quirement already satisfied: lesscpy>=0.11.2 in c:\programdata\anaconda3\lib\site-packages (from jupyterthemes) (0.14.0) quirement already satisfied: ipykernel in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (5.5.0) quirement already satisfied: pyzmq>=17 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (22.0.3) quirement already satisfied: ipython-genutils in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (0.2.0) quirement already satisfied: prometheus-client in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (0.8.0) quirement already satisfied: argon2-cffi in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (20.1.0) quirement already satisfied: nbformat in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (5.0.8) quirement already satisfied: Send2Trash in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (1.5.0) quirement already satisfied: tornado>=5.0 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (6.1) quirement already satisfied: jupyter-client>=5.3.4 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (6.1.12) quirement already satisfied: nbconvert in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (6.0.7) quirement already satisfied: jinja2 in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (2.11.2) quirement already satisfied: traitlets>=4.2.1 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from notebook>=5.6.0->jupyterthemes) (5.0.5) quirement already satisfied: terminado>=0.8.3 in c:\programdata\anaconda3\lib\site-packages (from notebook>=5.6.0->jupyterthemes) (0.9.1) quirement already satisfied: setuptools>=18.5 in c:\programdata\anaconda3\lib\site-packages (from ipython>=5.4.1->jupyterthemes) (50.3.1.post20201107) quirement already satisfied: decorator in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (4.4.2) quirement already satisfied: colorama; sys_platform == "win32" in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (0.4.3) quirement already satisfied: backcall in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (0.2.0) quirement already satisfied: prompt-toolkit!=3.0.0,!=3.0.1,<3.1.0,>=2.0.0 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (3.0.18) quirement already satisfied: pygments in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (2.8.1) quirement already satisfied: jedi>=0.16 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (0.18.0) quirement already satisfied: pickleshare in c:\users\nikita\appdata\roaming\python\python38\site-packages (from ipython>=5.4.1->jupyterthemes) (0.7.5) quirement already satisfied: pillow>=6.2.0 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (8.0.1) quirement already satisfied: pyparsing!=2.0.4,!=2.1.2,!=2.1.6,>=2.0.3 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (2.4.7) quirement already satisfied: numpy>=1.15 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (1.19.2) quirement already satisfied: kiwisolver>=1.0.1 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (1.3.0) quirement already satisfied: certifi>=2020.06.20 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (2020.6.20) quirement already satisfied: python-dateutil>=2.1 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from matplotlib>=1.4.3->jupyterthemes) (2.8.1) quirement already satisfied: cycler>=0.10 in c:\programdata\anaconda3\lib\site-packages (from matplotlib>=1.4.3->jupyterthemes) (0.10.0) quirement already satisfied: pywin32>=1.0; sys_platform == "win32" in c:\users\nikita\appdata\roaming\python\python38\site-packages (from jupyter-core->jupyterthemes) (300) quirement already satisfied: six in c:\users\nikita\appdata\roaming\python\python38\site-packages (from lesscpy>=0.11.2->jupyterthemes) (1.14.0) quirement already satisfied: ply in c:\programdata\anaconda3\lib\site-packages (from lesscpy>=0.11.2->jupyterthemes) (3.11) quirement already satisfied: cffi>=1.0.0 in c:\programdata\anaconda3\lib\site-packages (from argon2-cffi->notebook>=5.6.0->jupyterthemes) (1.14.3) quirement already satisfied: jsonschema!=2.5.0,>=2.4 in c:\programdata\anaconda3\lib\site-packages (from nbformat->notebook>=5.6.0->jupyterthemes) (3.2.0) quirement already satisfied: jupyterlab-pygments in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.1.2) quirement already satisfied: pandocfilters>=1.4.1 in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (1.4.3) quirement already satisfied: entrypoints>=0.2.2 in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.3) quirement already satisfied: nbclient<0.6.0,>=0.5.0 in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.5.1) quirement already satisfied: testpath in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.4.4) quirement already satisfied: mistune<2,>=0.8.1 in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.8.4) quirement already satisfied: bleach in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (3.2.1) quirement already satisfied: defusedxml in c:\programdata\anaconda3\lib\site-packages (from nbconvert->notebook>=5.6.0->jupyterthemes) (0.6.0) quirement already satisfied: MarkupSafe>=0.23 in c:\programdata\anaconda3\lib\site-packages (from jinja2->notebook>=5.6.0->jupyterthemes) (1.1.1) quirement already satisfied: pywinpty>=0.5 in c:\programdata\anaconda3\lib\site-packages (from terminado>=0.8.3->notebook>=5.6.0->jupyterthemes) (0.5.7) quirement already satisfied: wcwidth in c:\programdata\anaconda3\lib\site-packages (from prompt-toolkit!=3.0.0,!=3.0.1,<3.1.0,>=2.0.0->ipython>=5.4.1->jupyterthemes) (0.2.5) quirement already satisfied: parso<0.9.0,>=0.8.0 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from jedi>=0.16->ipython>=5.4.1->jupyterthemes) (0.8.1) quirement already satisfied: pycparser in c:\programdata\anaconda3\lib\site-packages (from cffi>=1.0.0->argon2-cffi->notebook>=5.6.0->jupyterthemes) (2.20) quirement already satisfied: attrs>=17.4.0 in c:\programdata\anaconda3\lib\site-packages (from jsonschema!=2.5.0,>=2.4->nbformat->notebook>=5.6.0->jupyterthemes) (20.3.0) quirement already satisfied: async-generator in c:\programdata\anaconda3\lib\site-packages (from nbclient<0.6.0,>=0.5.0->nbconvert->notebook>=5.6.0->jupyterthemes) (1.10) quirement already satisfied: nest-asyncio in c:\programdata\anaconda3\lib\site-packages (from nbclient<0.6.0,>=0.5.0->nbconvert->notebook>=5.6.0->jupyterthemes) (1.4.2) quirement already satisfied: webencodings in c:\programdata\anaconda3\lib\site-packages (from bleach->nbconvert->notebook>=5.6.0->jupyterthemes) (0.5.1) РК 1 по ТМО Выполнил: Студент группы ИУ5-62Б __Демирев Н.К.__ Преподаватель: __Гапанюк. Ю.Е.__

Для набора данных Admission_Predict_Ver1.1.csv провести корреляционный анализ. В случае наличия пропусков в данных удалить строки или колонки, содержащие пропуски. Сделать выводы о возможности построения моделей

Москва 2020 г. 1. Постановка задачи

!pip install jupyterthemes

quirement already satisfied: jupyterthemes in c:\programdata\anaconda3\lib\site-packages (0.20.0)

quirement already satisfied: notebook>=5.6.0 in c:\programdata\anaconda3\lib\site-packages (from jupyterthemes) (6.1.4)

quirement already satisfied: matplotlib>=1.4.3 in c:\programdata\anaconda3\lib\site-packages (from jupyterthemes) (3.3.2)

quirement already satisfied: ipython>=5.4.1 in c:\users\nikita\appdata\roaming\python\python38\site-packages (from jupyterthemes) (7.22.0)

quirement already satisfied: jupyter-core in c:\users\nikita\appdata\roaming\python\python38\site-packages (from jupyterthemes) (4.7.1)

!jt -t chesterish

pandas pd seaborn as sns

plt

машинного обучения и о возможном вкладе признаков в модель.

2. Обработка пропусков в данных

2.1. Импорт библиотек для анализа

np

matplotlib.pyplot

numpy

atplotlib inline

data = pd.read_csv

data.isnull().sum

ance of Admit

In [4]:

Out[6]:

In [15]:

Out[15]:

Импортируем наш датасет Admission_Predict_Ver1.1.csv:

sns.set(style="ticks")

sep =

Импортируем библиотеки с помощью команды import. Будем подключать все библиотеки последовательно, по мере их использования.

In [5]: {data.shape[0]}\nСтолбцов -{data.shape|

2.2. Импорт датасета и его анализ на пропуски

In [6]: data.dtypes

int64 int64 iversity Rating int64 float64 float64 float64 int64 ance of Admit float64

‡ проверим есть ли пропущенные значения

In [16]: data.head Serial No. GRE Score TOEFL Score University Rating SOP LOR CGPA Research Chance of Admit Out[16]: 0 337 118 4 4.5 4.5 9.65 0.92 2 324 107 4 4.0 4.5 8.87 1 0.76 3 316 104 3 3.0 3.5 8.00 0.72 322 110 3 3.5 2.5 8.67 0.80 314 103 2 2.0 3.0 8.21 0 0.65

3.1. Корреляционная матрица Корреляционную матрицу будем строить на основе коэффициента Спирмена

Как мы видим, наши данные не содержат пропусков, поэтому можно переходить к корреляционному анализу.

5 4.5 3.0 9.34

0.90

-0.075126

0.829251

0.809485

Research Chance of Admit

-0.001733

0.822201

0.793634

-0.005332

0.578487

0.474540

Serial No. 1.000000 -0.099592

mask = np.zeros like(data.corr(

mask[np.triu_indices_from(mask)

data.corr(method =

In [8]:

Out[8]:

330

115

3. Корреляционный анализ данных

GRE Score -0.099592 1.000000 0.823853 0.620688 0.514352 0.643423 **TOEFL Score** -0.142607 0.823853 1.000000 0.644715 0.523434 0.645533

Serial No. GRE Score TOEFL Score University Rating

-0.142607

0.645533 0.435351 0.703742 **University Rating** -0.055424 0.643423 1.000000 0.729399 0.602319 0.703333 -0.144249 0.620688 0.644715 0.729399 0.662653 0.717384 0.409088 0.702799 LOR 0.004220 0.514352 0.523434 0.662653 1.000000 0.639563 0.376166 0.643627 0.602319 **CGPA** -0.075126 0.829251 0.809485 0.717384 0.639563 1.000000 0.509264 0.888786 -0.005332 0.578487 0.565715 0.474540 0.409088 0.376166 0.509264 1.000000 Research 0.435351 Chance of Admit -0.001733 0.822201 0.793634 0.703742 0.702799 0.643627 0.888786 0.565715 1.000000 В качестве целевого признака выберем шанс поступления, так как студентам важно знать за счет чего повышается сам шанс поступления в тот или иной университет. 3.2. Визуализация корреляционной матрицы Для визуализации корреляционной матрицы будем использовать "тепловую карту" heatmap которая показывает степень корреляции различными цветами. fig, ax = plt.subplots(figsize = (15,10))

-0.055424 -0.144249 0.004220

sns.heatmap(data.corr(), cmap='YlGnBu', mask=mask, annot=' fmt='

dtype=np.bool

Out[9]:

Serial No. -GRE Score - - - 0.104 0.827 - 0.6 TOEFL Score - -0.142 0.635 0.650 University Rating - -0.068 0.613 0.644 0.728 SOP - -0.137 0.542 LOR - -0.004 0.525 0.609 0.664 - 0.2 0.712 -0.074 0.826 0.811 0.705 0.637 CGPA -0.563 0.467 0.427 0.408 0.373 0.501 Research - -0.005 - 0.0 0.009 0.810 0.792 0.690 0.684 0.645 0.882 0.546 Chance of Admit

1. Целевой признак наиболее сильно коррелирует с баллами по: • GRE (Последипломный тест, eng) • CGPA (Средний балл диплома)

• TOEFL Score (Тест на знание английского языка как иностранного)

На основе корреляционной матрицы можно сделать следующие выводы:

- Но стоит отметить, что CGPA также сильно коррелирует с GRE и TOEFL, поэтому их можно отбросить во избежание переобученности модели.
- 1. В меньшей степени целевой признак коррелирует с: • University Rating (Рейтинг универа) • SOP (Statement of purpose)

data1=data.drop(

data1.head(

In [14]:

Out[14]:

- LOR (Letters of Recommendation) Эти признаки можем оставить.

University Rating SOP LOR CGPA Chance of Admit

0.92

0.76

4 4.5 4.5 9.65

4 4.0 4.5 8.87

1. В наименьшей степени целевой признак коррелирует с Serial No. так что его можно откинуть. Также не имеет смысла включать в модель Research Experience так как он слабо коррелирует с целевым признаком по сравнению с 1 и 2 пунктами.

3 3.0 3.5 8.00 0.72 3 3.5 2.5 8.67 0.80 2 2.0 3.0 8.21 0.65 5 4.5 3.0 9.34 0.90 In []: