

## Conclusion

$R^2$  score is an indicator of accuracy of regression models, and the accuracy is measured as close to 1 of this value. Therefore, as seen, Multiple Linear Regression Models is better than Decision Tree Regression and Random Forest Regression on this dataset when comparing their  $R^2$  scores.

In [57]: `!pip install ibm_watson_machine_learning`

```
Requirement already satisfied: ibm_watson_machine_learning in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (1.0.257)
Requirement already satisfied: requests in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (2.26.0)
Requirement already satisfied: tabulate in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (0.8.9)
Requirement already satisfied: ibm-cos-sdk==2.11.* in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (2.11.0)
Requirement already satisfied: urllib3 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (1.26.7)
Requirement already satisfied: tomoad in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (0.3.3)
Requirement already satisfied: certifi in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (2022.9.24)
Requirement already satisfied: packaging in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (21.3)
Requirement already satisfied: importlib-metadata in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (4.8.2)
Requirement already satisfied: pandas<1.5.0,>=0.24.2 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm_watson_machine_learning) (1.3.4)
Requirement already satisfied: jmespath<1.0.0,>=0.7.1 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm-cos-sdk==2.11.*->ibm_watson_machine_learning) (0.10.0)
Requirement already satisfied: ibm-cos-sdk-core==2.11.0 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm-cos-sdk==2.11.*->ibm_watson_machine_learning) (2.11.0)
Requirement already satisfied: ibm-cos-sdk-s3transfer==2.11.0 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm-cos-sdk==2.11.*->ibm_watson_machine_learning) (2.11.0)
Requirement already satisfied: python-dateutil<3.0.0,>=2.1 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from ibm-cos-sdk-core==2.11.0->ibm_watson_machine_learning) (2.8.2)
Requirement already satisfied: pytz>=2017.3 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from pandas<1.5.0,>=0.24.2->ibm_watson_machine_learning) (2021.3)
Requirement already satisfied: numpy>=1.17.3 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from pandas<1.5.0,>=0.24.2->ibm_watson_machine_learning) (1.24.3)
```

```
cos-sdk-core==2.11.0->ibm-cos-sdk==2.11.*->ibm-watson-machine-learning) (1.15.0)
Requirement already satisfied: charset-normalizer==2.0.0 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from requests->ibm_watson_machine_learning) (2.0.4)
Requirement already satisfied: idna<4,>=2.5 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from requests->ibm_watson_machine_learning) (3.3)
Requirement already satisfied: zipp>=0.5 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from importlib-metadata->ibm_watson_machine_learning) (3.6.0)
Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in /opt/conda/envs/Python-3.9/lib/python3.9/site-packages (from packaging->ibm_watson_machine_learning) (3.0.4)
```

## Establishing connection to IBM Watson ML service

```
In [58]: from ibm_watson_machine_learning import APIClient
import json
```

```
In [59]: from ibm_watson_machine_learning import APIClient
wml_credentials = {
    "apikey": "GXIQ0WvFLYobrmTPaccsVpwENL_PHzJjoRIhFn0kfjkm",
    "url": "https://us-south.ml.cloud.ibm.com"
}
```

```
In [60]: wml_client=APIClient(wml_credentials)
```

```
In [61]: wml_client.spaces.list()
```

Note: 'limit' is not provided. Only first 50 records will be displayed if the number of records exceed 50

ID	NAME	CREATED
5e27b477-1bb8-4a48-8b0f-81b3147dffe1	multilinear demo	2022-11-14T15:45:46.614Z

```
In [62]: SPACE_ID="5e27b477-1bb8-4a48-8b0f-81b3147dffe1"
```

```
In [63]: wml_client.set.default_space(SPACE_ID)
```

```
Out[63]: 'SUCCESS'
```

```
In [64]: wml_client.software_specifications.list(500)
```

NAME	ASSET ID	TYPE
default_py3.6	0062b8c9-8b7d-44a0-a9b9-46c416adcbd9	base
kernel-spark3.2-scala2.12	020d69ce-7ac1-5e68-ac1a-31189867356a	base
pytorch-onnx_1.3-py3.7-edt	069ea134-3346-5748-b513-49120e15d288	base
scikit-learn_0.20-py3.6	09c5a1d0-9c1e-4473-a344-eb7b665ff687	base
spark-mllib_3.0-scala_2.12	09f4cff0-90a7-5899-b9ed-1ef348aebdee	base
pytorch-onnx_rt22.1-py3.9	0b848dd4-e681-5599-be41-b5f6fcc6471	base
ai-function_0.1-py3.6	0cdb0f1e-5376-4f4d-92dd-da3b69aa9bda	base
shiny-r3.6	0e6e79df-875e-4f24-8ae9-62dcc2148306	base
tensorflow_2.4-py3.7-horovod	1092590a-307d-563d-9b62-4eb7d64b3f22	base
pytorch_1.1-py3.6	10ac12d6-6b30-4ccd-8392-3e922c096a92	base
tensorflow_1.15-py3.6-ddl	111e41b3-de2d-5422-a4d6-bf776828c4b7	base
autoai-kb_rt22.2-py3.10	125b6d9a-5b1f-5e8d-972a-b251688ccf40	base
runtime-22.1-py3.9	12b83a17-24d8-5682-900f-0ab31fbfd3cb	base
scikit-learn_0.22-py3.6	154010fa-5b3b-4ac1-82af-4d5ee5abbc85	base
default_r3.6	1b70aec3-ab34-4b87-8aa0-a4a3c8296a36	base
pytorch-onnx_1.3-py3.6	1bc6029a-cc97-56da-b8e0-39c3880dbbe7	base
kernel-spark3.3-r3.6	1c9e5454-f216-59dd-a20e-474a5cdf5988	base
pytorch-onnx_rt22.1-py3.9-edt	1d362186-7ad5-5b59-8b6c-9d0880bde37f	base
tensorflow_2.1-py3.6	1eb25b84-d6ed-5dde-b6a5-3fbd1665666	base
spark-mllib_3.2	20047f72-0a98-58c7-9ff5-a77b012eb8f5	base
tensorflow_2.4-py3.8-horovod	217c16f6-178f-56bf-824a-b19f20564c49	base
runtime-22.1-py3.9-cuda	26215f05-08c3-5a41-a1b0-da66306ce658	base
do_py3.8	295addb5-9ef9-547e-9bf4-92ae3563e720	base
autoai-ts_3.8-py3.8	2aa0c932-798f-5ae9-abd6-15e0c2402fb5	base
tensorflow_1.15-py3.6	2b73a275-7cbf-420b-a912-eae7f436e0bc	base
kernel-spark3.3-py3.9	2b7961e2-e3b1-5a8c-a491-482c8368839a	base
pytorch_1.2-py3.6	2c8ef57d-2687-4b7d-acce-01f94976dac1	base
spark-mllib_2.3	2e51f700-bca0-4b0d-88dc-5c6791338875	base
pytorch-onnx_1.1-py3.6-edt	32983cea-3f32-4400-8965-dde874a8d67e	base

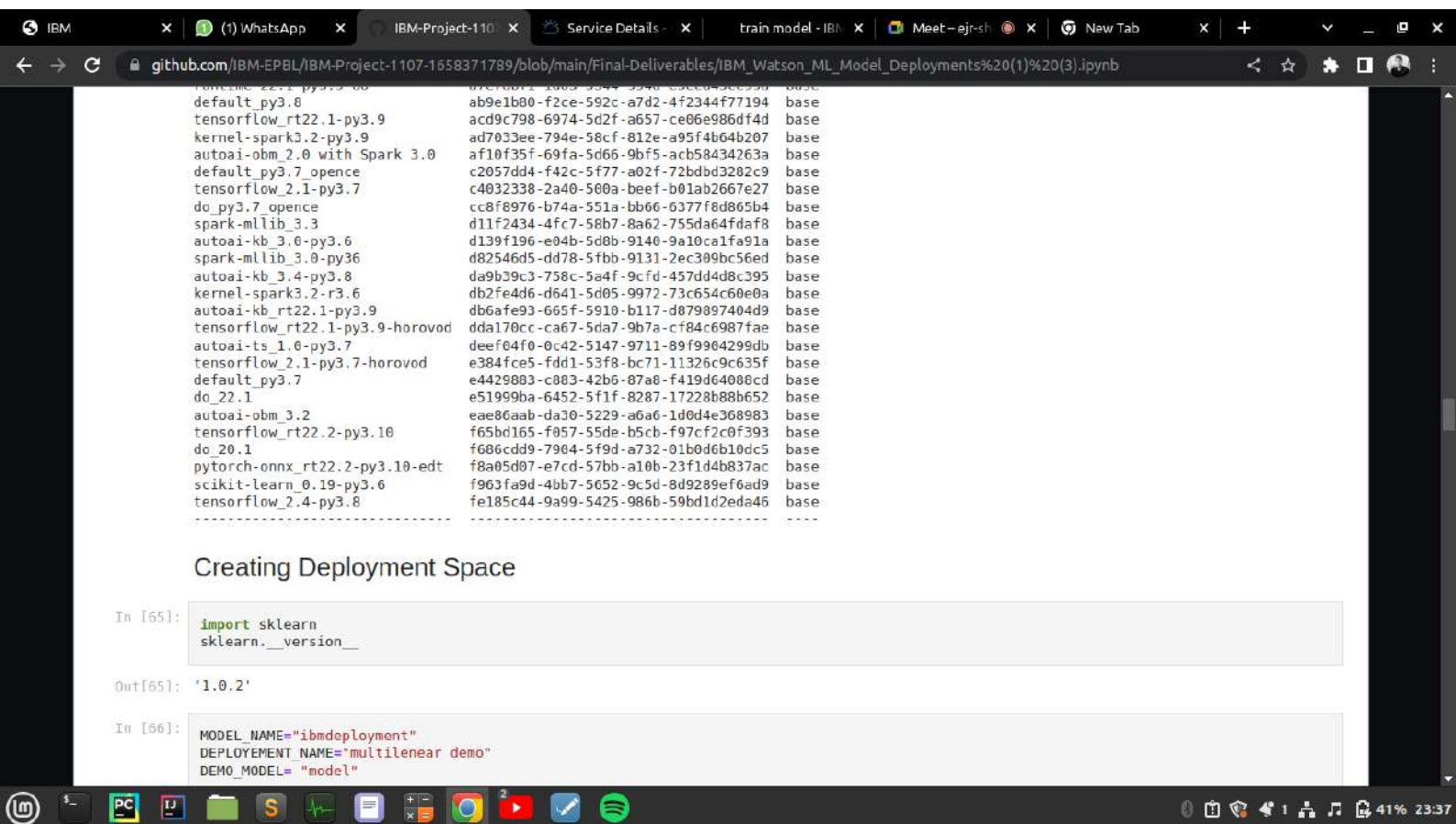
IBM (1) WhatsApp IBM-Project-1107 Service Details train model - IBM Meet - ajr-s New Tab

github.com/IBM-EPBL/IBM-Project-1107-1658371789/blob/main/Final-Deliverables/IBM\_Watson\_ML\_Model\_Deployments%20(1)%20(3).ipynb

spark-mllib_2.4	390d21f8-e58b-4fac-9c55-d7cedab2132b	base
autoai-ts_rt22.2-py3.10	396b2e83-0953-5b86-9a55-7ce1628a406f	base
xgboost_0.82-py3.6	39e31acd-5f30-41dc-ae44-60233c80306e	base
pytorch-onnx_1.2-py3.6-edt	40589d0e-7019-4e28-8daa-fb03b6f4fe12	base
pytorch-onnx_rt22.2-py3.10	40e73f55-783a-5535-b3fa-0c8b94291431	base
default_r36py38	41c247d3-45f8-5a71-b065-8580229facf0	base
autoai-ts_rt22.1-py3.9	4269d26e-07ba-5d40-8f66-2d495b0c71f7	base
autoai-obm_3.0	42b92e18-d9ab-567f-988a-4240ba1ed5f7	base
pmml-3.0_4.3	493bcb95-16f1-5bc5-bee6-81b0af00e9c7	base
spark-mllib_2.4-r_3.6	49403dff-92e9-4c87-a3d7-a42d0621c095	base
xgboost_0.90-py3.6	4ff8d6c2-1343-4c18-85e1-609c965304d3	base
pytorch-onnx_1.1-py3.6	50f95b2a-bc16-43bb-bc94-b0bed208c60b	base
autoai-ts_3.9-py3.8	52c57136-80fa-572e-8728-a5e7cbb42cde	base
spark-mllib_2.4-scala_2.11	55a70f99-7320-4be5-9fb9-9edb5a443af5	base
spark-mllib_3.0	5c1b0ca2-4977-5c2e-9439-ffd44ea0ffe9	base
autoai-obm_2.0	5c2e37fa-80b8-5e77-840f-d912469614ee	base
spss-modeler_18.1	5c3cad7e-507f-4b2a-a9a3-ab53a21dee8b	base
cuda-py3.8	5d3232bf-c86b-5df4-a2cd-7bb876a1cd4e	base
autoai-kb_3.1-py3.7	632d4b22-10aa-5180-88f0-f52dfb6444d7	base
pytorch-onnx_1.7-py3.8	634d3cdc-b562-5bf9-a2d4-ea90a478456b	base
spark-mllib_2.3-r_3.6	6586b9e3-cdd6-4f92-900f-0f8cb2bd6f0c	base
tensorflow_2.4-py3.7	65e171d7-72d1-55d9-8ebb-f813d620c9bb	base
spss-modeler_18.2	607eddc9-028a-4117-b9dd-e57b36f1efa5	base
pytorch-onnx_1.2-py3.6	692a6a4d-2c4d-45ff-a1ed-b167ee55469a	base
spark-mllib_2.3-scala_2.11	7963efe5-bbec-417e-92cf-0574e21b4e8d	base
spark-mllib_2.4-py37	7abc992b-b685-532b-a122-a396a3cddaab	base
caffe_1.0-py3.6	7bb3dbe2-da6e-4145-918d-b6d84aa93b6b	base
pytorch-onnx_1.7-py3.7	812c6631-42b7-5613-982b-02098e6c909c	base
cuda-py3.6	82c79ece-4d12-40e6-8787-a7b9e6f62770	base
tensorflow_1.15-py3.6-horovod	8964680e-d5e4-5bb8-919b-8342c6c0dfd8	base
hybrid_0.1	8c1a58c6-62b5-4dc4-907a-df751c2756b5	base
pytorch-onnx_1.3-py3.7	8d5d8a87-a912-54cf-81ec-3914adaa988d	base
caffe-ibm_1.6-py3.6	8d863266-7927-4d1e-97d7-56a7f4c0a19b	base
spss-modeler_17.1	902d0051-84bd-4af6-ab6b-8f6aa6fdeabb	base
do_12.10	9100fd72-8159-4eb9-0a0b-a87e12eefa36	base
do_py3.7	9447fa8b-2051-4d24-9eef-5acb0e3c59f8	base
spark-mllib_3.0-r_3.6	94bb6052-c837-569d-83f1-f4142f219e32	base
cuda-py3.7-opence	94e9652b-7f2d-59d5-ba5a-23a414ea488f	base
nlp-py3.8	96e60351-99d4-5a1c-9cc0-473ac1b5a864	base
cuda-py3.7	9a44990c-1aa1-4c7d-baf8-c4099011741c	base
hybrid_0.2	9b3f6010-8ce9-4ead-8d7a-780600f542f7	base

41% 23:37





## Creating Deployment Space

```
In [65]: import sklearn  
sklearn.__version__
```

```
Out[65]: '1.0.2'
```

```
In [66]: MODEL_NAME="ibmdeployment"  
DEPLOYMENT_NAME="multilinear demo"  
DEMO_MODEL= "model"
```

```
In [67]: software_spec_uid=wml_client.software_specifications.get_id_by_name('runtime-22.1-py3.9')
```

```
In [68]: software_spec_uid = wml_client.software_specifications.get_uid_by_name("runtime-22.1-py3.9")  
software_spec_uid  
model_props={  
    wml_client.repository.ModelMetaNames.NAME: "MODEL_NAME",  
    wml_client.repository.ModelMetaNames.TYPE: "scikit-learn_1.0",  
    wml_client.repository.ModelMetaNames.SOFTWARE_SPEC_UID: software_spec_uid  
}
```

```
In [69]: #Save model  
model_details = wml_client.repository.store_model(  
    model=DEMO_MODEL,  
    meta_props=model_props,  
    training_data="x_train",  
    training_target="y_train"  
)
```

```
Failure during getting trained models details. (GET https://us-south.ml.cloud.ibm.com/ml/v4/trainings/model?version=2021-06-24&space_id=5  
e27b477-1bb8-4a48-8b0f-81b3117dffe1)
```

## Testing

```
In [73]: x_train
```

```
Out[73]:
```

	GRE Score	TOEFL Score	University Rating	SOP	LOR	CGPA	Research
249	321	111	3	3.5	4.0	8.83	1
433	316	111	4	4.0	5.0	8.54	0
19	303	102	3	3.5	3.0	8.50	0
322	314	107	2	2.5	4.0	8.27	0
332	308	106	3	3.5	2.5	8.21	1
...	...	...	...	...	...	...	...
106	329	111	4	4.5	4.5	9.18	1
270	306	105	2	2.5	3.0	8.22	1
348	302	99	1	2.0	2.0	7.25	0
435	309	105	2	2.5	4.0	7.68	0
102	314	106	2	4.0	3.5	8.25	0

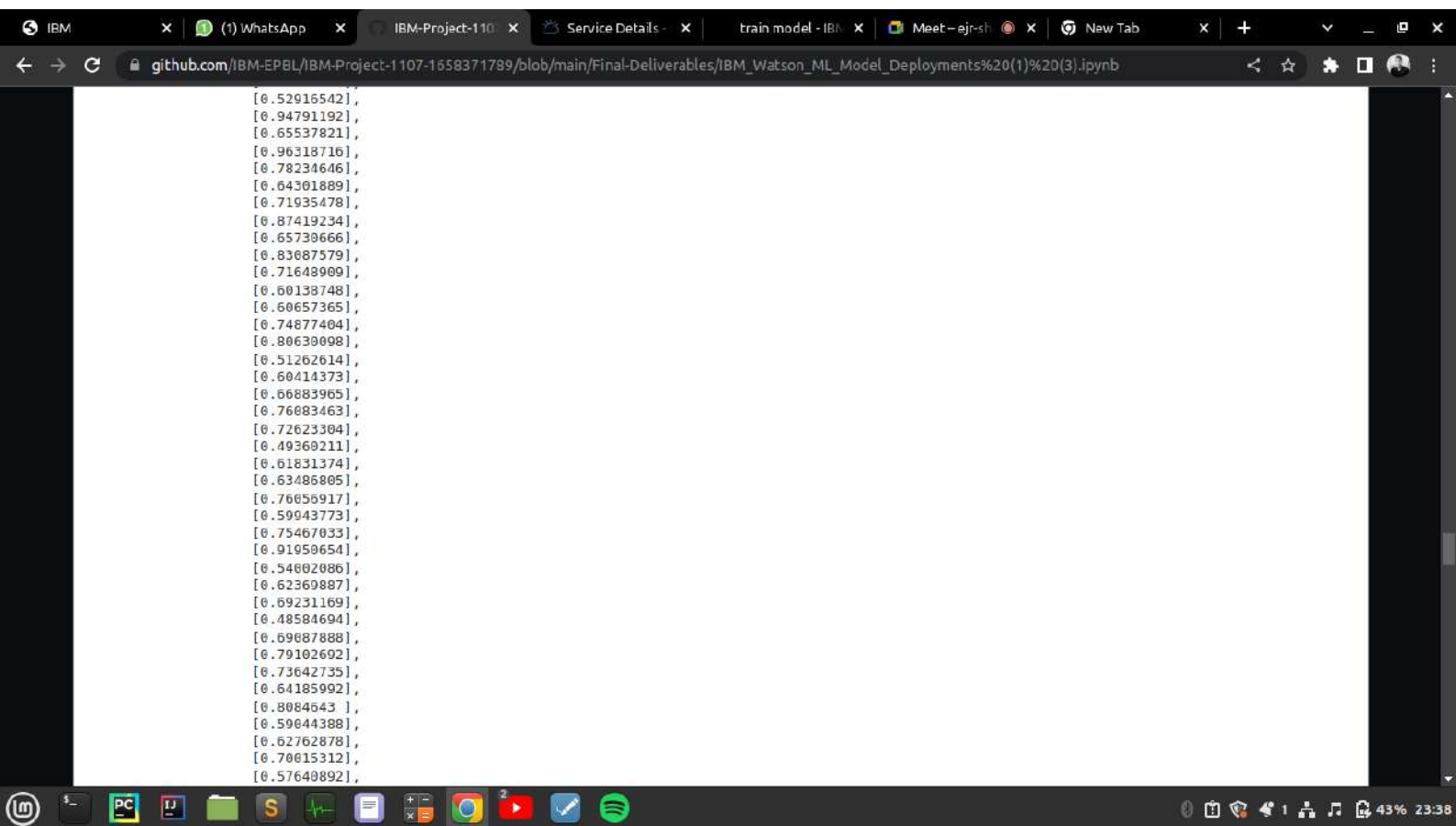
400 rows x 7 columns

```
In [74]: multiple_lin_reg.predict(x_train)
```

```
Out[74]: array([[0.79319678],
 [0.74507858],
 [0.64401532],
 [0.67274778],
 [0.65694595],
 [0.54916269],
 [0.72581613],
```

```
Out[74]: array([[0.79319678],
               [0.74507858],
               [0.64401532],
               [0.67274778],
               [0.65094595],
               [0.54916269],
               [0.72581613],
               [0.80517894],
               [0.63303132],
               [0.68811779],
               [0.64924268],
               [0.95289497],
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               [0.96863011],
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```





```
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[0.75013796],  
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[0.69242416],
```

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github.com/IBM-EPBL/IBM-Project-1107-1658371789/blob/main/Final-Deliverables/IBM\_Watson\_ML\_Model\_Deployments%20(1)%20(3).ipynb

```
[0.561388 ],
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```

Task Manager PC IntelliJ IDEA S VS Code Chrome 2 YouTube Spotify

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```
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```





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[0.77506528]

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[0.452599],  
[0.85733109],  
[0.70739453],  
[0.70669471],  
[0.58139224],  
[0.87316004],  
[0.57820416],  
[0.90490795],  
[0.85488862],  
[0.83523127],  
[0.98175209],  
[0.6368223],  
[0.61796838],  
[0.61448156],  
[0.76431017],  
[0.68727632],  
[0.66992581],  
[0.96531792],  
[0.91068827],  
[0.66491605],  
[0.81059061],  
[0.94695923],  
[0.66575207],  
[0.68129168],  
[0.77742757],  
[0.92352786],  
[0.74014032],  
[0.93752435],  
[0.82640054],  
[0.61927034],
```

## UASEP Multiple Linear Regression Model Deployment Test

```
In [39]: import requests

# NOTE: you must manually set API_KEY below using information retrieved from your IBM Cloud account.
API_KEY = "0-xbXqcCv2iPGZfem_krJ0KX-kQ2h5bKybYpPwY-g0fl"
token_response = requests.post('https://iam.cloud.ibm.com/identity/token', data={"apikey":
API_KEY, "grant_type": 'urn:ibm:params:oauth:grant-type:apikey'})
mltoken = token_response.json()["access_token"]

header = {'Content-Type': 'application/json', 'Authorization': 'Bearer ' + mltoken}

# NOTE: manually define and pass the array(s) of values to be scored in the next line
payload_scoring = {"input_data": [{"field": [{"GRE Score", "TOEFL Score", "University Rating", "SOP", "LOR ", "CGPA", "Research"}], "values":

response_scoring = requests.post('https://us-south.ml.cloud.ibm.com/ml/v4/deployments/uaep_deployment/predictions?version=2022-11-12', js
headers={'Authorization': 'Bearer ' + mltoken})
print("Scoring response")
print(response_scoring.json())
```

```
Scoring response
{'predictions': [{'fields': ['prediction'], 'values': [[0.8448151378927107]]}]}
```

```
In [40]: probability = response_scoring.json()['predictions'][0]['values'][0][0][0]
probability
```

```
Out[40]: 0.8448151378927107
```

```
In [40]:
```

```
In [40]:
```