

Aula 10 – Segmentação semântica

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- Localização, detecção e segmentação
- Modelos para segmentação semântica
- Aplicações de segmentação semântica
- U-Net
- Upsampling

Localização, detecção e segmentação

Semantic Segmentation



GRASS, CAT,
TREE, SKY

No objects, just pixels

Classification + Localization



CAT

Single Object

Object Detection



DOG, DOG, CAT

Multiple Object

Instance Segmentation



DOG, DOG, CAT

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Stanford cs231n (2022): http://cs231n.stanford.edu/slides/2022/lecture_9_jiajun.pdf

Modelos para segmentação semântica

- Fully convolutional network
- Masked R-CNN
- U-Net
- PSPNet
- DeepLab
- ...

Aplicações de segmentação semântica

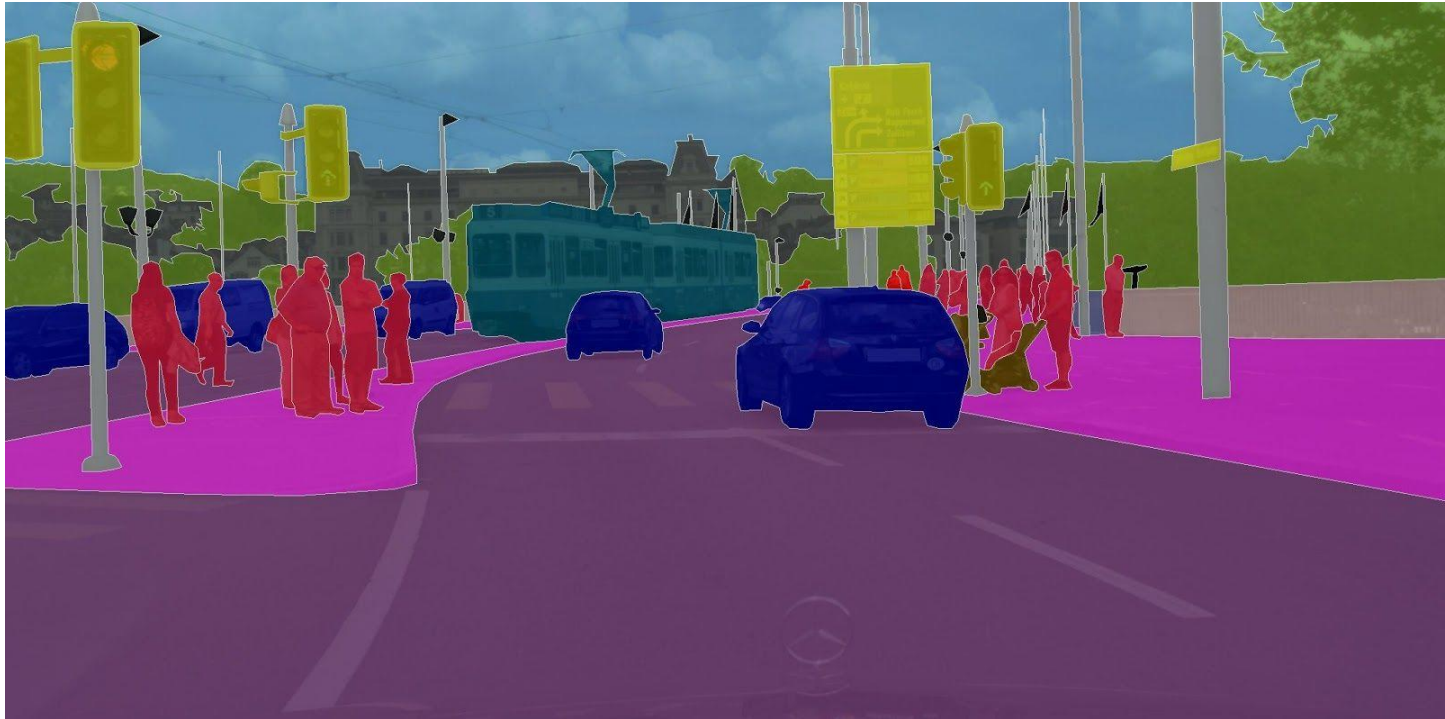
- Modo retrato e substituição do fundo



<https://ai.googleblog.com/2018/03/mobile-real-time-video-segmentation.html>

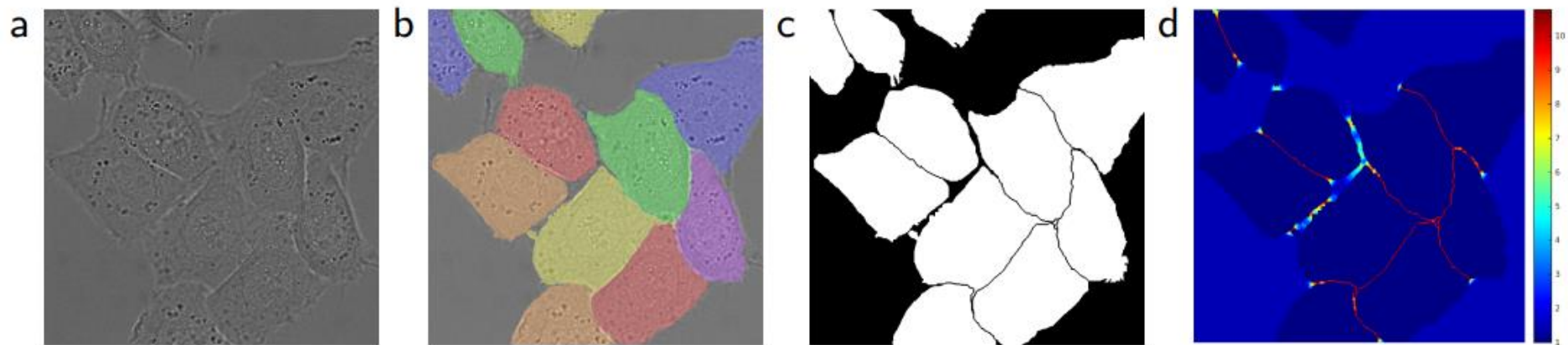
Aplicações de segmentação semântica

- Self-driving cars



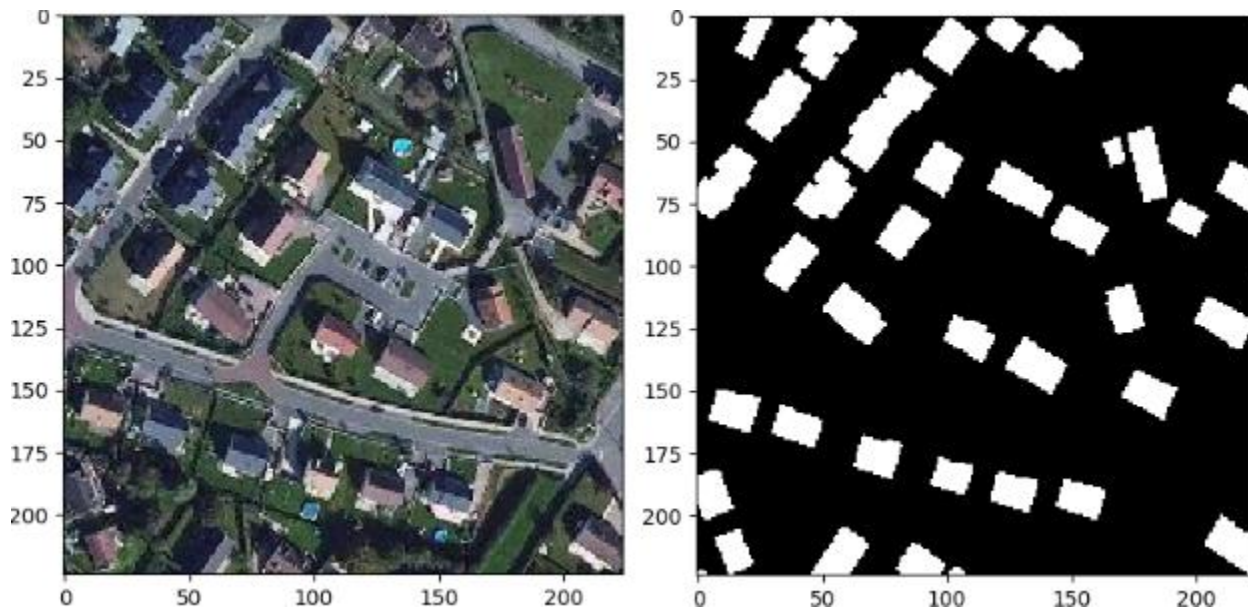
<https://ai.googleblog.com/2018/03/mobile-real-time-video-segmentation.html>

- Imagens biomédicas



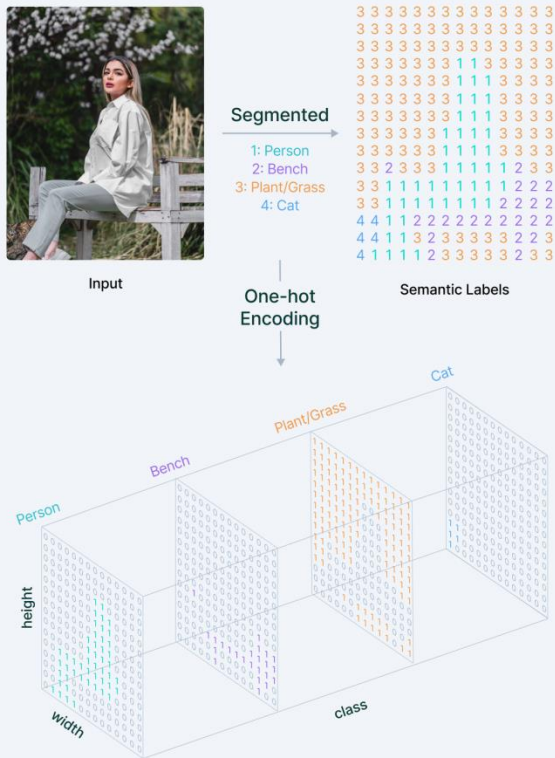
Aplicações de segmentação semântica

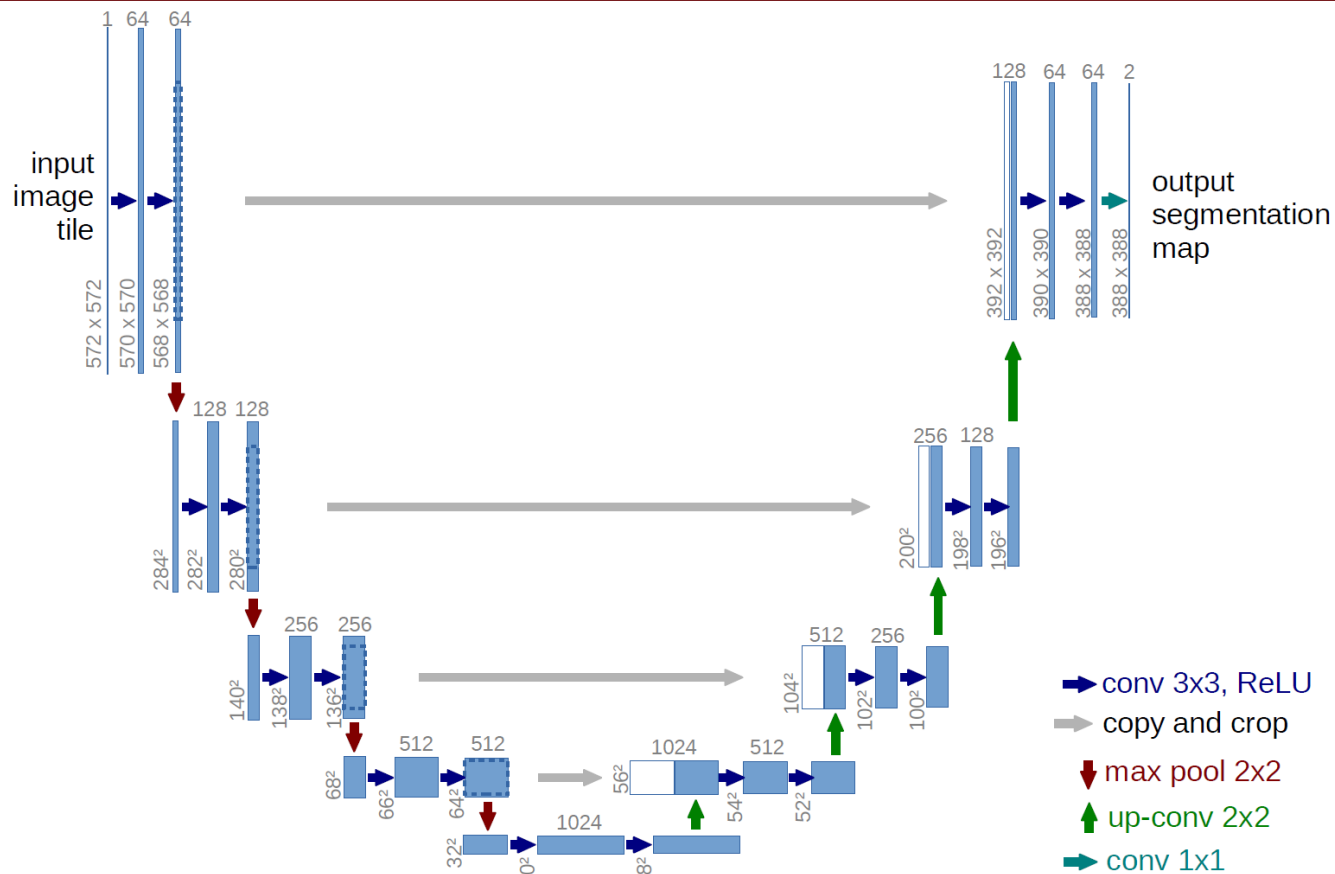
- Segmentação de imagens de satélite



Segmentação semântica

An overview of Semantic Image Segmentation





Ronneberger, Fischer, Brox. U-Net: Convolutional Networks for Biomedical Image Segmentation. 2015.



Upsampling

Nearest Neighbor

1	2
3	4



1	1	2	2
1	1	2	2
3	3	4	4
3	3	4	4

Input: 2 x 2

Output: 4 x 4

"Bed of Nails"

1	2
3	4



1	0	2	0
0	0	0	0
3	0	4	0
0	0	0	0

Input: 2 x 2

Output: 4 x 4

Upsampling

Max Pooling

Remember which element was max!

1	2	6	3
3	5	2	1
1	2	2	1
7	3	4	8

Input: 4 x 4



5	6
7	8

Output: 2 x 2



...

Rest of the network

Max Unpooling

Use positions from pooling layer

1	2
3	4

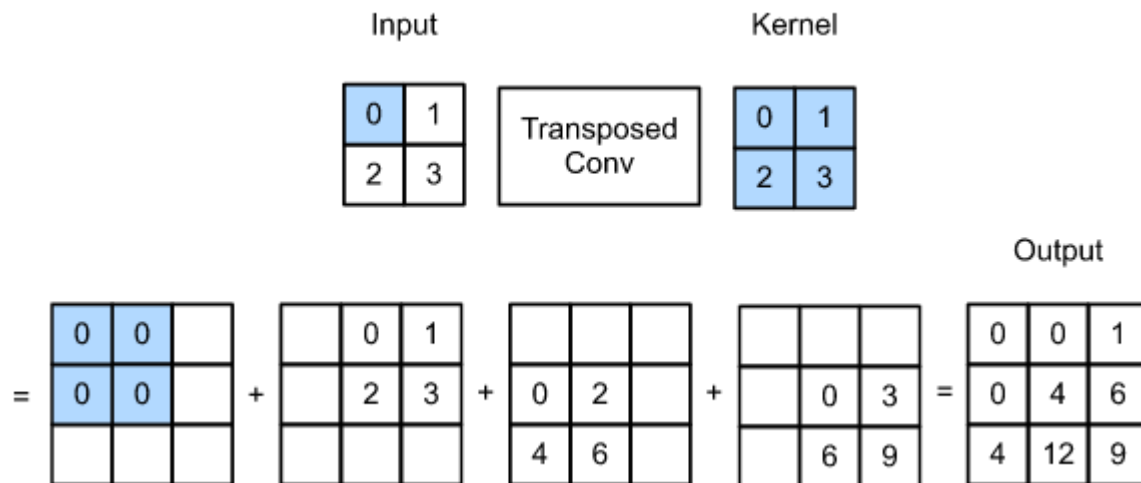
Input: 2 x 2



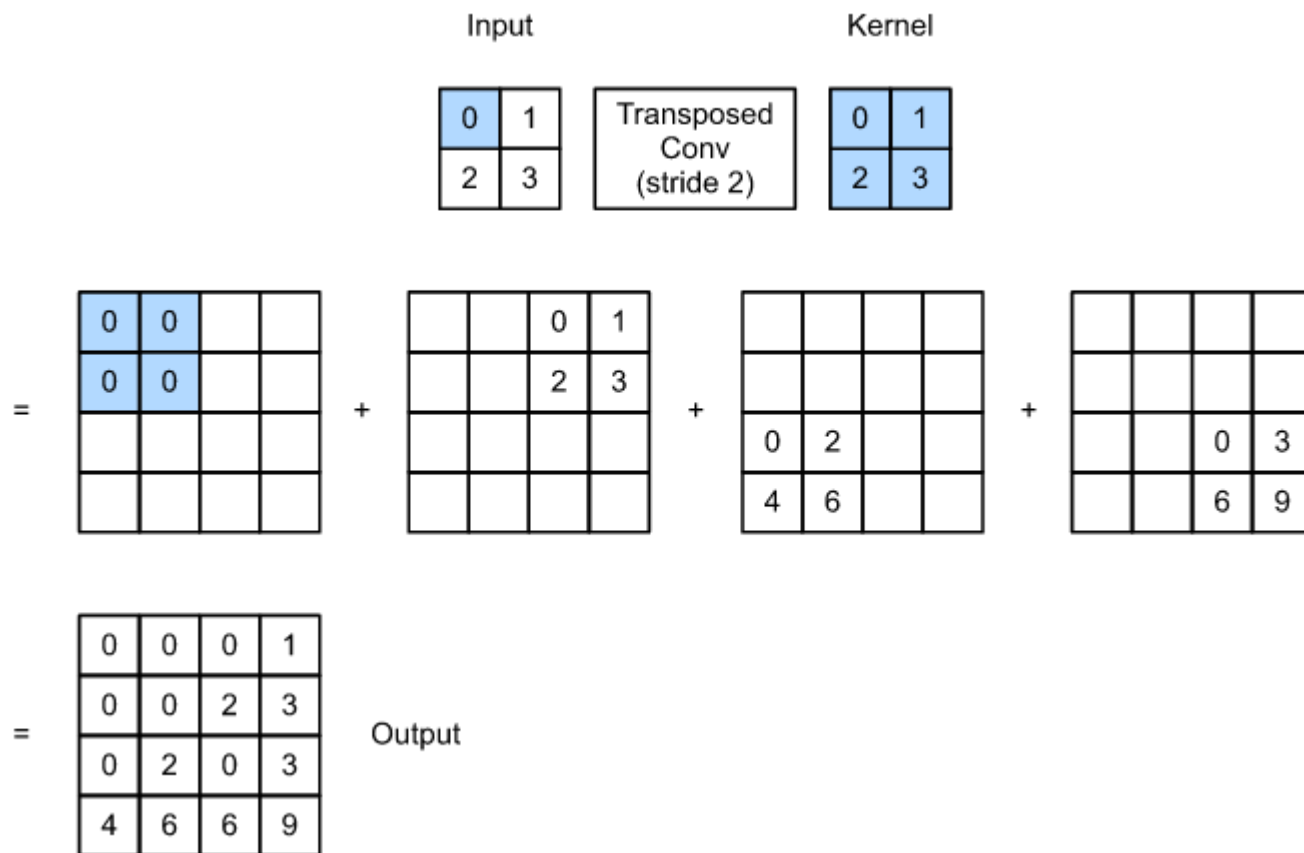
0	0	2	0
0	1	0	0
0	0	0	0
3	0	0	4

Output: 4 x 4

Convolução transposta



Convolução transposta



Convolução transposta

- Stride 2, padding 0

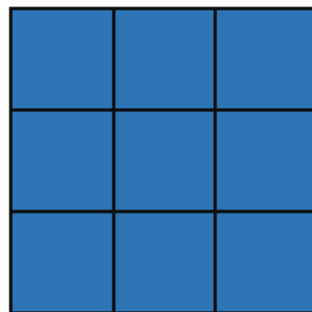


Imagem Original

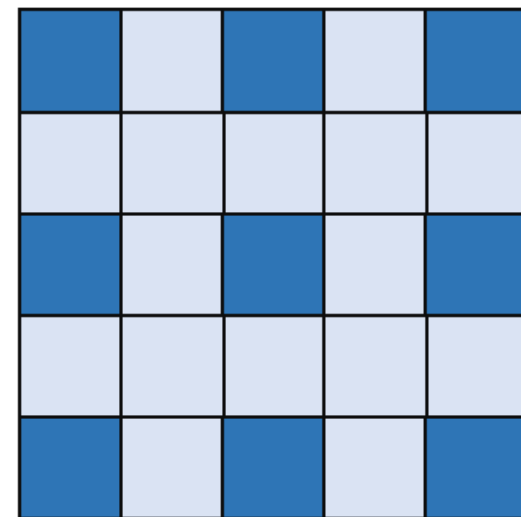


Imagem Final

Convolução transposta

- Stride 1, padding 1

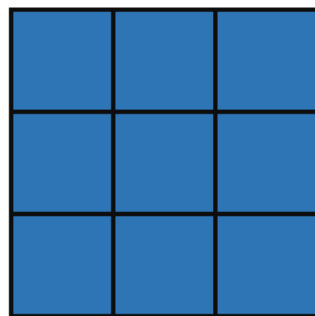


Imagem Original

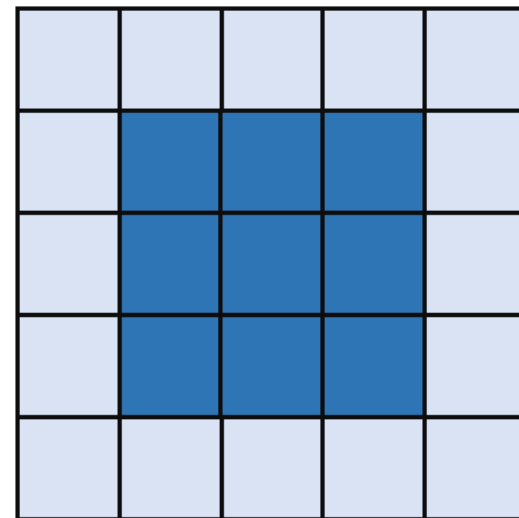
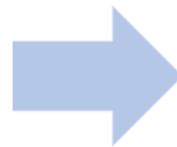


Imagem Final

Convolução transposta

- Stride 2, padding 1

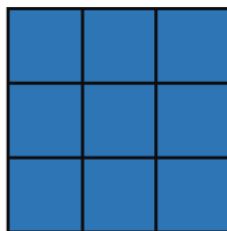


Imagem Original

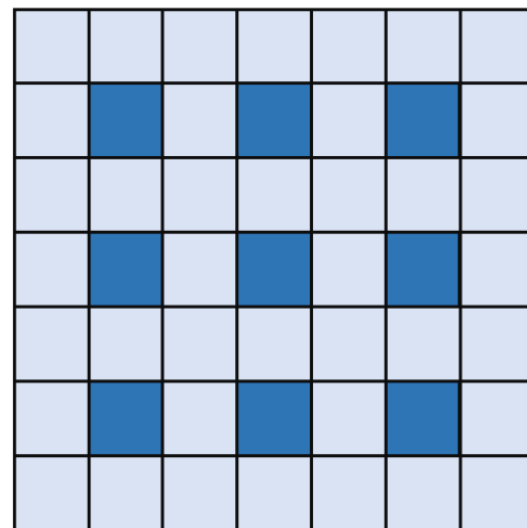


Imagem Final

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Bibliografia

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- Satellite Image Segmentation for Building Detection using U-net. Stanford CS229.
– <https://cs229.stanford.edu/proj2017/final-reports/5243715.pdf>
- https://d2l.ai/chapter_computer-vision/transposed-conv.html
- <https://didatica.tech/transposed-convolutional-layer/>

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