

T-AIA-901



# Taxi Driver



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Démo

# PROJET

# Taxi Driver

Problématique à résoudre

Tester différentes  
approches d'IA pour  
gagner au jeu Taxi-V3

# Organisation

Nos outils pour gérer notre projet

## OUTIL DE TRAVAIL

-  TEAMS
-  GITLAB REPO
-  TRELLO

## TECHNOS UTILISÉES

-  JUPYTER NOTEBOOK
-  PYTHON
-  DJANGO

## SERVEUR & DATA

-  HEBERGEMENT LOCAL

## LIBRAIRIES

- NUMPY
- PANDAS
- TENSORFLOW
- GYM

# Organisation

Gestion d'équipe

## FONCTIONNEMENT

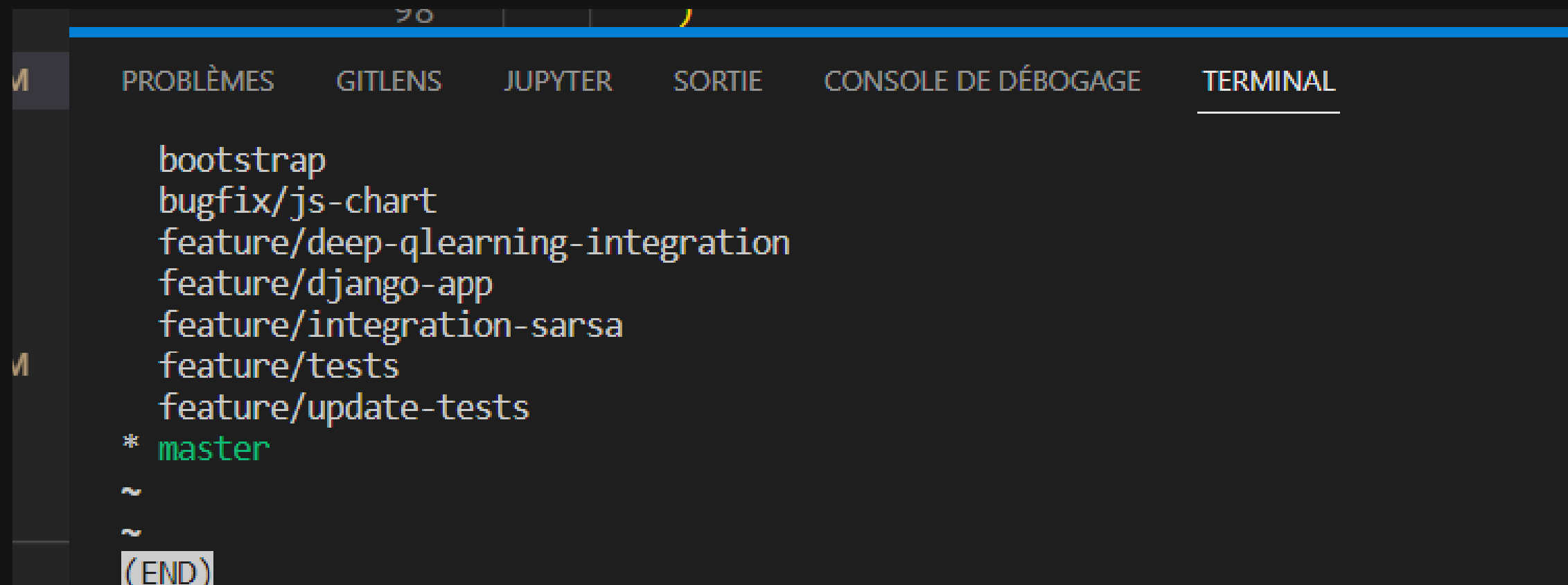
- Découpage et affectation des tâches
- Réunion hebdomadaire
- Peer programming
- Versionning et Pull Requests

# GIT & Gitlab

Comment avons-nous procédé

## FONCTIONNEMENT

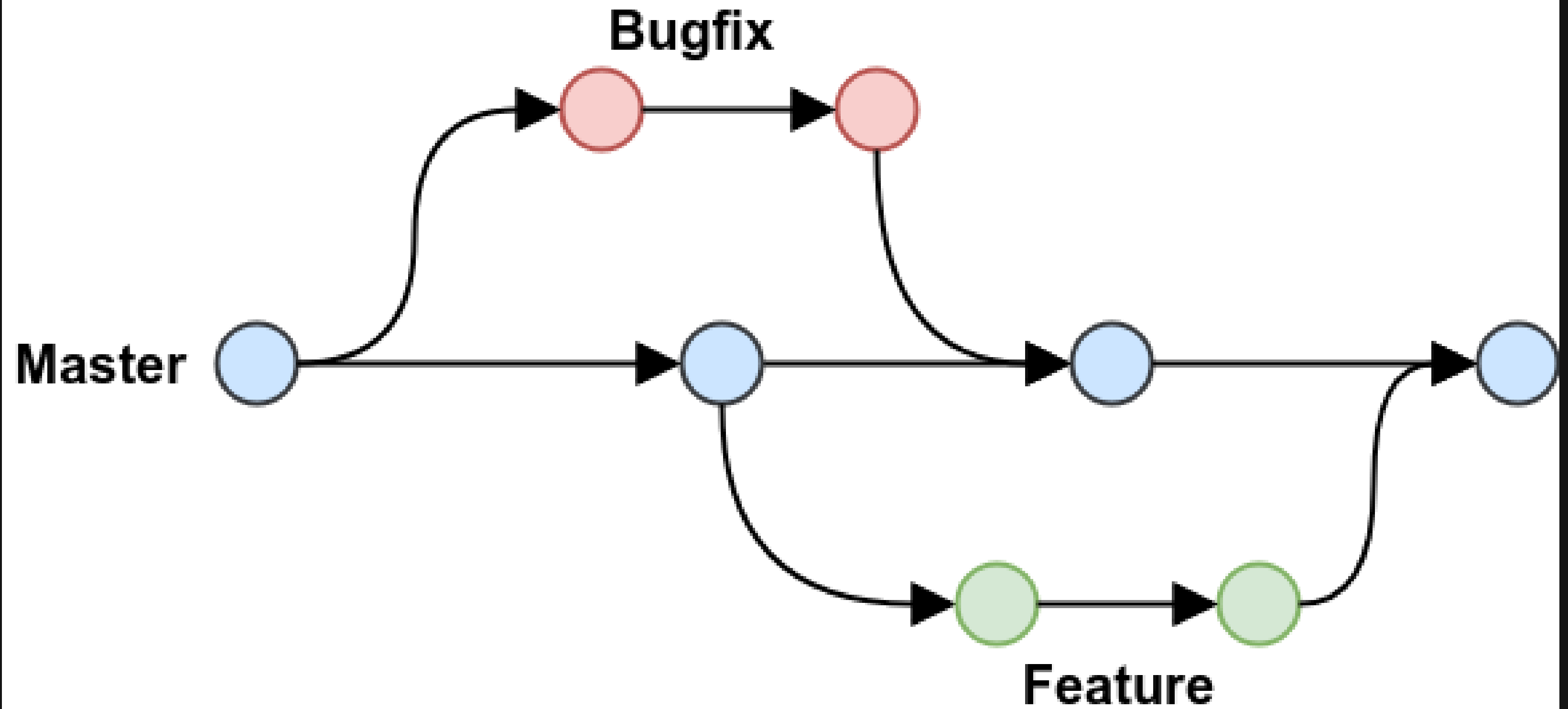
- Respect du github flow par branches (feature, bugfix, etc)



The screenshot shows a terminal window with a dark background and a blue title bar. The title bar contains several tabs: "PROBLÈMES", "GITLENS", "JUPYTER", "SORTIE", "CONSOLE DE DÉBOGAGE", and "TERMINAL". The "TERMINAL" tab is active. The terminal output displays a list of git branches: "bootstrap", "bugfix/js-chart", "feature/deep-qlearning-integration", "feature/django-app", "feature/integration-sarsa", "feature/tests", and "feature/update-tests". Below this list, the current branch is indicated as "\* master" in green text. At the bottom of the terminal, there is a prompt "~" and a button labeled "(END)".

```
bootstrap
bugfix/js-chart
feature/deep-qlearning-integration
feature/django-app
feature/integration-sarsa
feature/tests
feature/update-tests
* master
~
~
(END)
```

# GIT & Gitlab



# GIT & Gitlab

Comment avons-nous procédé

## FONCTIONNEMENT

- Respect du github flow par branches (feature, bugfix, etc)
- Protection des branches principales

Branch	Allowed to merge	Allowed to push	Allowed to force push ?	
bootstrap	Developers + Mai... ▾	No one ▾	<input checked="" type="checkbox"/>	Unprotect
master <small>default</small>	Developers + Mai... ▾	No one ▾	<input checked="" type="checkbox"/>	Unprotect





# GIT & Gitlab

Comment avons-nous procédé

## FONCTIONNEMENT

- Respect du github flow par branches (feature, bugfix, etc)
- Protection des branches principales
- Mirroring gitlab > Github

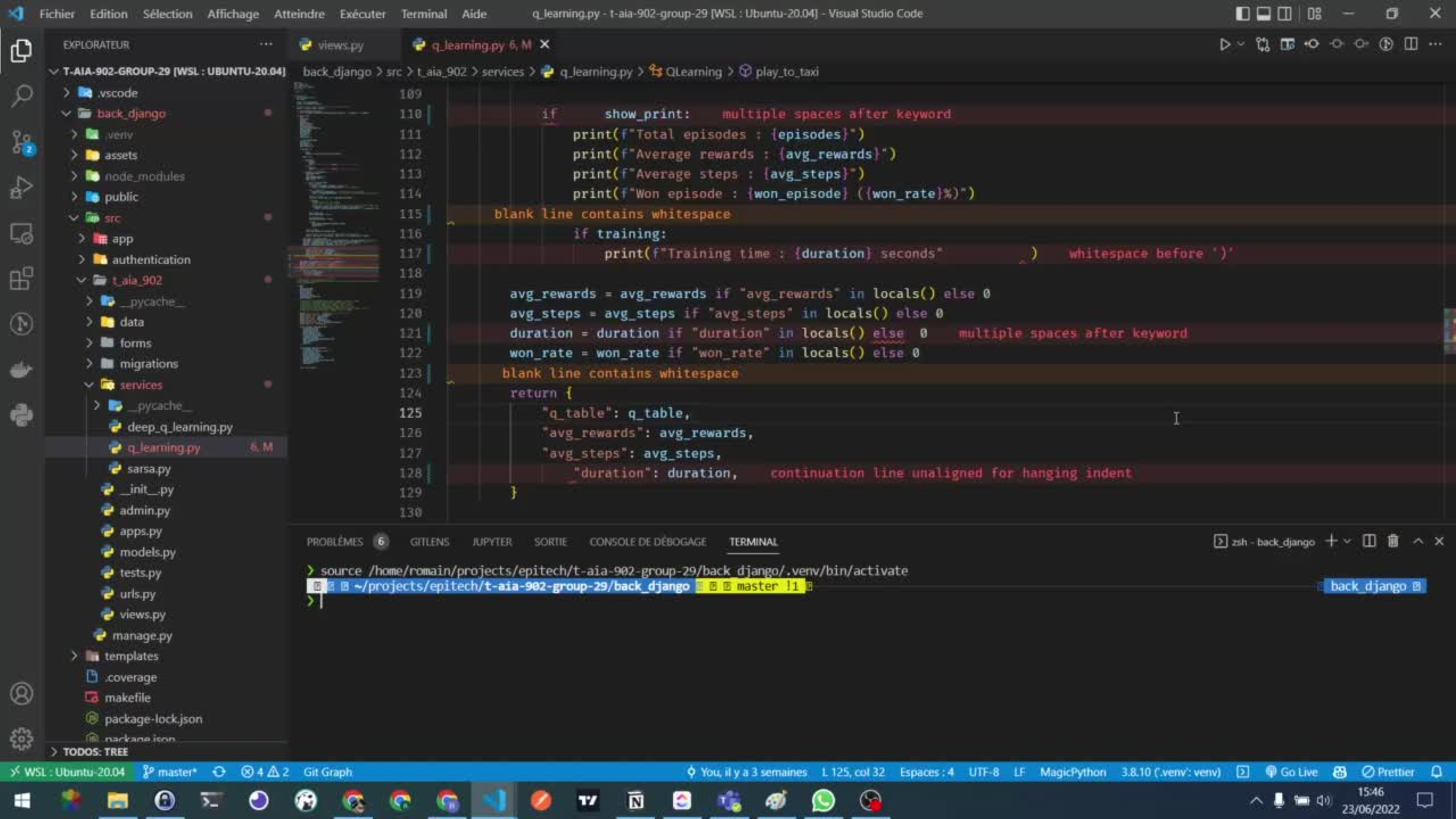
Mirrored repositories (1)	Direction	Last update attempt	Last successful update	
<a href="https://*****:*****@github.com/EpitechMscPro2020/T-AIA-902-GROUP-29.git">https://*****:*****@github.com/EpitechMscPro2020/T-AIA-902-GROUP-29.git</a>	Push	3 days ago	3 days ago	 

# ARCHITECTURE DU PROJET

Comment avons-nous procédé

## STRUCTURE

- Django (MVT, Services, classes)
- Respect des conventions de nommages
- Flake8 & black : detection et correction automatiques d'erreurs



# Approche et reflexion

Comment avons-nous pris en main le projet

## APPROCHE

- Recherche types d'algo
- Selection et implementation
- Test de performance
- Comparaison des performances
- Front pour selection et configuration d'algo
- Vue comparative des différents résultats

# Algorithmes implémentés

3 algorithmes implémentés



- SARSA
- Q-LEARNING
- DEEP Q-LEARNING

# Q-Learning

Explication & réalisation

## ALGORITHME

- Model off policy
- Mise à jour de la Q table en prenant la valeur max
- Prise de décision en fonction d'epsilon greedy
- Paramètres modifiables par l'utilisateur
- Sauvegarde des résultats d'entraînements avec différents paramètres

[illegible]

	A	B	C	D	E	F	G	H	I	J	K
1	nb_episodes	epsilon_rate	epsilon_min	epsilon_max	learning_rate	reward_disco	decay_rate	avg_rewards	avg_steps	duration	
2	10000	1.0	0.01	1.0	0.5	0.9	0.01	6.8	14.2	8,1	
3	10000	1.0	0.01	1.0	0.5	0.9	0.03	6.84	14.16	8,9	
4	10000	1.0	0.01	1.0	0.5	0.9	0.05	6.85	14.15	7,6	
5	10000	1.0	0.01	1.0	0.5	0.9	0.07	6.87	14.13	8,7	
6	10000	1.0	0.01	1.0	0.5	0.9	0.1	6.83	14.17	9	
7	10000	1.0	0.01	1.0	0.5	0.786	0.01	6.84	14.16	9	
8	10000	1.0	0.01	1.0	0.5	0.786	0.03	6.83	14.17	8,9	
9	10000	1.0	0.01	1.0	0.5	0.786	0.05	6.79	14.21	7,4	
10	10000	1.0	0.01	1.0	0.5	0.786	0.07	6.82	14.18	7,3	
11	10000	1.0	0.01	1.0	0.5	0.786	0.1	6.85	14.15	7,3	
12	10000	1.0	0.01	1.0	0.5	0.618	0.01	6.81	14.19	7,8	
13	10000	1.0	0.01	1.0	0.5	0.618	0.03	6.87	14.13	8	
14	10000	1.0	0.01	1.0	0.5	0.618	0.05	6.81	14.19	7,4	
15	10000	1.0	0.01	1.0	0.5	0.618	0.07	6.86	14.14	7,6	
16	10000	1.0	0.01	1.0	0.5	0.618	0.1	6.84	14.16	7,6	
17	10000	1.0	0.01	1.0	0.5	0.5	0.01	6.86	14.14	8,4	
18	10000	1.0	0.01	1.0	0.5	0.5	0.03	6.85	14.15	8,4	
19	10000	1.0	0.01	1.0	0.5	0.5	0.05	6.8	14.2	7,4	
20	10000	1.0	0.01	1.0	0.5	0.5	0.07	6.82	14.18	8,4	
21	10000	1.0	0.01	1.0	0.5	0.5	0.1	6.85	14.15	8,8	
22	10000	1.0	0.01	1.0	0.5	0.382	0.01	6.81	14.19	7,6	
23	10000	1.0	0.01	1.0	0.5	0.382	0.03	6.81	14.19	8,3	
24	10000	1.0	0.01	1.0	0.5	0.382	0.05	6.84	14.16	7	
25	10000	1.0	0.01	1.0	0.5	0.382	0.07	6.82	14.18	8,8	
26	10000	1.0	0.01	1.0	0.5	0.382	0.1	6.84	14.16	7,8	
27	10000	1.0	0.01	1.0	0.5	0.2	0.01	6.81	14.19	7	
28	10000	1.0	0.01	1.0	0.5	0.2	0.03	6.82	14.18	7,1	
29	10000	1.0	0.01	1.0	0.5	0.2	0.05	6.82	14.18	9	
30	10000	1.0	0.01	1.0	0.5	0.2	0.07	6.82	14.18	7	



# SARSA

Explication & réalisation

## ALGORITHME

- Modèle on Policy
- Mise à jour de la Q table en fonction d'upsilon Greedy
- Prise de décision en respectant la policy & Epsilon Greedy
- Paramètres modifiables par l'utilisateur
- Sauvegarde des résultats d'entraînements avec différents paramètres

	column 1	column 2	column 3	column 4	column 5	column 6	column 7	column 8	column 9	column 10
1	nb_episodes	epsilon_rate	epsilon_min	epsilon_1	learning_rate	reward_discount	decay_rate	avg_rewards	avg_steps	duration
2	10000	1.0	0.01	1.0	0.5	0.9	0.01	5.76	22.4	7.016526222229004
3	10000	1.0	0.01	1.0	0.5	0.9	0.03	5.47	16.15	12.667381048202515
4	10000	1.0	0.01	1.0	0.5	0.9	0.05	6.54	16.64	18.305476665496826
5	10000	1.0	0.01	1.0	0.5	0.9	0.07	6.17	22.3	24.37621283531189
6	10000	1.0	0.01	1.0	0.5	0.9	0.1	6.47	15.9	29.806821584701538
7	10000	1.0	0.01	1.0	0.5	0.786	0.01	5.4	46.91	45.63572859764099
8	10000	1.0	0.01	1.0	0.5	0.786	0.03	4.93	59.41	59.37526273727417
9	10000	1.0	0.01	1.0	0.5	0.786	0.05	6.53	42.95	70.98104333877563
10	10000	1.0	0.01	1.0	0.5	0.786	0.07	7.95	57.37	83.6065731048584
11	10000	1.0	0.01	1.0	0.5	0.786	0.1	6.42	42.01	93.87324500083923
12	10000	1.0	0.01	1.0	0.5	0.618	0.01	7.34	69.7	114.36566472053528
13	10000	1.0	0.01	1.0	0.5	0.618	0.03	6.68	70.7	133.4906759262085
14	10000	1.0	0.01	1.0	0.5	0.618	0.05	6.72	63.4	151.27170062065125
15	10000	1.0	0.01	1.0	0.5	0.618	0.07	6.38	68.21	169.46469640731812
16	10000	1.0	0.01	1.0	0.5	0.618	0.1	7.81	69.42	188.0488133430481
17	10000	1.0	0.01	1.0	0.5	0.5	0.01	6.45	82.83	209.52252626419067
18	10000	1.0	0.01	1.0	0.5	0.5	0.03	7.68	89.92	232.066570520401
19	10000	1.0	0.01	1.0	0.5	0.5	0.05	9.2	89.57	254.52487683296204
20	10000	1.0	0.01	1.0	0.5	0.5	0.07	5.19	80.48	275.1728301048279
21	10000	1.0	0.01	1.0	0.5	0.5	0.1	6.71	75.67	296.8964207172394
22	10000	1.0	0.01	1.0	0.5	0.382	0.01	4.74	83.11	319.75680208206177
23	10000	1.0	0.01	1.0	0.5	0.382	0.03	4.16	69.3	341.0043978691101
24	10000	1.0	0.01	1.0	0.5	0.382	0.05	6.27	75.98	361.5018730163574
25	10000	1.0	0.01	1.0	0.5	0.382	0.07	7.69	71.93	381.98092794418335
26	10000	1.0	0.01	1.0	0.5	0.382	0.1	6.11	82.09	403.9304850101471

# Deep Q-Learning

Modèle

## ALGORITHME

- Création du modèle

```
def build_model(actions):  
    model = Sequential()  
    model.add(Embedding(500, 10, input_length=1))  
    model.add(Reshape((10,)))  
    model.add(Dense(50, activation='relu'))  
    model.add(Dense(50, activation='relu'))  
    model.add(Dense(50, activation='relu'))  
    model.add(Dense(actions, activation='linear'))  
    return model
```

# Deep Q-Learning

Environnement et configuration

## ALGORITHME

- Import de l'environnement Taxi V3
- Police : epsylon greed
- Création de l'agent (dqn)
- Metrique : mae

# Deep Q-Learning

Entraînement et utilisation

## ALGORITHME

- Entraînement en utilisant le gpu
- Savegarde des poids (100k -> 1000k)
- Chargement des poids pour utiliser les models

# TESTS UNITAIRE DE SERVICES

## TESTS DES ALGO

- Tests sur les 3 classes de services
- plusieurs methodes par tests
- generation d'un rapport de coverage



EXPLOREUR

T-AIA-902-GROUP-29 [WSL : UBUNTU-20.04]

> .vscode

> back\_django

> .venv

> assets

> node\_modules

> public

> src

> app

> authentication

> t\_aia\_902

> \_\_pycache\_\_

> data

> forms

> migrations

> services

> \_\_init\_\_.py

> admin.py

> apps.py

> models.py

> tests.py

> urls.py

> views.py

> manage.py

> templates

> .coverage

> makefile

> package-lock.json

> package.json

> requirements.txt

> webpack.config.js

> yarn.lock

> Documents

> TODOS: TREE

views.py

q\_learning.py

tests.py

back\_django > src > t\_aia\_902 > tests.py > QlearningTestCase > test\_qlearning\_without\_episode

11

12

13

24

25

41

42

57

58

85

86

113

114

115

116

117

118

119

120

121

122

123

124

125

126

class QlearningTestCase(TestCase):

def test\_qlearning\_without\_episode(self):...

def test\_qlearning\_without\_training(self):...

def test\_qlearning\_private\_training(self):...

def test\_qlearning\_bad\_training(self):...

def test\_qlearning\_good\_training(self):...

def test\_qlearning\_taxi\_user\_method\_good\_training(self):

qlearning = QLearning()

qlearning\_empty\_qtable = copy(QLearning().q\_table)

qlearning\_data = qlearning.taxi(

nb\_episodes=10000,

)

print(qlearning\_data["avg\_rewards"])

self.assertEqual(type(qlearning\_data), dict)

self.assertEqual(qlearning\_data["avg\_rewards"] > 0, True)

self.assertEqual(qlearning\_data["avg\_steps"] != 99, True)

self.assertEqual(qlearning\_data["duration"] > 0.2, True)

self.assertEqual(np.array\_equal(qlearning\_data["q\_table"], qlearning\_empty\_qtable), False)

PROBLÈMES

GITLENS

JUPYTER

SORTIE

CONSOLE DE DÉBOGAGE

TERMINAL

zsh - back\_django

Average steps : 14.21

Won episode : 10000 (100.0%)

6.79

.....

-----

Ran 15 tests in 139.838s

OK

Destroying test database for alias 'default'...

Ubuntu-20.04

master\*

0 0

Git Graph

You, il y a 2 semaines

L 13, col 46

Espaces : 4

UTF-8

LF

MagicPython

3.8.10 (.venv: venv)

Go Live

EXPLOREUR

T-AIA-902-GROUP-29 [WSL : UBUNTU-20.04]

> .vscode

> back\_django

> .venv

> assets

> node\_modules

> public

> src

> app

> authentication

> t\_aia\_902

> \_\_pycache\_\_

> data

> forms

> migrations

> services

> \_\_pycache\_\_

deep\_q\_learning.py

q\_learning.py

sarsa.py

\_\_init\_\_.py

admin.py

apps.py

models.py

tests.py

urls.py

views.py

manage.py

> templates

.coverage

makefile

package-lock.json

package.json

views.py

q\_learning.py

tests.py M

sarsa.py M

makefile

back\_django > src > t\_aia\_902 > tests.py > QlearningTestCase > test\_qlearning\_taxi\_user\_method\_good\_training

> ng\_data["duration"] < 15, Aa ab .\*

Aucun résultat

↑

↓

≡

×

class QlearningTestCase(TestCase):

def test\_qlearning\_without\_episode(self): ...

PROBLÈMES

GITLENS

JUPYTER

SORTIE

CONSOLE DE DÉBOGAGE

TERMINAL

zsh - back\_django

+

↓

Name	Stmts	Miss	Cover
src/app/__init__.py	0	0	100%
src/app/models.py	7	0	100%
src/app/settings/__init__.py	0	0	100%
src/app/settings/base.py	28	0	100%
src/app/settings/local.py	9	0	100%
src/app/urls.py	3	0	100%
src/authentication/__init__.py	0	0	100%
src/authentication/admin.py	5	0	100%
src/authentication/apps.py	4	0	100%
src/authentication/auth_config.py	4	0	100%
src/authentication/migrations/0001_initial.py	9	0	100%
src/authentication/migrations/0002_remove_user_phone_number.py	4	0	100%
src/authentication/migrations/__init__.py	0	0	100%
src/authentication/models.py	5	0	100%
src/manage.py	19	3	84%
src/t_aia_902/__init__.py	0	0	100%
src/t_aia_902/admin.py	1	0	100%
src/t_aia_902/apps.py	4	0	100%
src/t_aia_902/forms/deep_qlearning_params.py	4	0	100%
src/t_aia_902/forms/qlearning_params.py	9	0	100%
src/t_aia_902/forms/select_algo.py	3	0	100%
src/t_aia_902/migrations/__init__.py	0	0	100%
src/t_aia_902/models.py	1	0	100%
src/t_aia_902/services/deep_q_learning.py	52	10	81%
src/t_aia_902/services/q_learning.py	81	1	99%
src/t_aia_902/services/sarsa.py	67	9	87%
src/t_aia_902/tests.py	151	0	100%
src/t_aia_902/urls.py	3	0	100%
src/t_aia_902/views.py	66	55	17%
TOTAL	539	78	86%

~/projects/epitech/t-aia-902-group-29/back\_django master !4

back

make coverage

TODOS: TREE



# Web App

World Wide Web

## DJANGO

- Réception des informations de formulaire
- Lancement de l'algorithme sélectionné avec les paramètres utilisateur
- Envoi du résultat
- Comparatif des résultats

Algo\*

Q-Learning



Q-Learning

Deep Q-Learning

Sarsa

Nb episodes\*

default = 10 000

Epsilon rate\*

default = 1.0

Epsilon min\*

default = 0.01

Epsilon max\*

default = 1.0

Learning rate\*

default = 0.8

Reward discount rate\*

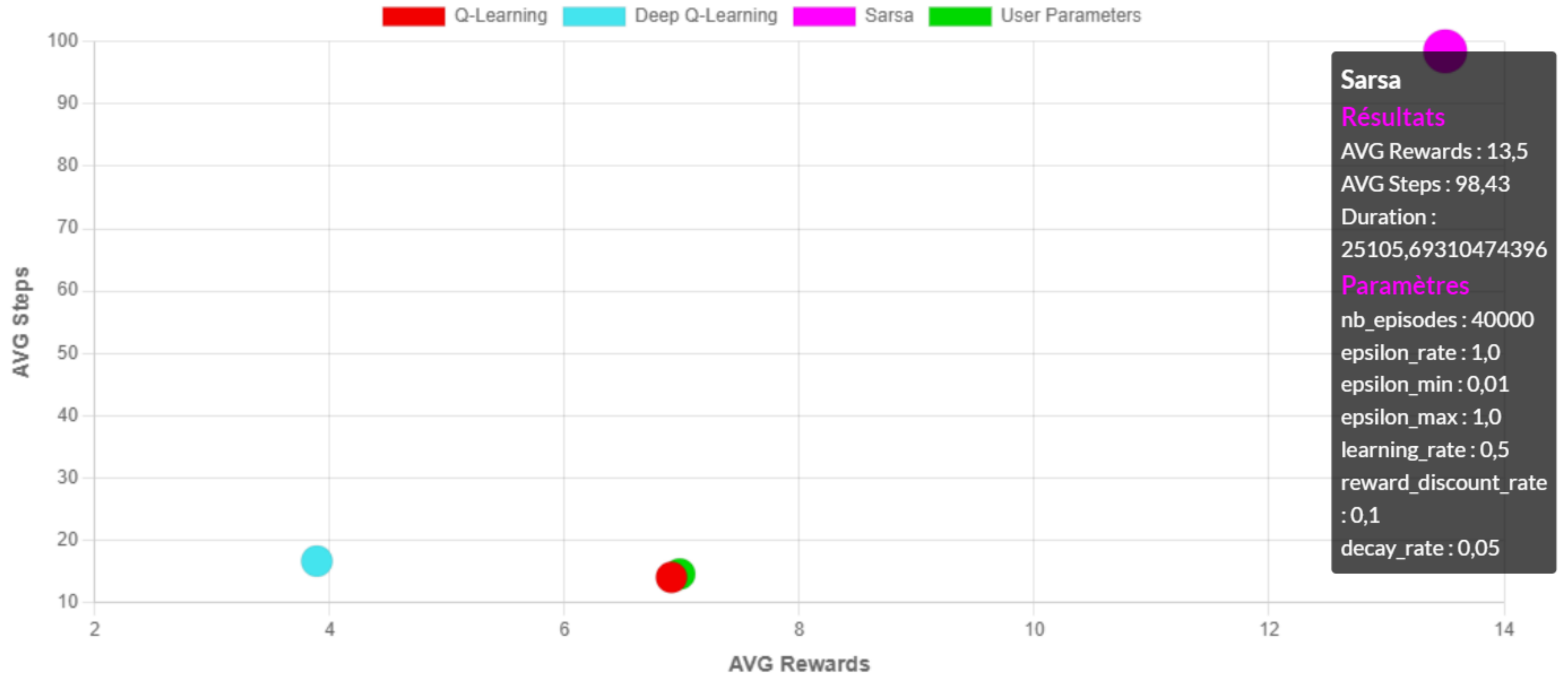
default = 0.786

Decay rate\*

default = 0.07

Valider

## Graphique comparatif des différents algos



# Conclusion

Pour conclure !

- Découverte du RL/deep RL
- Différents algorithmes plus ou moins efficaces
- Projet complet
- Jeu simple

# DÉMO



<https://travel-resolver-100.netlify.app/>

**THANK YOU**



**FOR WATCHING & LISTNING**

memegenerator.net