

# Vérification des performances d'un modèle de Deep Learning

DANNet: A One-Stage Domain Adaptation Network  
for Unsupervised  
Nighttime Semantic Segmentation

# L'article

## DANNet: A One-Stage Domain Adaptation Network for Unsupervised Nighttime Semantic Segmentation

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CONFÉRENCE

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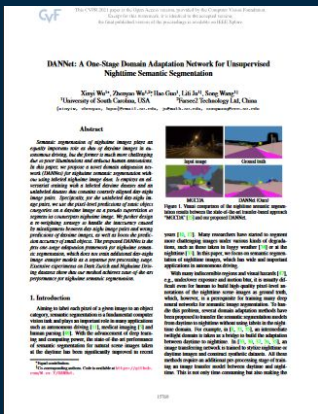
Hao Guo

Lili Ju

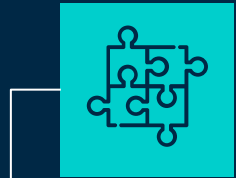
Song Wang

Juin 2021

Computer Vision and Pattern Recognition (CVPR)



# Sommaire



01

PROBLEME



02

SOLUTION



03

RÉSULTATS

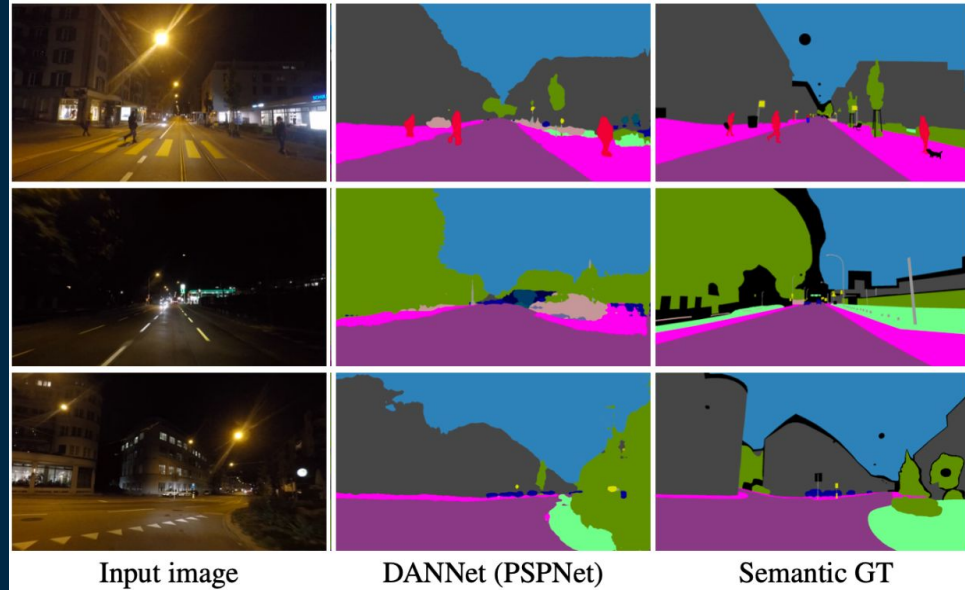
# LE PROBLÈME

01

# 1 - LE PROBLÈME

## Objectifs

Segmentation d'images de nuit  
non labellisées



# 1 - LE PROBLÈME

## Adaptation de domaine

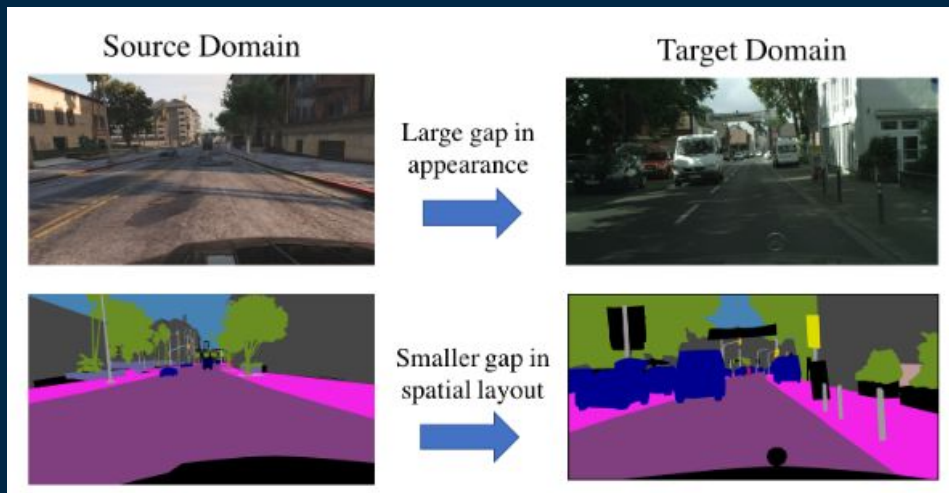
### Domaine source

On dispose de connaissances et de vérité terrain



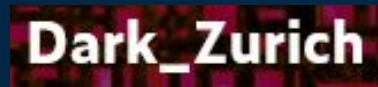
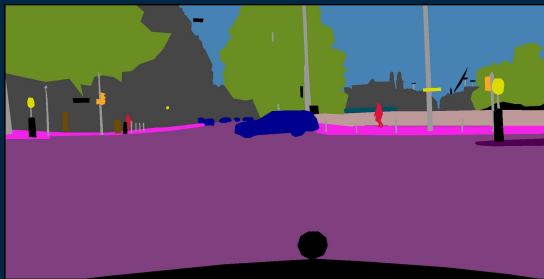
### Domaine cible

Vérité terrain inconnue



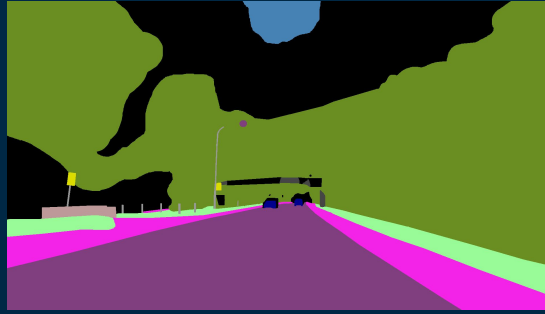
## 1 - LE PROBLÈME

# Les données d'apprentissage

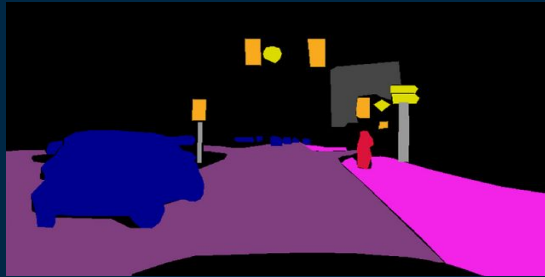


# 1 - LE PROBLÈME

## Les données de test



Dark\_Zurich



Nighttime Driving



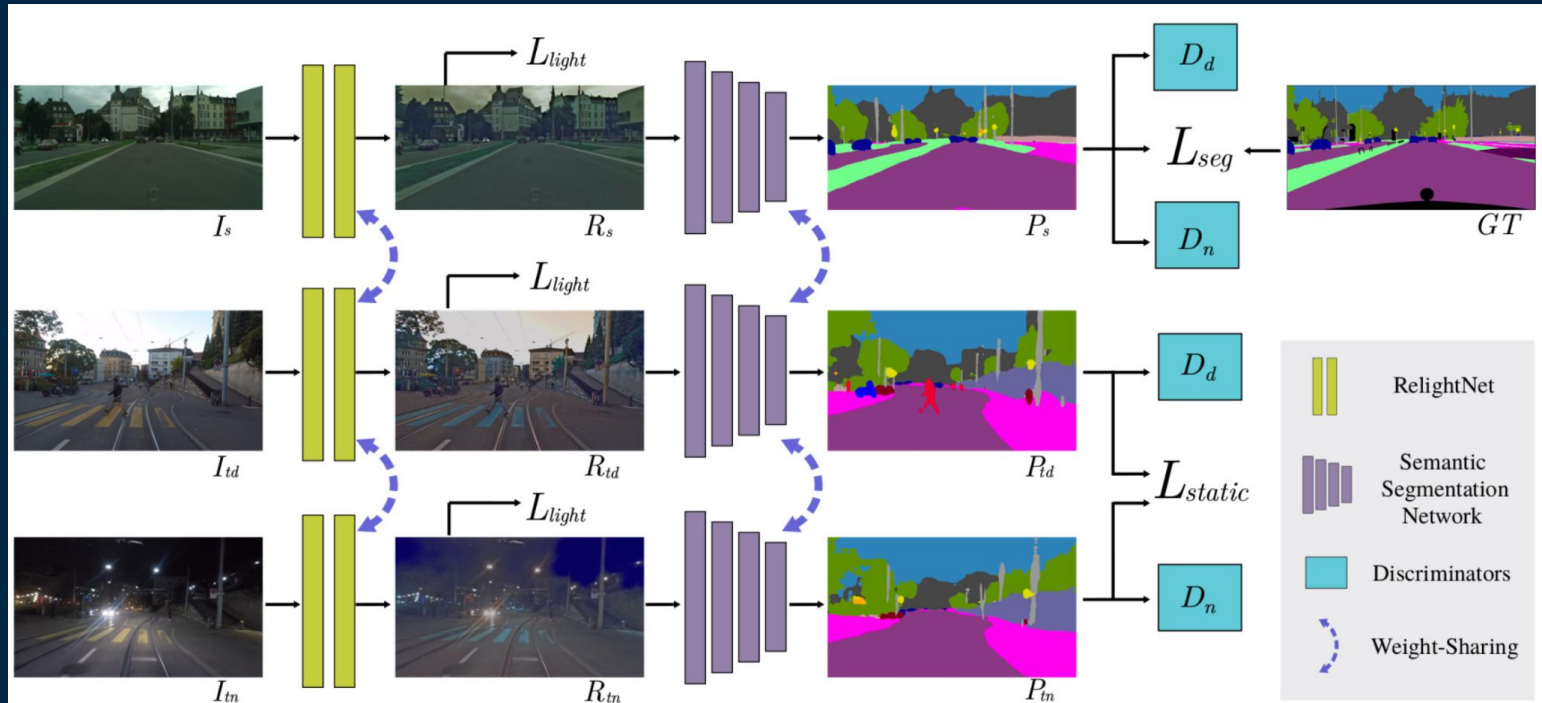


02

# LA SOLUTION

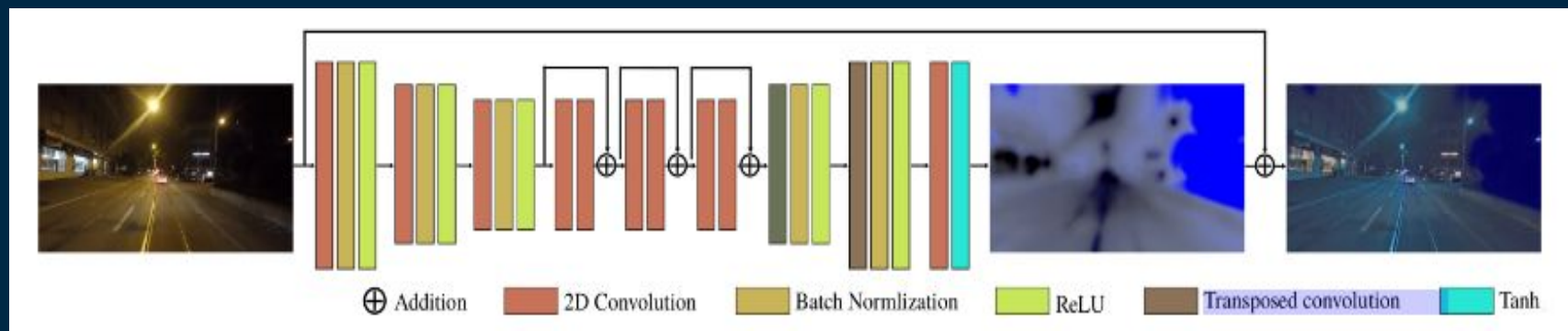
## 2 - LA SOLUTION

# Structure du DANNet



## 2 - LA SOLUTION

# Relight



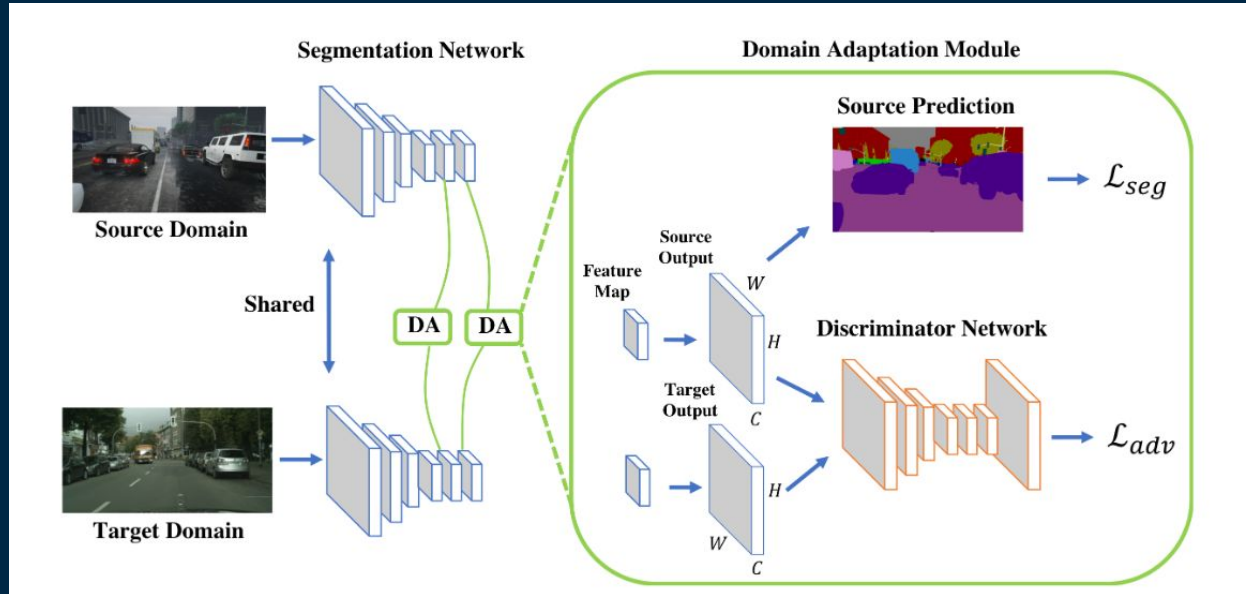
## 2 - LA SOLUTION

# Segmentation

- PSPNet : <https://arxiv.org/pdf/1612.01105.pdf>
- RefineNet : <https://arxiv.org/pdf/1611.06612.pdf>
- DeepLab\_v2 : <https://arxiv.org/pdf/1606.00915.pdf>

## 2 - LA SOLUTION

# Discriminateurs



Source : <https://arxiv.org/pdf/1802.10349.pdf>

# RÉSULTATS

03

### 3 - RÉSULTATS

## Intersection Over Union

$$IOU = \frac{\text{area of overlap}}{\text{area of union}} = \frac{\text{Diagram illustrating IOU calculation: Two overlapping rectangles (green and red) are shown above a single blue rectangle representing the union of the two rectangles. The intersection area is highlighted in blue within the green rectangle, and the union area is the entire blue rectangle below.$$

Source : [https://www.researchgate.net/figure/Intersection-Over-Union-IOU\\_fig2\\_343194514](https://www.researchgate.net/figure/Intersection-Over-Union-IOU_fig2_343194514)

### 3 - RÉSULTATS

## Réseaux de segmentation

Method	road	sidewalk	building	wall	fence	pole	traffic light	traffic sign	vegetation	terrain	sky	person	rider	car	truck	bus	train	motorcycle	bicycle	mIoU
DANNet (DeepLab-v2)	88.6	53.4	69.8	<u>34.0</u>	20.0	25.0	31.5	35.9	69.5	<b>32.2</b>	<u>82.3</u>	44.2	43.7	54.1	22.0	0.1	40.9	36.0	<b>24.1</b>	42.5
DANNet (RefineNet)	<u>90.0</u>	<u>54.0</u>	<b>74.8</b>	<b>41.0</b>	<u>21.1</u>	25.0	26.8	30.2	<b>72.0</b>	26.2	<b>84.0</b>	47.0	33.9	68.2	19.0	<b>0.3</b>	<u>66.4</u>	<u>38.3</u>	<u>23.6</u>	<u>44.3</u>
DANNet (PSPNet)	<b>90.4</b>	<b>60.1</b>	<u>71.0</u>	33.6	<b>22.9</b>	30.6	34.3	33.7	<u>70.5</u>	<u>31.8</u>	80.2	45.7	41.6	67.4	16.8	0.0	<b>73.0</b>	31.6	22.9	<b>45.2</b>



### 3 - RÉSULTATS

## Notre instance du modèle

Langage



Nombre d'epoch des réseaux pré-entraînés

150 000

Nombre d'epoch des auteurs

35 000 avec un GPU 2080TI

Nombre d'epoch de notre réseau

13 000 en 48h



### 3 - RÉSULTATS

## Segmentations obtenues

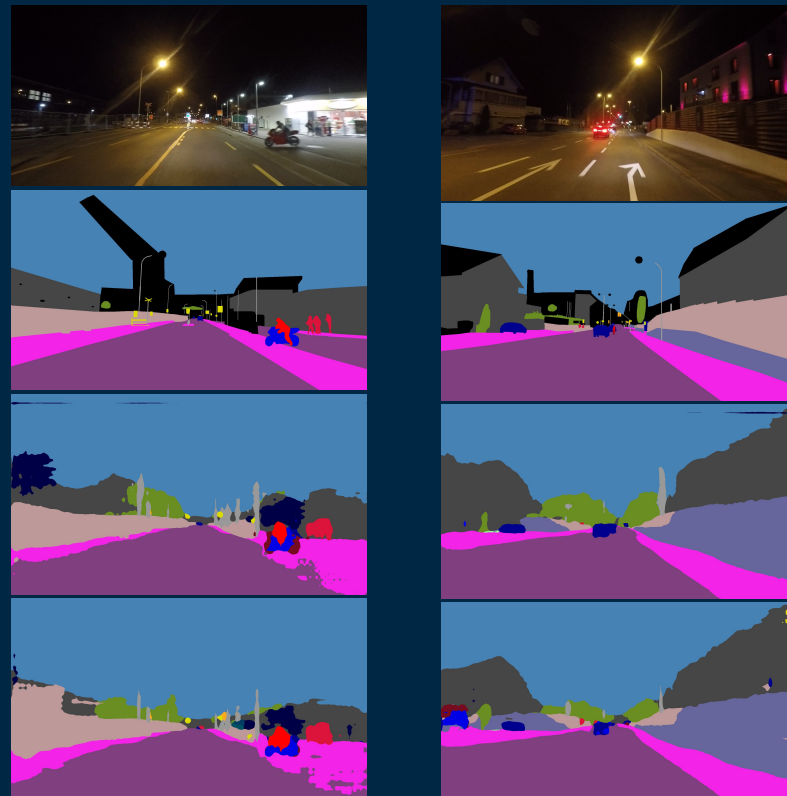
Source

Ground Truth

Dark\_Zurich

Modèle entraîné des auteurs

Notre modèle entraîné



### 3 - RÉSULTATS

## Performances sur Zurich-val

```
Num classes 19
===>road:      90.93
===>sidewalk:   59.35
===>building:   77.08
===>wall:       37.79
===>fence:      40.35
===>pole:       14.08
===>light:      39.95
===>sign:       14.15
===>vegetation: 68.26
===>terrain:    28.61
===>sky:        82.91
===>person:     21.01
===>rider:      25.44
===>car:        46.99
===>truck:      0.0
===>bus:        0.0
===>train:      0.0
===>motorcycle: 10.21
===>bicycle:    41.33
===> mIoU: 36.76
```

35000 epochs

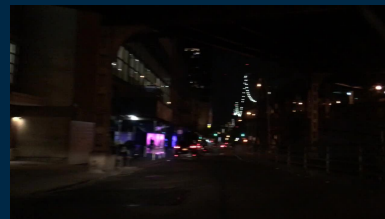
```
Num classes 19
===>road:      89.1
===>sidewalk:   58.17
===>building:   71.77
===>wall:       34.51
===>fence:      38.67
===>pole:       14.53
===>light:      26.16
===>sign:       6.35
===>vegetation: 63.06
===>terrain:    27.11
===>sky:        79.88
===>person:     21.33
===>rider:      29.14
===>car:        48.62
===>truck:      0.0
===>bus:        0.0
===>train:      0.0
===>motorcycle: 7.6
===>bicycle:    24.17
===> mIoU: 33.69
```

13000 epochs

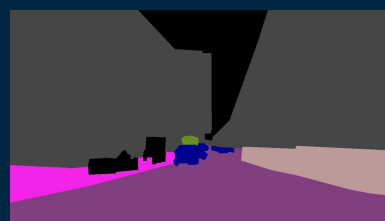
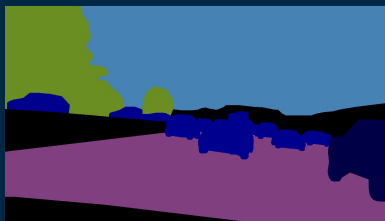
### 3 - RÉSULTATS

## Résultats sur les données Berkeley DeepDrive

Source



Ground Truth



Notre modèle entraîné

