, 0	8

Metodología

5. Definición de Arquitectura



image

transform

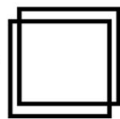
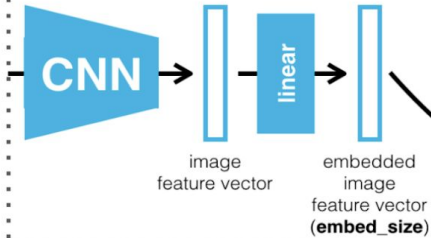
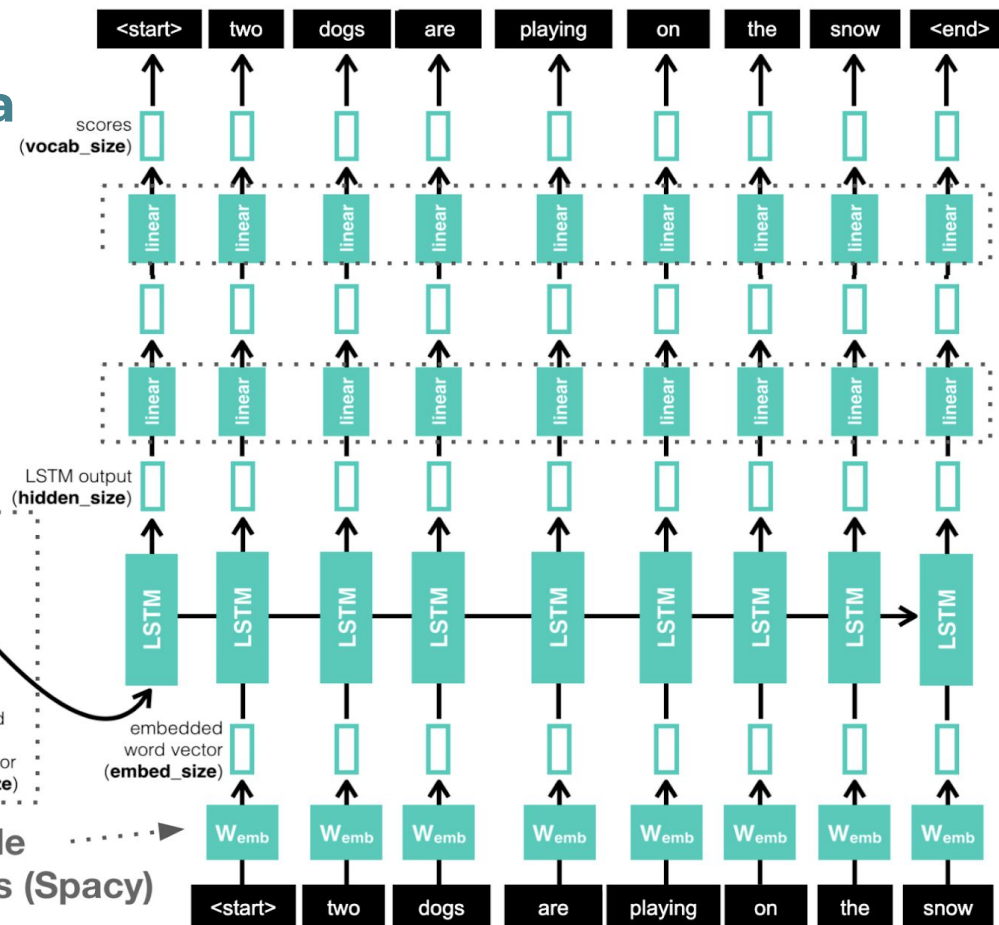


image tensor
(224,224,3)

InceptionV3
ResNet50



Matriz de
vectores (Spacy)



Metodología

5. Entrenamiento

50 épocas

26 min - GPU

32 imágenes

Batch Size

0.0012 lr

Learning rate

Adam

Optimizador

categorical_crossentropy

Función de Loss

Loss & Accuracy:

loss: 2.6940 - accuracy: 0.3657

Metodología

6. Pruebas y resultados

Caption 1: bald man dribbles basketball while wearing miami jersey

Caption 2: man playing basketball jersey number

Caption 3: number five plays basketball for miami

Caption 4: the basketball player is wearing orange sneakers

Caption 5: the number five miami player dribbles down the court

Prediction: basketball player in white uniform is dribbling the ball



Caption 1: couple people running through large sidewalk fountain

Caption 2: young boy is running through water fountain

Caption 3: children are under large fountain in the city

Caption 4: child runs through city fountain

Caption 5: some children run through fountain

Prediction: two children are playing in the water



Metodología

6. Pruebas y resultados

Caption 1: bicyclist rides on ramps

Caption 2: bike rider does trick in the air

Caption 3: man performs bike trick on ramp

Caption 4: extreme bmx rider defying gravity

Caption 5: person doing tricks on bicycle in skatepark

Prediction: man does trick on his bike in the air



Caption 1: woman in is walking holding silver cellphone

Caption 2: woman in black shirt walking down the street

Caption 3: woman wearing black shirt walks among crowd in city

Caption 4: brunette woman in black walking through blurred crowd

Caption 5: lady walking and squinting from the sun in large group of people

Prediction: woman in black shirt and sunglasses is standing in front of crowd



Metodología

6. Pruebas y resultados

Caption 1: two brown dogs are playing with each other in the snow

Caption 2: two brown dogs chase each other in the snow

Caption 3: two brown dogs play in the snow

Caption 4: two dogs playing in the snow

Caption 5: two dogs playing or fighting in the snow

Prediction: two dogs are running through the snow



Caption 1: guy is watching another guy jump in the air while snowboarding

Caption 2: person in orange pants is doing tricks on snowboard while

Caption 3: person sits on snowbank watching snowboarder take high leap

Caption 4: person watches as snowboarder does fancy trick in the air

Caption 5: snowboarder performing trick high in the air in snowy area

Prediction: snowboarder is jumping over snow hill



Metodología

6. Pruebas y resultados

Caption 1: dog chases toy in the grass with its owner in the background
 Caption 2: dog chases white animal on green lawn
 Caption 3: dog playing outside in the grass
 Caption 4: golden dog is running across the grass chasing white toy on the ground
 Caption 5: the brown dog is running outside on the grass

Prediction: dog runs through the grass



Caption 1: bunch of people playing soccer
 Caption 2: action photo of soccer players in red and black uniforms
 Caption 3: soccer player jumping in air during game
 Caption 4: six soccer players on field with player in red uniform in the air and ball airborne
 Caption 5: the red team knocked the ball toward the goal and the black team tried to block it

Prediction: two men in red and white uniforms play soccer



Metodología

6. Pruebas y resultados

Caption 1: little boy walking on railroad tracks

Caption 2: little boy walks along railroad tracks in the woods

Caption 3: little boy walking with stick on tracks

Caption 4: the little boy walks along the railroad tracks with his stick

Caption 5: there is little boy in red jacket walking down the railroad tracks

Prediction: man in red shirt is standing on the sidewalk



Caption 1: one girl is wearing white with red sleeves the other has words on hers

Caption 2: two asian girls laughing together

Caption 3: two girls with dark hair and white shirts

Caption 4: two girls with long hair are smiling and one is hold something white and green

Caption 5: two women in white shirts talking

Prediction: woman in black shirt and sunglasses is standing on the street



Próximos Pasos



Utilizar el Dataset **Flickr30k** con más de 3 veces la cantidad de imágenes con las que hemos entrenado.



Probar **nuevas arquitecturas**, diferentes modelos de **word embeddings** (large_model_spacy) y otras **CNNs diferentes a Resnet50 y InceptionV3** para obtener los vectores de las imágenes.



Incorporar **mecanismos de atención** para brindarle a red recurrente (decoder) un contexto en donde poner mayor atención y generar mejores predicciones.

Material Bibliográfico

- <https://www.kaggle.com/adityajn105/flickr8k> (**Dataset**)
- <https://academictorrents.com/details/9dea07ba660a722ae1008c4c8afdd303b6f6e53b>
- <https://machinelearningmastery.com/develop-a-deep-learning-caption-generation-model-in-python/>
- <https://towardsdatascience.com/image-captioning-with-keras-teaching-computers-to-describe-pictures-c88a46a311b8> (**Referencia: Data Generator Callback y Arquitectura**)
- <http://static.googleusercontent.com/media/research.google.com/es//pubs/archive/43274.pdf>



Repositorio



DavidFosca / Image_Caption_Generator

<> Code ⓘ Issues 🔗 Pull requests ⏸ Actions 📁 Projects 📖 Wiki 🛡 Security 📈 Insights ⚙ Settings

🔗 master 1 branch 0 tags Go to file Add file Code

DavidFosca Add files via upload 8d69d76 29 seconds ago 15 commits

Dataset	Add files via upload	13 minutes ago
Image_Caption_Model	Add files via upload	12 minutes ago
Python_Image_Caption_Generator	Add files via upload	29 seconds ago
LICENSE	Initial commit	24 minutes ago
README.md	Update README.md	3 minutes ago

README.md

Image_Caption_Generator

Github: https://github.com/DavidFosca/Image_Caption_Generator



PUCP

¡GRACIAS!