Pandas Tutorial

December 9, 2021

1 Instalação e setup



- jupyter 1.0.0 /project/jupyter/
- pandas 1.3.4 /project/pandas/
- openpyxl 3.0.9 /project/openpyxl/
- xlwt 1.3.0 /project/xlwt/
- xlrd 2.0.1 /project/xlrd/

2 Download dos dados



STACK OVERFLOW

3 Introdução

3.0.1 Para importar a biblioteca pandas

```
[1]: import pandas as pd
```

3.0.2 Para importar a biblioteca numpy

```
[2]: import numpy as np
```

3.0.3 Para ler o CSV com as perguntas

3.0.4 Para visualizar o respetivo DataFrame

[4]:	que	stions	
[4]:		qid	qname
[4].	0	QID16	qname S0
	1	QID10	MetaInfo
	2	QID12	S1
	3	QID2	MainBranch
	4	QID24	Employment
	5	QID6	Country
	6	QID7	US_State
	7	QID9	$\mathtt{UK}_{\mathtt{Country}}$
	8	QID190	S2
	9	QID25	EdLevel
	10	QID149	Age1stCode
	11	QID276	LearnCode
	12	QID32	YearsCode
	13	QID34	YearsCodePro
	14	QID31	DevType
	15		
		QID29	OrgSize
	16	QID50	Currency
	17	QID51	CompTotal
	18	QID52	${\tt CompFreq}$
	19	QID61	S3
	20	QID233	Language
	21	QID262	Database
	22	QID263	Platform
	23	QID264	Webframe
	24	QID265	MiscTech
	25	QID275	ToolsTech
	26	QID274	NEWCollabTools
	20 27		
		QID71	OpSys
	28	QID243	NEWStuck
	29	QID91	S4
	30	QID266	NEWSOSites
	31	QID100	${ t SOVisitFreq}$
	32	QID101	${\tt SOAccount}$
	33	QID102	${ t SOPartFreq}$
	34	QID106	SOComm
	35	QID267	NEWOtherComms
	36	QID268	NEWOtherCommsNames
	37	QID121	S5
	38	QID127	Age
	39	QID122	Gender
	40	QID153	Trans
	41	QID136	Sexuality

Ethnicity	QID126	42
Accessibility	QID124	43
MentalHealth	QID125	44
S6	QID131	45
SurveyLength	QID132	46
SurveyEase	QID133	47

	question	force_resp	type	\
0	<div>Hel</div>	False	DB	
1	Browser Meta Info	False	Meta	
2	<pre><span b<="" font-weight:="" style="font-size:22px; font-family: aria</pre></td><td>False</td><td>DB</td><td></td></tr><tr><td>3</td><td>Which of the following options best describes</td><td>True</td><td>MC</td><td></td></tr><tr><td>4</td><td>Which of the following best describes your cur</td><td>False</td><td>MC</td><td></td></tr><tr><td>5</td><td>Where do you live? <td>True</td><td>MC</td><td></td></pre>	True	MC	
6	In which state or territory of the USA do y	False	MC	
7	In which part of the United Kingdom do you liv	False	MC	
8	<pre><span aria<="" font-family:="" font-size:22px;="" pre="" style="font-size:22px; font-family: aria</pre></td><td>False</td><td>DB</td><td></td></tr><tr><td>9</td><td>Which of the following best describes the high</td><td>False</td><td>MC</td><td></td></tr><tr><td>10</td><td>At what age did you write your first line of c</td><td>False</td><td>MC</td><td></td></tr><tr><td>11</td><td>How did you learn to code? Select all that apply.</td><td>False</td><td>e MC</td><td></td></tr><tr><td>12</td><td>Including any education, how many years have y</td><td>False</td><td>MC</td><td></td></tr><tr><td>13</td><td>NOT including education, how many years have y</td><td>False</td><td>MC</td><td></td></tr><tr><td>14</td><td>Which of the following describes your current</td><td>False</td><td>MC</td><td></td></tr><tr><td>15</td><td>Approximately how many people are employed by</td><td>False</td><td>MC</td><td></td></tr><tr><td>16</td><td>Which currency do you use day-to-day? If your</td><td>True</td><td>MC</td><td></td></tr><tr><td>17</td><td>What is your current total compensation (salar</td><td>False</td><td>TE</td><td></td></tr><tr><td>18</td><td>Is that compensation weekly, monthly, or yearly?</td><td>False</td><td>e MC</td><td></td></tr><tr><td>19</td><td><pre></pre>	False	DB	
20	Which programming, scripting, and markup la	False	Matrix	
21	Which database environments have you do	False	Matrix	
22	Which cloud platforms have you done ext	False	Matrix	
23	Which web frameworks <span st<="" td=""><td>False</td><td>Matrix</td><td></td>	False	Matrix	
24	Which other frameworks and libraries ha	False	Matrix	
25	Which tools have you done ext	False	Matrix	
26	Which development environments<td>False</td><td>Matrix</td><td></td>	False	Matrix	
27	What is the primary operating system in which \dots	False	MC	
28	What do you do when you get stuck on a problem	False	MC	
29	<pre><span aria<="" font-family:="" font-size:22px;="" pre="" style="font-size:22px; font-family: aria</pre></td><td>False</td><td>DB</td><td></td></tr><tr><td>30</td><td>Which of the following Stack Overflow sites ha</td><td>False</td><td>MC</td><td></td></tr><tr><td>31</td><td>How frequently would you say you visit Stack O</td><td>False</td><td>MC</td><td></td></tr><tr><td>32</td><td>Do you have a Stack Overflow account?</td><td>False</td><td>e MC</td><td></td></tr><tr><td>33</td><td>How frequently would you say you participate i</td><td>False</td><td>MC</td><td></td></tr><tr><td>34</td><td>Do you consider yourself a member of the Stack</td><td>False</td><td>MC</td><td></td></tr><tr><td>35</td><td>Are you a member of any other online developer</td><td>False</td><td>MC</td><td></td></tr><tr><td>36</td><td>Please name up to 5 other online developer com</td><td>False</td><td>Matrix</td><td></td></tr><tr><td>37</td><td><pre></pre>	False	DB	
38	What is your age?	False	e MC	

39	Which of the following describe you, if any? P	False	MC
40	Do you identify as transgender?	False	MC
41	Which of the following describe you, if any? P	False	MC
42	Which of the following describe you, if any? P	False	MC
43	Which of the following describe you, if any? P	False	MC
44	Which of the following describe you, if any? P	False	MC
45	<pre>Final Qu</pre>	False	DB
46	How do you feel about the length of the survey	False	MC
47	How easy or difficult was this survey to compl	False	MC

selector 0 TB 1 Browser 2 TΒ 3 SAVR 4 MAVR 5 DL6 DL7 DL8 TB 9 SAVR 10 MAVR 11 MAVR 12 DL 13 DL14 MAVR 15 ${\tt MAVR}$ 16 SB 17 SL 18 MAVR 19 TB 20 Likert 21 Likert22 Likert 23 Likert 24 ${\tt Likert}$ 25 Likert 26 Likert 27 SAVR MAVR 28 29 TB 30 ${\tt MAVR}$ 31 MAVR 32 ${\tt MAVR}$ 33 MAVR

34

35

MAVR

MAVR

```
36
     Likert
37
          TB
38
       MAVR
39
       MAVR
40
       MAVR.
       MAVR
41
42
       MAVR.
       MAVR
43
44
       MAVR
45
          TB
       MAVR
46
47
       MAVR
```

3.0.5 Para ler o CSV com as respostas

```
[5]: answers = pd.read_csv("stack-overflow-developer-survey-2021/

survey_results_public.csv")
```

3.0.6 Para visualizar o respetivo DataFrame

```
[6]: answers
[6]:
            ResponseId
                                                                 MainBranch \
                                             I am a developer by profession
     0
                     1
                                    I am a student who is learning to code
     1
     2
                         I am not primarily a developer, but I write co...
                                             I am a developer by profession
     3
                     4
     4
                     5
                                             I am a developer by profession
                                            I am a developer by profession
     83434
                 83435
                                            I am a developer by profession
     83435
                 83436
     83436
                 83437
                                            I am a developer by profession
                                            I am a developer by profession
     83437
                 83438
                                             I am a developer by profession
     83438
                 83439
                                                     Employment \
     0
            Independent contractor, freelancer, or self-em...
                                            Student, full-time
     1
     2
                                            Student, full-time
     3
                                            Employed full-time
     4
            Independent contractor, freelancer, or self-em...
     83434
                                            Employed full-time
            Independent contractor, freelancer, or self-em...
     83435
```

```
83436
                                        Employed full-time
83437
                                        Employed full-time
83438
                                        Employed full-time
                                                   Country
                                                               US_State
0
                                                  Slovakia
                                                                     NaN
1
                                               Netherlands
                                                                     NaN
2
                                        Russian Federation
                                                                    NaN
3
                                                    Austria
                                                                     NaN
       United Kingdom of Great Britain and Northern I...
4
                                                                  NaN
83434
                                 United States of America
                                                                  Texas
83435
                                                      Benin
                                                                     NaN
83436
                                 United States of America
                                                             New Jersey
83437
                                                     Canada
                                                                     NaN
83438
                                                     Brazil
                                                                     NaN
                                                               EdLevel \
      UK_Country
0
             NaN
                   Secondary school (e.g. American high school, G...
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
1
2
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
3
             NaN
4
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
         England
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
83434
             NaN
83435
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
83436
             NaN
                   Secondary school (e.g. American high school, G...
83437
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
83438
             NaN
                                   Professional degree (JD, MD, etc.)
                                                                 LearnCode \
          Age1stCode
       18 - 24 years
                       Coding Bootcamp; Other online resources (ex: vi...
0
                       Other online resources (ex: videos, blogs, etc...
1
       11 - 17 years
                       Other online resources (ex: videos, blogs, etc...
       11 - 17 years
       11 - 17 years
3
4
        5 - 10 years
                                                  Friend or family member
                       Other online resources (ex: videos, blogs, etc...
       11 - 17 years
83434
       11 - 17 years
                       Other online resources (ex: videos, blogs, etc...
83435
83436
       11 - 17 years
                                                                     School
                       Online Courses or Certification; Books / Physic...
83437
       11 - 17 years
83438
       11 - 17 years
                                                                     School
      YearsCode
                                 Age Gender Trans
                                                                   Sexuality \
0
            NaN
                    25-34 years old
                                                     Straight / Heterosexual
                                         Man
                                                No
1
                     18-24 years old
                                         Man
                                                No
                                                     Straight / Heterosexual
2
            {\tt NaN}
                     18-24 years old
                                         Man
                                                No
                                                           Prefer not to say
```

```
3
                ... 35-44 years old
                                                    Straight / Heterosexual
            NaN
                                        Man
                                               No
4
                    25-34 years old
                                        Man
                                                                         NaN
             17
                                               No
83434
                    25-34 years old
                                               No
                                                    Straight / Heterosexual
                                        Man
83435
                    18-24 years old
                                                    Straight / Heterosexual
              4
                                        Man
                                               No
83436
                    25-34 years old
                                        Man
             10
                                               No
                                                                         NaN
83437
                    25-34 years old
                                        Man
                                               No
                                                    Straight / Heterosexual
              5
83438
             14
                    18-24 years old
                                        Man
                                                    Straight / Heterosexual
                           Ethnicity
                                                     Accessibility \
0
       White or of European descent
                                                None of the above
1
       White or of European descent
                                                 None of the above
2
                  Prefer not to say
                                                None of the above
3
       White or of European descent I am deaf / hard of hearing
4
                                                 None of the above
       White or of European descent
      White or of European descent
83434
                                                 None of the above
83435
        Black or of African descent
                                                 None of the above
83436
       White or of European descent
                                                None of the above
83437
       White or of European descent
                                                None of the above
83438
             Hispanic or Latino/a/x
                                                None of the above
                                             MentalHealth \
0
                                        None of the above
1
                                        None of the above
2
                                        None of the above
3
                                                       NaN
4
                                                       NaN
       I have a concentration and/or memory disorder ...
83434
83435
                                        None of the above
83436
                                        None of the above
83437
      I have a mood or emotional disorder (e.g. depr...
83438
                                        None of the above
                SurveyLength
                                               SurveyEase ConvertedCompYearly
0
                                                                       62268.0
       Appropriate in length
                                                      Easy
1
       Appropriate in length
                                                      Easy
                                                                            NaN
2
       Appropriate in length
                                                      Easy
                                                                            NaN
3
       Appropriate in length
                              Neither easy nor difficult
                                                                            NaN
4
       Appropriate in length
                                                                            NaN
                                                      Easy
      Appropriate in length
                                                                      160500.0
83434
                                                      Easy
83435
      Appropriate in length
                                                      Easy
                                                                        3960.0
83436
       Appropriate in length
                               Neither easy nor difficult
                                                                       90000.0
83437
       Appropriate in length
                               Neither easy nor difficult
                                                                      816816.0
83438
       Appropriate in length
                                                      Easy
                                                                        21168.0
```

3.0.7 Para visualizar o número de linhas e colunas do DataFrame

```
[7]: answers.shape
```

[7]: (83439, 48)

3.0.8~ Para visualizar informação detalhada acerca do Data
Frame

[8]: answers.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 83439 entries, 0 to 83438
Data columns (total 48 columns):

#	Column	Non-Null Count	Dtype
0	ResponseId	83439 non-null	int64
1	MainBranch	83439 non-null	object
2	Employment	83323 non-null	object
3	Country	83439 non-null	object
4	US_State	14920 non-null	object
5	UK_Country	4418 non-null	object
6	EdLevel	83126 non-null	object
7	Age1stCode	83243 non-null	object
8	LearnCode	82963 non-null	object
9	YearsCode	81641 non-null	object
10	YearsCodePro	61216 non-null	object
11	DevType	66484 non-null	object
12	OrgSize	60726 non-null	object
13	Currency	61080 non-null	object
14	CompTotal	47183 non-null	float64
15	CompFreq	52150 non-null	object
16	${\tt Language Have Worked With}$	82357 non-null	object
17	${\tt LanguageWantToWorkWith}$	76821 non-null	object
18	DatabaseHaveWorkedWith	69546 non-null	object
19	DatabaseWantToWorkWith	58299 non-null	object
20	PlatformHaveWorkedWith	52135 non-null	object
21	${\tt PlatformWantToWorkWith}$	41619 non-null	object
22	WebframeHaveWorkedWith	61707 non-null	object
23	WebframeWantToWorkWith	52095 non-null	object
24	MiscTechHaveWorkedWith	47055 non-null	object
25	MiscTechWantToWorkWith	38021 non-null	object
26	${\tt ToolsTechHaveWorkedWith}$	72537 non-null	object

```
ToolsTechWantToWorkWith
                                 65480 non-null
                                                 object
   NEWCollabToolsHaveWorkedWith 81234 non-null
                                                object
29
   NEWCollabToolsWantToWorkWith 73022 non-null object
   OpSys
                                 83294 non-null object
30
31
   NEWStuck
                                 83052 non-null object
32
   NEWSOSites
                                 83171 non-null object
   SOVisitFreq
                                 82413 non-null object
34 SOAccount
                                 82525 non-null object
   SOPartFreq
                                 67553 non-null object
   SOComm
36
                                 82319 non-null object
   NEWOtherComms
37
                                 82828 non-null object
38
   Age
                                 82407 non-null object
39
   Gender
                                 82286 non-null object
   Trans
40
                                 80678 non-null object
   Sexuality
                                 73366 non-null object
                                 79464 non-null object
42 Ethnicity
43
   Accessibility
                                 77603 non-null object
                                 76920 non-null object
44
   MentalHealth
45
   SurveyLength
                                 81711 non-null object
46
   SurveyEase
                                 81948 non-null object
   ConvertedCompYearly
                                 46844 non-null float64
```

dtypes: float64(2), int64(1), object(45)

memory usage: 30.6+ MB

3.0.9 Para visualizar o número máximo de colunas do DataFrame

```
[9]: pd.set_option("display.max_columns", 48)
[10]: answers
[10]:
             ResponseId
                                                                  MainBranch \
                                             I am a developer by profession
      0
                      1
                      2
      1
                                     I am a student who is learning to code
      2
                         I am not primarily a developer, but I write co...
      3
                      4
                                              I am a developer by profession
                      5
                                             I am a developer by profession
      4
      83434
                  83435
                                             I am a developer by profession
      83435
                  83436
                                             I am a developer by profession
                                             I am a developer by profession
      83436
                  83437
                                             I am a developer by profession
      83437
                  83438
                                             I am a developer by profession
      83438
                  83439
                                                      Employment \
      0
             Independent contractor, freelancer, or self-em...
      1
                                             Student, full-time
```

```
2
                                        Student, full-time
3
                                        Employed full-time
4
       Independent contractor, freelancer, or self-em...
83434
                                        Employed full-time
83435
       Independent contractor, freelancer, or self-em...
83436
                                        Employed full-time
83437
                                        Employed full-time
83438
                                        Employed full-time
                                                   Country
                                                               US_State
0
                                                  Slovakia
                                                                    NaN
1
                                               Netherlands
                                                                    NaN
2
                                        Russian Federation
                                                                    NaN
3
                                                    Austria
                                                                    NaN
4
       United Kingdom of Great Britain and Northern I...
                                                                  NaN
83434
                                 United States of America
                                                                  Texas
83435
                                                      Benin
                                                                    NaN
83436
                                 United States of America
                                                             New Jersey
83437
                                                     Canada
                                                                    NaN
                                                                    NaN
83438
                                                     Brazil
      UK Country
                                                               EdLevel \
0
                   Secondary school (e.g. American high school, G...
             NaN
1
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
2
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
             NaN
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
3
4
         England
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
83434
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
             NaN
83435
                   Secondary school (e.g. American high school, G...
83436
             NaN
83437
             NaN
                        Bachelor's degree (B.A., B.S., B.Eng., etc.)
83438
             NaN
                                  Professional degree (JD, MD, etc.)
          Age1stCode
                                                                 LearnCode \
0
       18 - 24 years
                       Coding Bootcamp; Other online resources (ex: vi...
1
       11 - 17 years
                       Other online resources (ex: videos, blogs, etc...
2
                       Other online resources (ex: videos, blogs, etc...
       11 - 17 years
3
       11 - 17 years
4
        5 - 10 years
                                                  Friend or family member
       11 - 17 years
                       Other online resources (ex: videos, blogs, etc...
83434
                       Other online resources (ex: videos, blogs, etc...
       11 - 17 years
83435
83436
       11 - 17 years
                                                                    School
83437
       11 - 17 years
                       Online Courses or Certification; Books / Physic...
```

```
YearsCode YearsCodePro
0
            NaN
1
               7
                          NaN
2
            NaN
                          NaN
            NaN
3
                          NaN
4
              17
                            10
               6
                            5
83434
                             2
83435
               4
83436
              10
                             4
83437
               5
                             3
83438
              14
                             4
                                                    DevType \
0
                                         Developer, mobile
1
                                                         NaN
2
                                                        NaN
3
                                      Developer, front-end
4
       Developer, desktop or enterprise applications; ...
83434
                                       Developer, back-end
83435
                                     Developer, full-stack
83436
       Data scientist or machine learning specialist;...
83437
                                       Developer, back-end
      Developer, front-end; Developer, full-stack; Dev...
83438
                                                    OrgSize
0
                                        20 to 99 employees
1
                                                        NaN
2
                                                         NaN
3
                                      100 to 499 employees
       Just me - I am a freelancer, sole proprietor, ...
4
83434
                                        20 to 99 employees
83435
       Just me - I am a freelancer, sole proprietor, ...
83436
                                  10,000 or more employees
83437
                                        20 to 99 employees
83438
                                               I don't know
                            Currency
                                      CompTotal CompFreq \
0
                  EUR European Euro
                                          4800.0
                                                  Monthly
1
                                 NaN
                                             NaN
                                                      NaN
2
                                 NaN
                                             NaN
                                                      NaN
                  EUR European Euro
3
                                            {\tt NaN}
                                                  Monthly
4
                GBP\tPound sterling
                                             NaN
                                                      NaN
```

•••	***	
83434	USD\tUnited States dollar 160500.0 Yearly	
83435	XOF\tWest African CFA franc 200000.0 Monthly	
83436	USD\tUnited States dollar 1800.0 Weekly	
	· ·	
83437	CAD\tCanadian dollar 90000.0 Monthly	
83438	BRL\tBrazilian real 7700.0 Monthly	
	LanguageHaveWorkedWith \	
0	<pre>C++;HTML/CSS;JavaScript;Objective-C;PHP;Swift</pre>	
1	${ t JavaScript; Python}$	
2	Assembly;C;Python;R;Rust	
3	${ t JavaScript;} { t TypeScript}$	
4	<pre>Bash/Shell;HTML/CSS;Python;SQL</pre>	
•••		
83434	Clojure;Kotlin;SQL	
83435	NaN	
83436	Groovy; Java; Python	
83437	Bash/Shell;JavaScript;Node.js;Python	
83438	Delphi;Elixir;HTML/CSS;Java;JavaScript	
00100	201911,211111,11112, 000,000,000	
	LanguageWantToWorkWith	\
0	Swift	•
1	NaN	
2		
	Julia; Python; Rust	
3	JavaScript; TypeScript	
4	Bash/Shell; HTML/CSS; Python; SQL	
83434	Clojure	
83435	NaN	
83436	Java; Python	
83437	Go; Rust	
83438	<pre>Elixir;HTML/CSS;Java;JavaScript;Node.js;PHP;SQ</pre>	
	${\tt Database Have Worked With}$	\
0	PostgreSQL;SQLite	
1	PostgreSQL	
2	SQLite	
3	NaN	
4	Elasticsearch; PostgreSQL; Redis	
 83434	 Oracle;SQLite	
83435	Firebase; MariaDB; MySQL; PostgreSQL; Redis; SQLite	
	•	
83436	DynamoDB; Elasticsearch; MongoDB; PostgreSQL; Redis	
83437	Cassandra; Elasticsearch; MongoDB; PostgreSQL; Redis	
83438	Oracle;PostgreSQL	
		,
	DatabaseWantToWorkWith	\

```
0
                                                      SQLite
1
                                                         NaN
2
                                                      SQLite
3
                                                         NaN
4
                 Cassandra; Elasticsearch; PostgreSQL; Redis
                                                      SQLite
83434
       Firebase;MariaDB;MongoDB;MySQL;PostgreSQL;Redi...
83435
83436
                                             DynamoDB; Redis
83437
                                                         NaN
83438
       Elasticsearch; MongoDB; MySQL; Oracle; PostgreSQL; ...
          PlatformHaveWorkedWith PlatformWantToWorkWith
0
                               NaN
                                                        NaN
1
                               NaN
                                                        NaN
2
                            Heroku
                                                        NaN
3
                               NaN
                                                        NaN
4
                               NaN
                                                        NaN
83434
                               AWS
                                                        AWS
83435
                                                        NaN
                               NaN
83436
       AWS; Google Cloud Platform
                                                        AWS
83437
                            Heroku
                                          AWS; DigitalOcean
83438
                  Microsoft Azure
                                                        AWS
                               WebframeHaveWorkedWith \
0
                                       Laravel; Symfony
1
                                 Angular; Flask; Vue. js
2
                                                  Flask
3
                                        Angular; jQuery
4
                                                  Flask
83434
                                                    NaN
       Django; jQuery; Laravel; React. js; Ruby on Rails
83435
83436
                                         FastAPI; Flask
83437
                       Django;Express;Flask;React.js
83438
                                        Angular; Spring
                                     WebframeWantToWorkWith
0
                                                         NaN
1
                                                         NaN
2
                                                       Flask
3
                                             Angular; jQuery
4
                                                       Flask
83434
                                                         NaN
       Django;Express;jQuery;Laravel;React.js;Ruby on...
83435
```

83436	FastAPI;Flask			
83437 83438	NaN Express;Laravel;Spring;Symfony			
	MiscTechHaveWo	rkedWith \		
0	nizo i comia vonc	NaN		
1		Cordova		
2	NumPy; Pandas; TensorFlow; Torch	/PyTorch		
3	·	NaN		
4	Apache Spark; Hadoop; NumP	y;Pandas		
 83434		 NaN		
83435	Fl	utter;Qt		
83436	Hadoop;Keras;NumP			
83437	NumPy; Pandas; TensorFlow; Torch			
83438	•	NaN		
	Mi	scTechWantToWorkWith \		
0		NaN		
1		NaN		
2	Keras; NumPy; Pandas; Tens	orFlow;Torch/PyTorch		
3		NaN		
4		Hadoop; NumPy; Pandas		
•••		•••		
83434		NaN		
83435		NaN		
83436	Apache Spark; Hadoop; Keras; Num	•		
83437	NumPy; Pandas; Tens	orFlow;Torch/PyTorch		
83438		NaN		
	${\tt ToolsTechHaveWorkedWith}$	${\tt ToolsTechWantToWorkWith} \backslash$		
0	NaN	NaN		
1	Docker;Git;Yarn	Git		
2	NaN	NaN		
3	NaN	NaN		
4	Docker; Git; Kubernetes; Yarn	Docker;Git;Kubernetes;Yarn		
83434	Docker;Git	Git; Kubernetes		
83435	Git;Unity 3D;Unreal Engine	Docker; Git; Kubernetes		
83436	Ansible; Docker; Git; Terraform	Docker; Git; Kubernetes; Terraform		
83437	Ansible;Docker;Git;Terraform	Kubernetes; Terraform		
83438	Docker;Git	Docker; Git; Kubernetes		
	NEWColla	bToolsHaveWorkedWith \		
0		PHPStorm; Xcode		
1	<pre>Android Studio;IntelliJ;Notepad++;PyCharm</pre>			
2	<pre>IPython/Jupyter;PyCharm;RStudio;Sublime Text;V</pre>			

```
3
                                                         NaN
4
               Atom; IPython/Jupyter; Notepad++; PyCharm; Vim
             IntelliJ;Sublime Text;Vim;Visual Studio Code
83434
       Android Studio; Eclipse; Emacs; IntelliJ; NetBeans...
83435
83436
       Android Studio; Eclipse; IntelliJ; IPython/Jupyte...
                                       PyCharm; Sublime Text
83437
                               IntelliJ; Visual Studio Code
83438
                              NEWCollabToolsWantToWorkWith
                                                                     OpSys \
0
                                                                     MacOS
                                                  Atom:Xcode
1
                                                                   Windows
                                                         NaN
2
       IPython/Jupyter; RStudio; Sublime Text; Visual St...
                                                                   MacOS
3
                                                                   Windows
                                                         NaN
4
       Atom; IPython/Jupyter; Notepad++; PyCharm; Vim; Vis... Linux-based
83434
                                           Sublime Text; Vim
                                                                     MacOS
       Emacs; IntelliJ; PHPStorm; PyCharm; RStudio; Sublim...
83435
                                                            Linux-based
83436
                   IntelliJ; IPython/Jupyter; Notepad++; Vim
                                                                   Windows
83437
                                                                     MacOS
                                                         NaN
83438
                     IntelliJ;PHPStorm;Visual Studio Code
                                                              Linux-based
                                                    NEWStuck
0
       Call a coworker or friend; Visit Stack Overflow...
1
                            Visit Stack Overflow; Google it
2
       Visit Stack Overflow; Google it; Watch help / tu...
       Call a coworker or friend; Visit Stack Overflow...
3
       Visit Stack Overflow; Go for a walk or other ph...
83434
                      Call a coworker or friend; Google it
       Call a coworker or friend; Visit Stack Overflow...
83435
       Call a coworker or friend; Visit Stack Overflow...
83436
       Call a coworker or friend; Visit Stack Overflow...
83437
       Call a coworker or friend; Visit Stack Overflow...
                                                  NEWSOSites
0
                                             Stack Overflow
1
                                             Stack Overflow
2
                             Stack Overflow; Stack Exchange
3
                                             Stack Overflow
4
                             Stack Overflow; Stack Exchange
                             Stack Overflow; Stack Exchange
83434
83435
                             Stack Overflow; Stack Exchange
83436
                             Stack Overflow; Stack Exchange
                                             Stack Overflow
83437
83438
       Stack Overflow; Stack Exchange; Stack Overflow f...
```

```
SOVisitFreq SOAccount
0
                Multiple times per day
1
                 Daily or almost daily
                                               Yes
2
                Multiple times per day
                                               Yes
3
                 Daily or almost daily
                                               Yes
                                               Yes
4
                 Daily or almost daily
83434
                   A few times per week
                                                No
                Multiple times per day
83435
                                               Yes
83436
                   A few times per week
                                               Yes
       A few times per month or weekly
83437
                                               Yes
83438
                   A few times per week
                                               Yes
                                                                      SOComm
                                                SOPartFreq
0
                          A few times per month or weekly
                                                             Yes, definitely
1
                                    Daily or almost daily
                                                             Yes, definitely
2
                                   Multiple times per day
                                                             Yes, definitely
3
                                    Daily or almost daily
                                                                     Neutral
4
                                      A few times per week
                                                               Yes, somewhat
83434
                                                       NaN
                                                              No, not at all
       I have never participated in Q&A on Stack Over...
                                                             Yes, somewhat
83435
       I have never participated in Q&A on Stack Over...
83436
                                                            No, not really
                                                              No, not really
83437
                      Less than once per month or monthly
83438
                                      A few times per week
                                                               Yes, somewhat
      NEWOtherComms
                                                                    Sexuality \
                                  Age Gender Trans
                                                     Straight / Heterosexual
0
                 No
                      25-34 years old
                                          Man
                                                 No
1
                      18-24 years old
                                                     Straight / Heterosexual
                 No
                                          Man
                                                 No
2
                 Yes
                      18-24 years old
                                          Man
                                                 No
                                                            Prefer not to say
                      35-44 years old
3
                                                     Straight / Heterosexual
                 No
                                          Man
4
                      25-34 years old
                                          Man
83434
                      25-34 years old
                                                     Straight / Heterosexual
                 No
                                          Man
                                                 No
83435
                      18-24 years old
                                          Man
                                                     Straight / Heterosexual
                 No
                                                 No
                      25-34 years old
83436
                 No
                                          Man
                                                 Nο
                                                                          NaN
                      25-34 years old
83437
                 No
                                          Man
                                                     Straight / Heterosexual
83438
                      18-24 years old
                                                     Straight / Heterosexual
                 No
                                          Man
                           Ethnicity
                                                     Accessibility
0
       White or of European descent
                                                 None of the above
       White or of European descent
                                                 None of the above
1
2
                   Prefer not to say
                                                 None of the above
                                      I am deaf / hard of hearing
3
       White or of European descent
4
       White or of European descent
                                                 None of the above
```

```
83434
      White or of European descent
                                                 None of the above
83435
        Black or of African descent
                                                 None of the above
83436
       White or of European descent
                                                 None of the above
83437
       White or of European descent
                                                 None of the above
83438
             Hispanic or Latino/a/x
                                                 None of the above
                                             MentalHealth \
                                        None of the above
0
1
                                        None of the above
2
                                        None of the above
3
                                                       NaN
4
                                                       NaN
83434
       I have a concentration and/or memory disorder ...
83435
                                        None of the above
83436
                                        None of the above
83437
       I have a mood or emotional disorder (e.g. depr...
                                        None of the above
83438
                SurveyLength
                                                SurveyEase
                                                            ConvertedCompYearly
                                                                         62268.0
0
       Appropriate in length
                                                      Easy
1
       Appropriate in length
                                                      Easy
                                                                             NaN
2
       Appropriate in length
                                                                             NaN
                                                      Easy
3
       Appropriate in length
                               Neither easy nor difficult
                                                                             NaN
4
       Appropriate in length
                                                      Easy
                                                                             NaN
83434
      Appropriate in length
                                                      Easy
                                                                        160500.0
      Appropriate in length
                                                                          3960.0
83435
                                                      Easy
83436
       Appropriate in length
                               Neither easy nor difficult
                                                                         90000.0
83437
       Appropriate in length
                               Neither easy nor difficult
                                                                        816816.0
83438
       Appropriate in length
                                                      Easy
                                                                         21168.0
```

[83439 rows x 48 columns]

3.0.10 Para visualizar as 5 primeiras linhas do DataFrame

[11]: answers.head() MainBranch \ [11]: ResponseId 0 I am a developer by profession 1 1 2 I am a student who is learning to code I am not primarily a developer, but I write co... 2 3 3 4 I am a developer by profession 4 5 I am a developer by profession

Employment \

```
Independent contractor, freelancer, or self-em...
1
                                    Student, full-time
2
                                    Student, full-time
3
                                    Employed full-time
   Independent contractor, freelancer, or self-em...
                                               Country US_State UK_Country \
0
                                              Slovakia
                                                             NaN
                                                                         NaN
1
                                           Netherlands
                                                                        NaN
                                                             NaN
2
                                    Russian Federation
                                                             NaN
                                                                        NaN
3
                                               Austria
                                                             NaN
                                                                         NaN
   United Kingdom of Great Britain and Northern I...
                                                                  England
                                                           NaN
                                               EdLevel
                                                            Age1stCode \
   Secondary school (e.g. American high school, G... 18 - 24 years
0
        Bachelor's degree (B.A., B.S., B.Eng., etc.)
1
2
        Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                         11 - 17 years
3
     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                         11 - 17 years
     Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                          5 - 10 years
                                             LearnCode YearsCodePro \
   Coding Bootcamp; Other online resources (ex: vi...
                                                            NaN
                                                                          NaN
   Other online resources (ex: videos, blogs, etc...
                                                              7
                                                                          NaN
   Other online resources (ex: videos, blogs, etc...
                                                            NaN
                                                                          NaN
3
                                                    NaN
                                                              NaN
                                                                            NaN
4
                              Friend or family member
                                                               17
                                                                             10
                                               DevType
0
                                     Developer, mobile
1
                                                   NaN
2
                                                   NaN
3
                                 Developer, front-end
   Developer, desktop or enterprise applications; ...
                                               OrgSize
                                                                    Currency \
0
                                    20 to 99 employees
                                                           EUR European Euro
1
                                                   NaN
                                                                          NaN
2
                                                   NaN
                                                                          NaN
3
                                  100 to 499 employees
                                                           EUR European Euro
   Just me - I am a freelancer, sole proprietor, ... GBP\tPound sterling
   CompTotal CompFreq
                                                LanguageHaveWorkedWith
0
      4800.0
                        C++; HTML/CSS; JavaScript; Objective-C; PHP; Swift
              Monthly
1
         NaN
                  NaN
                                                      JavaScript; Python
2
         NaN
                  NaN
                                              Assembly; C; Python; R; Rust
3
         NaN
              Monthly
                                                  JavaScript; TypeScript
4
         NaN
                  NaN
                                        Bash/Shell; HTML/CSS; Python; SQL
```

```
DatabaseHaveWorkedWith
           LanguageWantToWorkWith
0
                              Swift
                                                    PostgreSQL; SQLite
1
                                NaN
                                                           PostgreSQL
2
                 Julia; Python; Rust
                                                                SQLite
3
             JavaScript; TypeScript
                                                                   NaN
   Bash/Shell; HTML/CSS; Python; SQL Elasticsearch; PostgreSQL; Redis
                      DatabaseWantToWorkWith PlatformHaveWorkedWith
0
                                        SQLite
                                                                    NaN
1
                                           NaN
                                                                    NaN
2
                                        SQLite
                                                                 Heroku
3
                                           NaN
                                                                    NaN
   Cassandra; Elasticsearch; PostgreSQL; Redis
                                                                    NaN
  PlatformWantToWorkWith WebframeHaveWorkedWith WebframeWantToWorkWith
                                  Laravel; Symfony
0
                      NaN
                                                                        NaN
                      NaN
                             Angular; Flask; Vue. js
                                                                        NaN
1
2
                      NaN
                                             Flask
                                                                      Flask
3
                      NaN
                                   Angular; jQuery
                                                            Angular; jQuery
4
                                             Flask
                      NaN
                                                                      Flask
                   MiscTechHaveWorkedWith
0
                                        NaN
                                   Cordova
2
   NumPy; Pandas; TensorFlow; Torch/PyTorch
3
4
        Apache Spark; Hadoop; NumPy; Pandas
                          MiscTechWantToWorkWith
                                                       ToolsTechHaveWorkedWith
0
                                                                            NaN
                                              NaN
1
                                                               Docker; Git; Yarn
                                              NaN
2
   Keras;NumPy;Pandas;TensorFlow;Torch/PyTorch
                                                                            NaN
3
                                                                             NaN
4
                             Hadoop;NumPy;Pandas
                                                    Docker;Git;Kubernetes;Yarn
      ToolsTechWantToWorkWith
0
                            NaN
1
                            Git
2
                            NaN
3
                            NaN
   Docker; Git; Kubernetes; Yarn
                          NEWCollabToolsHaveWorkedWith
0
                                         PHPStorm; Xcode
            Android Studio; IntelliJ; Notepad++; PyCharm
   IPython/Jupyter;PyCharm;RStudio;Sublime Text;V...
```

```
3
                                                   NaN
4
          Atom; IPython/Jupyter; Notepad++; PyCharm; Vim
                         NEWCollabToolsWantToWorkWith
                                                              OpSys
0
                                           Atom: Xcode
                                                              MacOS
1
                                                   NaN
                                                            Windows
2
   IPython/Jupyter; RStudio; Sublime Text; Visual St...
                                                            MacOS
3
                                                   NaN
                                                            Windows
   Atom; IPython/Jupyter; Notepad++; PyCharm; Vim; Vis... Linux-based
                                              NEWStuck \
   Call a coworker or friend; Visit Stack Overflow...
1
                      Visit Stack Overflow; Google it
 Visit Stack Overflow; Google it; Watch help / tu...
3 Call a coworker or friend; Visit Stack Overflow...
4 Visit Stack Overflow; Go for a walk or other ph...
                                               SOVisitFreq SOAccount \
                       NEWSOSites
0
                  Stack Overflow
                                  Multiple times per day
                                                                 Yes
                  Stack Overflow
                                    Daily or almost daily
                                                                 Yes
1
2
   Stack Overflow; Stack Exchange
                                  Multiple times per day
                                                                 Yes
                  Stack Overflow
                                    Daily or almost daily
                                                                 Yes
3
   Stack Overflow; Stack Exchange
                                    Daily or almost daily
                                                                 Yes
                         SOPartFreq
                                              SOComm NEWOtherComms
   A few times per month or weekly
                                     Yes, definitely
             Daily or almost daily
                                     Yes, definitely
1
                                                                 No
2
            Multiple times per day
                                     Yes, definitely
                                                                Yes
3
             Daily or almost daily
                                             Neutral
                                                                 Nο
              A few times per week
                                       Yes, somewhat
                                                                 No
                                                 Sexuality
               Age Gender Trans
   25-34 years old
                              No
                                  Straight / Heterosexual
  18-24 years old
                       Man
                              No
                                  Straight / Heterosexual
  18-24 years old
                                        Prefer not to say
                      Man
                              No
   35-44 years old
                      Man
                              No
                                  Straight / Heterosexual
3
   25-34 years old
                      Man
                              No
                                                       NaN
                      Ethnicity
                                                 Accessibility \
  White or of European descent
                                            None of the above
  White or of European descent
                                            None of the above
2
              Prefer not to say
                                            None of the above
 White or of European descent
                                  I am deaf / hard of hearing
   White or of European descent
                                            None of the above
                                                               SurveyEase \
        MentalHealth
                                SurveyLength
   None of the above Appropriate in length
                                                                      Easy
```

```
None of the above Appropriate in length
                                                                        Easy
  None of the above
                      Appropriate in length
                                                                        Easy
3
                       Appropriate in length
                                                Neither easy nor difficult
4
                  {\tt NaN}
                       Appropriate in length
                                                                        Easy
   ConvertedCompYearly
0
                62268.0
1
                    NaN
2
                    NaN
3
                    NaN
4
                    NaN
```

3.0.11 Para visualizar as 10 primeiras linhas do DataFrame

```
[12]: answers.head(10)
[12]:
         ResponseId
                                                               MainBranch \
      0
                                          I am a developer by profession
                   2
                                  I am a student who is learning to code
      1
      2
                   3
                      I am not primarily a developer, but I write co...
      3
                   4
                                          I am a developer by profession
      4
                   5
                                          I am a developer by profession
      5
                   6
                                 I am a student who is learning to code
      6
                  7
                                             I code primarily as a hobby
      7
                  8
                                 I am a student who is learning to code
      8
                   9
                                          I am a developer by profession
      9
                  10
                                          I am a developer by profession
                                                  Employment \
         Independent contractor, freelancer, or self-em...
      0
      1
                                          Student, full-time
      2
                                          Student, full-time
      3
                                          Employed full-time
      4
         Independent contractor, freelancer, or self-em...
      5
                                          Student, part-time
      6
                                         I prefer not to say
                                          Student, full-time
      7
      8
                                          Employed part-time
                                          Employed full-time
      9
                                                      Country
                                                                    US_State
      0
                                                    Slovakia
                                                                          NaN
      1
                                                 Netherlands
                                                                          NaN
      2
                                          Russian Federation
                                                                          NaN
      3
                                                                          NaN
                                                      Austria
         United Kingdom of Great Britain and Northern I...
                                                                       NaN
```

```
5
                             United States of America
                                                                Georgia
6
                             United States of America
                                                         New Hampshire
7
                                               Malaysia
                                                                    NaN
8
                                                  India
                                                                    NaN
9
                                                 Sweden
                                                                    NaN
                                                           EdLevel \
  UK_Country
0
         NaN
               Secondary school (e.g. American high school, G...
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
1
         NaN
2
         NaN
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
3
         NaN
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
4
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
     England
5
         NaN
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
               Secondary school (e.g. American high school, G...
6
         NaN
7
         NaN
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
8
         NaN
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
9
         NaN
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      Age1stCode
                                                             LearnCode YearsCode
   18 - 24 years
                   Coding Bootcamp; Other online resources (ex: vi...
0
                                                                            NaN
1
   11 - 17 years
                   Other online resources (ex: videos, blogs, etc...
                                                                               7
                   Other online resources (ex: videos, blogs, etc...
2
   11 - 17 years
                                                                            NaN
3
   11 - 17 years
                                                                    NaN
                                                                               NaN
    5 - 10 years
                                               Friend or family member
                                                                                17
                   Other online resources (ex: videos, blogs, etc...
   11 - 17 years
                                                                            NaN
   11 - 17 years
                   Other online resources (ex: videos, blogs, etc...
                                                                               3
7
   11 - 17 years
                               School; Online Courses or Certification
                                                                                 4
8
   18 - 24 years
                                                       Coding Bootcamp
                                                                                 6
   11 - 17 years
                                                                 School
                                                                                 7
  YearsCodePro
                                                             DevType
0
                                                   Developer, mobile
           NaN
1
           NaN
                                                                  NaN
2
           NaN
                                                                  NaN
3
           NaN
                                                Developer, front-end
4
                 Developer, desktop or enterprise applications; ...
            10
5
           NaN
                                                                  NaN
6
           NaN
                                                                  NaN
7
           NaN
                                                                  NaN
8
             4
                                                Developer, front-end
9
             4
                     Data scientist or machine learning specialist
                                                OrgSize
                                                                     Currency
0
                                    20 to 99 employees
                                                           EUR European Euro
1
                                                    NaN
                                                                          NaN
2
                                                    NaN
                                                                          NaN
3
                                  100 to 499 employees
                                                           EUR European Euro
```

```
4
   Just me - I am a freelancer, sole proprietor, ... GBP\tPound sterling
5
                                                                            NaN
6
                                                     NaN
                                                                            NaN
7
                                                     NaN
                                                                            NaN
8
                              10,000 or more employees
                                                             INR\tIndian rupee
9
                                     10 to 19 employees
                                                            SEK\tSwedish krona
   CompTotal CompFreq
                                                       LanguageHaveWorkedWith
0
      4800.0
               Monthly
                             C++; HTML/CSS; JavaScript; Objective-C; PHP; Swift
1
          NaN
                   NaN
                                                            JavaScript; Python
2
          NaN
                                                    Assembly; C; Python; R; Rust
                   NaN
3
         NaN
               Monthly
                                                        JavaScript; TypeScript
4
         NaN
                   NaN
                                              Bash/Shell; HTML/CSS; Python; SQL
5
          NaN
                   NaN
                         C;C#;C++;HTML/CSS;Java;JavaScript;Node.js;Powe...
6
          NaN
                   NaN
                                                          HTML/CSS; JavaScript
7
          NaN
                   NaN
                               HTML/CSS; JavaScript; PHP; Ruby; SQL; TypeScript
8
          NaN
               Monthly
                                                          HTML/CSS; JavaScript
9
     42000.0
               Monthly
                                                                    C++; Python
                                 LanguageWantToWorkWith
0
                                                   Swift
1
                                                     NaN
2
                                      Julia; Python; Rust
3
                                  JavaScript; TypeScript
4
                        Bash/Shell; HTML/CSS; Python; SQL
5
   C#;C++;Go;HTML/CSS;Java;JavaScript;Node.js;Obj...
6
                               HTML/CSS; JavaScript; PHP
7
                                                    Ruby
8
                                    HTML/CSS; JavaScript
9
                                         Haskell; Python
            DatabaseHaveWorkedWith
0
                 PostgreSQL; SQLite
1
                         PostgreSQL
2
                             SQLite
3
                                 NaN
4
   Elasticsearch; PostgreSQL; Redis
5
           MySQL;PostgreSQL;SQLite
6
                                 NaN
7
           MySQL; PostgreSQL; SQLite
8
                         PostgreSQL
9
                         PostgreSQL
                                DatabaseWantToWorkWith PlatformHaveWorkedWith
0
                                                  SQLite
                                                                                NaN
1
                                                     NaN
                                                                                NaN
2
                                                  SQLite
                                                                            Heroku
```

```
3
                                                     NaN
                                                                               NaN
4
             Cassandra; Elasticsearch; PostgreSQL; Redis
                                                                               NaN
5
   Elasticsearch; Firebase; IBM DB2; MariaDB; Microso...
                                                                             NaN
6
                                                                               NaN
                                             PostgreSQL
7
                                                           Heroku; Microsoft Azure
                                             PostgreSQL
8
                                                                               AWS
9
                                                     NaN
                                                                               NaN
                                      WebframeHaveWorkedWith
  PlatformWantToWorkWith
0
                       NaN
                                             Laravel; Symfony
                       NaN
                                        Angular; Flask; Vue. js
1
2
                      NaN
                                                        Flask
3
                       NaN
                                               Angular; jQuery
4
                      NaN
                                                        Flask
5
                      NaN
                              Express;Flask;jQuery;React.js
6
                       NaN
7
                   Heroku
                            Angular.js; jQuery; Ruby on Rails
8
                       NaN
                                               Django; FastAPI
9
                       NaN
                                                           NaN
           WebframeWantToWorkWith
                                                            MiscTechHaveWorkedWith
0
                               NaN
                                                                                NaN
1
                               NaN
                                                                            Cordova
2
                             Flask
                                           NumPy;Pandas;TensorFlow;Torch/PyTorch
3
                   Angular; jQuery
                                                                                NaN
                                                 Apache Spark; Hadoop; NumPy; Pandas
4
                             Flask
   Express;Flask; jQuery;React.js
                                     Keras;NumPy;Pandas;TensorFlow;Torch/PyTorch
5
6
                            jQuery
                                                                                NaN
                    Ruby on Rails
7
                                                                                NaN
8
                   Django; FastAPI
                                                                                NaN
9
                               NaN
                                     Keras; NumPy; Pandas; TensorFlow; Torch/PyTorch
                                MiscTechWantToWorkWith
0
                                                     NaN
1
                                                     NaN
2
          Keras;NumPy;Pandas;TensorFlow;Torch/PyTorch
3
                                                     NaN
4
                                    Hadoop;NumPy;Pandas
5
   Keras;NumPy;Pandas;Qt;React Native;TensorFlow;...
6
                                                     NaN
7
                                                     NaN
8
                                                     NaN
9
                 Keras;NumPy;TensorFlow;Torch/PyTorch
      ToolsTechHaveWorkedWith
                                            ToolsTechWantToWorkWith
0
                            NaN
                                                                  NaN
1
               Docker; Git; Yarn
                                                                  Git
```

```
2
                            NaN
                                                                  NaN
3
                            NaN
                                                                  NaN
4
   Docker; Git; Kubernetes; Yarn
                                         Docker; Git; Kubernetes; Yarn
5
                            Git
                                  Docker; Git; Unity 3D; Unreal Engine
6
                            NaN
                                                                  NaN
7
                            NaN
                                                                  NaN
                                               Docker; Git; Kubernetes
                    Docker; Git
8
9
                            Git
                                                                  Git
                          NEWCollabToolsHaveWorkedWith
0
                                         PHPStorm: Xcode
1
            Android Studio; IntelliJ; Notepad++; PyCharm
2
   IPython/Jupyter; PyCharm; RStudio; Sublime Text; V...
3
                                                     NaN
4
           Atom; IPython/Jupyter; Notepad++; PyCharm; Vim
5
   IPython/Jupyter;Notepad++;PyCharm;Sublime Text...
6
                                                     NaN
7
                       Sublime Text; Visual Studio Code
8
                                   PyCharm; Sublime Text
9
               IPython/Jupyter; Vim; Visual Studio Code
                          NEWCollabToolsWantToWorkWith
                                                                 OpSys
0
                                                                 MacOS
                                              Atom; Xcode
1
                                                     NaN
                                                               Windows
2
   IPython/Jupyter; RStudio; Sublime Text; Visual St...
                                                               MacOS
3
                                                               Windows
4
   Atom; IPython/Jupyter; Notepad++; PyCharm; Vim; Vis...
                                                        Linux-based
   Android Studio; IPython/Jupyter; Vim; Visual Stud...
5
                                                             Windows
6
                                                     NaN
                                                               Windows
                       Sublime Text; Visual Studio Code
7
                                                           Linux-based
8
                                                               Windows
                                   PyCharm; Sublime Text
9
        Emacs; IPython/Jupyter; Vim; Visual Studio Code
                                                           Linux-based
                                                NEWStuck
   Call a coworker or friend; Visit Stack Overflow...
1
                        Visit Stack Overflow; Google it
  Visit Stack Overflow; Google it; Watch help / tu...
   Call a coworker or friend; Visit Stack Overflow...
  Visit Stack Overflow; Go for a walk or other ph...
  Visit Stack Overflow; Go for a walk or other ph...
   Call a coworker or friend; Visit Stack Overflow...
7
   Visit Stack Overflow; Go for a walk or other ph...
                 Visit Stack Overflow; Google it; Panic
8
   Call a coworker or friend; Visit Stack Overflow...
                        NEWSOSites
                                                 SOVisitFreq SOAccount
0
                   Stack Overflow Multiple times per day
                                                                     Yes
```

```
Stack Overflow
                                     Daily or almost daily
                                                                  Yes
1
2
   Stack Overflow; Stack Exchange
                                   Multiple times per day
                                                                  Yes
3
                   Stack Overflow
                                     Daily or almost daily
                                                                  Yes
   Stack Overflow; Stack Exchange
4
                                     Daily or almost daily
                                                                  Yes
5
   Stack Overflow; Stack Exchange
                                                                  Yes
                                   Multiple times per day
6
                   Stack Overflow
                                    Daily or almost daily
                                                                  Yes
7
   Stack Overflow; Stack Exchange
                                   Multiple times per day
                                                                  Yes
   Stack Overflow; Stack Exchange
                                     A few times per week
                                                                  Yes
   Stack Overflow; Stack Exchange
                                   Multiple times per day
                                                                  Yes
                                            SOPartFreq
                                                                  SOComm \
0
                      A few times per month or weekly
                                                         Yes, definitely
1
                                Daily or almost daily
                                                        Yes, definitely
2
                               Multiple times per day
                                                         Yes, definitely
3
                                Daily or almost daily
                                                                 Neutral
4
                                 A few times per week
                                                           Yes, somewhat
5
   I have never participated in Q&A on Stack Over...
                                                         Yes, somewhat
                                                           Yes, somewhat
                                  A few times per week
7
   I have never participated in Q&A on Stack Over...
                                                        No, not at all
                 Less than once per month or monthly
8
                                                        Yes, definitely
9
                                Daily or almost daily
                                                          Yes, somewhat
  NEWOtherComms
                                                 Gender Trans
                                Age
0
             No
                    25-34 years old
                                                    Man
                                                            No
1
             No
                    18-24 years old
                                                    Man
2
            Yes
                    18-24 years old
                                                    Man
3
             No
                    35-44 years old
                                                    Man
                                                            No
4
             No
                    25-34 years old
                                                    Man
                                                            No
5
             No
                    18-24 years old
                                      Prefer not to say
                                                            No
                 Prefer not to say
6
                                      Prefer not to say
                                                            No
             No
7
            Yes
                    18-24 years old
                                                  Woman
                                                            No
8
                    25-34 years old
             No
                                                    Man
                                                            No
9
                    25-34 years old
                                                    Man
                                                                       Ethnicity \
                  Sexuality
0
   Straight / Heterosexual
                                                   White or of European descent
1
   Straight / Heterosexual
                                                   White or of European descent
         Prefer not to say
                                                               Prefer not to say
2
3
   Straight / Heterosexual
                                                   White or of European descent
                                                   White or of European descent
4
5
   Straight / Heterosexual
                                                               Prefer not to say
                        NaN
                                                                    I don't know
7
   Straight / Heterosexual
                             White or of European descent; Multiracial; South...
8
                        NaN
                                                                     South Asian
   Straight / Heterosexual
                                                   White or of European descent
```

Accessibility \

```
0
             None of the above
             None of the above
1
2
             None of the above
3
   I am deaf / hard of hearing
4
             None of the above
             None of the above
5
             None of the above
6
             None of the above
7
8
                            NaN
9
             None of the above
                                          MentalHealth
                                                                  SurveyLength
0
                                     None of the above
                                                        Appropriate in length
1
                                     None of the above
                                                         Appropriate in length
2
                                     None of the above
                                                         Appropriate in length
3
                                                   NaN
                                                         Appropriate in length
4
                                                         Appropriate in length
                                                   NaN
5
   I have a concentration and/or memory disorder ...
                                                                    Too long
6
                                     None of the above
                                                         Appropriate in length
7
                                     None of the above
                                                         Appropriate in length
   I have a concentration and/or memory disorder ... Appropriate in length
8
                                     None of the above
9
                                                         Appropriate in length
                    SurveyEase
                                ConvertedCompYearly
0
                          Easy
                                             62268.0
1
                          Easy
                                                 NaN
2
                          Easy
                                                 NaN
3
   Neither easy nor difficult
                                                 NaN
4
                          Easy
                                                 NaN
                                                 NaN
   Neither easy nor difficult
5
   Neither easy nor difficult
                                                 NaN
7
                                                 NaN
                          Easy
8
                          Easy
                                                 NaN
   Neither easy nor difficult
                                             51552.0
```

3.0.12 Para visualizar as 5 últimas linhas do DataFrame

[13]: answers.tail() [13]: ResponseId MainBranch \ I am a developer by profession 83434 83435 I am a developer by profession 83435 83436 I am a developer by profession 83436 83437 I am a developer by profession 83437 83438 I am a developer by profession 83438 83439

```
Employment
83434
                                        Employed full-time
83435
       Independent contractor, freelancer, or self-em...
83436
                                        Employed full-time
83437
                                        Employed full-time
83438
                                        Employed full-time
                         Country
                                    US_State UK_Country
83434
       United States of America
                                        Texas
                                                     NaN
83435
                           Benin
                                          NaN
                                                     NaN
       United States of America
83436
                                 New Jersey
                                                     NaN
83437
                          Canada
                                          NaN
                                                     NaN
83438
                          Brazil
                                          NaN
                                                     NaN
                                                   EdLevel
                                                                Age1stCode \
83434
            Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                             11 - 17 years
83435
            Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                             11 - 17 years
       Secondary school (e.g. American high school, G... 11 - 17 years
83436
83437
            Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                            11 - 17 years
83438
                       Professional degree (JD, MD, etc.)
                                                            11 - 17 years
                                                 LearnCode YearsCode \
       Other online resources (ex: videos, blogs, etc...
                                                                  6
83434
       Other online resources (ex: videos, blogs, etc...
                                                                  4
83435
83436
                                                                   10
                                                    School
83437
       Online Courses or Certification; Books / Physic...
                                                                  5
                                                    School
83438
                                                                   14
      YearsCodePro
                                                                 DevType
83434
                  5
                                                    Developer, back-end
                  2
83435
                                                  Developer, full-stack
83436
                  4
                     Data scientist or machine learning specialist;...
                  3
83437
                                                    Developer, back-end
83438
                     Developer, front-end; Developer, full-stack; Dev...
                                                   OrgSize
83434
                                        20 to 99 employees
83435
       Just me - I am a freelancer, sole proprietor, ...
83436
                                  10,000 or more employees
                                        20 to 99 employees
83437
83438
                                              I don't know
                           Currency
                                     CompTotal CompFreq \
83434
         USD\tUnited States dollar
                                       160500.0
                                                  Yearly
83435
       XOF\tWest African CFA franc
                                       200000.0
                                                 Monthly
         USD\tUnited States dollar
83436
                                         1800.0
                                                  Weekly
83437
              CAD\tCanadian dollar
                                        90000.0
                                                 Monthly
```

83438	BRL\tBrazilian real 7700.0 Monthly	
83434 83435 83436 83437 83438	LanguageHaveWorkedWith \ Clojure;Kotlin;SQL NaN Groovy;Java;Python Bash/Shell;JavaScript;Node.js;Python Delphi;Elixir;HTML/CSS;Java;JavaScript	
83434 83435 83436 83437 83438	LanguageWantToWorkWith Clojure NaN Java;Python Go;Rust Elixir;HTML/CSS;Java;JavaScript;Node.js;PHP;SQ	\
83434 83435 83436 83437 83438	DatabaseHaveWorkedWith Oracle;SQLite Firebase;MariaDB;MySQL;PostgreSQL;Redis;SQLite DynamoDB;Elasticsearch;MongoDB;PostgreSQL;Redis Cassandra;Elasticsearch;MongoDB;PostgreSQL;Redis Oracle;PostgreSQL	\
83434 83435 83436 83437 83438	DatabaseWantToWorkWith SQLite Firebase;MariaDB;MongoDB;MySQL;PostgreSQL;Redi DynamoDB;Redis NaN Elasticsearch;MongoDB;MySQL;Oracle;PostgreSQL;	\
83434 83435 83436 83437 83438	PlatformHaveWorkedWith PlatformWantToWorkWith AWS AWS NaN NaN AWS;Google Cloud Platform AWS Heroku AWS;DigitalOcean Microsoft Azure AWS	\
83434 83435 83436 83437 83438	WebframeHaveWorkedWith \	
83434 83435	<pre>WebframeWantToWorkWith</pre>	\

```
83436
                                              FastAPI; Flask
83437
                                                         NaN
83438
                            Express; Laravel; Spring; Symfony
                       MiscTechHaveWorkedWith
83434
                                            NaN
83435
                                    Flutter; Qt
83436
                    Hadoop; Keras; NumPy; Pandas
       NumPy;Pandas;TensorFlow;Torch/PyTorch
83437
83438
                                    MiscTechWantToWorkWith \
83434
                                                         NaN
83435
                                                         NaN
83436
       Apache Spark; Hadoop; Keras; NumPy; Pandas; TensorFlow
83437
                    NumPy; Pandas; TensorFlow; Torch/PyTorch
83438
                                                         NaN
            ToolsTechHaveWorkedWith
                                                ToolsTechWantToWorkWith
83434
                           Docker; Git
                                                          Git: Kubernetes
83435
         Git; Unity 3D; Unreal Engine
                                                  Docker; Git; Kubernetes
       Ansible;Docker;Git;Terraform
                                      Docker; Git; Kubernetes; Terraform
83436
83437
       Ansible; Docker; Git; Terraform
                                                   Kubernetes; Terraform
83438
                                                  Docker; Git; Kubernetes
                          Docker; Git
                              NEWCollabToolsHaveWorkedWith \
83434
             IntelliJ; Sublime Text; Vim; Visual Studio Code
83435
       Android Studio; Eclipse; Emacs; IntelliJ; NetBeans...
83436
       Android Studio; Eclipse; IntelliJ; IPython/Jupyte...
83437
                                      PyCharm; Sublime Text
83438
                               IntelliJ; Visual Studio Code
                              NEWCollabToolsWantToWorkWith
                                                                    OpSys \
                                                                    MacOS
83434
                                           Sublime Text; Vim
83435
       Emacs; IntelliJ; PHPStorm; PyCharm; RStudio; Sublim... Linux-based
83436
                   IntelliJ; IPython/Jupyter; Notepad++; Vim
                                                                  Windows
83437
                                                                    MacOS
                                                         NaN
83438
                     IntelliJ;PHPStorm;Visual Studio Code
                                                              Linux-based
                                                   NEWStuck
83434
                      Call a coworker or friend; Google it
      Call a coworker or friend; Visit Stack Overflow...
83435
83436
       Call a coworker or friend; Visit Stack Overflow...
83437
       Call a coworker or friend; Visit Stack Overflow...
      Call a coworker or friend; Visit Stack Overflow...
83438
                                                 NEWSOSites \
```

```
83434
                           Stack Overflow; Stack Exchange
83435
                           Stack Overflow; Stack Exchange
83436
                           Stack Overflow; Stack Exchange
83437
                                           Stack Overflow
       Stack Overflow; Stack Exchange; Stack Overflow f...
83438
                           SOVisitFreq SOAccount
83434
                  A few times per week
                                               No
83435
                Multiple times per day
                                              Yes
83436
                  A few times per week
                                              Yes
       A few times per month or weekly
83437
                                              Yes
83438
                  A few times per week
                                              Yes
                                               SOPartFreq
                                                                    SOComm \
83434
                                                      NaN
                                                          No, not at all
83435
       I have never participated in Q&A on Stack Over...
                                                          Yes, somewhat
       I have never participated in Q&A on Stack Over... No, not really
83436
83437
                     Less than once per month or monthly No, not really
83438
                                     A few times per week
                                                            Yes, somewhat
      NEWOtherComms
                                  Age Gender Trans
                                                                   Sexuality \
                     25-34 years old
83434
                                         Man
                                                Nο
                                                    Straight / Heterosexual
                 No
83435
                     18-24 years old
                 No
                                         Man
                                                No
                                                    Straight / Heterosexual
                     25-34 years old
83436
                 No
                                         Man
                                                No
                     25-34 years old
                                         Man
                                                No Straight / Heterosexual
83437
                 No
83438
                 No
                     18-24 years old
                                         Man
                                                    Straight / Heterosexual
                                          Accessibility \
                          Ethnicity
83434 White or of European descent
                                      None of the above
        Black or of African descent None of the above
83435
       White or of European descent
83436
                                      None of the above
83437
       White or of European descent
                                      None of the above
83438
             Hispanic or Latino/a/x
                                      None of the above
                                             MentalHealth \
83434
       I have a concentration and/or memory disorder ...
83435
                                        None of the above
83436
                                        None of the above
83437
       I have a mood or emotional disorder (e.g. depr...
83438
                                        None of the above
                SurveyLength
                                               SurveyEase
                                                           ConvertedCompYearly
                                                                       160500.0
83434
       Appropriate in length
                                                     Easy
83435 Appropriate in length
                                                                         3960.0
                                                     Easy
83436
       Appropriate in length
                              Neither easy nor difficult
                                                                        90000.0
                              Neither easy nor difficult
83437
       Appropriate in length
                                                                       816816.0
83438
       Appropriate in length
                                                     Easy
                                                                        21168.0
```

3.0.13 Para visualizar as 10 últimas linhas do DataFrame

```
[14]: answers.tail(10)
[14]:
             ResponseId
                                               MainBranch \
      83429
                             I code primarily as a hobby
                   83430
      83430
                   83431
                          I am a developer by profession
      83431
                   83432
                          I am a developer by profession
      83432
                   83433
                          I am a developer by profession
      83433
                   83434
                          I am a developer by profession
                          I am a developer by profession
      83434
                   83435
                          I am a developer by profession
      83435
                   83436
                          I am a developer by profession
      83436
                   83437
                          I am a developer by profession
      83437
                   83438
      83438
                  83439
                          I am a developer by profession
                                                      Employment
      83429
                             Not employed, but looking for work
      83430
                                              Employed full-time
      83431
             Independent contractor, freelancer, or self-em...
      83432
                                              Employed full-time
      83433
             Independent contractor, freelancer, or self-em...
      83434
                                              Employed full-time
      83435
             Independent contractor, freelancer, or self-em...
      83436
                                              Employed full-time
      83437
                                              Employed full-time
      83438
                                              Employed full-time
                               Country
                                           US_State UK_Country
             United States of America
                                        Washington
                                                           NaN
      83429
             United States of America
      83430
                                           Illinois
                                                           NaN
      83431
                              Pakistan
                                                           NaN
                                                NaN
      83432
                                Canada
                                                NaN
                                                           NaN
      83433
                                Brazil
                                                NaN
                                                           NaN
      83434
             United States of America
                                              Texas
                                                           NaN
      83435
                                 Benin
                                                NaN
                                                           NaN
      83436
             United States of America
                                        New Jersey
                                                           NaN
      83437
                                Canada
                                                NaN
                                                           NaN
      83438
                                Brazil
                                                NaN
                                                           NaN
                                                         EdLevel
                                                                      Age1stCode
                   Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83429
                                                                   18 - 24 years
      83430
               Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                                   11 - 17 years
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83431
                                                                   11 - 17 years
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83432
                                                                   18 - 24 years
      83433
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                                   18 - 24 years
      83434
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                                   11 - 17 years
```

```
83435
            Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
       Secondary school (e.g. American high school, G... 11 - 17 years
83436
83437
            Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
                       Professional degree (JD, MD, etc.) 11 - 17 years
83438
                                                 LearnCode YearsCode
         Other online resources (ex: videos, blogs, etc)
83429
83430
       Other online resources (ex: videos, blogs, etc...
                                                                 23
83431
       Other online resources (ex: videos, blogs, etc...
                                                                  9
83432
                                                                    5
                                                     School
83433
       Online Forum; Online Courses or Certification; O...
                                                                 15
83434
       Other online resources (ex: videos, blogs, etc...
                                                                  6
83435
       Other online resources (ex: videos, blogs, etc...
                                                                  4
83436
                                                                    10
                                                     School
83437
       Online Courses or Certification; Books / Physic...
                                                                  5
83438
                                                     School
                                                                    14
           YearsCodePro
                                                                       DevType \
83429
                     NaN
                                             Other (please specify):;Student
83430
                          Developer, front-end; Developer, full-stack; Dev...
                      21
83431
                          Developer, mobile; Developer, desktop or enterp...
83432
                                                          Developer, back-end
       Less than 1 year
83433
                          Developer, mobile; Developer, front-end; Develop...
                      11
                       5
83434
                                                          Developer, back-end
83435
                       2
                                                        Developer, full-stack
83436
                          Data scientist or machine learning specialist;...
83437
                                                          Developer, back-end
83438
                          Developer, front-end; Developer, full-stack; Dev...
                                                   OrgSize
83429
                                                        NaN
83430
                                        10 to 19 employees
                                          2 to 9 employees
83431
83432
                                  10,000 or more employees
83433
                                  1,000 to 4,999 employees
83434
                                        20 to 99 employees
       Just me - I am a freelancer, sole proprietor, ...
83435
83436
                                  10,000 or more employees
83437
                                        20 to 99 employees
                                              I don't know
83438
                           Currency
                                      CompTotal CompFreq
83429
                                            NaN
                                                      NaN
83430
         USD\tUnited States dollar
                                       125000.0
                                                  Yearly
83431
              PKR\tPakistani rupee
                                       150000.0
                                                 Monthly
              CAD\tCanadian dollar
                                       106000.0
83432
                                                  Yearly
83433
                BRL\tBrazilian real
                                        80000.0
                                                  Yearly
```

83434 83435 83436 83437 83438	USD\tUnited States dollar 160500.0 Yearly XOF\tWest African CFA franc 200000.0 Monthly USD\tUnited States dollar 1800.0 Weekly CAD\tCanadian dollar 90000.0 Monthly BRL\tBrazilian real 7700.0 Monthly	
83429 83430 83431 83432 83433 83434 83435 83436 83437 83438	LanguageHaveWorkedWith HTML/CSS;PHP;PowerShell;Python;SQL;VBA APL;Clojure;LISP;Python;Ruby;SQL;TypeScript C#;Dart;HTML/CSS;Java;JavaScript;Kotlin;Node.j Ruby Java;JavaScript;Kotlin;Objective-C;TypeScript Clojure;Kotlin;SQL NaN Groovy;Java;Python Bash/Shell;JavaScript;Node.js;Python Delphi;Elixir;HTML/CSS;Java;JavaScript	
83429 83430 83431 83432 83433 83434 83435 83436 83437 83438	LanguageWantToWorkWith C#;Go;HTML/CSS;Java;JavaScript;PHP;Python;SQL;VBA	
83429 83430 83431 83432 83433 83434 83435 83436 83437 83438	DatabaseHaveWorkedWith MongoDB;MySQL;PostgreSQL MongoDB;MySQL;PostgreSQL;Redis Firebase;MySQL;SQLite MySQL;PostgreSQL Firebase;MongoDB;MySQL;SQLite Oracle;SQLite Firebase;MariaDB;MySQL;PostgreSQL;Redis;SQLite DynamoDB;Elasticsearch;MongoDB;PostgreSQL;Redis Cassandra;Elasticsearch;MongoDB;PostgreSQL;Redis Oracle;PostgreSQL	\
83429 83430 83431 83432	DatabaseWantToWorkWith MariaDB;Microsoft SQL Server;MongoDB;MySQL;Pos PostgreSQL DynamoDB;Firebase;MongoDB;MySQL;SQLite NaN	\

83433	NaN	
83434	SQLite	
83435 83436	Firebase; MariaDB; MongoDB; MySQL; PostgreSQL; Redi	
83437	DynamoDB;Redis NaN	
83438	Elasticsearch; MongoDB; MySQL; Oracle; PostgreSQL;	
	PlatformHaveWorkedWith \	
83429	Heroku	
83430	AWS;DigitalOcean;Google Cloud Platform;Heroku	
83431	Google Cloud Platform	
83432	Google Cloud Platform; Heroku	
83433	NaN	
83434	AWS	
83435	NaN	
83436	AWS; Google Cloud Platform	
83437	Heroku	
83438	Microsoft Azure	
	PlatformWantToWorkWith \	\
83429	AWS; Heroku; IBM Cloud or Watson; Microsoft Azure	
83430	AWS;DigitalOcean;Google Cloud Platform	
83431	AWS; Google Cloud Platform	
83432	NaN	
83433	NaN	
83434	AWS	
83435 83436	NaN AWS	
83437		
83438	AWS;DigitalOcean AWS	
00400	AWS	
	$\verb WebframeHaveWorkedWith \setminus$	
83429	Django;Flask;jQuery	
83430	Django;React.js;Ruby on Rails	
83431	Flask; jQuery	
83432	Flask;React.js;Ruby on Rails;Vue.js	
83433	React.js	
83434	NaN	
83435	Django;jQuery;Laravel;React.js;Ruby on Rails	
83436	FastAPI;Flask	
83437	Django; Express; Flask; React. js	
83438	Angular; Spring	
	WebframeWantToWorkWith	\
83429	Angular.js; ASP.NET; ASP.NET Core; Django; FastAP	
83430	NaN	
83431	Angular;Django;Flask;jQuery;Laravel	

```
83432
                                                          NaN
83433
                                                          NaN
83434
                                                          NaN
83435
       Django; Express; jQuery; Laravel; React. js; Ruby on...
83436
                                               FastAPI; Flask
83437
                                                          NaN
                            Express;Laravel;Spring;Symfony
83438
                        MiscTechHaveWorkedWith
83429
                                   NumPy; Pandas
83430
                                             NaN
83431
                                        Flutter
83432
       NumPy; Pandas; TensorFlow; Torch/PyTorch
83433
                                   React Native
83434
                                             NaN
83435
                                     Flutter; Qt
83436
                    Hadoop; Keras; NumPy; Pandas
83437
       NumPy; Pandas; TensorFlow; Torch/PyTorch
83438
                                     MiscTechWantToWorkWith
           .NET Framework; .NET Core / .NET 5; NumPy; Pandas
83429
83430
                                                          NaN
83431
           Flutter; Hadoop; NumPy; TensorFlow; Torch/PyTorch
83432
                                                          NaN
83433
                                                     Flutter
83434
                                                          NaN
83435
                                                          NaN
83436
       Apache Spark; Hadoop; Keras; NumPy; Pandas; TensorFlow
83437
                    NumPy;Pandas;TensorFlow;Torch/PyTorch
83438
                                                          NaN
             ToolsTechHaveWorkedWith
                                                 ToolsTechWantToWorkWith
83429
                                   Git
                                                      Docker; Git; Xamarin
83430
                           Docker; Git
                                         Docker; Git; Kubernetes; Unity 3D
83431
                                   Git
                                                               Docker; Git
83432
          Docker; Git; Kubernetes; Yarn
                                                                       NaN
                     Docker; Git; Yarn
83433
                                                               Docker; Git
83434
                           Docker; Git
                                                           Git; Kubernetes
83435
          Git; Unity 3D; Unreal Engine
                                                   Docker; Git; Kubernetes
       Ansible; Docker; Git; Terraform
83436
                                        Docker; Git; Kubernetes; Terraform
83437
       Ansible; Docker; Git; Terraform
                                                    Kubernetes; Terraform
83438
                           Docker; Git
                                                   Docker; Git; Kubernetes
                              NEWCollabToolsHaveWorkedWith
83429
           Atom; Notepad++; Sublime Text; Visual Studio Code
83430
                                                   Emacs; Vim
```

```
83431
       Android Studio; IntelliJ; IPython/Jupyter; Notepa...
83432
              Atom; IPython/Jupyter; Vim; Visual Studio Code
                  Android Studio; Visual Studio Code; Xcode
83433
83434
             IntelliJ; Sublime Text; Vim; Visual Studio Code
83435
       Android Studio; Eclipse; Emacs; IntelliJ; NetBeans...
83436
       Android Studio; Eclipse; IntelliJ; IPython/Jupyte...
83437
                                      PyCharm; Sublime Text
83438
                               IntelliJ; Visual Studio Code
                              NEWCollabToolsWantToWorkWith
                                                                    OpSys \
          Atom; Notepad++; Sublime Text; Visual Studio Code
83429
                                                                  Windows
83430
                                                              Linux-based
                                                      Emacs
83431
       Android Studio; IntelliJ; IPython/Jupyter; PyChar...
                                                                Windows
83432
                                                        NaN
                                                                    MacOS
83433
                                      Android Studio; Xcode
                                                                    MacOS
83434
                                           Sublime Text; Vim
                                                                    MacOS
83435
       Emacs; IntelliJ; PHPStorm; PyCharm; RStudio; Sublim...
                                                           Linux-based
                   IntelliJ; IPython/Jupyter; Notepad++; Vim
83436
                                                                  Windows
83437
                                                        NaN
                                                                    MacOS
83438
                     IntelliJ;PHPStorm;Visual Studio Code
                                                              Linux-based
                                                   NEWStuck
       Visit Stack Overflow; Google it; Watch help / tu...
83429
       Call a coworker or friend; Visit Stack Overflow...
83430
83431
       Visit Stack Overflow; Go for a walk or other ph...
83432
       Visit Stack Overflow; Go for a walk or other ph...
83433
       Call a coworker or friend; Visit Stack Overflow...
83434
                      Call a coworker or friend; Google it
83435
      Call a coworker or friend; Visit Stack Overflow...
      Call a coworker or friend; Visit Stack Overflow...
83436
       Call a coworker or friend; Visit Stack Overflow...
83437
      Call a coworker or friend; Visit Stack Overflow...
83438
                                                 NEWSOSites
83429
                             Stack Overflow; Stack Exchange
83430
                            Stack Overflow; Stack Exchange
83431
                            Stack Overflow; Stack Exchange
83432
                             Stack Overflow; Stack Exchange
83433
                                             Stack Overflow
                            Stack Overflow; Stack Exchange
83434
                             Stack Overflow; Stack Exchange
83435
83436
                             Stack Overflow; Stack Exchange
83437
                                             Stack Overflow
83438
       Stack Overflow; Stack Exchange; Stack Overflow f...
                             SOVisitFreq
                                                          SOAccount
83429
       A few times per month or weekly Not sure/can't remember
```

```
83430
                                                                No
                   A few times per week
83431
                Multiple times per day
                                                               Yes
83432
                 Daily or almost daily
                                                                No
83433
                 Daily or almost daily
                                                               Yes
83434
                   A few times per week
                                                                No
83435
                Multiple times per day
                                                               Yes
83436
                   A few times per week
                                                               Yes
83437
       A few times per month or weekly
                                                               Yes
83438
                   A few times per week
                                                               Yes
                                                SOPartFreq
                                                                      SOComm
83429
                                                        NaN
                                                               Yes, somewhat
83430
                                                        NaN
                                                              No, not really
83431
                          A few times per month or weekly
                                                             Yes, definitely
83432
                                                              No, not really
                                                        NaN
83433
                          A few times per month or weekly
                                                               Yes, somewhat
83434
                                                        NaN
                                                              No, not at all
83435
       I have never participated in Q&A on Stack Over...
                                                             Yes, somewhat
                                                            No, not really
83436
       I have never participated in Q&A on Stack Over...
83437
                      Less than once per month or monthly
                                                              No, not really
83438
                                      A few times per week
                                                               Yes, somewhat
      NEWOtherComms
                                                             Gender Trans
                                  Age
83429
                 No
                      25-34 years old
                                        Man; Or, in your own words:
                                                                      Yes
83430
                  No
                      45-54 years old
                                                                Man
                                                                       No
83431
                 No
                      18-24 years old
                                                                Man
                                                                       No
83432
                 No
                      18-24 years old
                                                              Woman
                                                                       No
83433
                 No
                      25-34 years old
                                                                Man
                                                                       No
83434
                 No
                      25-34 years old
                                                                Man
                                                                       Nο
83435
                      18-24 years old
                                                                Man
                 No
                                                                       Nο
83436
                  No
                      25-34 years old
                                                                Man
                                                                       No
                      25-34 years old
83437
                  No
                                                                Man
                                                                       No
83438
                      18-24 years old
                                                                Man
                                                                       No
                      Sexuality
                                                     Ethnicity
83429
                                 White or of European descent
                          Queer
83430
       Straight / Heterosexual
                                 White or of European descent
83431
       Straight / Heterosexual
                                               Southeast Asian
83432
       Straight / Heterosexual
                                                    East Asian
                                        Hispanic or Latino/a/x
83433
       Straight / Heterosexual
83434
       Straight / Heterosexual
                                 White or of European descent
83435
       Straight / Heterosexual
                                  Black or of African descent
83436
                                 White or of European descent
                            NaN
83437
                                 White or of European descent
       Straight / Heterosexual
83438
       Straight / Heterosexual
                                        Hispanic or Latino/a/x
```

Accessibility \

```
83429
       I am unable to / find it difficult to walk or ...
83430
                                        None of the above
83431
                                        None of the above
                                        None of the above
83432
83433
                                        None of the above
83434
                                        None of the above
83435
                                        None of the above
                                        None of the above
83436
                                        None of the above
83437
83438
                                        None of the above
                                             MentalHealth \
83429
                               I have an anxiety disorder
83430
                                        None of the above
                                        None of the above
83431
                                        None of the above
83432
83433
                               I have an anxiety disorder
       I have a concentration and/or memory disorder ...
83434
83435
                                        None of the above
83436
                                        None of the above
83437
       I have a mood or emotional disorder (e.g. depr...
83438
                                        None of the above
                SurveyLength
                                               SurveyEase
                                                           ConvertedCompYearly
       Appropriate in length Neither easy nor difficult
83429
                                                                            NaN
83430 Appropriate in length
                                                     Easy
                                                                       125000.0
                                                     Easy
83431 Appropriate in length
                                                                        11676.0
83432 Appropriate in length
                                                                        80169.0
                                                     Easy
83433
       Appropriate in length
                                                     Easy
                                                                        18326.0
83434 Appropriate in length
                                                                       160500.0
                                                     Easy
83435
       Appropriate in length
                                                     Easy
                                                                         3960.0
       Appropriate in length
83436
                              Neither easy nor difficult
                                                                        90000.0
       Appropriate in length
                              Neither easy nor difficult
83437
                                                                       816816.0
83438
       Appropriate in length
                                                     Easy
                                                                        21168.0
```

3.1 DataFrames e Series

3.1.1 Para criar um DataFrame

```
[15]: students = {
    "name": ["Francisco Gonçalves", "Carlos Costa", "Maria Almeida"],
    "number": [76433, 78944, 74822],
    "course": ["Direito", "Biologia", "Arquitetura"]
}
```

```
[16]: students_df = pd.DataFrame(students)
```

```
[17]: students_df
[17]:
                        name
                              number
                                            course
        Francisco Gonçalves
                               76433
                                          Direito
                                         Biologia
      1
                Carlos Costa
                               78944
               Maria Almeida
                               74822 Arquitetura
     3.1.2 Para aceder a uma certa coluna do DataFrame
[18]: students_df["course"]
[18]: 0
               Direito
      1
              Biologia
           Arquitetura
      Name: course, dtype: object
[19]: students_df.course
[19]: 0
               Direito
      1
              Biologia
           Arquitetura
      Name: course, dtype: object
     3.1.3 Para aceder a múltiplas colunas do DataFrame
[20]: students_df[["number", "course"]]
[20]:
         number
                      course
      0
          76433
                     Direito
      1
          78944
                    Biologia
      2
          74822 Arquitetura
     3.1.4 Para aceder aos rótulos de todas as colunas do DataFrame
[21]: students_df.columns
[21]: Index(['name', 'number', 'course'], dtype='object')
     3.1.5 Para aceder à informação do primeiro aluno
[22]: students_df.iloc[0]
```

```
[22]: name
                Francisco Gonçalves
                               76433
     number
                            Direito
      course
      Name: 0, dtype: object
[23]: students_df.loc[0]
[23]: name
                Francisco Gonçalves
      number
                               76433
      course
                            Direito
      Name: 0, dtype: object
     3.1.6 Para aceder à informação dos dois primeiros alunos
[24]: students_df.iloc[[0,1]]
[24]:
                        name
                              number
                                         course
        Francisco Gonçalves
                                76433
                                        Direito
      1
                Carlos Costa
                                78944
                                       Biologia
[25]: students_df.loc[[0,1]]
[25]:
                        name
                              number
                                         course
        Francisco Gonçalves
                                76433
                                        Direito
                Carlos Costa
                                78944
                                       Biologia
     3.1.7 Para aceder ao curso dos dois primeiros alunos
[26]: students_df.iloc[[0,1], 2]
[26]: 0
            Direito
      1
           Biologia
      Name: course, dtype: object
[27]: students_df.loc[[0,1], "course"]
[27]: 0
            Direito
```

1

Biologia

Name: course, dtype: object

3.1.8 Para aceder ao número e ao curso dos dois primeiros alunos

```
[28]: students_df.iloc[[0,1], [1,2]]
[28]:
         number
                   course
      0
          76433
                  Direito
          78944 Biologia
      1
[29]:
      students_df.iloc[0:2, 1:3]
[29]:
         number
                   course
      0
          76433
                  Direito
      1
          78944
                 Biologia
[30]: students_df.loc[[0,1], ["number", "course"]]
[30]:
         number
                   course
      0
          76433
                  Direito
      1
          78944
                 Biologia
[31]: students_df.loc[0:1, "number":"course"]
[31]:
         number
                   course
          76433
      0
                  Direito
      1
          78944
                 Biologia
     Nota: - iloc é baseado nas posições inteiras - loc é baseado nos rótulos
     3.2 Índices
     3.2.1 Para visualizar o índice do DataFrame
[32]: students_df.index
[32]: RangeIndex(start=0, stop=3, step=1)
     3.2.2 Para definir a coluna course como o novo índice
[33]: students_df.set_index("course", inplace = True)
[34]:
      students_df
[34]:
                                         number
                                   name
      course
      Direito
                   Francisco Gonçalves
                                           76433
```

Biologia Carlos Costa 78944 Arquitetura Maria Almeida 74822

3.2.3 Para redefinir o índice

3.2.4 Para definir a coluna qname como índice aquando da leitura do CSV com as perguntas

[38]: questions

[38]:		qid	question \
	qname	_	-
	SO	QID16	<div>Hel</div>
	MetaInfo	QID12	Browser Meta Info
	S1	QID1	<pre><span b<="" font-weight:="" style="font-size:22px; font-family: aria</pre></td></tr><tr><td></td><td>MainBranch</td><td>QID2</td><td>Which of the following options best describes</td></tr><tr><td></td><td>Employment</td><td>QID24</td><td>Which of the following best describes your cur</td></tr><tr><td></td><td>Country</td><td>QID6</td><td>Where do you live? </pre>
	US_State	QID7	In which state or territory of the USA do y
	UK_Country	QID9	In which part of the United Kingdom do you liv
	S2	QID190	<pre><span aria<="" font-family:="" font-size:22px;="" pre="" style="font-size:22px; font-family: aria</pre></td></tr><tr><td></td><td>EdLevel</td><td>QID25</td><td>Which of the following best describes the high</td></tr><tr><td></td><td>Age1stCode</td><td>QID149</td><td>At what age did you write your first line of c</td></tr><tr><td></td><td>LearnCode</td><td>QID276</td><td>How did you learn to code? Select all that apply.</td></tr><tr><td></td><td>YearsCode</td><td>QID32</td><td>Including any education, how many years have y</td></tr><tr><td></td><td>YearsCodePro</td><td>QID34</td><td>NOT including education, how many years have y</td></tr><tr><td></td><td>DevType</td><td>QID31</td><td>Which of the following describes your current</td></tr><tr><td></td><td>OrgSize</td><td>QID29</td><td>Approximately how many people are employed by</td></tr><tr><td></td><td>Currency</td><td>QID50</td><td>Which currency do you use day-to-day? If your</td></tr><tr><td></td><td>CompTotal</td><td>QID51</td><td>What is your current total compensation (salar</td></tr><tr><td></td><td><math>{\tt CompFreq}</math></td><td>QID52</td><td>Is that compensation weekly, monthly, or yearly?</td></tr><tr><td></td><td>S3</td><td>QID61</td><td><pre></pre>

Language	QID233	Which programming, scripting, and markup la
Database	QID262	Which database environments have you do
Platform	QID263	Which cloud platforms have you done ext
Webframe	QID264	Which web frameworks <span st<="" td="">
MiscTech	QID265	Which other frameworks and libraries ha
ToolsTech	QID275	Which tools have you done ext
NEWCollabTools	QID274	Which development environments
OpSys	QID71	What is the primary operating system in which
NEWStuck	QID243	What do you do when you get stuck on a problem
S4	QID91	<pre><span aria<="" font-family:="" font-size:22px;="" pre="" style="font-size:22px; font-family: aria</pre></td></tr><tr><td>NEWSOSites</td><td>QID266</td><td>Which of the following Stack Overflow sites ha</td></tr><tr><td><math>{\tt SOVisitFreq}</math></td><td>QID100</td><td>How frequently would you say you visit Stack O</td></tr><tr><td>SOAccount</td><td>QID101</td><td>Do you have a Stack Overflow account?</td></tr><tr><td>SOPartFreq</td><td>QID102</td><td>How frequently would you say you participate i</td></tr><tr><td>SOComm</td><td>QID106</td><td>Do you consider yourself a member of the Stack</td></tr><tr><td>NEWOtherComms</td><td>QID267</td><td>Are you a member of any other online developer</td></tr><tr><td>NEWOtherCommsNames</td><td>QID268</td><td>Please name up to 5 other online developer com</td></tr><tr><td>S5</td><td>QID121</td><td><pre></pre>
Age	QID127	What is your age?
Gender	QID122	Which of the following describe you, if any? P
Trans	QID153	Do you identify as transgender?
Sexuality	QID136	Which of the following describe you, if any? P
Ethnicity	QID126	Which of the following describe you, if any? P
Accessibility	QID124	Which of the following describe you, if any? P
MentalHealth	QID125	Which of the following describe you, if any? P
S6	QID131	<pre>Final Qu</pre>
SurveyLength	QID132	How do you feel about the length of the survey
SurveyEase	QID133	How easy or difficult was this survey to compl

	force_resp	type	selector
qname			
SO	False	DB	TB
MetaInfo	False	Meta	Browser
S1	False	DB	TB
MainBranch	True	MC	SAVR
Employment	False	MC	MAVR
Country	True	MC	DL
US_State	False	MC	DL
UK_Country	False	MC	DL
S2	False	DB	TB
EdLevel	False	MC	SAVR
Age1stCode	False	MC	MAVR
LearnCode	False	MC	MAVR
YearsCode	False	MC	DL
YearsCodePro	False	MC	DL
DevType	False	MC	MAVR
OrgSize	False	MC	MAVR

Currency	True	MC	SB
CompTotal	False	TE	SL
CompFreq	False	MC	MAVR
S3	False	DB	TB
Language	False	Matrix	Likert
Database	False	Matrix	Likert
Platform	False	Matrix	Likert
Webframe	False	Matrix	Likert
MiscTech	False	Matrix	Likert
ToolsTech	False	Matrix	Likert
NEWCollabTools	False	Matrix	Likert
OpSys	False	MC	SAVR
NEWStuck	False	MC	MAVR
S4	False	DB	TB
NEWSOSites	False	MC	MAVR
SOVisitFreq	False	MC	MAVR
SOAccount	False	MC	MAVR
SOPartFreq	False	MC	MAVR
SOComm	False	MC	MAVR
NEWOtherComms	False	MC	MAVR
NEWOtherCommsNames	False	Matrix	Likert
S5	False	DB	TB
Age	False	MC	MAVR
Gender	False	MC	MAVR
Trans	False	MC	MAVR
Sexuality	False	MC	MAVR
Ethnicity	False	MC	MAVR
Accessibility	False	MC	MAVR
MentalHealth	False	MC	MAVR
S6	False	DB	TB
SurveyLength	False	MC	MAVR
SurveyEase	False	MC	MAVR

3.2.5 Para definir a coluna ResponseId como índice aquando da leitura do CSV com as respostas

```
4
                                I am a developer by profession
5
                                I am a developer by profession
                                I am a developer by profession
83435
83436
                                I am a developer by profession
83437
                                I am a developer by profession
83438
                                I am a developer by profession
83439
                                I am a developer by profession
                                                      Employment
ResponseId
            Independent contractor, freelancer, or self-em...
1
2
                                             Student, full-time
3
                                             Student, full-time
4
                                             Employed full-time
5
            Independent contractor, freelancer, or self-em...
83435
                                             Employed full-time
83436
            Independent contractor, freelancer, or self-em...
83437
                                             Employed full-time
83438
                                             Employed full-time
83439
                                             Employed full-time
                                                         Country
                                                                    US_State
ResponseId
1
                                                        Slovakia
                                                                          NaN
                                                    Netherlands
2
                                                                          NaN
3
                                             Russian Federation
                                                                         NaN
4
                                                         Austria
                                                                          NaN
5
            United Kingdom of Great Britain and Northern I...
                                                                        NaN
83435
                                       United States of America
                                                                       Texas
83436
                                                           Benin
                                                                          NaN
83437
                                       United States of America
                                                                  New Jersey
83438
                                                          Canada
                                                                          NaN
83439
                                                          Brazil
                                                                          NaN
                                                                    EdLevel \
           UK_Country
ResponseId
                        Secondary school (e.g. American high school, G...
1
                   NaN
2
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
                   NaN
3
                   NaN
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
                          Master's degree (M.A., M.S., M.Eng., MBA, etc.)
4
                   NaN
5
                          Master's degree (M.A., M.S., M.Eng., MBA, etc.)
              England
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
83435
                   NaN
83436
                   NaN
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
```

```
83437
                   NaN
                        Secondary school (e.g. American high school, G...
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
83438
                   NaN
83439
                   NaN
                                        Professional degree (JD, MD, etc.)
                Age1stCode
                                                                       LearnCode \
ResponseId
1
             18 - 24 years
                            Coding Bootcamp; Other online resources (ex: vi...
2
             11 - 17 years
                            Other online resources (ex: videos, blogs, etc...
3
             11 - 17 years
                            Other online resources (ex: videos, blogs, etc...
4
             11 - 17 years
             5 - 10 years
5
                                                        Friend or family member
83435
             11 - 17 years
                            Other online resources (ex: videos, blogs, etc...
83436
             11 - 17 years
                            Other online resources (ex: videos, blogs, etc...
83437
             11 - 17 years
                                                                          School
83438
             11 - 17 years
                            Online Courses or Certification; Books / Physic...
83439
             11 - 17 years
                                                                          School
           YearsCode YearsCodePro \
ResponseId
                  NaN
                                NaN
1
2
                    7
                                NaN
3
                  NaN
                                NaN
4
                                NaN
                  NaN
5
                   17
                                 10
                                  5
83435
                    6
83436
                                  2
                    4
83437
                   10
                                  4
                    5
                                  3
83438
83439
                                  4
                   14
                                                         DevType \
ResponseId
1
                                               Developer, mobile
2
                                                              NaN
3
                                                              NaN
4
                                           Developer, front-end
5
            Developer, desktop or enterprise applications; ...
                                            Developer, back-end
83435
83436
                                          Developer, full-stack
83437
            Data scientist or machine learning specialist; ...
83438
                                            Developer, back-end
83439
            Developer, front-end; Developer, full-stack; Dev...
```

OrgSize \

```
ResponseId
                                             20 to 99 employees
2
                                                             NaN
3
                                                             NaN
4
                                           100 to 499 employees
5
            Just me - I am a freelancer, sole proprietor, ...
83435
                                             20 to 99 employees
            Just me - I am a freelancer, sole proprietor, ...
83436
83437
                                       10,000 or more employees
83438
                                              20 to 99 employees
83439
                                                    I don't know
                                 Currency
                                          CompTotal CompFreq \
ResponseId
                       EUR European Euro
                                               4800.0
                                                       Monthly
2
                                      NaN
                                                  NaN
                                                           NaN
3
                                      NaN
                                                  NaN
                                                           NaN
4
                       EUR European Euro
                                                       Monthly
                                                  NaN
5
                     GBP\tPound sterling
                                                           NaN
                                                  NaN
               USD\tUnited States dollar
83435
                                             160500.0
                                                        Yearly
83436
            XOF\tWest African CFA franc
                                             200000.0
                                                      Monthly
              USD\tUnited States dollar
                                                        Weekly
83437
                                              1800.0
83438
                    CAD\tCanadian dollar
                                              90000.0
                                                       Monthly
                                              7700.0
83439
                     BRL\tBrazilian real
                                                       Monthly
                                     LanguageHaveWorkedWith \
ResponseId
            C++; HTML/CSS; JavaScript; Objective-C; PHP; Swift
1
2
                                          JavaScript; Python
3
                                   Assembly; C; Python; R; Rust
4
                                      JavaScript; TypeScript
5
                            Bash/Shell;HTML/CSS;Python;SQL
83435
                                         Clojure; Kotlin; SQL
83436
                                                         NaN
83437
                                         Groovy; Java; Python
83438
                      Bash/Shell; JavaScript; Node. js; Python
83439
                    Delphi;Elixir;HTML/CSS;Java;JavaScript
                                         LanguageWantToWorkWith
ResponseId
1
                                                           Swift
2
                                                             NaN
3
                                               Julia; Python; Rust
                                          JavaScript; TypeScript
4
```

5	Bash/Shell; HTML/CSS; Python; SQL	
 83435 83436 83437	 Clojure NaN Java;Python	
83438 83439	Go;Rust Elixir;HTML/CSS;Java;JavaScript;Node.js;PHP;SQ	
ResponseId	DatabaseHaveWorkedWith	\
1 2 3 4	PostgreSQL;SQLite PostgreSQL SQLite NaN	
5	Elasticsearch; PostgreSQL; Redis	
83435 83436 83437 83438 83439	Oracle; SQLite Firebase; MariaDB; MySQL; PostgreSQL; Redis; SQLite DynamoDB; Elasticsearch; MongoDB; PostgreSQL; Redis Cassandra; Elasticsearch; MongoDB; PostgreSQL; Redis Oracle; PostgreSQL	
DammaraTd	DatabaseWantToWorkWith	. \
ResponseId 1 2 3 4 5	SQLite NaN SQLite NaN Cassandra;Elasticsearch;PostgreSQL;Redis	
 83435 83436 83437 83438	SQLite Firebase; MariaDB; MongoDB; MySQL; PostgreSQL; Redi DynamoDB; Redis NaN	
83439	<pre>Elasticsearch;MongoDB;MySQL;Oracle;PostgreSQL;</pre>	
ResponseId	${\tt PlatformHaveWorkedWith\ PlatformWantToWorkWith\ }$	\
1	NaN NaN	
2	NaN NaN	
3	Heroku NaN	
4 5	NaN NaN NaN NaN	
	NaN NaN	
 83435	AWS AWS	
83436	NaN NaN	
83437	AWS;Google Cloud Platform AWS	

```
83438
                                Heroku
                                              AWS; DigitalOcean
83439
                                                            AWS
                       Microsoft Azure
                                    WebframeHaveWorkedWith \
ResponseId
                                           Laravel; Symfony
1
2
                                      Angular; Flask; Vue. js
3
                                                      Flask
4
                                            Angular; jQuery
5
                                                     Flask
83435
                                                        NaN
83436
            Django; jQuery; Laravel; React. js; Ruby on Rails
83437
                                             FastAPI;Flask
83438
                            Django;Express;Flask;React.js
83439
                                            Angular; Spring
                                         WebframeWantToWorkWith \
ResponseId
1
                                                             NaN
2
                                                             NaN
3
                                                           Flask
4
                                                 Angular; jQuery
5
                                                           Flask
83435
                                                             NaN
83436
            Django;Express;jQuery;Laravel;React.js;Ruby on...
83437
                                                  FastAPI;Flask
83438
83439
                                Express;Laravel;Spring;Symfony
                            MiscTechHaveWorkedWith \
ResponseId
                                                NaN
2
                                            Cordova
3
            NumPy;Pandas;TensorFlow;Torch/PyTorch
4
5
                  Apache Spark; Hadoop; NumPy; Pandas
83435
                                                NaN
83436
                                         Flutter; Qt
                         Hadoop;Keras;NumPy;Pandas
83437
            NumPy;Pandas;TensorFlow;Torch/PyTorch
83438
83439
                                                NaN
                                         MiscTechWantToWorkWith \
ResponseId
```

1 2 3 4 5 83435	Keras;NumPy;Pandas;Tens	NaN NaN sorFlow;Torch/PyTorch NaN Hadoop;NumPy;Pandas NaN		
83436 83437 83438 83439	Apache Spark; Hadoop; Keras; Num NumPy; Pandas; Tens	NaN		
ResponseId	${\tt ToolsTechHaveWorkedWith}$	ToolsTechWar	ntToWorkWith	\
1 2 3 4	NaN Docker;Git;Yarn NaN NaN	De aleans City Work	NaN Git NaN NaN	
5 83435 83436 83437 83438 83439	Docker; Git; Kubernetes; Yarn Docker; Git Git; Unity 3D; Unreal Engine Ansible; Docker; Git; Terraform Ansible; Docker; Git; Terraform Docker; Git	Docker;Git;Kubernete Kubernete	 t;Kubernetes t;Kubernetes	
ResponseId 1 2 3 4 5	NEWColla Android Studio; Intell IPython/Jupyter; PyCharm; RStud Atom; IPython/Jupyter; N	lio;Sublime Text;V NaN		
83435 83436 83437 83438 83439		IntelliJ;NetBeans		
ResponseId 1 2 3	IPython/Jupyter;RStudio;Subli	NaN	OpSys MacOS Windows MacOS Windows	
5 Atom; IPython/Jupyter; Notepad++; PyCharm; Vim; Vis Linux-based				

83435 Sublime Text; Vim	MacOS
83436 Emacs; Intellij; PHPStorm; PyCharm; RStudio; Sublim Li	inux-based
83437 IntelliJ; IPython/Jupyter; Notepad++; Vim	Windows
83438 NaN	MacOS
83439 IntelliJ;PHPStorm;Visual Studio Code	Linux-based
,,,,,,	
NEWStuck	\
ResponseId	•
Call a coworker or friend; Visit Stack Overflow	
2 Visit Stack Overflow; Google it	
3 Visit Stack Overflow; Google it; Watch help / tu	
4 Call a coworker or friend; Visit Stack Overflow	
5 Visit Stack Overflow; Go for a walk or other ph	
ovisit Stack Over1110w, Go 101 a wark of other ph	
83435 Call a coworker or friend; Google it	
, 9	
83437 Call a coworker or friend; Visit Stack Overflow	
83438 Call a coworker or friend; Visit Stack Overflow	
83439 Call a coworker or friend; Visit Stack Overflow	
NEW COOK :	
	\
ResponseId	
1 Stack Overflow	
2 Stack Overflow	
3 Stack Overflow; Stack Exchange	
4 Stack Overflow	
5 Stack Overflow; Stack Exchange	
83435 Stack Overflow; Stack Exchange	
83436 Stack Overflow; Stack Exchange	
83437 Stack Overflow; Stack Exchange	
83438 Stack Overflow	
83439 Stack Overflow; Stack Exchange; Stack Overflow f	
SOVisitFreq SOAccount \	
ResponseId	
1 Multiple times per day Yes	
2 Daily or almost daily Yes	
3 Multiple times per day Yes	
4 Daily or almost daily Yes	
5 Daily or almost daily Yes	
83435 A few times per week No	
83436 Multiple times per day Yes	
83437 A few times per week Yes	
83438 A few times per month or weekly Yes	

00409	A lew cimes p	er week les	
		SOPartFr	·ea \
ResponseId		201 41 01 1	94 (
1	A few	times per month or week	:lv
2		Daily or almost dai	•
3		Multiple times per d	•
4		Daily or almost dai	•
5		A few times per we	•
•••			
83435		N	JaN
83436	I have never participate	d in Q&A on Stack Over	•
83437	I have never participate		
83438		once per month or month	
83439		A few times per we	•
		1	
	SOComm NEWOther	Comms Age	Gender Trans \
ResponseId		9	
1	Yes, definitely	No 25-34 years old	Man No
2	Yes, definitely	No 18-24 years old	Man No
3	Yes, definitely	Yes 18-24 years old	Man No
4	Neutral	No 35-44 years old	Man No
5	Yes, somewhat	No 25-34 years old	Man No
•••		••• •••	
83435	No, not at all	No 25-34 years old	Man No
83436	Yes, somewhat	No 18-24 years old	Man No
83437	No, not really	No 25-34 years old	Man No
83438	No, not really	No 25-34 years old	Man No
83439	Yes, somewhat	No 18-24 years old	Man No
		•	
	Sexuality	Eth	$nicity \setminus$
${\tt ResponseId}$			
1	Straight / Heterosexual	White or of European d	escent
2	Straight / Heterosexual	White or of European d	escent
3	Prefer not to say	Prefer not	to say
4	Straight / Heterosexual	White or of European d	escent
5	NaN	White or of European d	escent
•••	•••	•••	
83435	Straight / Heterosexual	White or of European d	escent
83436	Straight / Heterosexual	Black or of African d	escent
83437	NaN	White or of European d	escent
83438	Straight / Heterosexual	White or of European d	escent
83439	Straight / Heterosexual	Hispanic or Lati	no/a/x
D	Accessibil	ity \	
ResponseId	M		
1	None of the ab	ove	

A few times per week

Yes

83439

2 3 4 5	None of the above None of the above I am deaf / hard of hearing None of the above
83435	None of the above
83436	None of the above
83437 83438	None of the above None of the above
83439	None of the above
00100	None of the above
ResponseId	MentalHealth \
1	None of the above
2	None of the above
3	None of the above
4	NaN
5	NaN
 83435	I have a concentration and/or memory disorder
83436	None of the above
83437	None of the above
83438	I have a mood or emotional disorder (e.g. depr
83439	None of the above
	None of the above SurveyLength SurveyEase \
ResponseId	SurveyLength SurveyEase \
ResponseId	SurveyLength SurveyEase \ Appropriate in length Easy
ResponseId 1 2	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy
ResponseId	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy
ResponseId 1 2 3	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy
ResponseId 1 2 3 4	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Neither easy nor difficult
ResponseId 1 2 3 4	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Appropriate in length Appropriate in length Appropriate in length Neither easy nor difficult Appropriate in length Easy
ResponseId 1 2 3 4 5 83435 83436	SurveyLength SurveyEase \ Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Appropriate in length Appropriate in length Appropriate in length Neither easy nor difficult Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Neither easy nor difficult
ResponseId 1 2 3 4 5 83435 83436 83437 83438	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Neither easy nor difficult Appropriate in length Neither easy nor difficult
ResponseId 1 2 3 4 5 83435 83436 83437	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Appropriate in length Appropriate in length Appropriate in length Neither easy nor difficult Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Neither easy nor difficult
ResponseId 1 2 3 4 5 83435 83436 83437 83438	SurveyLength SurveyEase \ Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437 83438	SurveyLength SurveyEase \ Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Easy Appropriate in length Neither easy nor difficult Appropriate in length Neither easy nor difficult
ResponseId 1 2 3 4 5 83435 83436 83437 83438 83439	SurveyLength SurveyEase \ Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437 83438 83439 ResponseId	Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437 83438 83439 ResponseId 1	SurveyLength Appropriate in length Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437 83438 83439 ResponseId 1 2 3 4	Appropriate in length
ResponseId 1 2 3 4 5 83435 83436 83437 83438 83439 ResponseId 1 2 3	Appropriate in length

```
      83435
      160500.0

      83436
      3960.0

      83437
      90000.0

      83438
      816816.0

      83439
      21168.0
```

[83439 rows x 47 columns]

${\bf 3.2.6}$ Para aceder ao significado da coluna NEWStuck

```
[41]: questions.loc["NEWStuck", "question"]
```

[41]: 'What do you do when you get stuck on a problem? Select all that apply.'

3.3 Filtros

3.3.1 Para filtrar as respostas dadas por mulheres

[42]: answers[ans	swers["Gender"] == "Woman"]	
[42]:	MainBranch	\
ResponseId		
8	I am a student who is learning to code	
40	I am a student who is learning to code	
45	I am a developer by profession	
54	I am a developer by profession	
83	I am a student who is learning to code	
•••		
83395	I am a developer by profession	
83403	I am a developer by profession	
83414	I used to be a developer by profession, but no	
83422	I am a developer by profession	
83433	I am a developer by profession	
	Employment	\
ResponseId		
8	Student, full-time	
40	Student, part-time	
45	Employed full-time	
54	Student, full-time	
83	Student, full-time	
•••		
83395	Employed full-time	
83403	Employed full-time	

```
83414
                                              Employed full-time
83422
             Independent contractor, freelancer, or self-em...
83433
                                             Employed full-time
                                                         Country US_State \
ResponseId
                                                        Malaysia
                                                                       NaN
40
                                                           India
                                                                       NaN
45
                                                          France
                                                                       NaN
54
            United Kingdom of Great Britain and Northern I ...
                                                                     NaN
83
                                                     Netherlands
                                                                       NaN
83395
                                                           India
                                                                       NaN
83403
                                                     South Korea
                                                                       NaN
83414
                                                         Germany
                                                                       NaN
83422
                                                          Norway
                                                                       NaN
83433
                                                          Canada
                                                                       NaN
           UK_Country
                                                                     EdLevel
ResponseId
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
8
                   NaN
40
                   NaN
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
45
                          Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                   NaN
                          Master's degree (M.A., M.S., M.Eng., MBA, etc.)
54
               England
83
                                       Associate degree (A.A., A.S., etc.)
                   NaN
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
83395
                   NaN
                        Secondary school (e.g. American high school, G...
83403
                   NaN
83414
                   NaN
                          Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
83422
                   NaN
83433
                             Bachelor's degree (B.A., B.S., B.Eng., etc.)
                   NaN
                                                                       LearnCode \
                Age1stCode
ResponseId
8
                                        School; Online Courses or Certification
             11 - 17 years
40
             11 - 17 years
                                                                          School
45
             18 - 24 years
                                                                          School
                            Friend or family member; Online Courses or Cert...
54
             18 - 24 years
83
             11 - 17 years
                                                                          School
83395
             11 - 17 years
                                                         Books / Physical media
83403
             11 - 17 years
                            Other online resources (ex: videos, blogs, etc...
83414
                            Other online resources (ex: videos, blogs, etc...
             18 - 24 years
83422
             11 - 17 years
                            School; Friend or family member; Online Courses ...
83433
             18 - 24 years
                                                                          School
```

YearsCodePro

YearsCode

ResponseId 8 40 45 54 83 83395	4 3 6 6 5 9	Less than 1 years of 1 in 1 i	NaN NaN 4	
83403 83414	4 5	Less than 1 ye	ear 3	
83422	20		15	
83433	5	Less than 1 ye	ear	
ResponseId			DevTy	pe \
8				aN aN
40 45 54			Developer, full-sta	aN ck aN
83				aN
 83395 83403 83414 83422 83433	Developer	r, mobile;Develo	Developer, front-exper, front-exper, front-end; Develop Other (please specify Developer, full-sta): ck
D = == = = T d		OrgSize	e Currency	CompTotal \
ResponseId 8		Nal	NaN	NaN
40		Nal	NaN	NaN
45	10	to 19 employees	EUR European Euro	NaN
54		Nal	NaN	NaN
83		Nal	NaN	NaN
 83395	100 +	 to 499 employees	 S INR\tIndian rupee	 683000.0
83403		2 to 9 employees	_	
83414	_	l oo o ampiojoa. Nal		NaN
83422	100 t	to 499 employees		820000.0
83433		r more employees	_	106000.0
ResponseId	CompFreq		LanguageHav	eWorkedWith \
8	NaN	HTML/CSS	;JavaScript;PHP;Ruby;SQL	;TypeScript
40	NaN		;HTML/CSS;JavaScript;Nod	
45	NaN	HTML/CSS; JavaSo	cript;Node.js;Python;R;S	QL;TypeS
54	NaN			PowerShell

83	NaN	Dart; HTML/CSS; JavaS	cript;PHP;TypeScript
 83395	 Yearly	HTML/CSS:Java:J	avaScript;TypeScript
83403	Monthly C;Dart;HTML/CSS;Java;JavaScript;Kotlin;Node.js		
83414	NaN Bash/Shell; C#; HTML/CSS; Java; JavaScript; Matlab;		
83422	Yearly Bash/Shell; HTML/CSS; JavaScript; Node.js; Python;		
83433	Yearly		Ruby
	J		J
		LanguageWan	tToWorkWith \
${\tt ResponseId}$			
8			Ruby
40			NaN
45			NaN
54			Python
83		Dart;HTML/CSS;JavaScript;PHP	;TypeScript
 83395			 Node.js
83403			Dart;Kotlin
83414			Go; Python
83422	Rach/She	ell;HTML/CSS;JavaScript;Node.js	· ·
83433	Dasii/ biie	-	;TypeScript
00400		Java, muby	, Typescript
		DatabaseHaveWorkedWith	DatabaseWantToWorkWith \
ResponseId			
8		MySQL;PostgreSQL;SQLite	${\tt PostgreSQL}$
40		${ t MongoDB}$	NaN
45		${\tt PostgreSQL}$	NaN
54		NaN	NaN
83		MariaDB;MongoDB;MySQL	MariaDB;MongoDB;MySQL
			
83395		Firebase; MySQL	MongoDB; MySQL; Oracle
83403		; MariaDB; MongoDB; MySQL; Oracle	Firebase;MySQL;Oracle
83414	Micr	rosoft SQL Server; MySQL; Oracle	NaN
83422		MySQL	DynamoDB;MySQL;Redis
83433		MySQL;PostgreSQL	NaN
		${\tt PlatformHaveWorkedW}$	ith \
ResponseId			
8		Heroku; Microsoft Az	ure
40			oku
45		Google Cloud Platf	orm
54		Google Cloud Platf	orm
83			NaN
83395			NaN
83403	A110 0	AWS; Her	
83414	AWS;Goog	${f c}$ le Cloud Platform;Microsoft Az	ure

```
83422
                                                      AWS
83433
                           Google Cloud Platform; Heroku
                                 PlatformWantToWorkWith \
ResponseId
                                                   Heroku
40
                                                      NaN
45
                                                      NaN
54
                                   Google Cloud Platform
83
83395
                                                      NaN
83403
                                                      AWS
83414
                                                      NaN
83422
             AWS; Google Cloud Platform; Microsoft Azure
83433
                                                      NaN
                           WebframeHaveWorkedWith \
ResponseId
                 Angular.js; jQuery; Ruby on Rails
40
                          Express; jQuery; React.js
45
                              Django; Flask; Vue. js
54
                  ¡Query;Laravel;React.js;Vue.js
83
83395
                Angular; Angular.js; jQuery; Spring
83403
                                     Django; jQuery
83414
                    ASP.NET; ASP.NET Core ; jQuery
83422
                           Django; jQuery; React. js
83433
             Flask; React.js; Ruby on Rails; Vue.js
                                 WebframeWantToWorkWith \
ResponseId
                                           Ruby on Rails
40
                                                      NaN
45
                                                      NaN
54
                                                      NaN
83
                                 jQuery; Laravel; React. js
83395
                                Express;React.js;Vue.js
83403
                                         React.js; Vue.js
             Angular; Angular.js; React.js; Spring; Vue.js
83414
83422
                                           Django; Vue. js
83433
                                                      NaN
                             {\tt MiscTechHaveWorkedWith~MiscTechWantToWorkWith~} \setminus
ResponseId
```

8	NaN	NaN	
40	Keras; NumPy; TensorFlow NaN		
45	NumPy; TensorFlow	NaN	
54	Keras; NumPy; Torch/PyTorch NumPy; Torch/PyTorch		
83	Flutter; React Native	Flutter	
			
83395	NaN	NaN	
83403	Flutter	Flutter; React Native	
83414	.NET Framework;.NET Core / .NET 5	NaN	
83422	NaN	NaN	
83433	<pre>NumPy;Pandas;TensorFlow;Torch/PyTorch</pre>	NaN	
	ToolsTechHaveWorkedWith Too	olsTechWantToWorkWith \	
ResponseId			
8	NaN	NaN	
40	Flow; Unity 3D	NaN	
45	Docker; Git; Kubernetes	NaN	
54	Git	Git	
83	Docker;Git	Docker;Git	
•••	•••	•••	
83395	Git	NaN	
83403	Git	Git;Unity 3D	
83414	NaN	NaN	
83422	Docker;Git Docker;Git;	Kubernetes; Terraform	
83433	Docker; Git; Kubernetes; Yarn	NaN	
	NEWCollabToolsHave	WorkedWith \	
ResponseId		,	
8	Sublime Text; Visual Studio Code		
40	IPython/Jupyter; Sublime Text; Visual Studio Code		
45	Visual Studio		
54	Notepad++;PyCharm		
83	PHPStorm; Visual Studio Code; Webstorm; Xcode		
•••			
83395	<pre>Eclipse;IntelliJ;Notepad++;Sublime Text;Visual</pre>		
83403	Android Studio; Eclipse; IntelliJ; PyCharm; Visual		
83414	Eclipse;Notepad++;RStudio;Vis	sual Studio	
83422	IntelliJ;P	yCharm;Vim	
83433	Atom; IPython/Jupyter; Vim; Visual S	Studio Code	
	NEWCollabToolsWantToWorkWith	opSys \	
${\tt ResponseId}$			
8	Sublime Text; Visual Studio Code	e Linux-based	
40	NaN	Linux-based	
45	NaN	Linux-based	
54	PyCharm	n Linux-based	
83	PHPStorm; Webstorm; Xcode	e Windows	

•••	•••	•••
83395	Na	aN Windows
83403	Android Studio; Visual Studio Code; Xcoo	de MacOS
83414	Na	aN Windows
83422	Atom; IntelliJ; PyCharm; Vim; Webston	rm MacOS
83433	Na	aN MacOS
		NEWStuck \
ResponseId		
8	Visit Stack Overflow; Go for a walk or	other ph
40	Visit Stack Overflow; Go for a walk or	-
45	Call a coworker or frie	-
54	Visit Stack Overflow; Goog	•
83	Call a coworker or friend; Visit Stack	
	odii d coworker or irrend, vibro bodek	0 v 01 1 1 0 w
 83395	Visit Stack Overflow; Google it; Watch 1	heln / tu
83403	Call a coworker or friend; Visit Stack	•
83414	Call a coworker or friend; Visit Stack	
83422	Call a coworker or friend; Visit Stack	
83433	Visit Stack Overflow; Go for a walk or	
03433	VISIC Stack Over1110W, GO 101 a wark of	other bu
	NEWSOSites \	
ResponseId	WEMPORITES /	
8	Ctock Owenflow Ctock Evehonge	
40	Stack Overflow; Stack Exchange	
	Stack Overflow; Stack Exchange	
45	Stack Overflow	
54	Stack Overflow; Stack Exchange	
83	Stack Overflow	
83395	Stack Overflow; Stack Exchange	
83403	Stack Overflow	
83414	Stack Overflow	
83422	Stack Overflow; Stack Exchange	
83433	Stack Overflow; Stack Exchange	
	COVI - i+F CV	7.
D T -1	SOVisitFreq SO	JAccount \
ResponseId	W 21.1.2	
8	Multiple times per day	Yes
40	Multiple times per day	Yes
45	A few times per week	No
54	A few times per week	Yes
83	Daily or almost daily	Yes
83395	Daily or almost daily	Yes
83403	Multiple times per day	Yes
83414	Less than once per month or monthly	No
83422	Daily or almost daily	Yes

```
SOPartFreq \
ResponseId
            I have never participated in Q&A on Stack Over...
40
                               A few times per month or weekly
45
54
                               A few times per month or weekly
83
                               A few times per month or weekly
            I have never participated in Q&A on Stack Over...
83395
83403
            I have never participated in Q&A on Stack Over...
83414
                                                             NaN
83422
                                           A few times per week
83433
                                                             NaN
                      SOComm NEWOtherComms
                                                         Age Gender Trans
ResponseId
8
             No, not at all
                                       Yes
                                             18-24 years old
                                                                        No
                                                               Woman
40
                                             18-24 years old
              Yes, somewhat
                                       Yes
                                                               Woman
                                                                        No
45
                     Neutral
                                        No
                                             18-24 years old
                                                               Woman
                                                                        No
              Yes, somewhat
54
                                        No
                                             25-34 years old
                                                               Woman
                                                                        No
                                             18-24 years old
83
            Yes, definitely
                                        No
                                                               Woman
                                                                        No
83395
              Yes, somewhat
                                             25-34 years old Woman
                                        No
                                                                        No
83403
             No, not at all
                                             18-24 years old
                                                               Woman
                                                                        No
83414
             No, not really
                                        No
                                             35-44 years old
                                                               Woman
                                                                        No
83422
            Yes, definitely
                                        No
                                             35-44 years old
                                                               Woman
                                                                        No
                                             18-24 years old
83433
             No, not really
                                                               Woman
                                                                        No
                           Sexuality \
ResponseId
            Straight / Heterosexual
8
40
            Straight / Heterosexual
45
            Straight / Heterosexual
54
            Straight / Heterosexual
83
                            Bisexual
83395
                                 NaN
83403
                            Bisexual
83414
            Straight / Heterosexual
83422
            Straight / Heterosexual
83433
            Straight / Heterosexual
                                                      Ethnicity \
ResponseId
```

Daily or almost daily

No

83433

8

White or of European descent; Multiracial; South...

40	White or of European descent	
45	White or of European descent	
54	White or of European descent	
83	White or of European descent	
•••	•	
83395	Prefer not to say	
83403	East Asian	
83414	White or of European descent	
83422	White or of European descent	
83433	East Asian	
	Accessibility \	
ResponseId	,	
8	None of the above	
40	None of the above	
45	None of the above	
54	None of the above	
83	None of the above	
00	None of the above	
 83395	None of the above	
83403	None of the above	
83414	None of the above	
83422	None of the above	
83433	None of the above	
	Mantalliaalth	`
DognongoTd	MentalHealth	\
ResponseId 8	None of the above	
40		
45	I have a concentration and/or memory disorder	
54	None of the above	
	I have an anxiety disorder	
83	I have a concentration and/or memory disorder	
 0220E	December 100 100 100 100 100 100 100 100 100 10	
83395	Prefer not to say	
83403	None of the above	
83414	None of the above	
83422	None of the above	
83433	None of the above	
D T 1	SurveyLength SurveyEase	\
ResponseId	Annual de de la lace de lace de la lace de lace de lace de lace de lace de la lace de	
8	Appropriate in length Easy	
40	Appropriate in length Easy	
45	Appropriate in length Neither easy nor difficult	
54	Appropriate in length Easy	
83	Appropriate in length Easy	
•••		

```
83395
                          Too long
                                     Neither easy nor difficult
            Appropriate in length
83403
                                                            Easy
83414
            Appropriate in length
                                     Neither easy nor difficult
            Appropriate in length
                                     Neither easy nor difficult
83422
83433
            Appropriate in length
                                                            Easy
            ConvertedCompYearly
ResponseId
                             NaN
40
                             NaN
45
                             NaN
54
                             NaN
83
                             NaN
83395
                          9536.0
83403
                         18708.0
83414
                             NaN
83422
                         88474.0
83433
                         80169.0
```

[4120 rows x 47 columns]

3.3.2 Para aceder ao nível de educação das mulheres

```
[43]: answers.loc[answers["Gender"] == "Woman", "EdLevel"]
[43]: ResponseId
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      40
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      45
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      54
      83
                             Associate degree (A.A., A.S., etc.)
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83395
      83403
               Secondary school (e.g. American high school, G...
      83414
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      83422
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83433
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      Name: EdLevel, Length: 4120, dtype: object
```

3.3.3 Para aceder ao nível de educação das mulheres cuja idade está entre os 18 e os 24 anos

```
[44]: answers.loc[(answers["Gender"] == "Woman") & (answers["Age"] == "18-24 years_"
       →old"), "EdLevel"]
[44]: ResponseId
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      40
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      45
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      83
                             Associate degree (A.A., A.S., etc.)
      143
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83256
               Secondary school (e.g. American high school, G...
               Secondary school (e.g. American high school, G...
      83350
      83379
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      83403
               Secondary school (e.g. American high school, G...
      83433
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      Name: EdLevel, Length: 1282, dtype: object
```

3.3.4 Para aceder ao nível de educação das pessoas que são mulheres ou cuja idade está entre os 18 e os 24 anos

```
[45]: answers.loc[(answers["Gender"] == "Woman") | (answers["Age"] == "18-24 years⊔ →old"), "EdLevel"]
```

```
[45]: ResponseId
      2
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      3
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      6
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      8
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      22
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83427
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83432
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83433
      83436
               Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83439
                         Professional degree (JD, MD, etc.)
     Name: EdLevel, Length: 23831, dtype: object
```

3.3.5 Para aceder ao nível de educação das pessoas que não são mulheres e a cuja idade não está entre os 18 e os 24 anos

```
[46]: answers.loc[~((answers["Gender"] == "Woman") | (answers["Age"] == "18-24 years_\]
       →old")), "EdLevel"]
[46]: ResponseId
      1
               Secondary school (e.g. American high school, G...
      4
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
      5
      7
               Secondary school (e.g. American high school, G...
      9
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83431
                 Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83434
      83435
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      83437
               Secondary school (e.g. American high school, G...
      83438
                    Bachelor's degree (B.A., B.S., B.Eng., etc.)
      Name: EdLevel, Length: 59608, dtype: object
```

3.3.6 Para aceder ao país, às linguagens com que já trabalharam e à compensação total das pessoas cuja compensação total é superior a 70000\$

```
[47]: answers.loc[answers["CompTotal"] > 70000, ["Country", "LanguageHaveWorkedWith", User CompTotal"]]
```

```
[47]:
                                     Country \
      ResponseId
      13
                                     Germany
      25
                                     Germany
      27
                                 Switzerland
      30
                         Russian Federation
      37
                   United States of America
      83433
                                      Canada
      83434
                                      Brazil
      83435
                   United States of America
      83436
                                       Benin
      83438
                                      Canada
```

```
37
                                     Assembly; C; Java; Kotlin; Rust
                                                                      103000.0
                                                                      106000.0
83433
                                                              Ruby
                 Java; JavaScript; Kotlin; Objective-C; TypeScript
83434
                                                                       80000.0
                                              Clojure; Kotlin; SQL
83435
                                                                      160500.0
83436
                                                                      200000.0
83438
                           Bash/Shell; JavaScript; Node.js; Python
                                                                       90000.0
```

[22491 rows x 3 columns]

13

3.3.7 Para aceder às respostas cujo país toma o valor de Alemanha, Suiça ou Itália

I am a developer by profession

21	I am a developer by profession
25	I am a developer by profession
26	I am not primarily a developer, but I write co
27	I am not primarily a developer, but I write co
83329	I am a student who is learning to code
83337	I am a developer by profession
83414	I used to be a developer by profession, but no
83416	I am a developer by profession
83425	I am a developer by profession

	Employment	${\tt Country}$	\
ResponseId	l .		
13	Employed full-time	Germany	
21	Student, full-time	Germany	
25	Employed full-time	Germany	
26	Employed full-time	Germany	
27	Employed full-time	Switzerland	
•••		•••	
83329	Student, full-time	Italy	
83337	Independent contractor, freelancer, or self-em	Germany	
83414	Employed full-time	Germany	
83416	Employed full-time	Germany	
83425	Employed full-time	Germany	

US_State UK_Country \

ResponseId

```
13
                 NaN
                            NaN
21
                 NaN
                            NaN
25
                 NaN
                            NaN
26
                 NaN
                            NaN
27
                 NaN
                            NaN
83329
                            NaN
                 NaN
83337
                {\tt NaN}
                            NaN
83414
                 NaN
                            NaN
83416
                 NaN
                            NaN
83425
                 NaN
                            NaN
                                                         EdLevel
                                                                      Age1stCode \
ResponseId
13
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                                  11 - 17 years
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
21
                                                                  11 - 17 years
25
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                                  11 - 17 years
26
                    Other doctoral degree (Ph.D., Ed.D., etc.)
                                                                  25 - 34 years
27
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                                  11 - 17 years
83329
            Some college/university study without earning ... 11 - 17 years
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
83337
                                                                  11 - 17 years
83414
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
                                                                  18 - 24 years
              Master's degree (M.A., M.S., M.Eng., MBA, etc.)
83416
                                                                  11 - 17 years
83425
                  Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                       LearnCode YearsCode
ResponseId
13
                                        Other (please specify):
                                                                         15
21
                                               School; Colleague
                                                                        NaN
25
                                 School; Friend or family member
                                                                         26
26
                                   Coding Bootcamp; Online Forum
                                                                         12
27
                                        Other (please specify):
                                                                         14
83329
            Other online resources (ex: videos, blogs, etc...
                                                                       7
83337
            Other online resources (ex: videos, blogs, etc...
                                                                       16
83414
            Other online resources (ex: videos, blogs, etc...
                                                                        5
83416
            Other online resources (ex: videos, blogs, etc...
                                                                       33
83425
            Other online resources (ex: videos, blogs, etc...
                                                                       17
           YearsCodePro
                                                                       DevType \
ResponseId
13
                          Developer, desktop or enterprise applications; ...
                       6
21
                     NaN
25
                          Developer, front-end; Developer, desktop or ent...
                      18
26
                      12
                          Academic researcher; Database administrator; Sci...
                       5
27
                                       Academic researcher; Scientist; Student
```

```
83329
                     NaN
                                                                             NaN
83337
                        4
                           Developer, mobile; Developer, front-end; Develop...
                        3
83414
                                                       Other (please specify):
83416
                       22
                                                           Developer, back-end
83425
                       12
                           Developer, full-stack; Other (please specify):;...
                               OrgSize
                                                   Currency
                                                             CompTotal CompFreq
ResponseId
13
             1,000 to 4,999 employees
                                         EUR European Euro
                                                                71500.0
                                                                           Yearly
21
                                                        NaN
                                                                              NaN
                                   NaN
                                                                    NaN
25
             1,000 to 4,999 employees
                                         EUR European Euro
                                                                72000.0
                                                                           Yearly
26
                 100 to 499 employees
                                         EUR European Euro
                                                                    NaN
                                                                         Monthly
                                                                80000.0
27
             5,000 to 9,999 employees
                                          CHF\tSwiss franc
                                                                          Yearly
83329
                                   NaN
                                                        NaN
                                                                    NaN
                                                                              NaN
                                                                25000.0
83337
                     2 to 9 employees
                                         EUR European Euro
                                                                           Yearly
83414
                                                                    NaN
                                                                              NaN
83416
                 100 to 499 employees
                                         EUR European Euro
                                                                   65.0
                                                                           Yearly
83425
             10,000 or more employees
                                         EUR European Euro
                                                               120000.0
                                                                           Yearly
                                          LanguageHaveWorkedWith
ResponseId
13
                                            C;C++;Java;Perl;Ruby
21
                                                      Java; Python
             C++; HTML/CSS; Java; JavaScript; Kotlin; Node.js; Ty...
25
26
                                    HTML/CSS; Julia; Python; R; SQL
27
                                                       C++; Python
83329
                                                                 С
83337
             Assembly; Bash/Shell; C; Delphi; Haskell; HTML/CSS; ...
             Bash/Shell;C#;HTML/CSS;Java;JavaScript;Matlab;...
83414
83416
                                                        C;C#;Java
                      Bash/Shell;C;Go;Java;JavaScript;Perl;SQL
83425
                                          LanguageWantToWorkWith
ResponseId
13
                                                             Rust
21
                                                      Java; Python
25
             HTML/CSS; Java; JavaScript; Kotlin; Node.js; TypeSc...
26
                                     HTML/CSS; Julia; Python; R; SQL
27
                                              C++;Go; Java; Python
83329
                                               C;C++;Python;Rust
             Bash/Shell;C#;HTML/CSS;JavaScript;Node.js;PHP;...
83337
83414
                                                        Go; Python
                                                        C;C#;Java
83416
```

83425	Bash/Shell; Java; Rust; SQL	
ResponseId	DatabaseHaveWorkedWith	\
13 21 25 26 27	NaN MySQL;PostgreSQL DynamoDB;PostgreSQL PostgreSQL;SQLite NaN	
83329 83337 83414 83416 83425	NaN DynamoDB; MariaDB; Microsoft SQL Server; MongoDB; Microsoft SQL Server; MySQL; Oracle NaN MySQL	
	DatabaseWantToWorkWith \	
ResponseId 13 21 25 26 27	NaN MySQL;PostgreSQL PostgreSQL PostgreSQL NaN	
 83329 83337 83414 83416 83425	NaN DynamoDB; MariaDB; MySQL; SQLite NaN NaN PostgreSQL	
ResponseId	PlatformHaveWorkedWith	\
13 21 25 26 27	NaN AWS AWS;Heroku NaN NaN	
 83329 83337 83414 83416	NaN AWS;DigitalOcean;Google Cloud Platform;Microso AWS;Google Cloud Platform;Microsoft Azure NaN	
83425	AWS;DigitalOcean;Google Cloud Platform	
	PlatformWantToWorkWith \	
ResponseId 13	NaN	

21	NaN	
25	AWS; Heroku	
26	NaN	
27	NaN	
 83329	 NoN	
83337	NaN AWS	
83414	NaN	
83416	NaN	
83425	NaN	
ResponseId	WebframeHaveWorkedWith	\
13	Ruby on Rails	
21	Spring	
25	Angular; Express; Spring	
26	Django; jQuery	
27	NaN	
•••		
83329	NaN	
83337	Angular; Angular.js; ASP.NET; ASP.NET Core; Drupa	
83414	ASP.NET; ASP.NET Core ; jQuery	
83416	NaN	
83425	Angular.js;Spring;Vue.js	
	<pre>WebframeWantToWorkWith \</pre>	
ResponseId		
13	NaN	
21	Spring	
25	Angular; Express; Spring	
26 27	NaN NaN	
	NaN	
 83329	 NaN	
83337	Angular; Angular.js; jQuery; React.js; Symfony	
83414	Angular; Angular.js; React.js; Spring; Vue.js	
83416	NaN	
83425	Spring	
	${\tt MiscTechHaveWorkedWith} \backslash$	
ResponseId		
13	Qt	
21	NumPy; Pandas	
25	NaN	
26	NumPy; Pandas; TensorFlow	
27	NumPy; Pandas	
•••	•••	

```
83329
                                                           NaN
83337
             .NET Framework; .NET Core / .NET 5; React Native
                           .NET Framework; .NET Core / .NET 5
83414
                                                .NET Framework
83416
83425
                                                           NaN
              MiscTechWantToWorkWith
                                                          ToolsTechHaveWorkedWith \
ResponseId
13
                    NumPy; TensorFlow
                                                                                Git
21
                         NumPy; Pandas
                                                                                Git
25
                                   NaN
                                                            Docker; Git; Kubernetes
26
             NumPy; Pandas; TensorFlow
                                                                        Docker; Git
27
                                  NaN
                                                                        Docker: Git
83329
                                  NaN
                                                                                Git
83337
                         React Native
                                        Docker; Git; Kubernetes; Unreal Engine; Yarn
83414
                                  NaN
                                                                                NaN
83416
                       .NET Framework
                                                                                Git
83425
                                  NaN
                                                 Docker; Git; Kubernetes; Terraform
            ToolsTechWantToWorkWith
ResponseId
13
                  Docker; Kubernetes
21
25
              Docker; Git; Kubernetes
26
                                 Git
27
                          Docker; Git
83329
                                 Git
83337
                          Docker: Git
83414
                                 NaN
83416
83425
              Docker; Git; Kubernetes
                                    NEWCollabToolsHaveWorkedWith \
ResponseId
13
                                                               Vim
21
                                                 IntelliJ; PyCharm
25
                    Android Studio; IntelliJ; Visual Studio Code
26
                                                 Atom; RStudio; Vim
27
                                        IntelliJ; IPython/Jupyter
83329
                                              Visual Studio Code
83337
             Android Studio; Atom; Eclipse; IntelliJ; NetBeans; ...
83414
                       Eclipse; Notepad++; RStudio; Visual Studio
83416
                                         Notepad++; Visual Studio
83425
                                             IntelliJ; Neovim; Vim
```

NEWCollabToolsWantToWorkWith \ ResponseId 13 Vim; Visual Studio Code 21 IntelliJ; PyCharm 25 Android Studio; IntelliJ; Visual Studio Code 26 Atom; RStudio; Vim 27 IntelliJ; IPython/Jupyter 83329 Visual Studio Code 83337 PHPStorm; Visual Studio Code; Webstorm 83414 83416 Notepad++; Visual Studio 83425 IntelliJ; Neovim OpSys \ ResponseId 13 Linux-based 21 Windows 25 Linux-based 26 Linux-based 27 Linux-based 83329 Windows Subsystem for Linux (WSL) 83337 MacOS Windows 83414 83416 Windows 83425 MacOS NEWStuck \ ResponseId 13 Visit Stack Overflow; Google it; Watch help / tu... 21 Visit Stack Overflow; Google it Call a coworker or friend; Visit Stack Overflow... 25 26 Visit Stack Overflow; Go for a walk or other ph... 27 Visit Stack Overflow; Go for a walk or other ph... 83329 Visit Stack Overflow; Google it; Do other work a... Visit Stack Overflow; Go for a walk or other ph... 83337 83414 Call a coworker or friend; Visit Stack Overflow... 83416 Call a coworker or friend; Visit Stack Overflow... Call a coworker or friend; Visit Stack Overflow... 83425 NEWSOSites \ ResponseId Stack Overflow 13 21 Stack Overflow

25 26 27	Stack Overflow Stack Overflow;Stack Exchange Stack Overflow;Stack Exchange
83329 83337 83414	Stack Overflow; Stack Exchange Stack Overflow Stack Overflow
83416	Stack Overflow; Stack Exchange
83425	Stack Overflow; Stack Exchange
ResponseId	SOVisitFreq SOAccount \
13	Multiple times per day Yes
21	A few times per month or weekly Yes
25	Multiple times per day Yes
26	A few times per week Yes
27	Multiple times per day Yes
 83329	 A few times per week Yes
83337	Daily or almost daily No
83414	Less than once per month or monthly No
83416	Daily or almost daily Yes
83425	A few times per week Yes
ResponseId	SOPartFreq \
ResponseId	SOPartFreq \ Daily or almost daily
-	-
13	Daily or almost daily Less than once per month or monthly A few times per week
13 21 25 26	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly
13 21 25	Daily or almost daily Less than once per month or monthly A few times per week
13 21 25 26	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly
13 21 25 26 27 83329	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly
13 21 25 26 27 83329 83337	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN
13 21 25 26 27 83329 83337 83414	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN
13 21 25 26 27 83329 83337 83414 83416 83425	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId 13	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \ Yes, definitely No 25-34 years old
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId 13 21	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \ Yes, definitely No 25-34 years old Neutral No 25-34 years old
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId 13 21 25	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \ Yes, definitely No 25-34 years old Neutral No 25-34 years old Yes, somewhat No 35-44 years old
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId 13 21	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \ Yes, definitely No 25-34 years old Neutral No 25-34 years old Yes, somewhat No 35-44 years old Neutral No 35-44 years old
13 21 25 26 27 83329 83337 83414 83416 83425 ResponseId 13 21 25 26	Daily or almost daily Less than once per month or monthly A few times per week Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly NaN NaN Daily or almost daily Less than once per month or monthly SOComm NEWOtherComms Age \ Yes, definitely No 25-34 years old Neutral No 25-34 years old Yes, somewhat No 35-44 years old Neutral No 35-44 years old

```
83337
                    Not sure
                                        No 18-24 years old
             No, not really
83414
                                            35-44 years old
83416
              Yes, somewhat
                                            45-54 years old
83425
             No, not really
                                             25-34 years old
                                                         Gender \
ResponseId
                                                            Man
13
21
                                                            Man
25
                                                            Man
            Non-binary, genderqueer, or gender non-conforming
26
27
                                                            Man
83329
                                                            Man
83337
                                                            Man
83414
                                                          Woman
83416
                                                            Man
83425
                                                            Man
                         Trans
                                               Sexuality \
ResponseId
13
                                Straight / Heterosexual
                            No
21
                            No
                                                     NaN
25
                            No
                                Straight / Heterosexual
26
            Prefer not to say
                                                Bisexual
27
                            No
                                                     NaN
83329
                            No
                                Straight / Heterosexual
83337
                            No
                                Straight / Heterosexual
83414
                            No
                                Straight / Heterosexual
                                Straight / Heterosexual
83416
                            No
83425
                            No
                                Straight / Heterosexual
                                Ethnicity
                                                Accessibility \
ResponseId
13
            White or of European descent
                                           None of the above
21
            White or of European descent
                                                          NaN
25
            White or of European descent
                                            None of the above
26
            White or of European descent
                                            None of the above
27
            White or of European descent
                                            None of the above
83329
            White or of European descent
                                           None of the above
83337
            White or of European descent
                                           None of the above
83414
            White or of European descent
                                           None of the above
            White or of European descent
                                            None of the above
83416
83425
            White or of European descent
                                            None of the above
```

	MentalHealth	${ t SurveyLength}$	\
ResponseId			
13	Prefer not to say	Appropriate in length	
21	NaN	Too long	
25	None of the above	Appropriate in length	
26	I have an anxiety disorder	Appropriate in length	
27	None of the above	Appropriate in length	
	•••	•••	
83329	None of the above	Appropriate in length	
83337	None of the above	Appropriate in length	
83414	None of the above	Appropriate in length	
83416	None of the above	Appropriate in length	
83425	Or, in your own words:	Appropriate in length	
	SurveyEase	${\tt ConvertedCompYearly}$	
ResponseId			
13	Easy	77290.0	
21	Easy	NaN	
25	Easy	77831.0	
26	Neither easy nor difficult	NaN	
27	Easy	81319.0	
•••	•••		
83329	Easy	NaN	
83337	Neither easy nor difficult	27025.0	
83414	Neither easy nor difficult	NaN	
83416	Easy	70.0	
83425	Easy	129718.0	

[8213 rows x 47 columns]

83432

3.3.8 Para aceder às respostas cujo campo com as linguagens com que já trabalharam inclui Python

```
[49]: answers.loc[answers["LanguageHaveWorkedWith"].str.contains("Python", na =__
       →False), "LanguageHaveWorkedWith"]
[49]: ResponseId
      2
                                                 JavaScript; Python
      3
                                          Assembly; C; Python; R; Rust
      5
                                   Bash/Shell; HTML/CSS; Python; SQL
               C;C#;C++;HTML/CSS;Java;JavaScript;Node.js;Powe...
      6
                                                        C++;Python
      10
      83430
                           HTML/CSS;PHP;PowerShell;Python;SQL;VBA
                      APL;Clojure;LISP;Python;Ruby;SQL;TypeScript
      83431
```

C#;Dart;HTML/CSS;Java;JavaScript;Kotlin;Node.j...

```
83437 Groovy; Java; Python
83438 Bash/Shell; JavaScript; Node.js; Python
Name: LanguageHaveWorkedWith, Length: 39792, dtype: object
```

3.4 Alterar linhas e colunas

3.4.1 Para alterar os rótulos das colunas

```
[50]: students_df.columns = ["university course", "full name", "id"]
[51]: students_df
[51]:
       university course
                                     full name
                                                   id
                 Direito Francisco Gonçalves 76433
                                  Carlos Costa 78944
      1
                 Biologia
      2
              Arquitetura
                                 Maria Almeida 74822
[52]: students_df.rename(columns={"university course": "course", "full name": "name", __
       →"id": "number"}, inplace = True)
[53]: students_df
[53]:
              course
                                     name number
      0
            Direito Francisco Gonçalves
                                            76433
                             Carlos Costa
                                            78944
      1
            Biologia
      2 Arquitetura
                            Maria Almeida
                                            74822
[54]: students_df.columns = [x.upper() for x in students_df.columns]
[55]: students df
[55]:
              COURSE
                                     NAME NUMBER
            Direito Francisco Gonçalves
      0
                                            76433
                             Carlos Costa
      1
            Biologia
                                            78944
      2 Arquitetura
                            Maria Almeida
                                            74822
     3.4.2 Para alterar a informação do terceiro aluno
[56]: students_df.loc[2] = ["Medicina", "Fabiana Silva", "74877"]
[57]: students_df
[57]:
           COURSE
                                  NAME NUMBER
          Direito Francisco Gonçalves 76433
```

```
1 Biologia Carlos Costa 78944
2 Medicina Fabiana Silva 74877
```

3.4.3 Para alterar o nome do terceiro aluno

```
[58]: students_df.loc[2, "NAME"] = "Guilherme Costa"
[59]: students_df
[59]:
           COURSE
                                  NAME NUMBER
         Direito Francisco Gonçalves 76433
      1 Biologia
                          Carlos Costa 78944
      2 Medicina
                       Guilherme Costa 74877
[60]: students_df.at[2, "NAME"] = "Fabiana Silva"
[61]: students_df
[61]:
           COURSE
                                  NAME NUMBER
         Direito Francisco Gonçalves
                                       76433
      1 Biologia
                         Carlos Costa
                                       78944
      2 Medicina
                         Fabiana Silva 74877
     3.4.4 Para alterar o curso e o número do terceiro aluno
[62]: students_df.loc[2, ["COURSE", "NUMBER"]] = ["Arqueologia", "76877"]
[63]: students_df
[63]:
             COURSE
                                     NAME NUMBER
            Direito Francisco Gonçalves 76433
      0
           Biologia
                             Carlos Costa 78944
      1
      2 Arqueologia
                           Fabiana Silva 76877
     3.4.5 Para alterar todos os números cujo valor seja 76877
[64]: students_df.loc[students_df["NUMBER"] == "76877", "NUMBER"] = 76855
[65]: students_df
[65]:
             COURSE
                                     NAME NUMBER
      0
            Direito Francisco Gonçalves 76433
      1
                             Carlos Costa 78944
           Biologia
```

2 Arqueologia Fabiana Silva 76855

3.4.6 Para passar todos os cursos para minúsculas

[68]: 0 19 1 12 2 13 Name: NAME, dtype: int64

3.4.8 Para visualizar o número de valores em cada linha

3.4.9 Para colocar o prefixo em todos os números

```
1 biologia Carlos Costa pg78944
2 arqueologia Fabiana Silva pg76855
```

8

11

1

12

13

5

5

3.4.10 Para retirar o prefixo de todos os números

```
[73]: students_df["NUMBER"] = students_df["NUMBER"].apply(lambda x: x[2:])
[74]: students_df
              COURSE
[74]:
                                     NAME NUMBER
             direito
                     Francisco Gonçalves 76433
      1
            biologia
                             Carlos Costa 78944
      2 arqueologia
                            Fabiana Silva 76855
     3.4.11 Para visualizar o mínimo de todas as colunas
[75]: students_df.apply(pd.Series.min)
[75]: COURSE
                 arqueologia
     NAME
                Carlos Costa
     NUMBER
                       76433
      dtype: object
[76]: students_df.apply(lambda x: x.min())
[76]: COURSE
                 arqueologia
     NAME
                Carlos Costa
     NUMBER
                       76433
     dtype: object
     3.4.12 Para aceder ao comprimento de todos os valores do DataFrame
[77]: students_df.applymap(len)
[77]:
         COURSE
                NAME
                       NUMBER
      0
              7
                   19
                            5
```

3.4.13 Para alterar os nomes Francisco Gonçalves e Carlos Costa

```
[78]: students_df["NAME"].map({"Francisco Gonçalves": "Francisco", "Carlos Costa": [

¬"Carlos"})
[78]: 0
           Francisco
      1
              Carlos
      2
                 NaN
      Name: NAME, dtype: object
[79]: | students_df["NAME"] = students_df["NAME"].replace({"Francisco Gonçalves": __
       →"Francisco", "Carlos Costa": "Carlos"})
[80]: students_df
[80]:
              COURSE
                               NAME NUMBER
      0
             direito
                          Francisco 76433
      1
            biologia
                             Carlos 78944
      2 arqueologia Fabiana Silva 76855
          Adicionar/remover linhas e colunas
     3.5
     3.5.1 Para criar uma nova coluna que vai ter o nome e o número separados por um
           hífen
[81]: students df["NAME NUMBER"] = students df["NAME"] + " - " + students df["NUMBER"]
[82]: students_df
[82]:
              COURSE
                               NAME NUMBER
                                                      NAME_NUMBER
      0
             direito
                          Francisco 76433
                                                Francisco - 76433
                                                   Carlos - 78944
                             Carlos 78944
      1
            biologia
      2 arqueologia Fabiana Silva 76855 Fabiana Silva - 76855
     3.5.2 Para eliminar colunas
[83]: students_df.drop(columns = ["NAME", "NUMBER"], inplace = True)
[84]:
     students_df
[84]:
              COURSE
                                NAME NUMBER
      0
             direito
                          Francisco - 76433
            biologia
                             Carlos - 78944
      1
      2 arqueologia Fabiana Silva - 76855
```

3.5.3 Para criar duas novas colunas que vão ter a parte antes do hífen e a parte depois do hífen da coluna $NAME_NUMBER$

```
[85]: students_df[["NAME", "NUMBER"]] = students_df["NAME_NUMBER"].str.split(" - ",__
       →expand = True)
[86]: students df
[86]:
             COURSE
                                NAME NUMBER
                                                      NAME NUMBER
                          Francisco - 76433
            direito
                                                 Francisco 76433
      1
           biologia
                             Carlos - 78944
                                                    Carlos 78944
      2 arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
     3.5.4 Para adicionar uma nova linha
[87]: students_df.append({"NAME": "Rui"}, ignore_index = True)
[87]:
             COURSE
                                NAME_NUMBER
                                                      NAME NUMBER
      0
            direito
                          Francisco - 76433
                                                 Francisco 76433
           biologia
                             Carlos - 78944
                                                    Carlos 78944
      1
      2 arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
      3
                 NaN
                                                       Rui
                                        NaN
                                                              NaN
     3.5.5 Para adicionar um novo DataFrame
[88]: new_students = {
          "NAME": ["Vitor", "Joana", "Ricardo"],
          "NUMBER": [76133, 78144, 74122],
          "COURSE": ["Marketing", "Marketing", "Marketing"]
      }
[89]: new_students_df = pd.DataFrame(new_students)
[90]: new students df
[90]:
            NAME NUMBER
                             COURSE
                  76133 Marketing
           Vitor
      0
```

[91]: students_df = students_df.append(new students_df, ignore_index = True)

1

[92]: students df

Joana

2 Ricardo

78144 Marketing

74122 Marketing

```
[92]:
              COURSE
                                NAME_NUMBER
                                                       NAME NUMBER
      0
             direito
                          Francisco - 76433
                                                  Francisco 76433
      1
            biologia
                             Carlos - 78944
                                                     Carlos 78944
      2
         arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
           Marketing
      3
                                                      Vitor 76133
                                        NaN
      4
           Marketing
                                        NaN
                                                      Joana 78144
      5
           Marketing
                                        NaN
                                                    Ricardo 74122
```

3.5.6 Para eliminar a sexta linha

```
[93]: students_df.drop(index = 5)

[93]: COURSE NAME NUMBER NAME NUMBER
```

	0001001			
0	direito	Francisco - 76433	Francisco	76433
1	biologia	Carlos - 78944	Carlos	78944
2	arqueologia	Fabiana Silva - 76855	Fabiana Silva	76855
3	Marketing	NaN	Vitor	76133
4	Marketing	NaN	Joana	78144

3.5.7 Para eliminar as linhas onde o nome toma o valor de Carlos

```
[94]: students_df.drop(index = students_df[students_df["NAME"] == "Carlos"].index)
```

```
[94]:
              COURSE
                                NAME_NUMBER
                                                       NAME NUMBER
      0
                          Francisco - 76433
             direito
                                                  Francisco 76433
         arqueologia Fabiana Silva - 76855
                                             Fabiana Silva
                                                            76855
                                                      Vitor 76133
      3
           Marketing
                                        NaN
                                                      Joana 78144
      4
           Marketing
                                        NaN
      5
           Marketing
                                        NaN
                                                    Ricardo 74122
```

3.6 Ordenar dados

3.6.1 Para ordenar os valores da coluna NAME

```
[95]: students_df["NAME"].sort_values()
```

```
[95]: 1 Carlos
2 Fabiana Silva
0 Francisco
4 Joana
5 Ricardo
3 Vitor
```

Name: NAME, dtype: object

3.6.2 Para ordenar os valores segundo o curso

```
[96]: students_df.sort_values(by="COURSE")
[96]:
              COURSE
                                NAME_NUMBER
                                                      NAME NUMBER
      3
           Marketing
                                        NaN
                                                      Vitor 76133
      4
           Marketing
                                        NaN
                                                      Joana 78144
      5
           Marketing
                                                   Ricardo 74122
                                        NaN
         arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
            biologia
                             Carlos - 78944
                                                    Carlos 78944
      1
      0
             direito
                          Francisco - 76433
                                                 Francisco 76433
```

3.6.3 Para ordenar os valores por ordem decrescente segundo o curso

```
[97]: students_df.sort_values(by="COURSE", ascending = False)
[97]:
              COURSE
                                                       NAME NUMBER
                                NAME NUMBER
      0
             direito
                          Francisco - 76433
                                                  Francisco 76433
                             Carlos - 78944
            biologia
                                                     Carlos 78944
      1
      2
        arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
           Marketing
                                                      Vitor 76133
      3
                                        NaN
           Marketing
                                                      Joana 78144
      4
                                        NaN
      5
           Marketing
                                        NaN
                                                    Ricardo 74122
```

3.6.4 Para ordenar os valores por ordem decrescente segundo o curso e, depois, segundo o nome

```
[98]: students_df.sort_values(by=["COURSE", "NAME"], ascending = False)
[98]:
              COURSE
                                NAME NUMBER
                                                      NAME NUMBER
      0
             direito
                          Francisco - 76433
                                                 Francisco 76433
                             Carlos - 78944
                                                    Carlos 78944
      1
           biologia
      2
        arqueologia Fabiana Silva - 76855 Fabiana Silva 76855
           Marketing
                                                     Vitor 76133
      3
                                        NaN
                                                   Ricardo 74122
      5
           Marketing
                                        NaN
      4
           Marketing
                                                     Joana 78144
                                        NaN
```

3.6.5 Para ordenar os valores por ordem decrescente segundo o curso e, depois, por ordem crescente segundo o nome

```
[99]: students_df.sort_values(by=["COURSE", "NAME"], ascending = [False, True], 

→inplace = True)
```

```
[100]: students_df
[100]:
               COURSE
                                  NAME_NUMBER
                                                         NAME NUMBER
       0
                            Francisco - 76433
              direito
                                                   Francisco
                                                               76433
                               Carlos - 78944
       1
             biologia
                                                      Carlos
                                                               78944
       2
                       Fabiana Silva - 76855
                                               Fabiana Silva
          arqueologia
                                                               76855
       4
            Marketing
                                                        Joana
                                                              78144
                                          NaN
       5
            Marketing
                                          NaN
                                                     Ricardo
                                                              74122
       3
                                                       Vitor 76133
            Marketing
                                          NaN
      3.6.6 Para ordenar os valores segundo o índice
[101]: students_df.sort_index()
[101]:
               COURSE
                                  NAME_NUMBER
                                                         NAME NUMBER
       0
              direito
                           Francisco - 76433
                                                   Francisco
                                                              76433
       1
             biologia
                               Carlos - 78944
                                                      Carlos
                                                               78944
                                               Fabiana Silva
       2
          arqueologia
                       Fabiana Silva - 76855
                                                               76855
       3
            Marketing
                                                        Vitor
                                                               76133
                                          NaN
       4
            Marketing
                                          NaN
                                                        Joana 78144
            Marketing
                                                     Ricardo 74122
       5
                                          NaN
      3.6.7 Para visualizar os tipos das colunas
[102]:
      students_df.dtypes
[102]: COURSE
                      object
                      object
       NAME_NUMBER
       NAME
                      object
       NUMBER
                      object
       dtype: object
      3.6.8 Para alterar o tipo da coluna NUMBER
[103]: students_df["NUMBER"] = students_df["NUMBER"].astype(int)
      3.6.9 Para aceder aos 4 maiores valores da coluna NUMBER
[104]: students_df["NUMBER"].nlargest(4)
[104]: 1
            78944
```

78144

4

2 76855

0 76433

Name: NUMBER, dtype: int64

3.6.10 Para aceder às linhas com os 4 majores valores da coluna NUMBER

[105]: students_df.nlargest(4,"NUMBER")

COURSE [105]: NAME_NUMBER NAME NUMBER 1 biologia Carlos - 78944 Carlos 78944 4 Marketing Joana 78144 NaN 2 arqueologia Fabiana Silva - 76855 Fabiana Silva 76855 0 direito Francisco - 76433 Francisco 76433

3.6.11 Para aceder aos 4 menores valores da coluna NUMBER

[106]: students_df["NUMBER"].nsmallest(4)

[106]: 5 74122

3 76133

0 76433

2 76855

Name: NUMBER, dtype: int64

3.6.12 Para aceder às linhas com os 4 menores valores da coluna NUMBER

[107]: students_df.nsmallest(4,"NUMBER")

[107]: COURSE NAME_NUMBER NAME NUMBER 5 Marketing NaN Ricardo 74122 3 Marketing NaN Vitor 76133 direito Francisco - 76433 0 Francisco 76433 arqueologia Fabiana Silva - 76855 Fabiana Silva 76855

3.7 Agrupar e agregar

3.7.1 Para obter a mediana de todas as colunas com valores numéricos

[108]: answers.median()

[108]: CompTotal 67000.0 ConvertedCompYearly 56211.0 dtype: float64

3.7.2 Para obter a mediana da coluna CompTotal

```
[109]: answers["CompTotal"].median()
[109]: 67000.0
```

3.7.3 Para obter medidas de tendência e dispersão

```
[110]: answers.describe()
[110]:
                 CompTotal
                             ConvertedCompYearly
       count 4.718300e+04
                                    4.684400e+04
       mean
              2.119407e+69
                                    1.184262e+05
       std
              4.603702e+71
                                    5.272944e+05
              0.000000e+00
                                    1.000000e+00
       min
       25%
              1.600000e+04
                                    2.702500e+04
       50%
              6.700000e+04
                                    5.621100e+04
       75%
              1.400000e+05
                                    1.000000e+05
              1.000000e+74
                                    4.524131e+07
       max
```

3.7.4 Para obter o número de valores não nulos da coluna CompTotal

```
[111]: answers["CompTotal"].count()
[111]: 47183
```

3.7.5 Para obter o número de pessoas que responderam às diferentes opções da questão SurveyEase

```
[112]: answers["SurveyEase"].value_counts()

[112]: Easy 63087
   Neither easy nor difficult 18091
   Difficult 770
   Name: SurveyEase, dtype: int64
```

3.7.6 Para obter a percentagem de pessoas que responderam às diferentes opções da questão SurveyEase

```
[113]: answers["SurveyEase"].value counts(normalize = True)
[113]: Easy
                                     0.769842
      Neither easy nor difficult
                                     0.220762
      Difficult
                                     0.009396
      Name: SurveyEase, dtype: float64
      3.7.7 Para agrupar os valores pelo país
[114]:
      country_group = answers.groupby(["Country"])
      3.7.8 Para obter os valores cujo país é Estados Unidos da América
[115]: country_group.get_group("United States of America")
[115]:
                                               MainBranch \
       ResponseId
                   I am a student who is learning to code
       7
                              I code primarily as a hobby
                   I am a student who is learning to code
       16
       37
                           I am a developer by profession
       38
                           I am a developer by profession
                           I am a developer by profession
       83428
                              I code primarily as a hobby
       83430
       83431
                           I am a developer by profession
                           I am a developer by profession
       83435
       83437
                           I am a developer by profession
                                           Employment
                                                                         Country \
       ResponseId
                                   Student, part-time
                                                       United States of America
       7
                                  I prefer not to say
                                                       United States of America
                                   Student, full-time
       16
                                                       United States of America
       37
                                   Employed full-time United States of America
       38
                                   Employed full-time United States of America
       83428
                                   Employed full-time United States of America
       83430
                   Not employed, but looking for work United States of America
                                   Employed full-time United States of America
       83431
                                   Employed full-time United States of America
       83435
```

6

```
US_State UK_Country \
ResponseId
                          Georgia
6
                                         NaN
7
                   New Hampshire
                                         NaN
                        Missouri
                                         NaN
16
37
            District of Columbia
                                         NaN
38
                   Massachusetts
                                         NaN
83428
                    Pennsylvania
                                         NaN
83430
                      Washington
                                         NaN
83431
                        Illinois
                                         NaN
83435
                            Texas
                                         NaN
83437
                      New Jersey
                                         NaN
                                                        EdLevel
                                                                    Age1stCode \
ResponseId
6
                 Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
7
            Secondary school (e.g. American high school, G... 11 - 17 years
            Secondary school (e.g. American high school, G...
16
                                                                5 - 10 years
37
                 Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
38
            Some college/university study without earning ... 18 - 24 years
                 Bachelor's degree (B.A., B.S., B.Eng., etc.)
83428
                                                                 11 - 17 years
83430
                 Bachelor's degree (B.A., B.S., B.Eng., etc.)
                                                                 18 - 24 years
              Master's degree (M.A., M.S., M.Eng., MBA, etc.) 11 - 17 years
83431
83435
                 Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
83437
            Secondary school (e.g. American high school, G... 11 - 17 years
                                                      LearnCode YearsCode \
ResponseId
            Other online resources (ex: videos, blogs, etc...
6
                                                                    NaN
7
            Other online resources (ex: videos, blogs, etc...
16
                                       Other (please specify):
                                                                        7
            Other online resources (ex: videos, blogs, etc...
37
                                                                      8
38
              Other online resources (ex: videos, blogs, etc)
                                                                       20
83428
            Other online resources (ex: videos, blogs, etc...
                                                                     13
              Other online resources (ex: videos, blogs, etc)
83430
                                                                        6
            Other online resources (ex: videos, blogs, etc...
                                                                     23
83431
83435
            Other online resources (ex: videos, blogs, etc...
                                                                      6
83437
                                                         School
                                                                       10
                YearsCodePro
ResponseId
```

NaN

```
7
                           NaN
16
                           NaN
37
            Less than 1 year
38
                            15
                             2
83428
83430
                           NaN
83431
                            21
                             5
83435
83437
                             4
                                                          DevType \
ResponseId
6
                                                              NaN
7
                                                              NaN
16
                                                              NaN
37
                   Developer, embedded applications or devices
38
                                             Developer, back-end
83428
            Developer, front-end; Developer, desktop or ent...
83430
                                Other (please specify):;Student
            Developer, front-end; Developer, full-stack; Dev...
83431
83435
                                             Developer, back-end
83437
            Data scientist or machine learning specialist;...
                               OrgSize
                                                           Currency
                                                                     CompTotal \
ResponseId
6
                                   NaN
                                                                NaN
                                                                            NaN
7
                                   NaN
                                                                NaN
                                                                            NaN
16
                                   NaN
                                                                NaN
                                                                            NaN
37
                   20 to 99 employees
                                        USD\tUnited States dollar
                                                                       103000.0
38
             1,000 to 4,999 employees
                                                                       300000.0
                                        USD\tUnited States dollar
                                                                        86000.0
83428
             1,000 to 4,999 employees
                                        USD\tUnited States dollar
83430
                                                                            NaN
83431
                   10 to 19 employees
                                        USD\tUnited States dollar
                                                                       125000.0
83435
                   20 to 99 employees
                                        USD\tUnited States dollar
                                                                       160500.0
83437
             10,000 or more employees
                                        USD\tUnited States dollar
                                                                         1800.0
            CompFreq
                                                   LanguageHaveWorkedWith \
ResponseId
6
                      C; C#; C++; HTML/CSS; Java; JavaScript; Node.js; Powe...
7
                 NaN
                                                      HTML/CSS; JavaScript
16
                 NaN
                                                         Bash/Shell; Python
37
                                              Assembly; C; Java; Kotlin; Rust
              Yearly
              Yearly
                                                                         Go
38
```

83428 83430 83431 83435 83437	Weekly NaN Yearly Yearly Weekly	Java;Python HTML/CSS;PHP;PowerShell;Python;SQL;VBA APL;Clojure;LISP;Python;Ruby;SQL;TypeScript Clojure;Kotlin;SQL Groovy;Java;Python
ResponseId 6 7 16 37 38	C#;C++;Go;H	LanguageWantToWorkWith \ TML/CSS; Java; JavaScript; Node.js; Obj HTML/CSS; JavaScript; PHP Bash/Shell; Python Assembly; Kotlin; Rust; SQL Go; Rust
 83428 83430 83431 83435 83437	C#;Go;HTML/0	 C#;Java;Python CSS;Java;JavaScript;PHP;Python;SQL;VBA APL;Clojure;Haskell;LISP;R Clojure Java;Python
ResponseId 6 7 16 37 38		DatabaseHaveWorkedWith \ MySQL;PostgreSQL;SQLite NaN NaN NaN NaN NaN
 83428 83430 83431 83435 83437	DynamoDB;Ela	NaN MongoDB;MySQL;PostgreSQL MongoDB;MySQL;PostgreSQL;Redis Oracle;SQLite asticsearch;MongoDB;PostgreSQL;Redis
ResponseId 6 7 16 37 38	Elasticsear	DatabaseWantToWorkWith \ ch;Firebase;IBM DB2;MariaDB;Microso NaN NaN NaN NaN NaN
 83428 83430 83431 83435 83437	MariaDB;Mic	 NaN rosoft SQL Server;MongoDB;MySQL;Pos PostgreSQL SQLite DynamoDB;Redis

	${\tt PlatformHaveWorkedWith}$	\
ResponseId 6 7	NaN NaN	
16	NaN	
37	NaN	
38	AWS;Google Cloud Platform;Microsoft Azure	
 83428	 NaN	
83430	Heroku	
83431	AWS;DigitalOcean;Google Cloud Platform;Heroku	
83435	AWS	
83437	AWS;Google Cloud Platform	
	PlatformWantToWorkWi	th \
ResponseId		
6		aN
7		aN
16		aN
37		aN
38	N	aN
	 17	- NT
83428 83430		aN
83431	AWS; Heroku; IBM Cloud or Watson; Microsoft Azure AWS; DigitalOcean; Google Cloud Platfo	
83435		WS
83437		WS
	WebframeHaveWorkedWith \	
ResponseId		
6	<pre>Express;Flask;jQuery;React.js</pre>	
7	jQuery	
16	NaN	
37	NaN	
38	NaN	
•••	***	
83428	Angular; Flask	
83430	Django;Flask;jQuery	
83431	Django;React.js;Ruby on Rails	
83435	NaN	
83437	FastAPI;Flask	
	WebframeWantToWorkWi	th \
ResponseId	_	
6	Express; Flask; jQuery; React.	-
7	jQue	ry

```
16
                                                              NaN
37
                                                              NaN
38
                                                              NaN
83428
                                                          Angular
83430
             Angular.js; ASP.NET; ASP.NET Core ; Django; FastAP...
83431
83435
                                                              NaN
                                                   FastAPI;Flask
83437
                                   MiscTechHaveWorkedWith \
ResponseId
             Keras;NumPy;Pandas;TensorFlow;Torch/PyTorch
7
                                                        NaN
16
                                                        NaN
37
                                                        NaN
38
                                                        NaN
83428
                                                        NaN
83430
                                              NumPy; Pandas
83431
                                                        NaN
83435
                                                        NaN
83437
                                Hadoop;Keras;NumPy;Pandas
                                          MiscTechWantToWorkWith \
ResponseId
             Keras;NumPy;Pandas;Qt;React Native;TensorFlow;...
7
                                                              NaN
16
                                                              NaN
37
                                                              NaN
38
                                                              NaN
83428
                                                              NaN
83430
                .NET Framework; .NET Core / .NET 5; NumPy; Pandas
83431
83435
                                                              NaN
83437
             Apache Spark; Hadoop; Keras; NumPy; Pandas; TensorFlow
                    ToolsTechHaveWorkedWith
                                                          ToolsTechWantToWorkWith \
ResponseId
                                               Docker; Git; Unity 3D; Unreal Engine
                                          Git
7
                                          NaN
                                                                                NaN
16
                                          Git
                                                                                Git
37
                                  Docker; Git
                                                                                Git
38
                       Docker; Git; Terraform
                                                                     Git;Terraform
             Ansible; Git; Terraform; Unity 3D
                                                  Ansible; Git; Terraform; Unity 3D
83428
```

```
83430
                                          Git
                                                                Docker; Git; Xamarin
83431
                                  Docker; Git
                                                   Docker; Git; Kubernetes; Unity 3D
83435
                                  Docker; Git
                                                                    Git: Kubernetes
83437
               Ansible; Docker; Git; Terraform
                                                  Docker; Git; Kubernetes; Terraform
                                   NEWCollabToolsHaveWorkedWith \
ResponseId
6
             IPython/Jupyter;Notepad++;PyCharm;Sublime Text...
7
                                                               NaN
16
                                                 Emacs; Neovim; Vim
37
                                       IntelliJ;PyCharm;Webstorm
38
                                          Vim; Visual Studio Code
83428
             Eclipse;IntelliJ;NetBeans;Sublime Text;Visual ...
                Atom; Notepad++; Sublime Text; Visual Studio Code
83430
83431
                                                        Emacs; Vim
83435
                  IntelliJ; Sublime Text; Vim; Visual Studio Code
83437
             Android Studio; Eclipse; IntelliJ; IPython/Jupyte...
                                   NEWCollabToolsWantToWorkWith
                                                                           OpSys \
ResponseId
             Android Studio; IPython/Jupyter; Vim; Visual Stud...
6
                                                                      Windows
7
                                                               NaN
                                                                        Windows
16
                                                       Neovim: Vim Linux-based
37
             Android Studio; IntelliJ; PyCharm; Sublime Text; W... Linux-based
38
                                          Vim; Visual Studio Code
                                                                           MacOS
83428
                       IntelliJ;Sublime Text;Visual Studio Code
                                                                        Windows
83430
                Atom; Notepad++; Sublime Text; Visual Studio Code
                                                                        Windows
83431
                                                                    Linux-based
                                                             Emacs
83435
                                                 Sublime Text; Vim
                                                                          MacOS
                         IntelliJ; IPython/Jupyter; Notepad++; Vim
83437
                                                                        Windows
                                                         NEWStuck \
ResponseId
6
             Visit Stack Overflow; Go for a walk or other ph...
7
             Call a coworker or friend; Visit Stack Overflow...
16
             Call a coworker or friend; Visit Stack Overflow...
37
             Visit Stack Overflow; Google it; Do other work a...
             Google it; Do other work and come back later; Me...
38
83428
             Call a coworker or friend; Visit Stack Overflow...
             Visit Stack Overflow; Google it; Watch help / tu...
83430
83431
             Call a coworker or friend; Visit Stack Overflow...
83435
                            Call a coworker or friend; Google it
83437
             Call a coworker or friend; Visit Stack Overflow...
```

ResponseId		NEWSOSites	SOVisitFreq \
Stack Overflow; Stack Exchange	${\tt ResponseId}$		
16	6	_	
Stack Overflow; Stack Exchange Daily or almost daily	7	Stack Overflow	W Daily or almost daily
Stack Overflow; Stack Exchange	16	Stack Overflow; Stack Exchange	e Multiple times per day
### 33428	37	Stack Overflow; Stack Exchange	e Daily or almost daily
Stack Overflow; Stack Exchange	38	Stack Overflow; Stack Exchange	e Daily or almost daily
Stack Overflow; Stack Exchange	•••		•••
## Stack Overflow; Stack Exchange	83428	G .	
Stack Overflow; Stack Exchange	83430	Stack Overflow; Stack Exchange	e A few times per month or weekly
SOAccount SOAc	83431	_	-
SOAccount ResponseId	83435	9	-
ResponseId 6	83437	Stack Overflow; Stack Exchange	A few times per week
Yes 37		SOAccount \	
7	ResponseId		
16	6	Yes	
37	7	Yes	
### 338	16	Yes	
## ## ## ## ## ## ## ## ## ## ## ## ##	37	Yes	
83430	38	Yes	
83430	•••		
83431	83428	Yes	
83435	83430	Not sure/can't remember	
SOPartFreq Ness	83431	No	
ResponseId 6	83435	No	
ResponseId 6	83437	Yes	
ResponseId 6			CODe wh Free a
I have never participated in Q&A on Stack Over A few times per week Less than once per month or monthly A few times per week Baily or almost daily A few times per month or weekly A few times per week	ResponseTd		Supartreq \
A few times per week Less than once per month or monthly A few times per week Baily or almost daily A few times per month or weekly A few times per week A few times per w	-	I have never participated in	Ohl on Stack Over
Less than once per month or monthly A few times per week Daily or almost daily A few times per month or weekly A few times per week A few		I have hever participated in	
A few times per week Baily or almost daily A few times per month or weekly A few times per week		less than once	-
Daily or almost daily Daily or almost daily A few times per month or weekly NaN NaN NaN NaN NaN NaN NaN N		Hebb than thee	•
		ī	-
A few times per month or weekly 83430		•	
83430 NaN 83431 NaN 83435 NaN 83437 I have never participated in Q&A on Stack Over SOComm NEWOtherComms Age \ ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say		A few times	s per month or weekly
83431 NaN 83435 NaN 83437 I have never participated in Q&A on Stack Over SOComm NEWOtherComms Age \ ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say		n row ormov	-
83435 NaN 83437 I have never participated in Q&A on Stack Over SOComm NEWOtherComms Age \ ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say			
83437 I have never participated in Q&A on Stack Over SOComm NEWOtherComms Age \ ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say			
SOComm NEWOtherComms Age \ ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say		I have never participated in	
ResponseId 6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say	30 - 0 .	parototpassa in	
6 Yes, somewhat No 18-24 years old 7 Yes, somewhat No Prefer not to say		SOComm NEWOtherComms	Age \
7 Yes, somewhat No Prefer not to say	${\tt ResponseId}$		
·	6	Yes, somewhat No	o 18-24 years old
Neutral No Under 18 years old	7	Yes, somewhat No	Prefer not to say
	16	Neutral No	Under 18 years old

```
37
              Yes, somewhat
                                        Yes
                                                18-24 years old
38
            Yes, definitely
                                                35-44 years old
                                         No
83428
              Yes, somewhat
                                         No
                                                25-34 years old
83430
              Yes, somewhat
                                                25-34 years old
                                         No
83431
             No, not really
                                                45-54 years old
                                         No
             No, not at all
                                                25-34 years old
83435
                                         No
                                                25-34 years old
83437
             No, not really
                                         No
                                 Gender Trans
                                                               Sexuality \
ResponseId
                      Prefer not to say
                                                Straight / Heterosexual
                                            No
7
                      Prefer not to say
16
                                     Man
                                            No
                                                Straight / Heterosexual
37
                                     Man
                                                Straight / Heterosexual
38
                                     Man
                                                Straight / Heterosexual
                                      •••
83428
                                     Man
                                                Straight / Heterosexual
83430
            Man; Or, in your own words:
                                           Yes
                                                                   Queer
83431
                                                Straight / Heterosexual
                                     Man
                                            No
83435
                                     Man
                                            No
                                                Straight / Heterosexual
                                     Man
83437
                                                                     NaN
                                Ethnicity \
ResponseId
6
                        Prefer not to say
7
                             I don't know
16
            White or of European descent
37
            White or of European descent
38
            White or of European descent
83428
            White or of European descent
            White or of European descent
83430
83431
            White or of European descent
83435
            White or of European descent
83437
            White or of European descent
                                                  Accessibility \
ResponseId
6
                                              None of the above
7
                                              None of the above
16
                                              None of the above
37
                                              None of the above
38
                                              None of the above
83428
                                              None of the above
            I am unable to / find it difficult to walk or \dots
83430
```

83431 83435 83437	None of the above None of the above None of the above
	MentalHealth \
ResponseId	T have a second set in an allow many at a selection
6 7	I have a concentration and/or memory disorder None of the above
16	I have a concentration and/or memory disorder
37	Prefer not to say
38	I have a concentration and/or memory disorder
•••	
83428	I have an anxiety disorder; Or, in your own words:
83430	I have an anxiety disorder
83431	None of the above
83435	I have a concentration and/or memory disorder
83437	None of the above
	Cumucul on mth Cumuculla a c
ResponseId	SurveyLength SurveyEase \
6	Too long Neither easy nor difficult
7	Appropriate in length Neither easy nor difficult
16	Too long Easy
37	Too short Easy
38	Appropriate in length Easy
•••	
83428	Too short Easy
83430	Appropriate in length Neither easy nor difficult
83431	Appropriate in length Easy
83435	Appropriate in length Easy
83437	Appropriate in length Neither easy nor difficult
	ConvertedCompVeerly
ResponseId	ConvertedCompYearly
6	NaN
7	NaN
16	NaN
37	103000.0
38	300000.0
•••	
83428	4300000.0
83430	NaN
83431	125000.0
83435	160500.0
83437	90000.0

[15288 rows x 47 columns]

3.7.9 Para obter o número de pessoas que responderam às diferentes opções da questão Age1stCode para cada país

```
[116]: country_group["Age1stCode"].value_counts()
[116]: Country
                    Age1stCode
       Afghanistan 18 - 24 years
                                             19
                    Younger than 5 years
                                             13
                    11 - 17 years
                                             12
                    5 - 10 years
                                              7
                    25 - 34 years
                                              4
       Zimbabwe
                    11 - 17 years
                                              9
                    25 - 34 years
                                              5
                    5 - 10 years
                                              2
                    35 - 44 years
                                              1
                    Older than 64 years
                                              1
      Name: Age1stCode, Length: 992, dtype: int64
```

3.7.10 Para obter o número de pessoas que moram na Índia que responderam às diferentes opções da questão Age1stCode

```
[117]: country_group["Age1stCode"].value_counts().loc["India"]
[117]: Age1stCode
       11 - 17 years
                                4797
       18 - 24 years
                                4279
       5 - 10 years
                                 695
       25 - 34 years
                                 490
       Younger than 5 years
                                 103
       35 - 44 years
                                  85
       45 - 54 years
                                  20
       Older than 64 years
                                  5
       55 - 64 years
       Name: Age1stCode, dtype: int64
```

3.7.11 Para obter a mediana da compensação total para cada país

```
Andorra 87000.0
Angola 130000.0

Venezuela, Bolivarian Republic of... 1000.0
Viet Nam 18000000.0
Yemen 300.0
Zambia 12000.0
Zimbabwe 600.0
Name: CompTotal, Length: 181, dtype: float64
```

3.7.12 Para obter a mediana e a média da compensação total para cada país

```
[119]: country_group["CompTotal"].agg(["median", "mean"])
[119]:
                                                 median
                                                                  mean
       Country
       Afghanistan
                                                 63000.0 5.845616e+05
       Albania
                                                100000.0 2.504897e+06
       Algeria
                                                 60000.0 1.791122e+05
       Andorra
                                                 87000.0 9.892500e+04
       Angola
                                                130000.0 3.387364e+05
       Venezuela, Bolivarian Republic of...
                                               1000.0 5.110863e+07
       Viet Nam
                                              18000000.0 5.330125e+07
       Yemen
                                                   300.0 8.436429e+04
       Zambia
                                                 12000.0 3.455264e+04
       Zimbabwe
                                                   600.0 1.135846e+03
       [181 rows x 2 columns]
```

3.7.13 Para obter a percentagem de pessoas que já trabalharam com Python para cada país

```
[124]:
                                                LanguageHaveWorkedWith Country \
       Afghanistan
                                                                     20
                                                                               65
       Albania
                                                                     30
                                                                               73
       Algeria
                                                                     19
                                                                               46
       Andorra
                                                                      4
                                                                               12
       Angola
                                                                      5
                                                                               27
       Venezuela, Bolivarian Republic of...
                                                                   43
                                                                            104
       Viet Nam
                                                                    173
                                                                              386
       Yemen
                                                                      6
                                                                               20
       Zambia
                                                                     12
                                                                               22
       Zimbabwe
                                                                     17
                                                                               36
                                                pct_work_python
                                                      30.769231
       Afghanistan
       Albania
                                                      41.095890
       Algeria
                                                      41.304348
       Andorra
                                                      33.333333
       Angola
                                                      18.518519
       Venezuela, Bolivarian Republic of...
                                                    41.346154
       Viet Nam
                                                      44.818653
       Yemen
                                                      30.000000
       Zambia
                                                      54.545455
       Zimbabwe
                                                      47.22222
       [181 rows x 3 columns]
```

3.8 Limpar dados

3.8.1 Para criar um novo DataFrame com dados em falta

```
[125]: people = {
    "first": ["Ana", "Bruno", "Hugo", "Pedro", np.nan, None, "NA"],
    "last": ["Fernandes", "Ramalho", "Pimentel", "Santos", np.nan, np.nan, up.nan, up."Missing"],
    "email": ["AnaFernandes@gmail.com", "BrunoRamalho@gmail.com", up."HugoPimentel@gmail.com", None, np.nan, "Anonimo@gmail.com", "NA"],
    "age": [34, 67, 45, 45, None, None, "Missing"]
}
```

```
[126]: people_df = pd.DataFrame(people)
[127]: people_df
```

```
[127]:
          first
                        last
                                                 email
                                                             age
                              AnaFernandes@gmail.com
             Ana
                  Fernandes
                                                              34
          Bruno
                              BrunoRamalho@gmail.com
                                                              67
       1
                    Ramalho
                              HugoPimentel@gmail.com
       2
            Hugo
                   Pimentel
                                                              45
          Pedro
                     Santos
                                                  None
                                                              45
       3
       4
             NaN
                         NaN
                                                   NaN
                                                            None
       5
            None
                         {\tt NaN}
                                    Anonimo@gmail.com
                                                            None
       6
              NA
                    Missing
                                                     NA
                                                         Missing
```

3.8.2 Para eliminar as linhas que tenham um ou mais campos com NaN ou None

```
[128]: people_df.dropna()
[128]:
          first
                       last
                                                email
                                                            age
            Ana
                  Fernandes
                              AnaFernandes@gmail.com
                                                             34
                              BrunoRamalho@gmail.com
       1
          Bruno
                    Ramalho
                                                             67
       2
           Hugo
                   Pimentel
                              HugoPimentel@gmail.com
                                                             45
       6
             NA
                    Missing
                                                   NA
                                                       Missing
```

3.8.3 Para eliminar as linhas que tenham todos os campos com NaN ou None

```
people_df.dropna(how = "all")
[129]:
          first
                       last
                                                email
                                                            age
            Ana
                 Fernandes
                             AnaFernandes@gmail.com
       0
                                                             34
                              BrunoRamalho@gmail.com
       1
         Bruno
                    Ramalho
                                                             67
       2
           Hugo
                   Pimentel
                             HugoPimentel@gmail.com
                                                             45
         Pedro
                     Santos
                                                             45
       3
                                                 None
       5
           None
                        {\tt NaN}
                                   Anonimo@gmail.com
                                                           None
       6
             NA
                    Missing
                                                        Missing
```

3.8.4 Para eliminar as colunas que tenham NaN ou None

3.8.5 Para eliminar as linhas cujo email seja NaN ou None

```
[131]: people_df.dropna(subset=["email"])
[131]:
          first
                       last
                                               email
                                                           age
            Ana
                 Fernandes
                             AnaFernandes@gmail.com
                                                            34
       0
                             BrunoRamalho@gmail.com
          Bruno
                    Ramalho
                                                            67
       2
                             HugoPimentel@gmail.com
           Hugo
                   Pimentel
                                                            45
                                   Anonimo@gmail.com
       5
           None
                        NaN
                                                          None
             NA
                    Missing
                                                   NA
                                                      Missing
```

3.8.6 Para eliminar as linhas cujo último nome ou email sejam NaN ou None

```
[132]: people_df.dropna(subset=["last", "email"])
[132]:
          first
                       last
                                               email
                                                          age
            Ana
                Fernandes
                             AnaFernandes@gmail.com
                                                           34
       1
         Bruno
                   Ramalho
                            BrunoRamalho@gmail.com
                                                           67
       2
                            HugoPimentel@gmail.com
           Hugo
                  Pimentel
                                                           45
       6
             NA
                   Missing
                                                  NA
                                                     Missing
```

3.8.7 Para substituir NA por NaN

```
people_df.replace("NA", np.nan, inplace=True)
[134]: people_df
[134]:
          first
                       last
                                                email
                                                            age
       0
             Ana
                  Fernandes
                              AnaFernandes@gmail.com
                                                             34
       1
          Bruno
                    Ramalho
                              BrunoRamalho@gmail.com
                                                             67
                              HugoPimentel@gmail.com
                                                             45
       2
           Hugo
                   Pimentel
       3
          Pedro
                     Santos
                                                 None
                                                             45
       4
            NaN
                        NaN
                                                  NaN
                                                           None
       5
           None
                        NaN
                                   Anonimo@gmail.com
                                                           None
       6
            NaN
                    Missing
                                                  NaN
                                                       Missing
```

3.8.8 Para substituir *Missing* por *NaN*

```
[135]: people_df.replace("Missing", np.nan, inplace=True)
[136]: people_df
```

```
[136]:
          first
                       last
                                                email
                                                         age
                              AnaFernandes@gmail.com
       0
             Ana
                  Fernandes
                                                        34.0
                              BrunoRamalho@gmail.com
                                                        67.0
       1
          Bruno
                    Ramalho
       2
           Hugo
                   Pimentel
                              HugoPimentel@gmail.com
                                                        45.0
          Pedro
                     Santos
                                                  None
                                                        45.0
       3
       4
             NaN
                         NaN
                                                   NaN
                                                         NaN
       5
           None
                         NaN
                                   Anonimo@gmail.com
                                                         NaN
       6
             NaN
                         NaN
                                                   NaN
                                                         NaN
```

3.8.9 Para visualizar quais são os campos com valores em falta

```
[137]: people_df.isna()
[137]:
          first
                  last
                        email
                                 age
          False
                 False
                        False
                               False
       1 False
                False False
                              False
       2 False False False
                              False
       3 False
                False
                         True
                               False
       4
           True
                  True
                         True
                                True
       5
           True
                  True False
                                True
           True
                  True
                         True
                                True
```

3.8.10 Para preencher todos os valores em falta com MISSING

```
[138]:
      people_df.fillna("MISSING")
[138]:
            first
                         last
                                                 email
                                                             age
       0
                   Fernandes
                               AnaFernandes@gmail.com
              Ana
                                                            34.0
       1
                      Ramalho
                               BrunoRamalho@gmail.com
            Bruno
                                                            67.0
       2
             Hugo
                    Pimentel
                               HugoPimentel@gmail.com
                                                            45.0
       3
            Pedro
                       Santos
                                               MISSING
                                                            45.0
         MISSING
                      MISSING
                                               MISSING
                                                        MISSING
       5
          MISSING
                      MISSING
                                    Anonimo@gmail.com
                                                        MISSING
          MISSING
                      MISSING
                                               MISSING
                                                        MISSING
```

3.8.11 Para calcular a média de idades sem os valores em falta

```
[139]: people_df["age"].mean()
```

[139]: 47.75

3.8.12 Para visualizar os valores únicos da coluna idade

```
[140]: people_df["age"].unique()

[140]: array([34., 67., 45., nan])
```

3.8.13 Para reconhecer NA e Missing como valores em falta aquando da leitura do CSV com as respostas

```
[141]: na_vals = ["NA", "Missing"]

answers = pd.read_csv("stack-overflow-developer-survey-2021/

survey_results_public.csv", index_col = "ResponseId", na_values = na_vals)
```

- 3.9 Ler/escrever dados
- 3.9.1 Para obter um DataFrame com as respostas cujo país é Portugal

```
[142]: portugal_df = answers[answers["Country"] == "Portugal"]
```

3.9.2 Para escrever o DataFrame num CSV

3.9.3 Para escrever o DataFrame num TSV

```
[144]: portugal_df.to_csv("stack-overflow-developer-survey-2021/

survey_results_portugal.tsv", sep = "\t")
```

3.9.4 Para escrever o DataFrame num Excel

```
[145]: portugal_df.to_excel("stack-overflow-developer-survey-2021/

survey_results_portugal.xlsx")
```

3.9.5 Para ler o Excel

```
[146]: result = pd.read_excel("stack-overflow-developer-survey-2021/
        →survey_results_portugal.xlsx", index_col = "ResponseId")
[147]:
      result
[147]:
                                                            MainBranch \
       ResponseId
       41
                                       I am a developer by profession
       257
                   I am not primarily a developer, but I write co...
       427
                                          I code primarily as a hobby
       439
                                       I am a developer by profession
       455
                                       I am a developer by profession
       82962
                                       I am a developer by profession
                                       I am a developer by profession
       83140
       83259
                               I am a student who is learning to code
                   I am not primarily a developer, but I write co...
       83312
       83333
                                       I am a developer by profession
                            Employment
                                         Country US_State UK_Country \
       ResponseId
       41
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
       257
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
                   Student, full-time
       427
                                        Portugal
                                                        NaN
                                                                    NaN
       439
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
       455
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
       82962
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
       83140
                   Employed full-time
                                        Portugal
                                                        NaN
                                                                    NaN
                   Student, full-time
       83259
                                        Portugal
                                                        NaN
                                                                    NaN
                   Employed full-time
                                        Portugal
       83312
                                                        NaN
                                                                    NaN
       83333
                   Employed full-time
                                        Portugal
                                                                    NaN
                                                        NaN
                                                               EdLevel
                                                                           Age1stCode
       ResponseId
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.) 18 - 24 years
       41
                   Some college/university study without earning ... 11 - 17 years
       257
                   Some college/university study without earning ... 11 - 17 years
       427
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.) 18 - 24 years
       439
                   Secondary school (e.g. American high school, G... 11 - 17 years
       455
                     Master's degree (M.A., M.S., M.Eng., MBA, etc.) 18 - 24 years
       82962
                   Some college/university study without earning ... 11 - 17 years
       83140
       83259
                   Secondary school (e.g. American high school, G... 11 - 17 years
       83312
                        Bachelor's degree (B.A., B.S., B.Eng., etc.) 11 - 17 years
```

83333	Some college/university study without earning 11 - 17 years
	LearnCode \
ResponseId	
41 257	School
427	Other online resources (ex: videos, blogs, etc Online Forum
439	Other online resources (ex: videos, blogs, etc
455	Other online resources (ex: videos, blogs, etc
 82962	 School
83140	Other online resources (ex: videos, blogs, etc)
83259	Other online resources (ex: videos, blogs, etc
83312	Books / Physical media
83333	Coding Bootcamp; School
	YearsCode YearsCodePro \
${\tt ResponseId}$	
41	Less than 1 year 5
257	9 3
427	5 NaN
439	8 7
455	5 2
 82962	9 2
83140	2 2
83259	1 NaN
83312	33 30
83333	8 5
	DevType \
${\tt ResponseId}$	
41	Developer, full-stack
257	Developer, front-end; Developer, desktop or ent
427	NaN Danalanan hash and
439 455	Developer, back-end
	Developer, mobile; Developer, full-stack
 82962	Developer, full-stack
83140	Developer, back-end
83259	NaN
83312	Educator
83333	Developer, front-end; Developer, desktop or ent
	OrgSize Currency CompTotal CompFreq \
ResponseId	
41	20 to 99 employees EUR European Euro NaN Monthly

```
257
             1,000 to 4,999 employees
                                         EUR European Euro
                                                                  700.0
                                                                         Monthly
427
                                    NaN
                                                        NaN
                                                                    NaN
                                                                              NaN
439
                   20 to 99 employees
                                         EUR European Euro
                                                                 2650.0
                                                                          Monthly
                   20 to 99 employees
455
                                         EUR European Euro
                                                                              NaN
                                                                    NaN
82962
                   20 to 99 employees
                                         EUR European Euro
                                                                 1321.0
                                                                         Monthly
83140
                 100 to 499 employees
                                                                         Monthly
                                         EUR European Euro
                                                                    {\tt NaN}
83259
                                    NaN
                                                        NaN
                                                                    NaN
                                                                              NaN
83312
                   20 to 99 employees
                                         EUR European Euro
                                                                  800.0
                                                                         Monthly
83333
                 100 to 499 employees
                                         EUR European Euro
                                                                43000.0
                                                                           Yearly
                              LanguageHaveWorkedWith
ResponseId
41
                         C; C#; C++; Java; Kotlin; Python
257
                            C#;HTML/CSS;Java;SQL;VBA
427
                            C; Matlab; Python; Rust; SQL
439
                          Java; JavaScript; Python; SQL
455
                   C#;JavaScript;Node.js;TypeScript
82962
                                 Java; JavaScript; SQL
83140
                                       C#; Java; Python
83259
                              Assembly; C; Java; Python
83312
                                                   PHP
             HTML/CSS; JavaScript; Node.js; TypeScript
83333
                              LanguageWantToWorkWith
ResponseId
41
                            Dart;Kotlin;Python;Swift
                            C#;HTML/CSS;Java;SQL;VBA
257
427
                                                  Rust
439
                                      Java; Kotlin; SQL
455
                   C#; JavaScript; Node. js; TypeScript
82962
                                               Node.js
83140
                                          Java; Python
83259
                          C++; Java; JavaScript; Python
83312
                                                   PHP
83333
             HTML/CSS; JavaScript; Node.js; TypeScript
                                          DatabaseHaveWorkedWith \
ResponseId
41
                                MongoDB; MySQL; Oracle; PostgreSQL
257
                                      Microsoft SQL Server; MySQL
427
                                                       PostgreSQL
439
                                             Elasticsearch; MySQL
455
                  Firebase; Microsoft SQL Server; MongoDB; SQLite
```

```
82962
            MariaDB; Microsoft SQL Server; MongoDB; MySQL; Ora...
83140
                     IBM DB2;Microsoft SQL Server;MySQL;Oracle
83259
                                                             NaN
83312
                                                         MariaDB
83333
                                                      PostgreSQL
                          DatabaseWantToWorkWith PlatformHaveWorkedWith \
ResponseId
41
                              MongoDB; PostgreSQL
                                                                       NaN
257
                      Microsoft SQL Server; MySQL
                                                          Microsoft Azure
427
                                              NaN
                                                                       NaN
439
                       Elasticsearch; MySQL; Redis
                                                                       AWS
            Microsoft SQL Server; MongoDB; SQLite
455
                                                                    Heroku
82962
                                                                    Heroku
                                    Elasticsearch
83140
                                              NaN
                                                      IBM Cloud or Watson
83259
                                              NaN
                                                                       NaN
83312
                                          MariaDB
                                                                       NaN
83333
                                       PostgreSQL
                                                                       NaN
                PlatformWantToWorkWith
ResponseId
41
                                    NaN
257
                       Microsoft Azure
427
439
            AWS; Google Cloud Platform
455
82962
                                    NaN
83140
                                    NaN
83259
                                    NaN
83312
                                    NaN
83333
                                    NaN
                                 WebframeHaveWorkedWith \
ResponseId
41
                                                     NaN
257
                                  ASP.NET; ASP.NET Core
427
                                                     NaN
439
                                                  Spring
455
                                               React.js
82962
                                          jQuery; Spring
83140
                                                     NaN
83259
                                                     NaN
                                                 ASP.NET
83312
            Angular.js;Express;Gatsby;React.js;Vue.js
83333
```

```
WebframeWantToWorkWith
                                                          MiscTechHaveWorkedWith \
ResponseId
41
                                         NaN
                                                                    Flutter; NumPy
257
                      ASP.NET; ASP.NET Core
                                               .NET Framework; .NET Core / .NET 5
427
                                         NaN
                                                                               NaN
439
                                                                             NumPy
                                      Spring
455
            ASP.NET; ASP.NET Core ; React.js
                                              .NET Framework; .NET Core / .NET 5
82962
                    Express;React.js;Vue.js
                                                                               NaN
83140
                                                                   .NET Framework
83259
                                         NaN
                                                                               NaN
                                                                   .NET Framework
83312
                                     Laravel
83333
                     Gatsby;React.js;Vue.js
                                                                     React Native
                        MiscTechWantToWorkWith ToolsTechHaveWorkedWith \
ResponseId
41
                                                             Git; Unity 3D
                                             NaN
             .NET Framework; .NET Core / .NET 5
257
                                                                      NaN
427
                                            NaN
                                                                      Git
439
                                                               Docker; Git
                                            NaN
455
             .NET Framework; .NET Core / .NET 5
                                                                  Xamarin
82962
                                            NaN
                                                               Docker; Git
83140
                   Qt; TensorFlow; Torch/PyTorch
                                                                      NaN
83259
                                             NaN
                                                                      NaN
83312
                                        Flutter
                                                                      NaN
83333
                                   React Native
                                                         Docker; Git; Yarn
                     ToolsTechWantToWorkWith \
ResponseId
41
                                          Git
257
                                          NaN
427
                                          Git
439
                       Docker; Git; Kubernetes
455
                                      Xamarin
82962
                          Ansible; Kubernetes
83140
                                          NaN
83259
                                          NaN
83312
                                          NaN
83333
            Deno; Docker; Git; Kubernetes; Yarn
                                   NEWCollabToolsHaveWorkedWith \
ResponseId
41
            Android Studio; IntelliJ; Sublime Text; Visual St...
257
                                        Notepad++; Visual Studio
```

427	Visual Studio Code		
439	IntelliJ; Sublime Text		
455	Visual Studio; Visual Studio Code		
 82962	IntelliJ;Vim;Visual Studio Code		
83140	Eclipse;Notepad++;Visual Studio		
83259	Eclipse; Intellij; Visual Studio Code		
83312	Notepad++; Visual Studio		
83333	Webstorm		
	${\tt NEWCollabToolsWantToWorkWith}$	0pSys	\
ResponseId	Andreid Chadie Tatalli I Cablina Tratalli and Ch	M00	
41	Android Studio; Intellij; Sublime Text; Visual St	MacOS	
257	Notepad++; Visual Studio	Windows	
427 439	Visual Studio Code	Linux-based	
439 455	IntelliJ;Sublime Text Visual Studio;Visual Studio Code	MacOS Windows	
	VISUAL Studio, Visual Studio Code	windows 	
 82962	 NaN	 Linux-based	
83140	Android Studio; Eclipse; Notepad++; Visual Studio	Windows	
83259	IntelliJ	Windows	
83312	Visual Studio Code	Windows	
83333	Webstorm	MacOS	
	NEWStuck	\	
ResponseId		\	
41	Call a coworker or friend; Visit Stack Overflow	\	
41 257	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu	\	
41 257 427	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a		
41 257 427 439	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow		
41 257 427 439 455	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a		
41 257 427 439 455	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu		
41 257 427 439 455 82962	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow		
41 257 427 439 455 82962 83140	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w		
41 257 427 439 455 82962	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu		
41 257 427 439 455 82962 83140 83259	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w		
41 257 427 439 455 82962 83140 83259 83312	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Watch other ph		
41 257 427 439 455 82962 83140 83259 83312 83333	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Watch other ph		
41 257 427 439 455 82962 83140 83259 83312 83333	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Go for a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Go for a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41 257	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Go for a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41 257 427	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41 257 427 439	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Go for a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41 257 427	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange		
41 257 427 439 455 82962 83140 83259 83312 83333 ResponseId 41 257 427 439	Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Google it; Do other work a Call a coworker or friend; Visit Stack Overflow Visit Stack Overflow; Google it; Watch help / tu Call a coworker or friend; Visit Stack Overflow Call a coworker or friend; Google it; Do other w Visit Stack Overflow; Google it; Watch help / tu Visit Stack Overflow; Go for a walk or other ph Go for a walk or other physical activity; Googl NEWSOSites \ Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange Stack Overflow; Stack Exchange		

```
83140
                            Stack Overflow
83259
                            Stack Overflow
83312
                            Stack Overflow
83333
                            Stack Overflow
                                     SOVisitFreq SOAccount \
ResponseId
41
                           Daily or almost daily
                                                         No
257
                          Multiple times per day
                                                        Yes
427
                          Multiple times per day
                                                        Yes
439
                          Multiple times per day
                                                        Yes
455
                           Daily or almost daily
                                                        Yes
82962
                           Daily or almost daily
                                                        Yes
83140
                A few times per month or weekly
                                                        Yes
83259
            Less than once per month or monthly
                                                         No
83312
                          Multiple times per day
                                                        Yes
83333
                            A few times per week
                                                        Yes
                                                     SOPartFreq \
ResponseId
41
                                                            NaN
257
                               A few times per month or weekly
427
                               A few times per month or weekly
439
            I have never participated in Q&A on Stack Over...
455
            I have never participated in Q&A on Stack Over...
82962
            I have never participated in Q&A on Stack Over...
83140
                           Less than once per month or monthly
83259
            I have never participated in Q&A on Stack Over...
83312
83333
                           Less than once per month or monthly
                      SOComm NEWOtherComms
                                                         Age Gender Trans
ResponseId
41
                     Neutral
                                        No
                                            25-34 years old
                                                                 Man
                                                                        No
              Yes, somewhat
                                            25-34 years old
257
                                        No
                                                                Man
                                                                        No
427
                     Neutral
                                            18-24 years old
                                                                        No
                                        No
                                                                Man
439
             No, not really
                                        No
                                             25-34 years old
                                                                Man
                                                                        No
455
                     Neutral
                                             18-24 years old
                                       Yes
                                                                 Man
                                                                        No
82962
             No, not really
                                        No
                                             25-34 years old
                                                                Man
                                                                        No
                     Neutral
                                            25-34 years old
83140
                                        No
                                                                Man
                                                                        No
83259
             No, not at all
                                        No 18-24 years old
                                                                Man
                                                                        No
            Yes, definitely
                                        No 45-54 years old
83312
                                                                 Man
                                                                        No
83333
             No, not really
                                        No 35-44 years old
                                                                 Man
                                                                        No
```

	Sexuality Ethnicity	\
${\tt ResponseId}$		
41	NaN NaN	
257	Straight / Heterosexual White or of European descent	
427	Straight / Heterosexual White or of European descent	
439	Straight / Heterosexual White or of European descent	
455	Straight / Heterosexual White or of European descent	
 82962	 Straight / Heterosexual White or of European descent	
83140	Straight / Heterosexual White or of European descent	
83259	Straight / Heterosexual White or of European descent	
83312	Straight / Heterosexual White or of European descent	
83333	Straight / Heterosexual White or of European descent	
ResponseId	Accessibility MentalHealth	\
41	NaN NaN	
257	None of the above None of the above	
427	None of the above None of the above	
439	None of the above None of the above	
455	I am blind / have difficulty seeing None of the above	
•••		
82962	None of the above None of the above	
83140	None of the above None of the above	
83259	None of the above NaN	
83312	None of the above None of the above	
83333	None of the above None of the above	
	Curvey on ath Curvey Enga Converted CompVerty	
ResponseId	SurveyLength SurveyEase ConvertedCompYearly	
41	Appropriate in length Easy NaN	
257	Appropriate in length Easy 9084.0	
427	Appropriate in length Easy NaN	
439	Appropriate in length Easy 34380.0	
455	Appropriate in length Easy NaN	
•••		
82962	Appropriate in length Easy 17136.0	
83140	Appropriate in length Easy NaN	
83259	Appropriate in length Easy NaN	
83312	Too long Easy 10380.0	
83333	Appropriate in length Easy 46482.0	

[530 rows x 47 columns]