Pandas_practice3

March 21, 2021

```
[193]: import pandas as pd
[194]: df= pd.read_csv('D:\Data Science\sheets\survey_results_public.
        ⇔csv',index_col='Respondent')
[195]: df.head(5)
[195]:
                                                            MainBranch Hobbyist
       Respondent
                               I am a student who is learning to code
                                                                             Yes
       1
       2
                               I am a student who is learning to code
                                                                              No
       3
                   I am not primarily a developer, but I write co...
                                                                           Yes
       4
                                       I am a developer by profession
                                                                              No
       5
                                       I am a developer by profession
                                                                             Yes
                                   OpenSourcer \
       Respondent
                                         Never
       1
       2
                      Less than once per year
       3
                                         Never
       4
                                         Never
       5
                   Once a month or more often
                                                            OpenSource \
       Respondent
       1
                   The quality of OSS and closed source software ...
       2
                   The quality of OSS and closed source software \dots
       3
                   The quality of OSS and closed source software ...
       4
                   The quality of OSS and closed source software \dots
       5
                   OSS is, on average, of HIGHER quality than pro...
                                                 Employment
                                                                             Country \
       Respondent
       1
                   Not employed, and not looking for work
                                                                      United Kingdom
       2
                       Not employed, but looking for work
                                                            Bosnia and Herzegovina
       3
                                                                            Thailand
                                        Employed full-time
       4
                                        Employed full-time
                                                                       United States
       5
                                        Employed full-time
                                                                             Ukraine
```

Respondent 1 No Primary/elementary school 2 Yes, full-time Secondary school (e.g. American high school, G 3 No Bachelor's degree (BA, BS, B.Eng., etc.) 4 No Bachelor's degree (BA, BS, B.Eng., etc.) 5 No Bachelor's degree (BA, BS, B.Eng., etc.)
Yes, full-time Secondary school (e.g. American high school, G No Bachelor's degree (BA, BS, B.Eng., etc.) No Bachelor's degree (BA, BS, B.Eng., etc.) No Bachelor's degree (BA, BS, B.Eng., etc.) UndergradMajor \ EundergradMajor \ Respondent NaN NaN Web development or web design Computer science, computer engineering, or sof Computer science, computer engineering, or sof EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw NaN Taken an online course in programming or softw Developer, desktop or enterprise applications; NaN Developer, desktop or enterprise applications; NaN Developer, front Developer, full-stack Bachelor's degree (BA, BS, B.Eng., etc.) Nan Nan Nan A Developer, full-stack Bachelor's degree (BA, BS, B.Eng., etc.) Nan Nan A Bachelor's degree (BA, BS, B.Eng., etc.) Nan Nan A Bachelor's degree (BA, BS, B.Eng., etc.) Nan Nan A Bachelor's degree (BA, BS, B.Eng., etc.) Nan A Bachelor's degree (BA, BS, B.Eng. Bachelor's degree (BA, BS, B.Eng. Bachelor's degree (BA. B) Bachelor's degree (BA. B) Beta.)
No Bachelor's degree (BA, BS, B.Eng., etc.) No Bachelor's degree (BA, BS, B.Eng., etc.) No Bachelor's degree (BA, BS, B.Eng., etc.) UndergradMajor \ Respondent NaN NaN NaN Computer science, computer engineering, or sof Computer science, computer engineering, or sof Computer science, computer engineering, or sof EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw DorgSize \ Respondent NaN 1
4 No Bachelor's degree (BA, BS, B.Eng., etc.) 5 No Bachelor's degree (BA, BS, B.Eng., etc.) **Property of the property of the
UndergradMajor \ Respondent Respondent 1
Respondent 1
Respondent 1
Respondent 1
NaN
NaN Web development or web design Computer science, computer engineering, or sof Computer science, computer engineering, or sof EduOther \ EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100 to 499 employees 100 to 499 employees DevType YearsCode \ Respondent NaN DevEloper, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front Beauth of the design of the series of the s
Web development or web design Computer science, computer engineering, or sof Computer science, computer engineering, or sof EduOther \ EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN NaN 100 to 499 employees 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent NaN DevEloper, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front 3 Developer, full-stack 3
Computer science, computer engineering, or sof Computer science, computer engineering, or sof EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw Taught yourself a new language, framework, or Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100 to 499 employees 100 to 499 employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front Developer, full-stack 3
EduOther \ Respondent Taught yourself a new language, framework, or Taken an online course in programming or softw Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 1000 to 499 employees 1000 to 499 employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front Developer, full-stack 3
Respondent 1 Taught yourself a new language, framework, or 2 Taken an online course in programming or softw 3 Taught yourself a new language, framework, or 4 Taken an online course in programming or softw 5 Taken an online course in programming or softw OrgSize \ Respondent 1 NaN 2 NaN 3 100 to 499 employees 4 100 to 499 employees 5 10,000 or more employees Respondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN 3 Designer; Developer, back-end; Developer, front 3 4 Developer, full-stack 3
Respondent 1 Taught yourself a new language, framework, or 2 Taken an online course in programming or softw 3 Taught yourself a new language, framework, or 4 Taken an online course in programming or softw 5 Taken an online course in programming or softw CorgSize \ Respondent 1 NaN 2 NaN 3 100 to 499 employees 4 100 to 499 employees 5 10,000 or more employees CRespondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN 3 Designer; Developer, back-end; Developer, front 3 4 Developer, full-stack 3
Respondent 1 Taught yourself a new language, framework, or 2 Taken an online course in programming or softw 3 Taught yourself a new language, framework, or 4 Taken an online course in programming or softw 5 Taken an online course in programming or softw CorgSize \ Respondent 1 NaN 2 NaN 3 100 to 499 employees 4 100 to 499 employees 5 10,000 or more employees CRespondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN 3 Designer; Developer, back-end; Developer, front 3 4 Developer, full-stack 3
Taught yourself a new language, framework, or Taken an online course in programming or softw Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front Developer, full-stack 3
Taken an online course in programming or softw Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer; Developer, back-end; Developer, front Developer, full-stack Developer, desktop or enterprise applications;
Taught yourself a new language, framework, or Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer; Developer, back-end; Developer, front 3 Developer, full-stack 3
Taken an online course in programming or softw Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent NaN Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front Developer, full-stack Developer, full-stack
Taken an online course in programming or softw OrgSize \ Respondent NaN NaN 1 NaN 3 100 to 499 employees 4 100 to 499 employees 5 10,000 or more employees Respondent 1 NaN 4 Respondent 1 NaN 4 Developer, desktop or enterprise applications; NaN Designer; Developer, back-end; Developer, front 3 Developer, full-stack 3
Respondent 1
Respondent 1
NaN
NaN 100 to 499 employees 100 to 499 employees 100,000 or more employees DevType YearsCode \ Respondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front 3 Developer, full-stack 3
100 to 499 employees 10,000 or more employees DevType YearsCode \ Respondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN 3 Designer;Developer, back-end;Developer, front 3 4 Developer, full-stack 3
4 100 to 499 employees 5 10,000 or more employees DevType YearsCode \ Respondent 1 NaN 4 2 Developer, desktop or enterprise applications; NaN 3 Designer;Developer, back-end;Developer, front 3 4 Developer, full-stack 3
DevType YearsCode \ Respondent Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front 3 Developer, full-stack 3
DevType YearsCode \ Respondent 1
Respondent 1
Respondent 1
NaN 4 Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front 3 Developer, full-stack 3
Developer, desktop or enterprise applications; NaN Designer;Developer, back-end;Developer, front 3 Developer, full-stack 3
Designer; Developer, back-end; Developer, front 3 Developer, full-stack 3
Developer, full-stack 3
•
o meademic researcher, developer, deskrop of elite 10
Age1stCode YearsCodePro CareerSat \
Respondent
1 10 NaN NaN
2 17 NaN NaN
3 22 1 Slightly satisfied
4 16 Less than 1 year Very satisfied

	voly 420040102104		
	JobSat MgrIdiot MgrI	Money MgrWant	\
Respondent	N- N	NI - NI NI - NI	
1	NaN NaN	NaN NaN	
2	NaN NaN	NaN NaN	
3	.	sure Not sure	
4	Slightly satisfied Very confident	No Not sure	
5	Slightly dissatisfied Somewhat confident	Yes No	
Respondent	JobSee	k \	
1	Nai	N	
2	I am actively looking for a jo		
3	I'm not actively looking, but I am open to new	S	
4	I am not interested in new job opportunities	a	
5	I am not interested in new job opportunities		
J	i am not interested in new job opportuniters	3	
	LastHireDate \		
Respondent			
1	NaN		
2	I've never had a job		
3	1-2 years ago		
4	Less than a year ago		
5	Less than a year ago		
Pognondont	LastIn	t FizzBuzz \	
Respondent 1	Nai	N NaN	
2	Nai		
3	Interview with people in peer roles		
4	Write code by hand (e.g., on a whiteboard); Int	No No	
5	Write any code; Write code by hand (e.g., on a	No	
J	write any code, write code by hand (e.g., on a	110	
	JobFactor	s \	
Respondent			
1	Na	N	
2	Financial performance or funding status of the		
3	Languages, frameworks, and other technologies		
4	Languages, frameworks, and other technologies		
5	Industry that I'd be working in; Languages, fra		
	ResumeUpdate	e CurrencySymbol	\
Respondent			
1	Nai	N NaN	
2	Something else changed (education, award, medi	NaN	
3	I was preparing for a job search	h THB	

9 Very dissatisfied

4	I was preparing for a job se	earch USD		
5	I was preparing for a job se	earch UAH		
	CurrencyDesc CompTotal CompFreq Cor	nvertedComp \		
Respondent				
1	NaN NaN NaN	NaN		
2	NaN NaN NaN	NaN		
3	Thai baht 23000.0 Monthly	8820.0		
4	United States dollar 61000.0 Yearly	61000.0		
5	Ukrainian hryvnia NaN NaN	NaN		
	WorkWeekHrs	WorkPlan \		
Respondent	WOIKWEEKHIS	WorkPlan \		
1	NaN	NaN		
2	NaN	NaN		
3	40.0 There's no schedule or spec; I w			
4	80.0 There's no schedule or spec; I was			
5	55.0 There is a schedule and/or spec			
	ooto moro is a sonourio ana, or spoo	(made by me erm		
	WorkChall	lenge \		
Respondent				
1		NaN		
2		NaN		
3	Distracting work environment; Inadequate access			
4		NaN		
5	Being tasked with non-development work; Inade	au		
		1		
	WorkRemote WorkLoc	ImpSyn \		
Respondent	WorkRemote WorkLoc	-		
1	NaN NaN	ImpSyn \		
_	NaN NaN NaN NaN	ImpSyn \		
1	NaN NaN	ImpSyn \		
1 2	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A	ImpSyn \ NaN NaN Average little below average		
1 2 3	NaN NaN NaN NaN Less than once per month / Never Home	ImpSyn \ NaN NaN Average little below average		
1 2 3 4	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A	ImpSyn \ NaN NaN Average little below average little above average		
1 2 3 4 5	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A	ImpSyn \ NaN NaN Average little below average		
1 2 3 4 5 Respondent	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code	ImpSyn \ NaN NaN Average little below average little above average		
1 2 3 4 5 Respondent 1	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN		
1 2 3 4 5 Respondent 1 2	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN		
1 2 3 4 5 Respondent 1 2 3	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN NaN	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3 4	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN No No	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN NaN	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3 4	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN NaN No No No Yes, because I see value in code review	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3 4 5	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN No No	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3 4 5	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN No No No Yes, because I see value in code review UnitTests \	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN NaN NaN		
1 2 3 4 5 Respondent 1 2 3 4 5	NaN NaN NaN NaN Less than once per month / Never Home Less than once per month / Never Home A A few days each month Office A CodeRev Code NaN NaN NaN No No No Yes, because I see value in code review	ImpSyn \ NaN NaN Average little below average little above average eRevHrs \ NaN NaN NaN NaN NaN		

```
3
                 No, but I think we should
4
                 No, but I think we should
5
            Yes, it's part of our process
                                                     PurchaseHow \
Respondent
1
                                                             NaN
2
                                                             NaN
3
                                                        Not sure
4
            Developers typically have the most influence o...
5
                                                        Not sure
                               PurchaseWhat
Respondent
                                        NaN
1
2
                                        NaN
3
            I have little or no influence
4
            I have little or no influence
            I have little or no influence
                                       LanguageWorkedWith \
Respondent
1
                         HTML/CSS; Java; JavaScript; Python
2
                                      C++; HTML/CSS; Python
3
                                                  HTML/CSS
4
                                      C;C++;C#;Python;SQL
            C++; HTML/CSS; Java; JavaScript; Python; SQL; VBA
                                       LanguageDesireNextYear
Respondent
            C;C++;C#;Go;HTML/CSS;Java;JavaScript;Python;SQL
1
2
                                  C++; HTML/CSS; JavaScript; SQL
3
                                              Elixir;HTML/CSS
4
                                          C;C#;JavaScript;SQL
5
                    HTML/CSS; Java; JavaScript; SQL; WebAssembly
                                            DatabaseWorkedWith
Respondent
1
                                                         SQLite
2
                                                            NaN
3
                                                     PostgreSQL
4
                                                   MySQL; SQLite
            Couchbase; MongoDB; MySQL; Oracle; PostgreSQL; SQLite
                                         DatabaseDesireNextYear
Respondent
                                                           MySQL
1
```

2 3 4 5	MySQL PostgreSQL MySQL;SQLite Couchbase;Firebase;MongoDB;MySQL;Oracle;Postgr	
	PlatformWorkedWith \	
Respondent 1 2 3 4	MacOS;Windows Windows NaN Linux;Windows	
5	Android;Linux;MacOS;Slack;Windows	
D 1 +	PlatformDesireNextYear \	
Respondent 1 2 3 4 5	Android; Arduino; Windows Windows NaN Linux; Windows Android; Docker; Kubernetes; Linux; Slack	
D 1 .	<pre>WebFrameWorkedWith \</pre>	
Respondent 1 2 3 4 5	Django;Flask Django NaN NaN Django;Express;Flask;jQuery;React.js;Spring	
	<pre>WebFrameDesireNextYear MiscTechWorkedWith \</pre>	
Respondent 1 2 3 4 5	Flask; jQuery Node.js Django NaN Other(s): NaN NaN .NET Flask; jQuery; React.js; Spring Cordova; Node.js	
	MiscTechDesireNextYear \	
Respondent 1 2 3 4 5	Node.js NaN NaN .NET Apache Spark;Hadoop;Node.js;React Native	
Respondent	DevEnviron OpSys	S \

```
1
                               IntelliJ;Notepad++;PyCharm
                                                                 Windows
2
                                              Atom; PyCharm
                                                                 Windows
3
                                    Vim; Visual Studio Code
                                                             Linux-based
4
                                                                 Windows
            Eclipse; Vim; Visual Studio; Visual Studio Code
5
                                    IntelliJ;Notepad++;Vim
                                                            Linux-based
                                          Containers BlockchainOrg
Respondent
                            I do not use containers
                                                                NaN
2
                            I do not use containers
                                                                NaN
3
                            I do not use containers
                                                                NaN
4
                            I do not use containers
                                                         Not at all
5
            Outside of work, for personal projects
                                                         Not at all
                                                   BlockchainIs BetterLife \
Respondent
                                                             NaN
                                                                        Yes
1
2
            Useful across many domains and could change ma...
                                                                       Yes
3
                                                                        Yes
4
            Useful for decentralized currency (i.e., Bitcoin)
                                                                        Yes
5
                                                             NaN
                                                                        Yes
                                              ITperson OffOn SocialMedia \
Respondent
            Fortunately, someone else has that title
1
                                                          Yes
                                                                  Twitter
2
                                                   Yes
                                                          Yes
                                                                Instagram
3
                                                   Yes
                                                                   Reddit
                                                          Yes
4
                                                  SIGH
                                                          Yes
                                                                   Reddit
5
                                              Also Yes
                                                          Yes
                                                                 Facebook
                         Extraversion ScreenName
                                                          SOVisit1st
Respondent
                               Online
                                         Username
                                                                2017
1
2
                               Online
                                         Username
                                                                2017
3
            In real life (in person)
                                                                2011
                                         Username
4
            In real life (in person)
                                         Username
                                                                2014
            In real life (in person)
                                         Username I don't remember
                                  SOVisitFreq \
Respondent
            A few times per month or weekly
2
                       Daily or almost daily
3
                        A few times per week
4
                       Daily or almost daily
5
                      Multiple times per day
```

SOVisitTo \

Respondent 1 2 3 4 5	Find answers to specific questions; Learn how t Find answers to specific questions; Learn how t Find answers to specific questions; Learn how t Find answers to specific questions; Pass the ti Find answers to specific questions
	SOFindAnswer SOTimeSaved \
Respondent	
1	3-5 times per week Stack Overflow was much faster
2	3-5 times per week Stack Overflow was much faster
3	6-10 times per week They were about the same
4	1-2 times per week Stack Overflow was much faster
5	More than 10 times per week Stack Overflow was much faster
D 1 .	SOHowMuchTime SOAccount SOPartFreq \
Respondent	24 CO minutes No. No.
1	31-60 minutes No NaN
2	11-30 minutes Yes A few times per month or weekly
3	NaN Yes Less than once per month or monthly 31-60 minutes Yes Less than once per month or monthly
4	1
5	NaN Yes A few times per month or weekly
	SOJobs \
Respondent	
1	No, I didn't know that Stack Overflow had a jo
2	No, I knew that Stack Overflow had a job board
3	Yes
4	Yes
5	No, I knew that Stack Overflow had a job board
	EntTeams \
Respondent	
1	No, and I don't know what those are
2	No, and I don't know what those are
3	No, I've heard of them, but I am not part of a
4	No, and I don't know what those are
5	No, I've heard of them, but I am not part of a
D 1 .	SOComm WelcomeChange \
Respondent	Neutrol Tugt og volgeme men er T felt lest men.
1	Neutral Just as welcome now as I felt last year
2	Yes, somewhat Just as welcome now as I felt last year
3	Neutral Just as welcome now as I felt last year
4	No, not really Just as welcome now as I felt last year
5	Yes, definitely Just as welcome now as I felt last year

```
Respondent
       1
                   Tech articles written by other developers; Indu...
                                                                              Man
       2
                   Tech articles written by other developers; Indu...
                                                                      19.0
                                                                              Man
       3
                   Tech meetups or events in your area; Courses on...
                                                                              Man
                                                                      28.0
       4
                   Tech articles written by other developers; Indu...
                                                                      22.0
                                                                              Man
                   Tech meetups or events in your area; Courses on...
                                                                              Man
       5
                                                                      30.0
                                        Sexuality \
                  Trans
       Respondent
       1
                     No
                         Straight / Heterosexual
       2
                         Straight / Heterosexual
       3
                     No
                         Straight / Heterosexual
       4
                     No
                         Straight / Heterosexual
       5
                         Straight / Heterosexual
                                                   Ethnicity Dependents \
       Respondent
       1
                                                         NaN
                                                                      No
       2
                                                         NaN
                                                                      No
       3
                                                         NaN
                                                                     Yes
       4
                                White or of European descent
                                                                      Nο
       5
                   White or of European descent; Multiracial
                                                                      No
                             SurveyLength
                                                            SurveyEase
       Respondent
       1
                   Appropriate in length Neither easy nor difficult
       2
                   Appropriate in length Neither easy nor difficult
                                           Neither easy nor difficult
       3
                   Appropriate in length
       4
                   Appropriate in length
                                                                  Easy
       5
                   Appropriate in length
                                                                  Easy
[196]: df.shape
[196]: (88883, 84)
[197]: df.columns
[197]: Index(['MainBranch', 'Hobbyist', 'OpenSourcer', 'OpenSource', 'Employment',
              'Country', 'Student', 'EdLevel', 'UndergradMajor', 'EduOther',
              'OrgSize', 'DevType', 'YearsCode', 'Age1stCode', 'YearsCodePro',
              'CareerSat', 'JobSat', 'MgrIdiot', 'MgrMoney', 'MgrWant', 'JobSeek',
              'LastHireDate', 'LastInt', 'FizzBuzz', 'JobFactors', 'ResumeUpdate',
              'CurrencySymbol', 'CurrencyDesc', 'CompTotal', 'CompFreq',
              'ConvertedComp', 'WorkWeekHrs', 'WorkPlan', 'WorkChallenge',
              'WorkRemote', 'WorkLoc', 'ImpSyn', 'CodeRev', 'CodeRevHrs', 'UnitTests',
              'PurchaseHow', 'PurchaseWhat', 'LanguageWorkedWith',
```

SONewContent

Age Gender \

```
'DatabaseDesireNextYear', 'PlatformWorkedWith',
              'PlatformDesireNextYear', 'WebFrameWorkedWith',
              'WebFrameDesireNextYear', 'MiscTechWorkedWith',
              'MiscTechDesireNextYear', 'DevEnviron', 'OpSys', 'Containers',
              'BlockchainOrg', 'BlockchainIs', 'BetterLife', 'ITperson', 'OffOn',
              'SocialMedia', 'Extraversion', 'ScreenName', 'SOVisit1st',
              'SOVisitFreq', 'SOVisitTo', 'SOFindAnswer', 'SOTimeSaved',
              'SOHowMuchTime', 'SOAccount', 'SOPartFreq', 'SOJobs', 'EntTeams',
              'SOComm', 'WelcomeChange', 'SONewContent', 'Age', 'Gender', 'Trans',
              'Sexuality', 'Ethnicity', 'Dependents', 'SurveyLength', 'SurveyEase'],
             dtype='object')
[198]: pd.set_option('display.max_columns',85)
       pd.set_option('display.max_rows',85)
[199]: | schema_df = pd.read_csv('D:\Data Science\sheets\survey_results_schema.
       schema_df
[199]:
                                                                     QuestionText
       Column
      Respondent
                               Randomized respondent ID number (not in order ...
      MainBranch
                               Which of the following options best describes ...
      Hobbyist
                                                          Do you code as a hobby?
       OpenSourcer
                                     How often do you contribute to open source?
       OpenSource
                               How do you feel about the quality of open sour...
       Employment
                               Which of the following best describes your cur...
                                       In which country do you currently reside?
       Country
       Student
                               Are you currently enrolled in a formal, degree...
       EdLevel
                               Which of the following best describes the high...
                               What was your main or most important field of ...
       UndergradMajor
       EduOther
                               Which of the following types of non-degree edu...
                               Approximately how many people are employed by ...
       OrgSize
      DevType
                               Which of the following describe you? Please se...
      YearsCode
                               Including any education, how many years have y...
      Age1stCode
                               At what age did you write your first line of c...
                               How many years have you coded professionally (...
       YearsCodePro
       CareerSat
                               Overall, how satisfied are you with your caree...
       JobSat
                               How satisfied are you with your current job? (...
      MgrIdiot
                               How confident are you that your manager knows ...
                               Do you believe that you need to be a manager t...
      MgrMoney
      MgrWant
                               Do you want to become a manager yourself in th...
       JobSeek
                               Which of the following best describes your cur...
      LastHireDate
                               When was the last time that you took a job wit...
                               In your most recent successful job interview (...
      LastInt
       FizzBuzz
                               Have you ever been asked to solve FizzBuzz in ...
```

'LanguageDesireNextYear', 'DatabaseWorkedWith',

JobFactors ResumeUpdate CurrencySymbol CurrencyDesc CompTotal CompFreq ConvertedComp WorkWeekHrs WorkPlan WorkChallenge WorkRemote WorkLoc ImpSyn CodeRev CodeRevHrs UnitTests PurchaseHow PurchaseWhat LanguageWorkedWith LanguageDesireNextYear DatabaseWorkedWith DatabaseDesireNextYear PlatformWorkedWith PlatformDesireNextYear WebFrameWorkedWith WebFrameDesireNextYear MiscTechWorkedWith DevEnviron av2q0 Containers BlockchainOrg BlockchainIs BetterLife ITperson OffOn SocialMedia Extraversion ScreenName SOVisit1st SOVisitFreq SOVisitTo SOFindAnswer SOTimeSaved SOHowMuchTime SOAccount

SOPartFreq

Imagine that you are deciding between two job ... Think back to the last time you updated your r... Which currency do you use day-to-day? If your ... Which currency do you use day-to-day? If your ... What is your current total compensation (salar... Is that compensation weekly, monthly, or yearly? Salary converted to annual USD salaries using ... On average, how many hours per week do you work? How structured or planned is your work? Of these options, what are your greatest chall... How often do you work remotely? Where would you prefer to work? For the specific work you do, and the years of ... Do you review code as part of your work? On average, how many hours per week do you spe... Does your company regularly employ unit tests ... How does your company make decisions about pur... What level of influence do you, personally, ha... Which of the following programming, scripting,... Which of the following programming, scripting,... Which of the following database environments h... Which of the following database environments h... Which of the following platforms have you done ... Which of the following platforms have you done... Which of the following web frameworks have you... Which of the following web frameworks have you... Which of the following other frameworks, libra... MiscTechDesireNextYear Which of the following other frameworks, libra... Which development environment(s) do you use re... What is the primary operating system in which ... How do you use containers (Docker, Open Contai... How is your organization thinking about or imp... Blockchain / cryptocurrency technology is prim... Do you think people born today will have a bet ... Are you the "IT support person" for your family? Have you tried turning it off and on again? What social media site do you use the most? Do you prefer online chat or IRL conversations? What do you call it? To the best of your memory, when did you first... How frequently would you say you visit Stack O... I visit Stack Overflow to... (check all that a... On average, how many times a week do you find ... Think back to the last time you solved a codin... About how much time did you save? If you're no... Do you have a Stack Overflow account? How frequently would you say you participate i...

```
EntTeams
                                Have you ever used Stack Overflow for Enterpri...
       SOComm
                                Do you consider yourself a member of the Stack...
       WelcomeChange
                                Compared to last year, how welcome do you feel ...
       SONewContent
                                Would you like to see any of the following on ...
                                What is your age (in years)? If you prefer not ...
       Age
       Gender
                                Which of the following do you currently identi...
       Trans
                                                   Do you identify as transgender?
                                Which of the following do you currently identi...
       Sexuality
                                Which of the following do you identify as? Ple...
       Ethnicity
                                Do you have any dependents (e.g., children, el...
       Dependents
       SurveyLength
                                How do you feel about the length of the survey...
       SurveyEase
                                How easy or difficult was this survey to compl...
[200]: df.sort_index(inplace=True)
[201]: df['Hobbyist']
[201]: Respondent
       1
                Yes
       2
                 No
       3
                Yes
       4
                 No
       5
                Yes
       88879
                Yes
       88880
                Yes
       88881
                Yes
       88882
                Yes
       88883
                Yes
       Name: Hobbyist, Length: 88883, dtype: object
[202]: df.loc[0:3, 'Hobbyist': 'Employment']
[202]:
                  Hobbyist
                                          OpenSourcer \
       Respondent
                        Yes
                                                Never
       1
       2
                         No
                             Less than once per year
                        Yes
       3
                                                Never
                                                             OpenSource \
       Respondent
       1
                    The quality of OSS and closed source software ...
       2
                    The quality of OSS and closed source software ...
       3
                    The quality of OSS and closed source software ...
```

Have you ever used or visited Stack Overflow J...

SOJobs

Employment

```
Respondent
                   Not employed, and not looking for work
       2
                        Not employed, but looking for work
       3
                                         Employed full-time
[203]:
      df['Hobbyist'].value_counts()
[203]: Yes
              71257
       No
              17626
       Name: Hobbyist, dtype: int64
[204]: |filt=df['LanguageWorkedWith'].str.contains('Python',na=False)
[205]:
       filt
[205]: Respondent
       1
                 True
       2
                 True
       3
                False
       4
                 True
       5
                 True
       88879
                 True
       88880
                False
       88881
                 True
       88882
                 True
       88883
                False
       Name: LanguageWorkedWith, Length: 88883, dtype: bool
      df.loc[filt]
[206]:
[206]:
                                                 MainBranch Hobbyist \
       Respondent
                    I am a student who is learning to code
       1
                                                                  Yes
       2
                    I am a student who is learning to code
                                                                   No
       4
                            I am a developer by profession
                                                                   No
                            I am a developer by profession
       5
                                                                  Yes
       8
                               I code primarily as a hobby
                                                                  Yes
       88874
                            I am a developer by profession
                                                                  Yes
       88876
                            I am a developer by profession
                                                                  Yes
                            I am a developer by profession
       88879
                                                                  Yes
       88881
                            I am a developer by profession
                                                                  Yes
       88882
                            I am a developer by profession
                                                                  Yes
                                   OpenSourcer \
       Respondent
```

```
1
                                  Never
2
                Less than once per year
4
                                  Never
5
            Once a month or more often
8
                Less than once per year
88874
            Once a month or more often
88876
                                  Never
88879
                                  Never
88881
            Once a month or more often
88882
                                  Never
                                                      OpenSource \
Respondent
            The quality of OSS and closed source software ...
1
2
            The quality of OSS and closed source software ...
4
            The quality of OSS and closed source software ...
5
            OSS is, on average, of HIGHER quality than pro...
8
            OSS is, on average, of HIGHER quality than pro...
88874
            OSS is, on average, of LOWER quality than prop...
88876
            OSS is, on average, of HIGHER quality than pro...
88879
            The quality of OSS and closed source software ...
88881
            OSS is, on average, of HIGHER quality than pro...
88882
            OSS is, on average, of LOWER quality than prop...
                                                                      Country \
                                          Employment
Respondent
1
            Not employed, and not looking for work
                                                               United Kingdom
2
                 Not employed, but looking for work
                                                      Bosnia and Herzegovina
4
                                  Employed full-time
                                                                United States
5
                                                                      Ukraine
                                  Employed full-time
8
                Not employed, but looking for work
                                                                         India
88874
                                  Employed full-time
                                                                United States
88876
                                  Employed full-time
                                                                United States
88879
                                 Employed full-time
                                                                      Finland
88881
                                 Employed full-time
                                                                      Austria
88882
                                  Employed full-time
                                                                  Netherlands
                    Student
                                                                          EdLevel \
Respondent
1
                         No
                                                       Primary/elementary school
2
            Yes, full-time
                             Secondary school (e.g. American high school, G...
4
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                         No
5
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                         No
8
                        NaN
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
```

```
88874
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                         No
88876
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
88879
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
                         No
88881
                         No
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
88882
            Yes, full-time
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
                                                 UndergradMajor \
Respondent
1
                                                             NaN
2
                                                             NaN
4
            Computer science, computer engineering, or sof ...
5
            Computer science, computer engineering, or sof ...
8
            Computer science, computer engineering, or sof...
88874
            A social science (ex. anthropology, psychology...
88876
            Computer science, computer engineering, or sof...
88879
            Computer science, computer engineering, or sof...
88881
            Computer science, computer engineering, or sof...
88882
            Computer science, computer engineering, or sof...
                                                        EduOther \
Respondent
1
            Taught yourself a new language, framework, or ...
2
            Taken an online course in programming or softw...
4
            Taken an online course in programming or softw...
5
            Taken an online course in programming or softw...
8
            Taught yourself a new language, framework, or ...
88874
            Taken an online course in programming or softw...
            Received on-the-job training in software devel...
88876
88879
            Taught yourself a new language, framework, or ...
88881
            Taken an online course in programming or softw...
88882
            Participated in online coding competitions (e...
                              OrgSize \
Respondent
1
                                  NaN
2
                                  NaN
4
                 100 to 499 employees
5
             10,000 or more employees
8
                                  NaN
88874
             10,000 or more employees
88876
             10,000 or more employees
88879
                   20 to 99 employees
88881
                 100 to 499 employees
```

88882 100 to 499 employees

			DevType	YearsCode \	
Respondent					
1			NaN	4	
2	Developer, de	esktop or enterprise		NaN	
4			loper, full-stack		
5		earcher;Developer, de	_	16	
8	Developer	, back-end; Engineer,	site reliability	8	
	5				
88874		st or machine learnin	• •	7	
88876	_	<pre>back-end;Developer,</pre>		8	
88879	_	esktop or enterprise		17	
88881	_	full-stack; Engineer,	•		
88882	Academic rese	earcher;Database admi	inistrator;Dev	10	
	Age1stCode	YearsCodePro		CareerSat	\
Respondent					
1	10	NaN		NaN	
2	17	NaN		NaN	
4	16 Le	ess than 1 year		Very satisfied	
5	14	9	Ver	y dissatisfied	
8	16	NaN		NaN	
•••	•••	•••		•••	
88874	19	4		Very satisfied	
88876	15	2		Very satisfied	
88879	16	7	Slig	htly satisfied	
88881	17	9 Neit	ther satisfied no	r dissatisfied	
88882	15	8	Slightl	y dissatisfied	
		JobSa	at. M	grIdiot \	
Respondent		00000	11	Sirarou (
1		Na	a N	NaN	
2		Na		NaN	
4		Slightly satisfie			
5		Slightly dissatisfie			
8		Na		NaN	
		•••			
88874		Very satisfie	ed	NaN	
88876		Slightly satisfie		nfident	
88879	Neither satis	sfied nor dissatisfie		nfident	
88881	Neither satis	sfied nor dissatisfie	ed Very co	nfident	
88882		Very dissatisfie	· · · · · · · · · · · · · · · · · · ·		
_	${ t MgrMoney}$	MgrWant	\		
Respondent	NaN	NaN			

2 4 5 8 88874 88876 88879	NaN NaN No Not sure Yes No NaN NaN NaN NaN Yes Not sure Not sure I am already a manager
88881 88882	No No Yes Yes
Respondent 1 2 4 5	JobSeek \ NaN I am actively looking for a job I am not interested in new job opportunities I am not interested in new job opportunities NaN
88874 88876 88879 88881 88882	I am not interested in new job opportunities I'm not actively looking, but I am open to new I'm not actively looking, but I am open to new I am not interested in new job opportunities I'm not actively looking, but I am open to new
	LastHireDate \
Respondent	M- N
1 2	NaN I've never had a job
4	Less than a year ago
5	Less than a year ago
8	NaN
	Tors then a week and
88874 88876	Less than a year ago 1-2 years ago
88879	More than 4 years ago
88881	More than 4 years ago
88882	Less than a year ago
Respondent	LastInt FizzBuzz \
1	NaN NaN
2	NaN NaN
4	Write code by hand (e.g., on a whiteboard); Int No
5	Write any code; Write code by hand (e.g., on a No
8	NaN NaN
•••	•••

88874 88876	Write code by hand (e.g., on a whiteboard); Sol Write code by hand (e.g., on a whiteboard)	No No
88879	·	No
88881		No
88882		No
00002	"III of any code, complete a came nome project, iiii	
	JobFactors \	
Respondent	(
1	NaN	
2	Financial performance or funding status of the	
4	Languages, frameworks, and other technologies	
5	Industry that I'd be working in; Languages, fra	
8	NaN	
 88874	Specific department or team I'd be working on;	
88876	Office environment or company culture; Remote w	
88879	Languages, frameworks, and other technologies	
88881	Office environment or company culture; Diversit	
88882	Office environment or company culture; Remote w	
00002	office charlement of company curvate, we move w	
	ResumeUpdate Curr	encvSvmbol \
Respondent	1000 amoo paa oo o aa a	SHOYDYMDOT (
1	NaN	NaN
2	Something else changed (education, award, medi	NaN
4	I was preparing for a job search	USD
5	I was preparing for a job search	UAH
8	nan	NaN
O	14014	wan
 88874	I was preparing for a job search	 USD
88876	My job status changed (promotion, new job, etc.)	USD
88879	I had a negative experience or interaction at	EUR
88881	Something else changed (education, award, medi	EUR
88882	I had a negative experience or interaction at	EUR
00002	i had a negative experience of interaction at	LOIL
	CurrencyDesc CompTotal CompFreq ConvertedCom	n \
Respondent	ourious/pope comprised comprised converted	,
1	NaN NaN NaN Na	N
2	Nan Nan Nan Na	
4	United States dollar 61000.0 Yearly 61000.0	
5	Ukrainian hryvnia NaN NaN Na	
8	NaN NaN NaN Na	
		.•
 88874	United States dollar 185000.0 Weekly 2000000.	0
88876	United States dollar 180000.0 Weekly 2000000.0	
88879	European Euro 6000.0 Monthly 82488.0	
88881	European Euro 60000.0 Fonting 62466.0	
88882	•	
00002	European Euro 42768.0 Monthly 588012.	J

	WorkWeekHrs		WorkPlan	\
Respondent				
1	NaN		NaN	
2	NaN		NaN	
4	80.00 There's no schedule or spec; I work	on wh	at se	
5	55.00 There is a schedule and/or spec (ma	ide by	me or	
8	NaN	v	NaN	
•••	•••		•••	
88874	50.00 There is a schedule and/or spec (ma	ade by	me or	
88876	40.00 There is a schedule and/or spec (ma	•		
88879	37.75 There is a schedule and/or spec (ma	•		
88881	39.00 There is a schedule and/or spec (ma	•		
88882	40.00 There is a schedule and/or spec (ma	•		
00002	10.00 India is a solidatio and, of spec (me	ido by	OI	
.	WorkChalleng	ge \		
Respondent	Y.	27		
1	Na			
2	Na 			
4	Na	ιN		
5	Being tasked with non-development work; Inadequ			
8	Na	ıN		
				
88874	Being tasked with non-development work; Not eno			
88876	Distracting work environment; Meetings; Time spe			
88879	Being tasked with non-development work; Distrac			
88881	Distracting work environment; Not enough people			
88882	Distracting work environment; Lack of support f			
	WorkRemot	-a Work	Loc \	
Respondent	WOIKItemot	,e work	LUC (
1	Na	a N	NaN	
2	Na Na		NaN	
4	Less than once per month / Neve		lome	
5	A few days each month			
8	Na Tew days eden mone		NaN	
O	NC	LIV	Ivaiv	
 88874	About half the time	 ne Off	ice	
88876	Less than half the time, but at least one day			
88879	Less than once per month / Neve		lome	
88881	A few days each mont		ice	
88882	•			
00002	Less than once per month / Neve	, т. П	Iome	
	ImpSyn		CodeRev	, \
Respondent				
1	NaN		NaN	ſ
2	NaN		NaN	Ī

```
4
            A little below average
                                                                            No
            A little above average
5
                                     Yes, because I see value in code review
8
                                NaN
                                                                           NaN
88874
                                    Yes, because I see value in code review
            A little above average
88876
                                     Yes, because I see value in code review
                            Average
88879
                                     Yes, because I see value in code review
                 Far above average
88881
            A little below average
                                     Yes, because I see value in code review
88882
                 Far above average Yes, because I see value in code review
            CodeRevHrs
                                             UnitTests \
Respondent
1
                   NaN
                                                    NaN
2
                   NaN
                                                    NaN
4
                   NaN
                             No, but I think we should
                        Yes, it's part of our process
5
                    NaN
8
                    NaN
                                                    NaN
88874
                    5.0
                        Yes, it's part of our process
88876
                        Yes, it's part of our process
                   3.0
88879
                  10.0 Yes, it's part of our process
88881
                  10.0 Yes, it's part of our process
88882
                   5.0 Yes, it's part of our process
                                                    PurchaseHow \
Respondent
1
                                                            NaN
2
4
            Developers typically have the most influence o...
5
                                                       Not sure
8
                                                            NaN
            Developers and management have nearly equal in...
88874
88876
                                                       Not sure
88879
            Developers and management have nearly equal in...
88881
            The CTO, CIO, or other management purchase new...
88882
                                                       Not sure
                              PurchaseWhat \
Respondent
                                       NaN
2
            I have little or no influence
5
            I have little or no influence
8
                                       NaN
88874
                    I have some influence
```

```
88876
             I have little or no influence
88879
             I have little or no influence
88881
             I have little or no influence
88882
             I have little or no influence
                                              LanguageWorkedWith \
Respondent
1
                                HTML/CSS; Java; JavaScript; Python
2
                                             C++; HTML/CSS; Python
4
                                             C;C++;C#;Python;SQL
5
                   C++; HTML/CSS; Java; JavaScript; Python; SQL; VBA
8
             Bash/Shell/PowerShell;C;C++;HTML/CSS;Java;Java...
88874
                                            C++; Python; Scala; SQL
88876
             Bash/Shell/PowerShell;C#;HTML/CSS;Java;Python;...
88879
                               Bash/Shell/PowerShell; C++; Python
88881
             Bash/Shell/PowerShell;Go;HTML/CSS;Java;JavaScr...
88882
                         C#; HTML/CSS; Java; JavaScript; PHP; Python
                                          LanguageDesireNextYear
Respondent
1
               C;C++;C#;Go;HTML/CSS;Java;JavaScript;Python;SQL
2
                                     C++; HTML/CSS; JavaScript; SQL
4
                                             C;C#;JavaScript;SQL
5
                      HTML/CSS; Java; JavaScript; SQL; WebAssembly
8
             Bash/Shell/PowerShell; C; C++; Elixir; Erlang; Go; P...
88874
                                                               NaN
88876
                                            C#; Java; Kotlin; Scala
88879
88881
             Bash/Shell/PowerShell;Go;HTML/CSS;JavaScript;P...
88882
                                          C#; Java; JavaScript; PHP
                                              DatabaseWorkedWith
Respondent
1
                                                           SQLite
2
                                                              NaN
4
                                                     MySQL; SQLite
5
              Couchbase; MongoDB; MySQL; Oracle; PostgreSQL; SQLite
8
             Cassandra; Elasticsearch; MongoDB; MySQL; Oracle; R...
88874
                                Elasticsearch; PostgreSQL; SQLite
88876
                                                   DynamoDB; MySQL
88879
                                                               NaN
88881
                                                PostgreSQL; Redis
88882
                                              MariaDB; PostgreSQL
```

	DatabaseDesireNextYear	\
Respondent		
1	MySQL	
2	MySQL	
4	MySQL;SQLite	
5	Couchbase; Firebase; MongoDB; MySQL; Oracle; Postgr	
8	Cassandra; DynamoDB; Elasticsearch; Firebase; Mong	

88874	NaN	
88876	DynamoDB	
88879	NaN	
88881	Elasticsearch;PostgreSQL;Redis	
88882	MariaDB;PostgreSQL	
00002	Mai laub, i os egi esqi	
	${\tt PlatformWorkedWith}$	\
Respondent		
1	MacOS;Windows	
2	Windows	
4	Linux;Windows	
5	Android;Linux;MacOS;Slack;Windows	
8	AWS;Docker;Heroku;Linux;MacOS;Slack	
88874	AWS; Docker; Linux; MacOS; Slack	
88876	AWS;Linux;MacOS;Windows	
88879	Android; Linux; Windows	
88881	Docker; Kubernetes; Linux; MacOS; Microsoft Azure;	
88882	Android; Arduino; Linux; Raspberry Pi; WordPress	
	PlatformDesireNextYear	\
Respondent		
1	Android; Arduino; Windows	
2	Windows	
4	Linux; Windows	
5	Android; Docker; Kubernetes; Linux; Slack	
8	Android; Arduino; AWS; Docker; Google Cloud Platfo	
***	•••	
88874	NaN	
88876	Android; AWS; iOS; Linux; MacOS; Windows	
88879	Linux; Windows	
88881	Docker; Google Cloud Platform; iOS; Kubernetes; Li	
88882	Android; Arduino; Linux; Raspberry Pi; WordPress	
	WebFrameWorkedWith \	
Respondent		
1	Django;Flask	
2	Django	
4	NaN	

```
5
             Django;Express;Flask;jQuery;React.js;Spring
8
                            Express;Flask;React.js;Spring
88874
                                                         NaN
88876
                                                         NaN
88879
                                                         NaN
88881
                                            Django; React. js
                                            jQuery; React. js
88882
                            WebFrameDesireNextYear
Respondent
                                       Flask; jQuery
2
                                              Django
4
                                                 NaN
5
                      Flask; jQuery; React. js; Spring
8
             Django;Express;Flask;React.js;Vue.js
88874
                                                 NaN
88876
                                                 NaN
88879
88881
               Angular/Angular.js;Django;React.js
88882
                                    jQuery; React. js
                                   MiscTechWorkedWith
Respondent
                                               Node.js
1
2
                                                    NaN
4
                                                   .NET
5
                                      Cordova; Node. js
8
                                Hadoop; Node. js; Pandas
88874
                      Apache Spark; Pandas; TensorFlow
             Apache Spark; Hadoop; .NET Core; Unity 3D
88876
88879
                                                    NaN
88881
                                               Ansible
88882
                                              Unity 3D
                                           {\tt MiscTechDesireNextYear}
Respondent
1
                                                           Node.js
2
                                                                NaN
4
                                                               .NET
5
                       Apache Spark; Hadoop; Node. js; React Native
8
             Ansible; Apache Spark; Chef; Hadoop; Node.js; Panda...
88874
                                                                NaN
             Apache Spark; CryEngine; Hadoop; . NET; . NET Core; T...
88876
```

```
88879
                              TensorFlow; Unity 3D; Unreal Engine
88881
                                                 Ansible; Node. js
88882
                                                        Unity 3D
                                                      DevEnviron
                                                                          OpSys \
Respondent
1
                                     IntelliJ;Notepad++;PyCharm
                                                                       Windows
2
                                                    Atom; PyCharm
                                                                       Windows
4
                  Eclipse; Vim; Visual Studio; Visual Studio Code
                                                                       Windows
5
                                          IntelliJ;Notepad++;Vim Linux-based
             Atom; IntelliJ; IPython / Jupyter; PyCharm; Visual... Linux-based
8
88874
                    IPython / Jupyter; PyCharm; Sublime Text; Vim Linux-based
             IntelliJ;Notepad++;PyCharm;Sublime Text;Vim;Vi...
88876
                                                                       MacOS
88879
                    Android Studio; Notepad++; Vim; Visual Studio
                                                                       Windows
88881
                                   Emacs; Vim; Visual Studio Code
                                                                         MacOS
             Android Studio; IntelliJ; Notepad++; Vim; Visual S... Linux-based
88882
                                                      Containers \
Respondent
                                        I do not use containers
1
2
                                        I do not use containers
4
                                        I do not use containers
5
                        Outside of work, for personal projects
8
            Development; Testing; Production; Outside of work...
88874
                                 Development; Testing; Production
88876
                                        I do not use containers
88879
                                        I do not use containers
88881
            Development; Testing; Production; Outside of work...
88882
                                        I do not use containers
                                        BlockchainOrg \
Respondent
1
                                                   NaN
2
                                                   NaN
4
                                           Not at all
5
                                           Not at all
8
                                                   NaN
88874
                                                   NaN
88876
                                                   NaN
88879
                                            Not at all
88881
            Non-currency applications of blockchain
88882
                                            Not at all
```

24

BlockchainIs BetterLife \

Respondent	
1	NaN Yes
2	Useful across many domains and could change ma Yes
4	Useful for decentralized currency (i.e., Bitcoin) Yes
5	NaN Yes
8	Useful across many domains and could change ma Yes
 88874	 NaN Yes
88876	A passing fad Yes
88879	A passing fad Yes
88881	Useful for immutable record keeping outside of No
88882	A passing fad Yes
Pognondont	ITperson OffOn SocialMedia \
Respondent 1	Fortunately, someone else has that title Yes Twitter
2	Yes Yes Instagram
4	SIGH Yes Reddit
5	Also Yes Yes Facebook
8	SIGH Yes YouTube
•••	
88874	Yes Yes Reddit
88876	SIGH Yes Reddit
88879	NaN NaN YouTube
88881	Yes Yes NaN
88882	Yes Yes Instagram
	Extraversion ScreenName SOVisit1st \
Respondent	Extraversion between bovisions (
1	Online Username 2017
2	Online Username 2017
4	In real life (in person) Username 2014
5	In real life (in person) Username I don't remember
8	In real life (in person) Handle 2012
88874	In real life (in person) Username 2012
88876	Neither UserID 2011
88879 88881	Neither Username I don't remember Online Login 2008
88882	Online Login 2008 Neither Username 2009
00002	Nerther Osername 2009
	SOVisitFreq \
Respondent	
1	A few times per month or weekly
2	Daily or almost daily
4	Daily or almost daily
5	Multiple times per day

8	A few times per week
88874	A few times per week
88876	A few times per month or weekly
88879	A few times per month or weekly
88881	A few times per month or weekly
88882	A few times per week
	•
	SOVisitTo \
Respondent	
1	Find answers to specific questions; Learn how t
2	Find answers to specific questions; Learn how t
4	Find answers to specific questions; Pass the ti
5	Find answers to specific questions
8	Find answers to specific questions; Learn how t
 88874	Find answers to specific questions;Learn how t
88876	Find answers to specific questions
88879	Find answers to specific questions
88881	Find answers to specific questions
88882	Find answers to specific questions
00002	Tina answers to specific questions
	SOFindAnswer SOTimeSaved \
Respondent	boi indanswei boi imebaved /
1	3-5 times per week Stack Overflow was much faster
2	3-5 times per week Stack Overflow was much faster
4	1-2 times per week Stack Overflow was much faster
5	More than 10 times per week Stack Overflow was much faster
8	Less than once per week Stack Overflow was slightly faster
O	Less than once per week black overflow was slightly laster
 88874	
88876	1-2 times per week Stack Overflow was much faster
88879	Less than once per week Stack Overflow was much faster
88881	More than 10 times per week Stack Overflow was slightly faster
88882	3-5 times per week Stack Overflow was slightly faster
00002	5 5 times per week Stack Overliow was singuity laster
	SOHowMuchTime SOAccount SOPartFreq \
Pognondon+	Sundwruchtime Sunccount Surartried /
Respondent	21 60 minutes No.
1	31-60 minutes No NaN
2	11-30 minutes Yes A few times per month or weekly
4	31-60 minutes Yes Less than once per month or monthly
5	NaN Yes A few times per month or weekly
8	11-30 minutes Yes Less than once per month or monthly
88874	60+ minutes Yes A few times per month or weekly
88876	60+ minutes Yes Less than once per month or monthly
88879	60+ minutes No NaN

```
88881
            11-30 minutes
                                 Yes Less than once per month or monthly
88882
            11-30 minutes
                                 Yes Less than once per month or monthly
                                                         SOJobs \
Respondent
            No, I didn't know that Stack Overflow had a jo...
1
2
            No, I knew that Stack Overflow had a job board...
4
                                                             Yes
5
            No, I knew that Stack Overflow had a job board...
8
88874
                                                             Yes
88876
            No, I didn't know that Stack Overflow had a jo...
88879
            No, I didn't know that Stack Overflow had a jo...
88881
88882
            No, I knew that Stack Overflow had a job board...
                                                       EntTeams
Respondent
                           No, and I don't know what those are
1
2
                           No, and I don't know what those are
4
                           No, and I don't know what those are
5
            No, I've heard of them, but I am not part of a...
                           No, and I don't know what those are
8
88874
                           No, and I don't know what those are
88876
                           No, and I don't know what those are
88879
                           No, and I don't know what those are
88881
            No, I've heard of them, but I am not part of a...
88882
                           No, and I don't know what those are
                      SOComm
Respondent
1
                     Neutral
2
              Yes, somewhat
4
             No, not really
            Yes, definitely
5
            Yes, definitely
8
88874
              Yes, somewhat
88876
              Yes, somewhat
88879
             No, not at all
88881
                     Neutral
88882
             No, not really
```

Respondent

WelcomeChange \

```
1
                       Just as welcome now as I felt last year
2
                       Just as welcome now as I felt last year
4
                       Just as welcome now as I felt last year
5
                       Just as welcome now as I felt last year
8
                         A lot more welcome now than last year
88874
                       Just as welcome now as I felt last year
88876
                         A lot less welcome now than last year
88879
            Not applicable - I did not use Stack Overflow ...
88881
88882
                       Just as welcome now as I felt last year
                                                    SONewContent
                                                                    Age Gender \
Respondent
             Tech articles written by other developers; Indu...
                                                                         Man
1
                                                                 14.0
2
             Tech articles written by other developers; Indu...
                                                                 19.0
                                                                         Man
4
            Tech articles written by other developers; Indu...
                                                                 22.0
                                                                         Man
5
            Tech meetups or events in your area; Courses on...
                                                                 30.0
                                                                         Man
8
             Tech articles written by other developers; Indu...
                                                                          Man
88874
                                                              NaN
                                                                   26.0
                                                                           Man
                                                                   23.0
88876
                                                              NaN
                                                                           Man
88879
                                                                   34.0
                                                              {\tt NaN}
                                                                           Man
88881
                                                                   37.0
                                                              NaN
                                                                           Man
88882
                                                              NaN
                                                                    NaN
                                                                           Man
           Trans
                                  Sexuality \
Respondent
1
               No
                   Straight / Heterosexual
2
                   Straight / Heterosexual
               No
4
               No
                   Straight / Heterosexual
5
               No
                   Straight / Heterosexual
8
                   Straight / Heterosexual
88874
                   Straight / Heterosexual
               No
88876
                   Straight / Heterosexual
               No
88879
               No
                   Straight / Heterosexual
88881
                   Straight / Heterosexual
88882
                   Straight / Heterosexual
                                              Ethnicity Dependents
Respondent
                                                    NaN
1
                                                                 No
2
                                                    NaN
                                                                 No
4
                         White or of European descent
                                                                 No
5
             White or of European descent; Multiracial
                                                                 No
8
                                                    NaN
                                                                NaN
```

```
88876
                               White or of European descent
                                                                     No
       88879
                               White or of European descent
                                                                     No
       88881
                               White or of European descent
                                                                     No
       88882
                               White or of European descent
                                                                    Yes
                            SurveyLength
                                                           SurveyEase
      Respondent
                   Appropriate in length Neither easy nor difficult
       1
       2
                   Appropriate in length Neither easy nor difficult
       4
                   Appropriate in length
                                                                 Easy
       5
                   Appropriate in length
                                                                 Easy
                   Appropriate in length Neither easy nor difficult
       8
       88874
                   Appropriate in length
                                                                 Easy
       88876
                   Appropriate in length
                                                                 Easy
       88879
                   Appropriate in length
                                                                 Easy
       88881
                   Appropriate in length
                                                                 Easy
       88882
                                Too long
                                                                 Easy
       [36443 rows x 84 columns]
[207]: df.rename(columns={'ConvertedComp':'SalaryUSD'},inplace= True)
[208]: df.columns
[208]: Index(['MainBranch', 'Hobbyist', 'OpenSourcer', 'OpenSource', 'Employment',
              'Country', 'Student', 'EdLevel', 'UndergradMajor', 'EduOther',
              'OrgSize', 'DevType', 'YearsCode', 'Age1stCode', 'YearsCodePro',
              'CareerSat', 'JobSat', 'MgrIdiot', 'MgrMoney', 'MgrWant', 'JobSeek',
              'LastHireDate', 'LastInt', 'FizzBuzz', 'JobFactors', 'ResumeUpdate',
              'CurrencySymbol', 'CurrencyDesc', 'CompTotal', 'CompFreq', 'SalaryUSD',
              'WorkWeekHrs', 'WorkPlan', 'WorkChallenge', 'WorkRemote', 'WorkLoc',
              'ImpSyn', 'CodeRev', 'CodeRevHrs', 'UnitTests', 'PurchaseHow',
              'PurchaseWhat', 'LanguageWorkedWith', 'LanguageDesireNextYear',
              'DatabaseWorkedWith', 'DatabaseDesireNextYear', 'PlatformWorkedWith',
              'PlatformDesireNextYear', 'WebFrameWorkedWith',
              'WebFrameDesireNextYear', 'MiscTechWorkedWith',
              'MiscTechDesireNextYear', 'DevEnviron', 'OpSys', 'Containers',
              'BlockchainOrg', 'BlockchainIs', 'BetterLife', 'ITperson', 'OffOn',
              'SocialMedia', 'Extraversion', 'ScreenName', 'SOVisit1st',
              'SOVisitFreq', 'SOVisitTo', 'SOFindAnswer', 'SOTimeSaved',
              'SOHowMuchTime', 'SOAccount', 'SOPartFreq', 'SOJobs', 'EntTeams',
              'SOComm', 'WelcomeChange', 'SONewContent', 'Age', 'Gender', 'Trans',
              'Sexuality', 'Ethnicity', 'Dependents', 'SurveyLength', 'SurveyEase'],
             dtype='object')
```

White or of European descent

No

88874

```
[209]: df['Hobbyist'].map({'Yes': True, 'No':False})
[209]: Respondent
       1
                 True
       2
                False
       3
                 True
       4
                False
       5
                 True
       88879
                  True
       88880
                 True
       88881
                 True
       88882
                 True
       88883
                 True
       Name: Hobbyist, Length: 88883, dtype: bool
[210]: df['Hobbyist']=df['Hobbyist'].map({'Yes': True, 'No':False})
[211]: df
[211]:
                                                             MainBranch Hobbyist \
       Respondent
       1
                               I am a student who is learning to code
                                                                             True
       2
                               I am a student who is learning to code
                                                                            False
       3
                    I am not primarily a developer, but I write co...
                                                                           True
                                        I am a developer by profession
                                                                            False
       4
       5
                                        I am a developer by profession
                                                                              True
       88879
                                        I am a developer by profession
                                                                             True
       88880
                    I am not primarily a developer, but I write co...
                                                                           True
       88881
                                        I am a developer by profession
                                                                             True
       88882
                                        I am a developer by profession
                                                                             True
       88883
                                        I am a developer by profession
                                                                             True
                                   OpenSourcer \
       Respondent
       1
                                          Never
       2
                       Less than once per year
       3
                                          Never
       4
                                          Never
       5
                    Once a month or more often
       88879
                                          Never
       88880
                                          Never
       88881
                    Once a month or more often
       88882
                                          Never
       88883
                    Once a month or more often
```

```
Respondent
1
            The quality of OSS and closed source software ...
2
            The quality of OSS and closed source software ...
3
            The quality of OSS and closed source software ...
4
            The quality of OSS and closed source software ...
5
            OSS is, on average, of HIGHER quality than pro...
88879
            The quality of OSS and closed source software ...
88880
            The quality of OSS and closed source software ...
88881
            OSS is, on average, of HIGHER quality than pro...
88882
            OSS is, on average, of LOWER quality than prop...
88883
            OSS is, on average, of HIGHER quality than pro...
                                          Employment
                                                                      Country \
Respondent
1
            Not employed, and not looking for work
                                                               United Kingdom
2
                Not employed, but looking for work
                                                      Bosnia and Herzegovina
3
                                 Employed full-time
                                                                     Thailand
4
                                 Employed full-time
                                                                United States
5
                                 Employed full-time
                                                                      Ukraine
88879
                                 Employed full-time
                                                                      Finland
88880
                                                                United States
                                 Employed full-time
88881
                                 Employed full-time
                                                                      Austria
88882
                                 Employed full-time
                                                                  Netherlands
88883
                                 Employed full-time
                                                                       Greece
                    Student
                                                                         EdLevel \
Respondent
                                                      Primary/elementary school
1
                         No
2
            Yes, full-time
                             Secondary school (e.g. American high school, G...
3
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
4
                         No
5
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
88879
                         No
88880
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
                         No
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
88881
                                   Master's degree (MA, MS, M.Eng., MBA, etc.)
88882
            Yes, full-time
88883
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                                                 UndergradMajor
Respondent
1
                                                             NaN
2
                                                             NaN
```

OpenSource \

```
3
                                  Web development or web design
4
            Computer science, computer engineering, or sof...
5
            Computer science, computer engineering, or sof...
88879
            Computer science, computer engineering, or sof...
88880
            Computer science, computer engineering, or sof ...
88881
            Computer science, computer engineering, or sof ...
88882
            Computer science, computer engineering, or sof ...
88883
            Computer science, computer engineering, or sof...
                                                        EduOther \
Respondent
1
            Taught yourself a new language, framework, or ...
2
            Taken an online course in programming or softw...
3
            Taught yourself a new language, framework, or ...
4
            Taken an online course in programming or softw...
5
            Taken an online course in programming or softw...
88879
            Taught yourself a new language, framework, or ...
            Taught yourself a new language, framework, or ...
88880
88881
            Taken an online course in programming or softw...
            Participated in online coding competitions (e...
88882
88883
            Taught yourself a new language, framework, or ...
                              OrgSize \
Respondent
1
                                   NaN
2
                                   NaN
3
                 100 to 499 employees
4
                 100 to 499 employees
5
            10,000 or more employees
88879
                   20 to 99 employees
88880
                        2-9 employees
88881
                 100 to 499 employees
88882
                 100 to 499 employees
88883
                   20 to 99 employees
                                                         DevType YearsCode \
Respondent
                                                                          4
                                                             NaN
2
            Developer, desktop or enterprise applications; ...
                                                                      NaN
3
            Designer; Developer, back-end; Developer, front-...
4
                                          Developer, full-stack
                                                                          3
5
            Academic researcher; Developer, desktop or ente...
                                                                       16
88879
            Developer, desktop or enterprise applications; ...
                                                                       17
```

88880	Developer, mobile; Er	ngineering manag	ger;Product	20			
88881	Developer, full-stack; Engineer, site reliability			18			
88882	Academic researcher; Database administrator; Dev			10			
88883	Developer, back-end;	Developer, desk	top or ente	9			
	Age1stCode Years	sCodePro		CareerSat	\		
Respondent							
1	10	NaN		NaN			
2	17	NaN		NaN			
3	22	1	Slig	htly satisfied			
4	16 Less than	ı 1 year	_	Very satisfied			
5	14	9		y dissatisfied			
•••	•••	•••		•••			
88879	16	7	Slig	htly satisfied			
88880	12	20	_	y dissatisfied			
88881	17	9 Neithe	er satisfied no	~			
88882	15	8		y dissatisfied			
88883	15	5	_	y dissatisfied			
00000	10	· ·	51181101	j dibbdoibiiou			
		JobSat	М	grIdiot \			
Respondent							
1		NaN		NaN			
2		NaN		NaN			
3	Slip	ghtly satisfied	Not at all co				
4	-	ghtly satisfied	Very co				
5	-	ly dissatisfied	Somewhat co				
Ü	51181101	ly dibbdoibilou	Domowna o	111 140110			
 88879	Neither satisfied no	or dissatisfied	Not at all co	mfident			
88880	Neither satisfied no		noo do dii oo	NaN			
88881	Neither satisfied no		Very co	nfident			
88882		ry dissatisfied	Not at all co				
88883		y dissatisfied	Not at all co				
00000	prigno	ly dissatisfied	NOU AU AII CO	mildent			
	MgrMoney	MgrWant \					
Respondent	11611101101	1181 114110	`				
1	NaN	NaN					
2	NaN	NaN					
3	Not sure	Not sure					
4	No No	Not sure					
5							
5	Yes	No					
 88879	 Not sure I am alrea	 ady a manager					
88880	NaN	NaN					
88881	No	No					
88882	Yes	Yes					
88883	No	No					

JobSeek \ Respondent NaN 2 I am actively looking for a job 3 I'm not actively looking, but I am open to new... I am not interested in new job opportunities I am not interested in new job opportunities 5 I'm not actively looking, but I am open to new ... 88879 I'm not actively looking, but I am open to new ... 88880 I am not interested in new job opportunities 88881 88882 I'm not actively looking, but I am open to new ... 88883 I'm not actively looking, but I am open to new ... LastHireDate \ Respondent 1 NaN 2 I've never had a job 3 1-2 years ago 4 Less than a year ago 5 Less than a year ago 88879 More than 4 years ago 88880 Less than a year ago More than 4 years ago 88881 88882 Less than a year ago 88883 More than 4 years ago LastInt FizzBuzz Respondent 1 NaN NaN 2 NaN NaN 3 Interview with people in peer roles No 4 Write code by hand (e.g., on a whiteboard); Int... No 5 Write any code; Write code by hand (e.g., on a ... No 88879 Complete a take-home project; Interview with pe... No 88880 Interview with people in peer roles; Interview ... No 88881 Write any code; Complete a take-home project; In... No Write any code; Complete a take-home project; In... 88882 No Interview with people in senior / management r... 88883 No JobFactors \ Respondent NaN 1 2 Financial performance or funding status of the... 3 Languages, frameworks, and other technologies ...

4	Languages, frameworks, and other technologies					
5	Industry that I'd be working in; Languages, fra					
•••						
88879	Languages, frameworks, and other technologies					
88880	Office environment or company culture; Remote w					
88881	Office environment or company culture; Diversit					
88882						
88883	Office environment or company culture; Remote w					
00003	Financial performance or funding status of the					
	Dogum alle data Comman and Comb	7 \				
ъ .	ResumeUpdate CurrencySymb	ют /				
Respondent	77 T7 37					
1		IaN				
2	Something else changed (education, award, medi NaN					
3		THB				
4	I was preparing for a job search	JSD				
5	I was preparing for a job search UAH					
•••						
88879	I had a negative experience or interaction at EUR	L				
88880	I was preparing for a job search U	JSD				
88881	Something else changed (education, award, medi EUR					
88882	I had a negative experience or interaction at EUR					
88883		EUR				
	y January and Garaff and a year Jany and					
	CurrencyDesc CompTotal CompFreq SalaryUSD WorkWeekH	lrs \				
Respondent	00110012000 00mp10001 00mp11004 001000 w01111000111	,				
1	NaN NaN NaN NaN N	IaN				
2		IaN				
3	Thai baht 23000.0 Monthly 8820.0 40.					
4	United States dollar 61000.0 Yearly 61000.0 80.					
5	·					
5	Ukrainian hryvnia NaN NaN NaN 55.	00				
		75				
88879	European Euro 6000.0 Monthly 82488.0 37.					
88880		IaN				
88881	European Euro 60000.0 Yearly 68745.0 39.					
88882	European Euro 42768.0 Monthly 588012.0 40.					
88883	European Euro 20000.0 Yearly 22915.0 48.	00				
	WorkPlan \					
Respondent						
1	NaN					
2	NaN					
3	There's no schedule or spec; I work on what se					
4	There's no schedule or spec; I work on what se					
5	There is a schedule and/or spec (made by me or					
 88879	There is a schedule and/or spec (made by me or					
88880	There is a schedule and/or spec (made by me or					
India is a solicatio and, or spec (made by me or						

```
88881
            There is a schedule and/or spec (made by me or ...
88882
            There is a schedule and/or spec (made by me or...
88883
             There's no schedule or spec; I work on what se...
                                                   WorkChallenge \
Respondent
1
                                                             NaN
2
                                                             NaN
3
            Distracting work environment; Inadequate access...
4
5
            Being tasked with non-development work; Inadequ...
88879
            Being tasked with non-development work; Distrac...
88880
            Distracting work environment; Meetings; Not enou...
88881
            Distracting work environment; Not enough people...
88882
            Distracting work environment; Lack of support f...
88883
             Inadequate access to necessary tools; Not enoug...
                                                      WorkRemote WorkLoc \
Respondent
1
                                                             NaN
                                                                      NaN
2
                                                             NaN
                                                                      NaN
3
                               Less than once per month / Never
                                                                     Home
4
                               Less than once per month / Never
                                                                     Home
5
                                          A few days each month
                                                                   Office
                               Less than once per month / Never
88879
                                                                     Home
88880
                         More than half, but not all, the time
                                                                     Home
88881
                                          A few days each month
                                                                   Office
88882
                               Less than once per month / Never
                                                                     Home
            Less than half the time, but at least one day \boldsymbol{...}
88883
                                                                   Home
                              ImpSyn
                                                                        CodeRev \
Respondent
                                 NaN
                                                                             NaN
1
2
                                 NaN
                                                                             NaN
3
                            Average
                                                                             Nο
4
            A little below average
                                                                             No
5
            A little above average
                                      Yes, because I see value in code review
88879
                  Far above average
                                      Yes, because I see value in code review
88880
                                      Yes, because I see value in code review
88881
            A little below average
                                      Yes, because I see value in code review
88882
                  Far above average
                                      Yes, because I see value in code review
88883
                  Far above average
                                                                              No
            CodeRevHrs
                                                                    UnitTests \
```

```
Respondent
                                                                          NaN
                    NaN
2
                    NaN
                                                                          NaN
3
                    NaN
                                                   No, but I think we should
4
                                                   No, but I think we should
                    NaN
5
                    NaN
                                               Yes, it's part of our process
88879
                   10.0
                                               Yes, it's part of our process
88880
                         Yes, it's not part of our process but the deve...
                    {\tt NaN}
88881
                   10.0
                                               Yes, it's part of our process
                                               Yes, it's part of our process
88882
                    5.0
88883
                    NaN
                                               Yes, it's part of our process
                                                     PurchaseHow \
Respondent
                                                              NaN
2
                                                             NaN
3
                                                        Not sure
4
            Developers typically have the most influence o...
5
                                                        Not sure
            Developers and management have nearly equal in...
88879
88880
                                                              NaN
88881
            The CTO, CIO, or other management purchase new...
88882
                                                        Not sure
88883
                                                        Not sure
                               PurchaseWhat \
Respondent
1
                                        NaN
2
                                        NaN
3
            I have little or no influence
4
             I have little or no influence
            I have little or no influence
88879
            I have little or no influence
88880
                                        NaN
88881
            I have little or no influence
            I have little or no influence
88882
            I have little or no influence
88883
                                             LanguageWorkedWith \
Respondent
1
                               HTML/CSS; Java; JavaScript; Python
2
                                            C++; HTML/CSS; Python
3
                                                        HTML/CSS
4
                                             C;C++;C#;Python;SQL
```

```
5
                   C++; HTML/CSS; Java; JavaScript; Python; SQL; VBA
                               Bash/Shell/PowerShell; C++; Python
88879
88880
88881
             Bash/Shell/PowerShell; Go; HTML/CSS; Java; JavaScr...
                         C#; HTML/CSS; Java; JavaScript; PHP; Python
88882
88883
                          Go;HTML/CSS; Java; JavaScript;Other(s):
                                          LanguageDesireNextYear
Respondent
               C;C++;C#;Go;HTML/CSS;Java;JavaScript;Python;SQL
1
2
                                     C++; HTML/CSS; JavaScript; SQL
                                                  Elixir; HTML/CSS
3
4
                                              C;C#;JavaScript;SQL
5
                       HTML/CSS; Java; JavaScript; SQL; WebAssembly
                                                               C++
88879
88880
                                                               NaN
88881
             Bash/Shell/PowerShell;Go;HTML/CSS;JavaScript;P...
88882
                                          C#; Java; JavaScript; PHP
88883
                                                 C++;Go;Java;Rust
                                              DatabaseWorkedWith
Respondent
1
                                                           SQLite
2
                                                              NaN
                                                       PostgreSQL
4
                                                    MySQL; SQLite
5
             Couchbase; MongoDB; MySQL; Oracle; PostgreSQL; SQLite
88879
                                                              NaN
88880
                                                              NaN
                                                PostgreSQL; Redis
88881
                                              MariaDB; PostgreSQL
88882
88883
                           Cassandra; MariaDB; PostgreSQL; SQLite
                                          DatabaseDesireNextYear
Respondent
1
                                                             MySQL
2
                                                             MySQL
3
                                                        PostgreSQL
4
                                                     MySQL; SQLite
5
             Couchbase; Firebase; MongoDB; MySQL; Oracle; Postgr...
88879
                                                               NaN
88880
88881
                                  Elasticsearch; PostgreSQL; Redis
```

```
88882
                                              MariaDB; PostgreSQL
88883
                                                      PostgreSQL
                                              PlatformWorkedWith \
Respondent
                                                   MacOS; Windows
1
2
                                                          Windows
3
                                                              NaN
4
                                                   Linux; Windows
5
                              Android; Linux; MacOS; Slack; Windows
88879
                                           Android; Linux; Windows
88880
88881
             Docker;Kubernetes;Linux;MacOS;Microsoft Azure;...
88882
                  Android; Arduino; Linux; Raspberry Pi; WordPress
88883
                                                     Docker; Linux
                                          PlatformDesireNextYear \
Respondent
1
                                         Android; Arduino; Windows
2
                                                          Windows
3
                                                              NaN
4
                                                   Linux; Windows
5
                          Android; Docker; Kubernetes; Linux; Slack
88879
                                                   Linux:Windows
88880
88881
             Docker; Google Cloud Platform; iOS; Kubernetes; Li...
88882
                  Android; Arduino; Linux; Raspberry Pi; WordPress
88883
                                                    Docker; Linux
                                        WebFrameWorkedWith \
Respondent
                                              Django;Flask
2
                                                    Django
3
                                                        NaN
4
5
             Django;Express;Flask;jQuery;React.js;Spring
88879
                                                        NaN
88880
                                                        NaN
88881
                                           Django; React. js
88882
                                           jQuery; React. js
88883
                                             Spring; Vue. js
                          WebFrameDesireNextYear MiscTechWorkedWith \
Respondent
```

```
1
                                    Flask; jQuery
                                                              Node.js
2
                                           Django
                                                                   NaN
3
                                        Other(s):
                                                                   NaN
4
                                                                  .NET
5
                   Flask; jQuery; React. js; Spring
                                                      Cordova; Node. js
88879
                                              NaN
                                                                   NaN
88880
                                              NaN
                                                                   NaN
88881
             Angular/Angular.js;Django;React.js
                                                              Ansible
88882
                                 jQuery; React. js
                                                             Unity 3D
88883
                                   Spring; Vue. js
                                                                   NaN
                                MiscTechDesireNextYear
Respondent
1
                                                Node.js
2
                                                     NaN
3
                                                    NaN
4
                                                    .NET
5
             Apache Spark; Hadoop; Node. js; React Native
88879
                    TensorFlow; Unity 3D; Unreal Engine
88880
                                                    NaN
88881
                                        Ansible; Node. js
88882
                                               Unity 3D
88883
                                                    NaN
                                                                          OpSys \
                                                       DevEnviron
Respondent
1
                                      IntelliJ;Notepad++;PyCharm
                                                                        Windows
2
                                                                        Windows
                                                     Atom; PyCharm
3
                                          Vim; Visual Studio Code
                                                                   Linux-based
4
                  Eclipse; Vim; Visual Studio; Visual Studio Code
                                                                        Windows
5
                                          IntelliJ;Notepad++;Vim
                                                                   Linux-based
88879
                    Android Studio; Notepad++; Vim; Visual Studio
                                                                        Windows
88880
                                                              NaN
                                                                            NaN
88881
                                   Emacs; Vim; Visual Studio Code
                                                                          MacOS
88882
             Android Studio; IntelliJ; Notepad++; Vim; Visual S... Linux-based
88883
                                           IntelliJ; Sublime Text Linux-based
                                                       Containers
Respondent
1
                                         I do not use containers
2
                                         I do not use containers
3
                                         I do not use containers
4
                                         I do not use containers
5
                         Outside of work, for personal projects
```

 88879 88880	 I do not use containers NaN
88881	Development; Testing; Production; Outside of work
88882 88883	I do not use containers Testing; Production; Outside of work, for person
	BlockchainOrg \
Respondent	NoN
1 2	NaN NaN
3	NaN
4	Not at all
5	Not at all
•••	
88879	Not at all
88880	NaN
88881	Non-currency applications of blockchain
88882 88883	Not at all Implementing cryptocurrency-based products
00000	implementing cryptoculiency bubed products
	BlockchainIs BetterLife \
Respondent	
1	NaN Yes
2	Useful across many domains and could change ma Yes
4	NaN Yes Useful for decentralized currency (i.e., Bitcoin) Yes
5	NaN Yes
•••	
88879	A passing fad Yes
88880	NaN NaN
88881	Useful for immutable record keeping outside of No
88882	A passing fad Yes
88883	A passing fad Yes
Respondent	ITperson OffOn SocialMedia \
1	Fortunately, someone else has that title Yes Twitter
2	Yes Yes Instagram
3	Yes Yes Reddit
4	SIGH Yes Reddit
5	Also Yes Yes Facebook
88879 88880	NaN NaN YouTube NaN NaN NaN
88881	nan nan nan nan Nan
88882	Yes Yes Instagram
-	

88883	SIGH Yes Reddit						
	Extraversion ScreenName SOVisit1st \						
Respondent	0.1:						
1	Online Username 2017						
2	Online Username 2017						
3	In real life (in person) Username 2011						
4	In real life (in person) Username 2014						
5	In real life (in person) Username I don't remember						
 88879	 Neither Username I don't remember						
88880	NaN NaN NaN						
88881	Online Login 2008						
88882	Neither Username 2009						
88883	In real life (in person) Username 2008						
00000	In 18d1 1116 (In porbon) oborname 2000						
	SOVisitFreq \						
Respondent	•						
1	A few times per month or weekly						
2	Daily or almost daily						
3	A few times per week						
4	Daily or almost daily						
5	Multiple times per day						
•••	••						
88879	A few times per month or weekly						
88880	NaN						
88881	A few times per month or weekly						
88882	A few times per week						
88883	A few times per week						
	SOVisitTo \						
Respondent	SUVISITIO (
1	Find answers to specific questions; Learn how t						
2	Find answers to specific questions; Learn how t						
3	Find answers to specific questions; Learn how t						
4	Find answers to specific questions; Pass the ti						
5	Find answers to specific questions						
•••							
88879	Find answers to specific questions						
88880	NaN						
88881	Find answers to specific questions						
88882	Find answers to specific questions						
88883	Find answers to specific questions; Learn how t						
_	SOFindAnswer SOTimeSaved \						
Respondent							
1	3-5 times per week Stack Overflow was much faster						

2	3-5 times per week Stack Overflow was much faster
3	6-10 times per week They were about the same
4	1-2 times per week Stack Overflow was much faster
5	More than 10 times per week Stack Overflow was much faster
O	note than to times per week boack overflow was made rabber
88879	Less than once per week Stack Overflow was slightly faster
88880	NaN NaN
88881	More than 10 times per week Stack Overflow was slightly faster
88882	3-5 times per week Stack Overflow was slightly faster
88883	1-2 times per week They were about the same
	SOHowMuchTime SOAccount SOPartFreq \
Respondent	
1	31-60 minutes No NaN
2	11-30 minutes Yes A few times per month or weekly
3	NaN Yes Less than once per month or monthly
4	31-60 minutes Yes Less than once per month or monthly
5	NaN Yes A few times per month or weekly
	•
 88879	60+ minutes No NaN
88880	NaN NaN NaN NaN
88881	11-30 minutes Yes Less than once per month or monthly
88882	11-30 minutes Yes Less than once per month or monthly
88883	NaN Yes A few times per month or weekly
	707.1 \
	SOJobs \
Respondent	
1	No, I didn't know that Stack Overflow had a jo
2	No, I knew that Stack Overflow had a job board
3	Yes
4	Yes
5	No, I knew that Stack Overflow had a job board
•••	
88879	No, I didn't know that Stack Overflow had a jo
88880	NaN
88881	Yes
88882	No, I knew that Stack Overflow had a job board
88883	No, I knew that Stack Overflow had a job board
00000	no, I mow black boach over110w had a job boara
	EntTeams \
Respondent	
1	No, and I don't know what those are
2	No, and I don't know what those are
3	
4	No, I've heard of them, but I am not part of a
4	No, and I don't know what those are
4 5	

```
88879
                           No, and I don't know what those are
88880
                                                             NaN
88881
            No, I've heard of them, but I am not part of a...
88882
                           No, and I don't know what those are
88883
            No, I've heard of them, but I am not part of a...
                      SOComm \
Respondent
                     Neutral
2
               Yes, somewhat
3
                     Neutral
4
             No, not really
5
            Yes, definitely
88879
             No, not at all
88880
                         NaN
                     Neutral
88881
88882
             No, not really
88883
             No, not really
                                                   WelcomeChange \
Respondent
1
                       Just as welcome now as I felt last year
2
                       Just as welcome now as I felt last year
3
                       Just as welcome now as I felt last year
4
                       Just as welcome now as I felt last year
                       Just as welcome now as I felt last year
88879
            Not applicable - I did not use Stack Overflow ...
88880
                                                             NaN
88881
                                                             NaN
88882
                       Just as welcome now as I felt last year
88883
                       Just as welcome now as I felt last year
                                                    SONewContent
                                                                    Age Gender \
Respondent
1
            Tech articles written by other developers; Indu...
                                                                14.0
                                                                         Man
2
            Tech articles written by other developers; Indu...
                                                                         Man
                                                                 19.0
3
            Tech meetups or events in your area; Courses on...
                                                                 28.0
                                                                         Man
4
            Tech articles written by other developers; Indu...
                                                                         Man
            Tech meetups or events in your area; Courses on...
5
                                                                         Man
88879
                                                             NaN
                                                                   34.0
                                                                           Man
88880
                                                             NaN
                                                                    NaN
                                                                           NaN
88881
                                                                  37.0
                                                             NaN
                                                                           Man
88882
                                                                    NaN
                                                                           Man
88883
                     Tech articles written by other developers
                                                                   33.0
                                                                           Man
```

```
Trans
                                         Sexuality \
       Respondent
       1
                      No
                          Straight / Heterosexual
       2
                          Straight / Heterosexual
                      No
       3
                          Straight / Heterosexual
                      No
       4
                          Straight / Heterosexual
                     No
       5
                     No
                          Straight / Heterosexual
       88879
                     No
                          Straight / Heterosexual
       88880
                    NaN
                                               NaN
       88881
                     No
                          Straight / Heterosexual
       88882
                     No
                          Straight / Heterosexual
       88883
                      No
                          Straight / Heterosexual
                                                    Ethnicity Dependents
       Respondent
       1
                                                          NaN
                                                                       No
       2
                                                          NaN
                                                                       No
       3
                                                          NaN
                                                                      Yes
       4
                                White or of European descent
                                                                       No
       5
                   White or of European descent; Multiracial
                                                                       No
       88879
                                White or of European descent
                                                                       No
       88880
                                                                      NaN
                                                          NaN
       88881
                                White or of European descent
                                                                       No
       88882
                                White or of European descent
                                                                      Yes
       88883
                                White or of European descent
                                                                       No
                             SurveyLength
                                                             SurveyEase
       Respondent
       1
                    Appropriate in length
                                            Neither easy nor difficult
                    Appropriate in length
       2
                                            Neither easy nor difficult
       3
                    Appropriate in length
                                            Neither easy nor difficult
       4
                    Appropriate in length
                                                                   Easy
       5
                   Appropriate in length
                                                                   Easy
       88879
                    Appropriate in length
                                                                   Easy
       88880
                                                                    NaN
       88881
                    Appropriate in length
                                                                   Easy
       88882
                                 Too long
                                                                   Easy
       88883
                                Too short
                                                                   Easy
       [88883 rows x 84 columns]
[212]: df.sort_values(by=['Country', 'SalaryUSD'], ascending=[True, False],inplace=_
        →True)
```

```
df[['Country', 'SalaryUSD']].head(5)
[212]:
                        Country
                                 SalaryUSD
       Respondent
       63129
                   Afghanistan
                                 1000000.0
       50499
                    Afghanistan
                                  153216.0
       39258
                    Afghanistan
                                   19152.0
       58450
                    Afghanistan
                                   17556.0
       7085
                   Afghanistan
                                   14364.0
[213]: df['SalaryUSD'].nlargest(10)
[213]: Respondent
       25983
                2000000.0
       87896
                2000000.0
       22013
                2000000.0
       28243
                2000000.0
       72732
                2000000.0
       78151
                2000000.0
       80200
                2000000.0
       52132
                2000000.0
       75561
                2000000.0
       32250
                2000000.0
       Name: SalaryUSD, dtype: float64
[214]: df['SalaryUSD'].nsmallest(5)
[214]: Respondent
       722
                0.0
       28638
                0.0
       13825
                0.0
       40913
                0.0
       30630
                0.0
       Name: SalaryUSD, dtype: float64
[215]: df.nsmallest(5, 'SalaryUSD')
[215]:
                                        MainBranch
                                                    Hobbyist \
       Respondent
       722
                    I am a developer by profession
                                                        False
                    I am a developer by profession
       28638
                                                         True
                    I am a developer by profession
                                                         True
       13825
                    I am a developer by profession
       40913
                                                         True
                    I am a developer by profession
       30630
                                                         True
                                                            OpenSourcer \
       Respondent
       722
                   Less than once a month but more than once per \dots
```

```
28638
            Less than once a month but more than once per \dots
13825
                                                           Never
40913
                                        Less than once per year
30630
            Less than once a month but more than once per ...
                                                      OpenSource \
Respondent
722
            The quality of OSS and closed source software \dots
28638
            OSS is, on average, of HIGHER quality than pro...
13825
            The quality of OSS and closed source software \dots
40913
            The quality of OSS and closed source software \dots
30630
            The quality of OSS and closed source software ...
                                                      Employment
                                                                       Country \
Respondent
722
                                                             NaN
                                                                  Afghanistan
28638
            Independent contractor, freelancer, or self-em... Afghanistan
13825
                                                                       Algeria
40913
                                             Employed full-time
                                                                       Armenia
30630
                                             Employed full-time
                                                                     Australia
           Student
                                                           EdLevel \
Respondent
722
               NaN
                                                               NaN
28638
               NaN
                       Other doctoral degree (Ph.D, Ed.D., etc.)
13825
                NaN
40913
                No
                        Bachelor's degree (BA, BS, B.Eng., etc.)
30630
                No
                     Master's degree (MA, MS, M.Eng., MBA, etc.)
                                                  UndergradMajor \
Respondent
722
                                                             NaN
28638
                                       I never declared a major
13825
40913
            Computer science, computer engineering, or sof ...
30630
                                                             NaN
                                                        EduOther
                                                                         OrgSize \
Respondent
722
                                                             NaN
                                                                             NaN
28638
                                                             NaN
                                                                             NaN
13825
                                                             NaN
                                                                             NaN
40913
            Taught yourself a new language, framework, or ... 2-9 employees
30630
            Taken an online course in programming or softw... 2-9 employees
                                                         DevType \
Respondent
```

```
722
                                                             NaN
28638
                                                             NaN
13825
                                                             NaN
40913
            Developer, desktop or enterprise applications; ...
30630
            Database administrator; Developer, back-end; Dev...
                    YearsCode
                                          Age1stCode
                                                           YearsCodePro
Respondent
722
            Less than 1 year
                               Younger than 5 years
                                                       Less than 1 year
28638
                           36
                                                   13
13825
                           13
                                                      Less than 1 year
40913
                            7
                                                  15
30630
                           35
                                                                      30
                                       CareerSat
                                                               JobSat \
Respondent
722
                                  Very satisfied
                                                       Very satisfied
28638
                              Very dissatisfied
                                                    Very dissatisfied
13825
                              Very dissatisfied
                                                       Very satisfied
40913
                             Slightly satisfied
                                                   Slightly satisfied
30630
            Neither satisfied nor dissatisfied
                                                       Very satisfied
                   MgrIdiot MgrMoney
                                         MgrWant
Respondent
722
                        NaN
                                  NaN
                                             NaN
28638
                        NaN
                                  NaN
                                             NaN
13825
                        NaN
                                  NaN
                                             NaN
40913
            Very confident
                             Not sure
                                        Not sure
30630
                        NaN
                                  NaN
                                             NaN
                                                    JobSeek \
Respondent
            I am not interested in new job opportunities
722
28638
            I am not interested in new job opportunities
13825
                          I am actively looking for a job
40913
            I am not interested in new job opportunities
30630
            I am not interested in new job opportunities
                                                   LastHireDate \
Respondent
722
            NA - I am an independent contractor or self em...
28638
                                                             NaN
13825
            NA - I am an independent contractor or self em...
40913
                                           Less than a year ago
30630
            NA - I am an independent contractor or self em...
```

LastInt FizzBuzz \

Respondent 722 28638 13825 40913 30630 Respondent 722 28638 13825 40913	Nam Complete a take-home project; Solve a brain-tea Write any code; Write code by hand (e.g., on a Interview with people in peer roles; Interview JobFactors Nam Nam Financial performance or funding status of the Industry that I'd be working in; Languages, fra	I NaN Yes No No	
30630	Industry that I'd be working in;Office environ		
Dans and and	ResumeUpdate	e CurrencySymbol \	\
Respondent 722 28638 13825 40913 30630	I heard about a job opportunity (from a recrui NaN Something else changed (education, award, medi Something else changed (education, award, medi I heard about a job opportunity (from a recrui	AFN AFN AFN AMD AUD	
	CurrencyDesc CompTotal CompFreq SalaryUSD	WorkWeekHrs \	
Respondent			
722	Afghan afghani 1.0 Yearly 0.0	1.0	
28638	Afghan afghani 3.0 Monthly 0.0	2.0	
13825	Afghan afghani 1.0 Yearly 0.0	168.0	
40913	Armenian dram 0.0 Monthly 0.0	40.0	
30630	Australian dollar 0.0 Yearly 0.0	80.0	
	WorkPlan	1 \	
Respondent	NaN	ī	
722 28638	nan NaN		
13825	nan Nan		
40913	There's no schedule or spec; I work on what se	1	
30630	There's no schedule or spec; I work on what se		
	. ,		
Respondent	WorkChallenge	• \	
722	NaN	I	
28638	NaN	ſ	
13825	Being tasked with non-development work; Non-wor		
40913	Meetings; Non-work commitments (parenting, scho		
30630	Distracting work environment; Non-work commitme		

WorkRemote \ Respondent 722 Less than once per month / Never 28638 13825 About half the time 40913 Less than half the time, but at least one day ... 30630 It's complicated WorkLoc \ Respondent 722 Other place, such as a coworking space or cafe 28638 13825 Home 40913 Office 30630 Other place, such as a coworking space or cafe ImpSyn CodeRev \ Respondent 722 Far above average Yes, because I see value in code review 28638 NaN NaN13825 Far above average No 40913 A little above average Yes, because I see value in code review 30630 A little above average Yes, because I see value in code review CodeRevHrs UnitTests \ Respondent 722 1.0 No, and I'm glad we don't 28638 NaN NaN 13825 ${\tt NaN}$ Yes, it's part of our process 40913 No, and I'm glad we don't 3.0 30630 10.0 No, but I think we should PurchaseHow \ Respondent 722 NaN 28638 NaN 13825 NaN 40913 Developers and management have nearly equal in... 30630 NaN PurchaseWhat \ Respondent 722 I have little or no influence 28638 13825 I have a great deal of influence 40913 I have a great deal of influence

I have a great deal of influence

30630

```
LanguageWorkedWith \
Respondent
722
                                                               NaN
28638
             Bash/Shell/PowerShell; C; C++; Java; Objective-C; O...
13825
                                                        Other(s):
40913
             Bash/Shell/PowerShell; C; C++; Java; JavaScript; Py...
30630
                Bash/Shell/PowerShell; HTML/CSS; JavaScript; Ruby
                                          LanguageDesireNextYear
Respondent
722
28638
             Bash/Shell/PowerShell; C; C++; Java; Objective-C; O...
13825
                                                        Other(s):
40913
                               C;C++;Java;Python;SQL;TypeScript
                                          Elixir; Ruby; TypeScript
30630
                                      DatabaseWorkedWith DatabaseDesireNextYear \
Respondent
722
                                                      NaN
                                                                               NaN
28638
                                            MySQL; SQLite
                                                                     MySQL; SQLite
13825
                                               Other(s):
                                                                        Other(s):
40913
             Elasticsearch; MariaDB; MongoDB; MySQL; Redis
                                                           MariaDB; MongoDB; MySQL
30630
                                              PostgreSQL
                                                                       PostgreSQL
                                              PlatformWorkedWith \
Respondent
722
                                                              NaN
28638
                                         Android; iOS; Linux; MacOS
13825
                                                        Other(s):
40913
             Arduino; AWS; Docker; Linux; MacOS; Raspberry Pi; Sl...
30630
                                                          AWS;iOS
                       PlatformDesireNextYear
                                                    WebFrameWorkedWith \
Respondent
722
                                            NaN
                                                                    NaN
28638
                             Android; iOS; Linux
                                                                 jQuery
13825
                                      Other(s):
                                                             Other(s):
40913
             Arduino;Linux;MacOS;Raspberry Pi
                                                 ASP.NET; Django; Flask
30630
                               Android; AWS; iOS
                                                 Ruby on Rails; Vue. js
            WebFrameDesireNextYear
                                                          MiscTechWorkedWith \
Respondent
722
                                NaN
                                                                          NaN
28638
                                NaN
                                                         TensorFlow; Unity 3D
                          Other(s):
13825
                                                                    Other(s):
                                      .NET; Node.js; TensorFlow; Torch/PyTorch
40913
                       Django;Flask
```

30630	Ruby on Rails; Vue.js		Chef;React Native		
	MiscTechDesireNextYear	\			
Respondent					
722	NaN				
28638	<pre>Hadoop;TensorFlow;Unity 3D</pre>				
13825	Other(s):				
40913	Node.js				
30630	React Native				
		DevEnviron	o OpSys \		
Respondent		a			
722		NaN			
28638		Emacs	s Linux-based		
13825		NaN			
40913	<pre>IntelliJ; IPython / Jupyter; S</pre>	Sublime Text;Vim	n Linux-based		
30630	Sublime Text; Tex	ktMate;Vim;Xcode	e MacOS		
	Containers Bloo	ckchainOrg \			
Respondent					
722	NaN	NaN			
28638	I do not use containers	NaN			
13825	I do not use containers	NaN			
40913	Production N	Not at all			
30630	I do not use containers N	Not at all			
		Blocko	chainIs BetterLife \		
Respondent					
722			NaN No		
28638	Useful for immutable record	keeping outside	e of No		
13825	An irrespons	sible use of res	sources No		
40913		A passi	ng fad No		
30630	An irrespons	sible use of res	sources Yes		
		ITperson (OffOn SocialMedia \		
Respondent		arau i	II + O N - N		
722			That? NaN		
28638		Yes	No NaN		
13825		Yes	Yes NaN		
40913		SIGH	Yes Facebook		
30630	Fortunately, someone else ha	as that title	No Reddit		
Dograma	Extraversion Scr	reenName	SOVisit1st \		
Respondent	37 * . 3	NI – NI	0000		
722	Neither	NaN	2008		
28638	•	Jsername	2008		
13825	Neither	NaN	2015		

40913 30630	In real life (in person) Username 2013 Online Username I don't remember					
	SOVisitFreq \					
Respondent 722 28638 13825 40913 30630	Multiple times per day Daily or almost daily A few times per month or weekly Multiple times per day A few times per month or weekly					
Dognandont	SOVisitTo \					
Respondent 722 28638 13825 40913 30630	NaN Find answers to specific questions Find answers to specific questions Find answers to specific questions; Learn how t Find answers to specific questions					
Dognandont	SOFindAnswer SOTimeSaved \					
Respondent 722 28638 13825 40913 30630	More than 10 times per week 6-10 times per week 1-2 times per week 3-5 times per week 1-2 times per week The other resource was much faster They were about the same Stack Overflow was much faster They were about the same					
	SOHowMuchTime SOAccount \					
Respondent 722 28638 13825 40913 30630	60+ minutes Not sure / can't remember 11-30 minutes Yes NaN Yes 0-10 minutes Yes NaN Yes					
	SOPartFreq \					
Respondent 722 28638 13825 40913 30630	NaN Less than once per month or monthly I have never participated in Q&A on Stack Over Less than once per month or monthly Less than once per month or monthly					
Respondent 722 28638	SOJobs \ Yes Yes					

```
13825
            No, I knew that Stack Overflow had a job board...
40913
            No, I knew that Stack Overflow had a job board...
30630
            No, I knew that Stack Overflow had a job board...
                                                        EntTeams
                                                                           SOComm \
Respondent
722
                                                             Yes
                                                                         Not sure
28638
            No, I've heard of them, but I am not part of a... No, not at all
13825
                           No, and I don't know what those are No, not at all
40913
            No, I've heard of them, but I am not part of a... No, not really
30630
                           No, and I don't know what those are No, not really
                                                  WelcomeChange \
Respondent
722
            Not applicable - I did not use Stack Overflow ...
28638
                         A lot less welcome now than last year
13825
                         A lot less welcome now than last year
40913
                       Just as welcome now as I felt last year
30630
                         A lot less welcome now than last year
                                           SONewContent
                                                           Age Gender Trans
Respondent
722
                                                           1.0
                                                                  NaN
                                                                         NaN
                                                     {\tt NaN}
28638
                                                                  NaN
                                                     NaN
                                                           NaN
                                                                         NaN
13825
                                                          56.0
                                                                  NaN
                                                                         NaN
                                                     NaN
40913
            Tech articles written by other developers
                                                          22.0
                                                                  Man
                                                                          No
30630
                                                          43.0
                                                                  NaN
                                                                          No
                           Sexuality Ethnicity Dependents
Respondent
722
                                  NaN
                                            NaN
                                                        NaN
28638
                                  NaN
                                            NaN
                                                        NaN
13825
                                  NaN
                                            NaN
                                                        Yes
40913
            Straight / Heterosexual
                                            NaN
                                                         No
30630
                                  NaN
                                            NaN
                                                         No
                      SurveyLength SurveyEase
Respondent
722
                          Too long
                                    Difficult
28638
                          Too long
                                           NaN
13825
                         Too short
                                          Easy
40913
            Appropriate in length
                                          Easy
30630
            Appropriate in length
                                          Easy
```

[216]: df.nlargest(5, 'SalaryUSD')

```
[216]:
                                                             MainBranch Hobbyist \
       Respondent
                                       I am a developer by profession
       25983
                                                                             True
       87896
                                        I am a developer by profession
                                                                             True
                                        I am a developer by profession
       22013
                                                                             True
       28243
                                        I am a developer by profession
                                                                             True
       72732
                    I am not primarily a developer, but I write co...
                                                                          False
                                                            OpenSourcer
       Respondent
       25983
                                               Less than once per year
       87896
                                               Less than once per year
       22013
                                                                  Never
       28243
                                            Once a month or more often
       72732
                   Less than once a month but more than once per ...
                                                             OpenSource \
       Respondent
       25983
                   OSS is, on average, of HIGHER quality than pro...
       87896
                   The quality of OSS and closed source software ...
                    The quality of OSS and closed source software ...
       22013
                    OSS is, on average, of HIGHER quality than pro...
       28243
       72732
                    OSS is, on average, of LOWER quality than prop...
                                                             Employment
                                                                         Country \
       Respondent
       25983
                                                    Employed full-time
                                                                          Canada
       87896
                                                    Employed full-time
                                                                         Germany
       22013
                                                    Employed full-time
                                                                           India
       28243
                    Independent contractor, freelancer, or self-em...
                                                                         India
       72732
                                                                           India
                                                                    NaN
                           Student
                                                                          EdLevel \
       Respondent
       25983
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                                No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
       87896
                                No
                                              Professional degree (JD, MD, etc.)
       22013
                                No
       28243
                                    Master's degree (MA, MS, M.Eng., MBA, etc.)
       72732
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                   Yes, full-time
                                                        UndergradMajor \
       Respondent
       25983
                    Computer science, computer engineering, or sof ...
                    Computer science, computer engineering, or sof ...
       87896
       22013
                    A natural science (ex. biology, chemistry, phy...
       28243
                    Computer science, computer engineering, or sof ...
       72732
                    Computer science, computer engineering, or sof ...
```

D 1 .		EduOther \
Respondent 25983	Received on-the-job training in sof	ftware devel…
87896	Taken an online course in programmi	
22013	Taken an online course in programmi	
28243	Taken an online course in programmi	_
72732	Contributed to open s	_
	-	
	OrgSize \	
Respondent		
25983	10,000 or more employees	
87896	2-9 employees	
22013	2-9 employees	
28243	2-9 employees NaN	
72732	Nan	
		DevType YearsCode \
Respondent		The state of the s
25983	Develor	per, full-stack 8
87896	_	per, full-stack 9
22013	Academic researcher; Data scientist	or machine 3
28243	Developer, back-end; Developer, full	L-stack;Deve 25
72732		NaN 4
	Age1stCode YearsCodePro	CareerSat \
Respondent	S	
25983	16 2	Very satisfied
87896	17 8	Very satisfied
22013	26 3	Very satisfied
28243	9 14 Neither sat	cisfied nor dissatisfied
72732	20 5	Slightly satisfied
	JobSat	MgrIdiot MgrMoney \
Respondent		
25983	Very satisfied	
87896	Very satisfied	Somewhat confident No
22013	Very satisfied	NaN NaN
	·	
28243	Neither satisfied nor dissatisfied	NaN NaN
28243 72732	·	
72732	Neither satisfied nor dissatisfied	NaN NaN
72732 Respondent	Neither satisfied nor dissatisfied Slightly satisfied MgrWant \	NaN NaN
72732 Respondent 25983	Neither satisfied nor dissatisfied Slightly satisfied MgrWant \ No	NaN NaN
72732 Respondent 25983 87896	Neither satisfied nor dissatisfied Slightly satisfied MgrWant \ No I am already a manager	NaN NaN
72732 Respondent 25983	Neither satisfied nor dissatisfied Slightly satisfied MgrWant \ No	NaN NaN

72732 NaN

	JobSeek \
Respondent 25983 87896 22013 28243 72732	I'm not actively looking, but I am open to new I am not interested in new job opportunities I am not interested in new job opportunities I'm not actively looking, but I am open to new I am actively looking for a job
	LastHireDate \
Respondent 25983 87896 22013 28243 72732	3-4 years ago More than 4 years ago 3-4 years ago 1-2 years ago More than 4 years ago
	LastInt FizzBuzz \
Respondent 25983 87896 22013 28243 72732	Solve a brain-teaser style puzzle; Interview wi Write any code; Interview with people in senior Write code by hand (e.g., on a whiteboard); Com Interview with people in peer roles; Interview Write any code No
	JobFactors \
Respondent 25983 87896 22013 28243 72732	Remote work options;Opportunities for professi Office environment or company culture;Diversit Financial performance or funding status of the Financial performance or funding status of the Remote work options;Opportunities for professi
	ResumeUpdate CurrencySymbol \
Respondent 25983 87896 22013 28243 72732	My job status changed (promotion, new job, etc.) Something else changed (education, award, medi Something else changed (education, award, medi I heard about a job opportunity (from a recrui I was preparing for a job search USD
Respondent	CurrencyDesc CompTotal CompFreq SalaryUSD WorkWeekHrs \
25983	United States dollar 65500.0 Weekly 2000000.0 45.0
87896	United States dollar 55000.0 Weekly 2000000.0 40.0
22013	United States dollar 1500000.0 Weekly 2000000.0 50.0

28243 72732	United States dollar 2000000.0 Yearly 2000000.0 20.0 United States dollar 80000.0 Weekly 2000000.0 40.0
	WorkPlan \
Respondent 25983 87896 22013 28243 72732	There is a schedule and/or spec (made by me or There is a schedule and/or spec (made by me or There's no schedule or spec; I work on what se There is a schedule and/or spec (made by me or There is a schedule and/or spec (made by me or
	WorkChallenge \
Respondent 25983 87896 22013 28243 72732	Being tasked with non-development work; Meeting Being tasked with non-development work; Meeting Inadequate access to necessary tools; Meetings; Being tasked with non-development work; Not eno Lack of support from management; Meetings; Time
	WorkRemote WorkLoc \
Respondent 25983 87896 22013 28243 72732	A few days each month Office All or almost all the time (I'm full-time remote) Home All or almost all the time (I'm full-time remote) Home All or almost all the time (I'm full-time remote) Office Less than once per month / Never Office
	ImpSyn CodeRev \
Respondent 25983 87896 22013 28243 72732	Average Yes, because I see value in code review A little above average Yes, because I see value in code review A little below average Yes, because I see value in code review Far above average Yes, because I see value in code review A little above average Yes, because I see value in code review
	CodeRevHrs UnitTests \
Respondent 25983 87896 22013 28243 72732	2.0 Yes, it's part of our process 3.0 No, but I think we should 10.0 Yes, it's part of our process NaN NaN 10.0 Yes, it's part of our process
Respondent	PurchaseHow \
25983 87896	Developers and management have nearly equal in Developers and management have nearly equal in

22013 28243 72732	Developers typically have the most influence o NaN Not sure	
	PurchaseWhat \	
Respondent 25983 87896 22013 28243 72732	I have little or no influence I have a great deal of influence I have a great deal of influence NaN I have little or no influence	
	LanguageWorkedWith	\
Respondent 25983 87896 22013 28243 72732	Bash/Shell/PowerShell;C++;C#;HTML/CSS;JavaScri HTML/CSS;JavaScript;PHP;SQL Assembly;Bash/Shell/PowerShell;C;C++;Java;Java C++;C#;Java;JavaScript;Objective-C;Python Java;Python;SQL	
D	LanguageDesireNextYear	\
Respondent 25983 87896 22013 28243 72732	Bash/Shell/PowerShell; C#; F#; Python; SQL; TypeScript HTML/CSS; JavaScript; PHP; Ruby; SQL; TypeScript Python; Swift C; C++; C# NaN	
ъ.	${\tt DatabaseWorkedWith}$	\
Respondent 25983 87896 22013 28243 72732	Microsoft SQL Server; MySQL MariaDB; MySQL; PostgreSQL Cassandra; Microsoft SQL Server; Oracle PostgreSQL; SQLite MongoDB; Microsoft SQL Server; MySQL; Oracle; Post	
Dagwandant	DatabaseDesireNextYear \	
Respondent 25983 87896 22013 28243 72732	Microsoft SQL Server; MySQL MariaDB; MySQL; PostgreSQL Cassandra SQLite MySQL	
Respondent	PlatformWorkedWith	\
25983	AWS;Docker;Heroku;Linux;MacOS;Raspberry Pi;Win	

87896 22013	WordPress Android;Arduino;Google Cloud Platform;IBM Clou			
28243	Android; AWS; iOS; MacOS; Windows			
72732	Android; Windows			
	PlatformDesireNextYear WebFrameWorkedWith \			
Respondent				
25983	AWS;Docker;Linux;MacOS;Windows Angular/Angular.js			
87896	NaN jQuery;Laravel;Vue.js			
22013	IBM Cloud or Watson; Windows jQuery			
28243	Android; Linux NaN			
72732	AWS; Docker NaN			
	WebFrameDesireNextYear MiscTechWorkedWith \			
Respondent				
25983	<pre>Angular/Angular.js;Flask;React.js .NET;.NET Core;Node.js</pre>			
87896	Express; Laravel; Ruby on Rails; Vue.js NaN			
22013	NaN TensorFlow			
28243	NaN Node.js;Pandas;Unity 3D			
72732	Angular/Angular.js;React.js NaN			
	MiscTechDesireNextYear \			
Respondent				
25983	.NET Core;Node.js			
87896	Node.js			
22013	TensorFlow			
28243	Unity 3D;Unreal Engine			
72732	NaN			
	DevEnviron OpSys \			
Respondent	Devimivition oppys (
25983	Notepad++;Sublime Text;Vim;Visual Studio;Visua Windows			
87896	Sublime Text; Vim; Visual Studio Code Linux-based			
22013	Visual Studio; Visual Studio Code Windows			
28243	Android Studio;Coda;PyCharm;Visual Studio;Visu MacOS			
72732	Eclipse; Notepad++; PyCharm Windows			
.	Containers BlockchainOrg \			
Respondent	D I I D I I I			
25983	Development; Production NaN			
87896	I do not use containers Not at all			
22013	Development Implementing our own cryptocurrency			
28243	I do not use containers NaN			
72732	Testing NaN			
	BlockchainIs BetterLife \			
Respondent				
•				

25983 87896 22013 28243 72732	Useful for dece Useful for immu Useful across m	table record 1	keeping outs nd could cha	ide of… nge ma…	No No Yes No Yes	
	ITperson OffOn	:	SocialMedia		Extraversion	n \
Respondent					,	
25983	Yes Yes		Reddit	In real life	e (in person)	
87896	Yes Yes		Twitter		Online	
22013	Yes No		YouTube		Online	
28243	Yes No	I don't use so		In real life	e (in person)	
72732	Yes No		WhatsApp		Neither	r
	ScreenName SOV	isit1st		SOVisitF	req \	
Respondent						
25983	Username	2013	Daily	or almost da	ily	
87896	Handle	2011	Daily	or almost da	ily	
22013	Screen Name	NaN	A few	times per we	eek	
28243	Username	2008	Daily	or almost da	ily	
72732	NaN	2017 A fe	w times per	month or weel	kly	
				SOVisitTo \		
Respondent				,		
25983	Find answers to	specific que	stions:Learn	how t		
87896		Find answers				
22013		Find answers	-	_		
28243		Find answers	-	_		
72732	Get a sense of		_	_		
		0 0	•			
		SOFindAnswer		;	SOTimeSaved	\
Respondent						
25983		mes per week		verflow was n		
87896		mes per week		verflow was n		
22013	1-2 ti	mes per week		verflow was m		
28243	More than 10 ti	mes per week	Stack O	verflow was n	nuch faster	
72732	1-2 ti	mes per week	Stack Overf	low was slig	htly faster	
	SOHowMuchTime S	SOAccount \				
Respondent						
25983	11-30 minutes	Yes				
87896	0-10 minutes	Yes				
22013	60+ minutes	Yes				
28243	60+ minutes	Yes				
72732	11-30 minutes	Yes				
		- 3.0				

SOPartFreq \

Respondent 25983 87896 22013 28243 72732	Less than once per month or monthly Less than once per month or monthly I have never participated in Q&A on Stack Over Multiple times per day A few times per month or weekly	
_	SOJobs \	
Respondent 25983 87896 22013 28243 72732	No, I knew that Stack Overflow had a job board No, I knew that Stack Overflow had a job board Yes Yes Yes	
	EntTeams \	
Respondent		
25983	No, and I don't know what those are	
87896	No, I've heard of them, but I am not part of a	
22013	Yes	
28243	No, and I don't know what those are	
72732	No, and I don't know what those are	
	SOComm WelcomeChange \	
Respondent	8	
25983		
	No, not really Just as welcome now as I felt last year	
87896	No, not really Just as welcome now as I felt last year	
22013	Yes, definitely A lot more welcome now than last year	
28243		
	Yes, definitely A lot less welcome now than last year	
72732	Yes, definitely A lot less welcome now than last year Not sure A lot less welcome now than last year	
12132	·	
Respondent	Not sure A lot less welcome now than last year SONewContent Age Gender	`
	Not sure A lot less welcome now than last year SONewContent Age Gender	\
Respondent	Not sure A lot less welcome now than last year SONewContent Age Gender	\
Respondent 25983	Not sure A lot less welcome now than last year SONewContent Age Gender \ NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man	`
Respondent 25983 87896 22013	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man	`
Respondent 25983 87896	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man	`
Respondent 25983 87896 22013 28243	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man	•
Respondent 25983 87896 22013 28243 72732	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity	`
Respondent 25983 87896 22013 28243 72732 Respondent	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity \	`
Respondent 25983 87896 22013 28243 72732 Respondent 25983	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity \ No Straight / Heterosexual White or of European descent	
Respondent 25983 87896 22013 28243 72732 Respondent 25983 87896	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity \ No Straight / Heterosexual White or of European descent No Gay or Lesbian White or of European descent	•
Respondent 25983 87896 22013 28243 72732 Respondent 25983 87896 22013	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity \ No Straight / Heterosexual White or of European descent No Gay or Lesbian White or of European descent No Straight / Heterosexual NaN	
Respondent 25983 87896 22013 28243 72732 Respondent 25983 87896	Not sure A lot less welcome now than last year SONewContent Age Gender NaN 24.0 Man Tech articles written by other developers; Tech 32.0 Man Tech articles written by other developers; Indu NaN Man Tech meetups or events in your area NaN NaN Tech articles written by other developers; Tech NaN Man Tech articles written by other developers; Tech NaN Man Trans Sexuality Ethnicity \ No Straight / Heterosexual White or of European descent No Gay or Lesbian White or of European descent	

```
Respondent
       25983
                               Appropriate in length
                                                                               Easy
                               Appropriate in length
       87896
                           No
                                                       Neither easy nor difficult
       22013
                          Yes
                                             Too long
                                                                               Easy
                                            Too short
       28243
                          Yes
                                                                               Easy
       72732
                          Yes
                                             Too long
                                                                               Easy
[217]: df['SalaryUSD'].head(10)
[217]: Respondent
       63129
                1000000.0
       50499
                  153216.0
       39258
                   19152.0
       58450
                   17556.0
       7085
                   14364.0
       22450
                   7980.0
       48436
                   4464.0
       10746
                    3996.0
       8149
                    1596.0
       29736
                    1116.0
       Name: SalaryUSD, dtype: float64
[218]: df['SalaryUSD'].mean()
[218]: 127110.73842323056
[219]: df['SalaryUSD'].median()
[219]: 57287.0
[220]:
       df.median()
[220]: Hobbyist
                           1.0
       CompTotal
                       62000.0
       SalaryUSD
                       57287.0
       WorkWeekHrs
                          40.0
       CodeRevHrs
                           4.0
                          29.0
       Age
       dtype: float64
[221]: df.describe()
[221]:
                  CompTotal
                                SalaryUSD
                                             WorkWeekHrs
                                                             CodeRevHrs
                                                                                   Age
              5.594500e+04
                             5.582300e+04
                                            64503.000000
                                                          49790.000000
                                                                         79210.000000
       count
       mean
              5.519014e+11
                             1.271107e+05
                                               42.127197
                                                               5.084308
                                                                             30.336699
       std
              7.331926e+13
                             2.841523e+05
                                               37.287610
                                                               5.513931
                                                                              9.178390
              0.000000e+00
                             0.000000e+00
                                                1.000000
                                                               0.000000
                                                                              1.000000
       min
```

SurveyLength

SurveyEase

Dependents

```
50%
              6.200000e+04
                             5.728700e+04
                                                                4.000000
                                                                             29.000000
                                               40.000000
       75%
              1.200000e+05
                             1.000000e+05
                                               44.750000
                                                                6.000000
                                                                             35.000000
                             2.000000e+06
                                             4850.000000
                                                              99.000000
                                                                             99.000000
       max
              1.000000e+16
[222]:
      df['SalaryUSD'].count()
[222]: 55823
[223]:
       df['SocialMedia']
[223]: Respondent
       63129
                I don't use social media
       50499
                                  WhatsApp
                                 Facebook
       39258
       58450
                                 Facebook
       7085
                                Instagram
       88062
                                       NaN
       88076
                                       NaN
       88601
                                       {\tt NaN}
       88802
                                       NaN
       88816
                                       {\tt NaN}
       Name: SocialMedia, Length: 88883, dtype: object
[224]: schema_df.loc['SocialMedia']
[224]: QuestionText
                        What social media site do you use the most?
       Name: SocialMedia, dtype: object
[225]: df['SocialMedia'].value_counts()
[225]: Reddit
                                     14374
       YouTube
                                     13830
       WhatsApp
                                     13347
       Facebook
                                     13178
       Twitter
                                     11398
       Instagram
                                      6261
       I don't use social media
                                      5554
       LinkedIn
                                      4501
       WeChat
                                      667
       Snapchat
                                       628
       VK
                                 603
       Weibo
                                      56
       Youku Tudou
                                       21
       Hello
                                        19
       Name: SocialMedia, dtype: int64
```

25%

2.000000e+04

2.577750e+04

40.000000

2.000000

24.000000

```
[226]: df['SocialMedia'].value_counts(normalize= True)
[226]: Reddit
                                    0.170233
       YouTube
                                    0.163791
       WhatsApp
                                    0.158071
      Facebook
                                    0.156069
       Twitter
                                    0.134988
       Instagram
                                    0.074150
       I don't use social media
                                    0.065777
       LinkedIn
                                    0.053306
       WeChat
                                   0.007899
                                    0.007437
       Snapchat
       VK
                               0.007141
       Weibo
                                  0.000663
       Youku Tudou
                                   0.000249
       Hello
                                    0.000225
       Name: SocialMedia, dtype: float64
[227]: df['Country'].value_counts()
[227]: United States
                                 20949
       India
                                  9061
       Germany
                                  5866
       United Kingdom
                                  5737
       Canada
                                  3395
       Saint Kitts and Nevis
                                     1
       Chad
                                     1
       Timor-Leste
                                     1
       Dominica
                                     1
       Tonga
       Name: Country, Length: 179, dtype: int64
[228]: Country_grp=df.groupby('Country')
[229]: Country_grp.get_group('India')
[229]:
                                                            MainBranch Hobbyist \
       Respondent
       22013
                                       I am a developer by profession
                                                                             True
       28243
                                       I am a developer by profession
                                                                             True
       72732
                   I am not primarily a developer, but I write co...
                                                                          False
       16793
                                       I am a developer by profession
                                                                             True
                                       I am a developer by profession
       52561
                                                                             True
                               I am a student who is learning to code
       88829
                                                                             True
       88843
                                       I am a developer by profession
                                                                             True
```

```
88856
                                I am a developer by profession
                                                                       True
88869
                                I am a developer by profession
                                                                      False
88872
                                I am a developer by profession
                                                                       True
                                                     OpenSourcer \
Respondent
22013
                                                           Never
28243
                                     Once a month or more often
72732
            Less than once a month but more than once per ...
16793
                                     Once a month or more often
52561
                                                           Never
88829
                                     Once a month or more often
88843
                                                           Never
88856
                                                           Never
88869
                                                           Never
88872
            Less than once a month but more than once per ...
                                                      OpenSource \
Respondent
            The quality of OSS and closed source software ...
22013
28243
            OSS is, on average, of HIGHER quality than pro...
72732
            OSS is, on average, of LOWER quality than prop...
             OSS is, on average, of HIGHER quality than pro...
16793
52561
            OSS is, on average, of LOWER quality than prop...
88829
            OSS is, on average, of HIGHER quality than pro...
            OSS is, on average, of HIGHER quality than pro...
88843
88856
            OSS is, on average, of HIGHER quality than pro...
            OSS is, on average, of LOWER quality than prop...
88869
            OSS is, on average, of HIGHER quality than pro...
88872
                                                      Employment Country \
Respondent
22013
                                             Employed full-time
                                                                    India
28243
             Independent contractor, freelancer, or self-em...
                                                                 India
72732
                                                             NaN
                                                                   India
16793
             Independent contractor, freelancer, or self-em...
                                                                 India
52561
                                             Employed full-time
                                                                    India
                            Not employed, but looking for work
88829
                                                                   India
88843
                                             Employed full-time
                                                                    India
88856
                                             Employed full-time
                                                                    India
88869
                                             Employed full-time
                                                                   India
88872
                                             Employed full-time
                                                                    India
```

66

Student

EdLevel \

```
Respondent
22013
                                             Professional degree (JD, MD, etc.)
                         No
28243
                         No
                                    Master's degree (MA, MS, M.Eng., MBA, etc.)
72732
            Yes, full-time
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
16793
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
52561
                         No
                                    Master's degree (MA, MS, M.Eng., MBA, etc.)
88829
            Yes, full-time
                             Secondary school (e.g. American high school, G...
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
88843
                         No
88856
            Yes, full-time
                                    Master's degree (MA, MS, M.Eng., MBA, etc.)
88869
                        NaN
                                                                              NaN
88872
                         No
                                       Bachelor's degree (BA, BS, B.Eng., etc.)
                                                 UndergradMajor \
Respondent
22013
            A natural science (ex. biology, chemistry, phy...
28243
            Computer science, computer engineering, or sof ...
            Computer science, computer engineering, or sof ...
72732
16793
            Computer science, computer engineering, or sof ...
52561
            Computer science, computer engineering, or sof ...
88829
                                                             NaN
88843
            Computer science, computer engineering, or sof ...
                                  Web development or web design
88856
88869
                                                             NaN
88872
            Computer science, computer engineering, or sof ...
                                                        EduOther \
Respondent
22013
            Taken an online course in programming or softw...
28243
            Taken an online course in programming or softw...
72732
                           Contributed to open source software
16793
            Taken an online course in programming or softw...
52561
            Taken an online course in programming or softw...
88829
            Taught yourself a new language, framework, or ...
88843
            Taken an online course in programming or softw...
88856
            Participated in online coding competitions (e...
88869
                                                             NaN
88872
            Taken an online course in programming or softw...
                                                         OrgSize
Respondent
22013
                                                  2-9 employees
28243
                                                   2-9 employees
72732
16793
            Just me - I am a freelancer, sole proprietor, ...
```

52561	5,000 to 9,999 employees	
 88829	 NaN	
88843	20 to 99 employees	
88856	5,000 to 9,999 employees	
88869	NaN	
88872	100 to 499 employees	
Respondent	DevType YearsC	ode \
22013	Academic researcher; Data scientist or machine	3
28243	Developer, back-end; Developer, full-stack; Deve 2	
72732	NaN	4
16793		4
52561	•	2
		_
88829	Developer, full-stack;Student	3
88843	-	9
88856	Designer	5
88869	_	NaN
88872	Developer, back-end;DevOps specialist	7
000.2	20.01001, 2001 010,20.000 200201200	·
	Age1stCode YearsCodePro CareerS	at \
Respondent		
22013	26 3 Very satisfi	ed
28243	9 14 Neither satisfied nor dissatisfi	ed
72732	20 5 Slightly satisfi	ed
16793	14 6 Neither satisfied nor dissatisfi	ed
52561	11 9 Slightly satisfi	ed
88829	17 NaN N	aN
88843	13 2 Very satisfi	ed
88856	5 2 Neither satisfied nor dissatisfi	ed
88869	NaN NaN Very dissatisfi	ed
88872	17 4 Slightly satisfi	ed
	JobSat MgrIdiot	MgrMoney \
Respondent		
22013	Very satisfied NaN	NaN
28243	Neither satisfied nor dissatisfied NaN	NaN
72732	Slightly satisfied NaN	NaN
16793	Neither satisfied nor dissatisfied NaN	NaN
52561	Slightly satisfied Somewhat confident	No
•••		
88829	NaN NaN	NaN
88843	•	Not sure
88856	Neither satisfied nor dissatisfied Very confident	NaN

```
88869
                               Very dissatisfied
                                                       Very confident
                                                                              Yes
88872
                             Slightly satisfied
                                                   Somewhat confident
                                                                               No
             MgrWant
                                                                    JobSeek
Respondent
22013
                             I am not interested in new job opportunities
                  NaN
28243
                       I'm not actively looking, but I am open to new ...
                  NaN
72732
                  NaN
                                          I am actively looking for a job
16793
                  NaN
                                          I am actively looking for a job
52561
                       I'm not actively looking, but I am open to new ...
                   No
88829
                  NaN
                                          I am actively looking for a job
88843
                  Yes
                       I'm not actively looking, but I am open to new...
88856
                  Yes
                       I'm not actively looking, but I am open to new ...
88869
                       I'm not actively looking, but I am open to new ...
                       I'm not actively looking, but I am open to new...
88872
            Not sure
                      LastHireDate
Respondent
22013
                     3-4 years ago
28243
                     1-2 years ago
            More than 4 years ago
72732
16793
                     1-2 years ago
52561
                     3-4 years ago
88829
              I've never had a job
88843
                     1-2 years ago
88856
                     3-4 years ago
88869
             Less than a year ago
88872
                     3-4 years ago
                                                         LastInt FizzBuzz \
Respondent
22013
            Write code by hand (e.g., on a whiteboard); Com...
                                                                      No
28243
             Interview with people in peer roles; Interview ...
                                                                     Yes
72732
                                                  Write any code
                                                                        No
16793
            Write any code; Write code by hand (e.g., on a ...
                                                                     Yes
52561
            Write any code; Write code by hand (e.g., on a ...
                                                                      No
88829
                                                              NaN
                                                                       NaN
            Write any code; Solve a brain-teaser style puzz...
88843
                                                                      No
88856
            Write any code; Write code by hand (e.g., on a ...
                                                                      No
88869
            Write any code; Write code by hand (e.g., on a ...
                                                                      No
88872
            Write code by hand (e.g., on a whiteboard); Sol ...
                                                                      No
                                                      JobFactors
```

Respondent

22013	Financial performance or funding status of the	
28243	Financial performance or funding status of the	
72732	Remote work options;Opportunities for professi	
16793	Office environment or company culture; Opportun	
52561	Languages, frameworks, and other technologies	
•••		
88829	Office environment or company culture; Opportun	
88843	Industry that I'd be working in; Languages, fra	
88856	Specific department or team I'd be working on;	
88869	Remote work options;Opportunities for professi	
88872	Languages, frameworks, and other technologies	
	ResumeUpdate CurrencySyn	mbol \
Respondent		
22013	Something else changed (education, award, medi U	SD
28243		SD
72732	I was preparing for a job search	USD
16793		NR
52561		NR
02001	someoning error enamed (earestein, awara, mearm	
 88829	I was preparing for a job search	NaN
88843	I was preparing for a job search	INR
88856		OA
88869		NR
	3 11	
88872	I was preparing for a job search	INR
	CurrencyDesc CompTotal CompFreq SalaryUSD \	
Respondent	Currencybesc Comprovat Compried Salaryosb (
22013	United States dollar 1500000.0 Weekly 2000000.0	
	·	
28243	United States dollar 2000000.0 Yearly 2000000.0	
72732	United States dollar 80000.0 Weekly 2000000.0	
16793	Indian rupee 106673250.0 Yearly 1000000.0	
52561	Indian rupee 2000000.0 Weekly 1000000.0	
88829	NaN NaN NaN NaN	
88843	Indian rupee NaN Monthly NaN	
88856	Angolan kwanza NaN Weekly NaN	
88869	Indian rupee NaN NaN NaN	
88872	Indian rupee NaN NaN NaN	
		_
_	WorkWeekHrs WorkPla	an \
Respondent		
22013	50.0 There's no schedule or spec; I work on what se	
28243	20.0 There is a schedule and/or spec (made by me or	
72732	40.0 There is a schedule and/or spec (made by me or	
16793	50.0 There is a schedule and/or spec (made by me or	
52561	40.0 There's no schedule or spec; I work on what se	

•••	
88829	NaN NaN
88843	40.0 There is a schedule and/or spec (made by me or
88856	NaN NaN
88869	NaN NaN
88872	NaN There's no schedule or spec; I work on what se
	•
	WorkChallenge \
Respondent	
22013	Inadequate access to necessary tools; Meetings;
28243	Being tasked with non-development work; Not eno
72732	Lack of support from management; Meetings; Time
16793	Distracting work environment; Non-work commitme
52561	Being tasked with non-development work; Distrac
02001	boing tablea with non actorophone work, bibliacom
 88829	 NaN
88843	Being tasked with non-development work; Non-wor
88856	NaN
88869	Being tasked with non-development work; Distrac
88872	Being tasked with non-development work; Meeting
00012	being tasked with hon-development work, meeting
	WorkRemote WorkLoc \
Respondent	WOIRITEMOTE WOIRLOC (
22013	All or almost all the time (I'm full-time remote) Home
28243	All or almost all the time (I'm full-time remote) Office
72732	Less than once per month / Never Office
16793	It's complicated Office
52561	A few days each month Office
88829	NaN NaN
88843	Less than once per month / Never Home
88856	NaN NaN
88869	All or almost all the time (I'm full-time remote) Home
88872	NaN Office
	T 0
	ImpSyn CodeRev \
Respondent	
22013	A little below average Yes, because I see value in code review
28243	Far above average Yes, because I see value in code review
72732	A little above average Yes, because I see value in code review
16793	Far above average Yes, because I see value in code review
52561	A little above average Yes, because I was told to do so
•••	
88829	NaN
88843	A little above average Yes, because I see value in code review
88856	NaN NaN
88869	A little below average Yes, because I see value in code review

88872	A little above average Yes, because I see value in code review
Respondent	CodeRevHrs UnitTests \
22013	10.0 Yes, it's part of our process
28243	NaN NaN
72732	10.0 Yes, it's part of our process
16793	20.0 NaN
52561	2.0 Yes, it's part of our process
•••	
88829	NaN NaN
88843	NaN Yes, it's not part of our process but the deve
88856	NaN NaN
88869	3.0 Yes, it's part of our process
88872	5.0 Yes, it's part of our process
	PurchaseHow \
Respondent	
22013	Developers typically have the most influence o
28243	NaN
72732	Not sure
16793 52561	NaN Developers and management have nearly equal in
	beveropers and management have hearry equal in
 88829	 NaN
88843	Not sure
88856	NaN
88869	NaN
88872	Developers typically have the most influence o
	PurchaseWhat \
Respondent	
22013	I have a great deal of influence
28243	NaN
72732	I have little or no influence
16793	NaN
52561	I have some influence
	 No N
88829	NaN Thomasinthe or no influence
88843	I have little or no influence
88856 88869	NaN NaN
88872	I have a great deal of influence
00012	I have a great dear or intractice
	LanguageWorkedWith \
Respondent	
22013	Assembly;Bash/Shell/PowerShell;C;C++;Java;Java

28243	C++;C#;Java;JavaScript;Objective-C;Python	
72732	Java; Python; SQL	
16793	Assembly;Bash/Shell/PowerShell;C;C++;C#;Dart;G	
52561	C#;JavaScript	
	- 	
88829	<pre>Bash/Shell/PowerShell;C;C++;HTML/CSS;JavaScrip</pre>	
88843	Bash/Shell/PowerShell;C;C++;HTML/CSS;Java;Java	
88856		
	HTML/CSS; JavaScript; PHP; TypeScript	
88869	HTML/CSS; JavaScript; PHP; SQL	
88872	Java; Ruby; SQL	
	${\tt LanguageDesireNextYear}$	\
Respondent		
22013	Python; Swift	
28243	C;C++;C#	
72732	NaN	
16793	<pre>Bash/Shell/PowerShell;C;C++;Go;HTML/CSS;Java;J</pre>	
52561	C#;JavaScript	
 88829	Bash/Shell/PowerShell;C;C++;HTML/CSS;JavaScrip	
88843	HTML/CSS; JavaScript; Python; SQL; TypeScript	
88856	HTML/CSS; JavaScript; PHP; TypeScript	
88869	Kotlin; Python; R	
88872	Go; Python; R	
	5	
	DatabaseWorkedWith	\
Respondent		
22013	Cassandra; Microsoft SQL Server; Oracle	
28243	PostgreSQL;SQLite	
72732	<pre>MongoDB;Microsoft SQL Server;MySQL;Oracle;Post</pre>	
16793	Cassandra;Couchbase;DynamoDB;Elasticsearch;Fir	
52561	DynamoDB; Microsoft SQL Server; SQLite	
•••	•	
88829	MySQL;Oracle;PostgreSQL;Redis;SQLite	
88843	Microsoft SQL Server; MySQL; PostgreSQL	
88856	NaN	
88869	MariaDB;MySQL	
88872	Cassandra; MongoDB; MySQL	
00012	oassandra, nongobb, nybqi	
	DatabaseDesireNextYear	\
Respondent	ngrangsenes ii ewey (i eai	`
-	0	
22013	Cassandra	
28243	SQLite	
72732	MySQL	
	•	
16793	Cassandra;Couchbase;DynamoDB;Elasticsearch;Fir	
16793 52561	•	

88829 88843 88856	Couchbase; Elasticsearch; MySQL; PostgreSQL; Redis Elasticsearch; MySQL NaN	
88869 88872	Elasticsearch; Firebase; MongoDB; Redis PostgreSQL; Redis	
Respondent	PlatformWorkedWith	\
22013 28243 72732	Android; Arduino; Google Cloud Platform; IBM Clou Android; AWS; iOS; MacOS; Windows Android; Windows	
16793 52561 	Android; Arduino; AWS; Docker; Google Cloud Platfo AWS; Docker; Linux; Windows	
88829 88843 88856	Docker;Linux NaN NaN	
88869 88872	AWS;Heroku;Windows Docker;Google Cloud Platform;Linux	
Respondent	PlatformDesireNextYear	\
22013 28243	IBM Cloud or Watson;Windows Android;Linux	
72732 16793 52561	AWS;Docker Android;Arduino;AWS;Docker;Google Cloud Platfo AWS;Docker;Linux;Windows	
 88829 88843 88856	 Docker;Linux NaN NaN	
88869 88872	IBM Cloud or Watson; Kubernetes; Linux AWS; Docker; Google Cloud Platform; Kubernetes; Linux	
Respondent	WebFrameWorkedWith	\
22013 28243	jQuery NaN	
72732 16793	NaN Angular/Angular.js; ASP.NET; Django; Drupal; Expre	
52561 	Angular/Angular.js; ASP.NET; Express; React.js	
88829 88843 88856 88869	Django;Express;Flask;jQuery Angular/Angular.js;Django;Express;jQuery Angular/Angular.js;ASP.NET Express;Laravel;React.js;Ruby on Rails	
88872	NaN	

	WebFrameDesireNextYear	\		
Respondent				
22013	NaN			
28243	NaN			
72732	Angular/Angular.js;React.js			
16793	Angular/Angular.js;ASP.NET;Django;Flask;jQuery			
52561	Angular/Angular.js; ASP.NET; Express; React.js			
02001	imgarar, imgarar. jo, nor . indr, naprobo, iloaco. jo			
 88829	Angular/Angular.js;Django;Flask;jQuery;React.js			
88843	Angular/Angular.js;Django;Express;jQuery;React.js			
88856	Angular/Angular.js;ASP.NET			
88869				
	Laravel; React.js; Ruby on Rails			
88872	NaN			
	W: T 177 1 177 1	,		
	t MiscTechWorkedWith	\		
Respondent				
22013	TensorFlow			
28243	Node.js;Pandas;Unity 3D			
72732	NaN			
16793	Apache Spark; Flutter; Hadoop; .NET; .NET Core; Nod			
52561	.NET;.NET Core;Node.js			
•••				
88829	Ansible; Node. js			
88843	Node.js			
88856	NaN			
88869	Node.js			
88872	NaN			
	MiscTechDesireNextYear	\		
Respondent				
22013	TensorFlow			
28243	Unity 3D;Unreal Engine			
72732	NaN			
16793	Apache Spark; Hadoop; Pandas; TensorFlow; Torch/Py			
52561	.NET;.NET Core;Node.js			
	, J			
 88829	Ansible; Puppet; React Native			
88843	Node.js			
88856	NaN			
88869	Hadoop;Node.js;React Native			
88872				
00012	Chef; Puppet			
	DevEnviron		OpSys	\
Dognandant	Devenviion		opays	\
Respondent	Vignal Ctudia. Vignal Ctudia Cada		Window-	
22013	Visual Studio; Visual Studio Code		Windows	
28243	Android Studio;Coda;PyCharm;Visual Studio;Visu		MacOS	

72732 16793 52561	Eclipse; Notepad++; PyCharm Android Studio; Atom; Eclipse; Emacs; IntelliJ; IPy I Visual Studio; Visual Studio Code	Windows Linux-based Windows
88829 88843 88856 88869 88872	Visual Studio Code IntelliJ;Notepad++;PHPStorm;Visual Studio Code Eclipse;Notepad++;PHPStorm;Sublime Text;Visual NetBeans;Notepad++;PHPStorm IntelliJ;RubyMine;Vim	Linux-based Windows Windows Linux-based Linux-based
Respondent 22013 28243 72732 16793 52561	Development I do not use containers Testing Development; Testing; Production; Outside of work Development; Testing; Production; Outside of work	
88829 88843 88856 88869 88872	Development; Testing; Production; Outside of work I do not use containers Development I do not use containers Development; Production	
Respondent 22013 28243 72732 16793 52561 88829 88843 88856	Implementing our own cryptocurrency NaN NaN NaN Not at all NaN Accepting Bitcoin or other coins and tokens as	
88869 88872	Not at all NaN BlockchainIs	BetterLife \
Respondent 22013 28243 72732 16793 52561	Useful across many domains and could change ma An irresponsible use of resources NaN Useful across many domains and could change ma Useful for immutable record keeping outside of	Yes No Yes Yes No
88829	NaN	Yes

88843 88856 88869 88872	Useful across many domains and could change ma Useful across many domains and could change ma Useful for decentralized currency (i.e., Bitcoin) NaN	No No No Yes			
Respondent 22013	<pre>ITperson OffOn SocialMedia \ Yes No YouTube</pre>				
28243	Yes No I don't use social media				
72732	Yes No WhatsApp				
16793	Also Yes What? LinkedIn				
52561	Also Yes YouTube				
•••					
88829	Yes What? NaN				
88843	Yes Yes WhatsApp				
88856	Yes Yes NaN				
88869	SIGH What? WhatsApp				
88872	Yes What? LinkedIn				
	Extraversion ScreenName SOVisit1st \setminus				
Respondent					
22013	Online Screen Name NaN				
28243	In real life (in person) Username 2008				
72732	Neither NaN 2017				
16793	Online Handle 2009				
52561	Online UserID 2009				
•••					
88829	Online Username 2016				
88843	In real life (in person) UserID 2013				
88856	NaN NaN 2011				
88869	Online UserID 2011				
88872	In real life (in person) Username 2011				
	SOVisitFreq \				
Respondent					
22013	A few times per week				
28243	Daily or almost daily				
72732	A few times per month or weekly				
16793	Multiple times per day				
52561	Daily or almost daily				
					
88829	A few times per week				
88843	Daily or almost daily				
88856	I have never visited Stack Overflow (before to				
88869	Multiple times per day				
88872	A few times per week				

Respondent 22013 Find answers to specific questions 28243 Find answers to specific questions 72732 Get a sense of belonging to the developer comm... 16793 Find answers to specific questions; Learn how t... 52561 Find answers to specific questions; Contribute ... 88829 Find answers to specific questions 88843 Find answers to specific questions; Learn how t... Find answers to specific questions; Learn how t... 88856 88869 Find answers to specific questions; Learn how t... 88872 Find answers to specific questions; Contribute ... SOFindAnswer SOTimeSaved \ Respondent 22013 1-2 times per week Stack Overflow was much faster 28243 Stack Overflow was much faster More than 10 times per week 72732 1-2 times per week Stack Overflow was slightly faster 16793 More than 10 times per week Stack Overflow was much faster 52561 Stack Overflow was much faster 1-2 times per week 88829 6-10 times per week Stack Overflow was much faster 1-2 times per week Stack Overflow was slightly faster 88843 88856 3-5 times per week NaN 88869 1-2 times per week They were about the same Less than once per week 88872 Stack Overflow was much faster SOHowMuchTime SOAccount \ Respondent 22013 60+ minutes Yes 28243 60+ minutes Yes Yes 72732 11-30 minutes 16793 0-10 minutes Yes 52561 0-10 minutes Yes 88829 31-60 minutes Yes 88843 0-10 minutes Yes 88856 31-60 minutes NaN 88869 NaNYes 88872 0-10 minutes Yes SOPartFreq \ Respondent 22013 I have never participated in Q&A on Stack Over... 28243 Multiple times per day

SOVisitTo \

A few times per month or weekly

72732

16793	A few times per week
52561	A few times per month or weekly
 88829	Less than once per month or monthly
88843	Less than once per month or monthly
88856	NaN
88869	Less than once per month or monthly
88872	A few times per month or weekly
	SOJobs \
Respondent 22013	Yes
28243	Yes
72732	Yes
16793	No, I didn't know that Stack Overflow had a jo
52561	Yes
•••	
88829	No, I knew that Stack Overflow had a job board
88843	No, I knew that Stack Overflow had a job board
88856	No, I knew that Stack Overflow had a job board
88869	Yes
88872	No, I knew that Stack Overflow had a job board
	EntTeams \
Respondent	Life County (
22013	Yes
28243	No, and I don't know what those are
72732	No, and I don't know what those are
16793	No, and I don't know what those are
52561	No, I've heard of them, but I am not part of a
 88829	No and I don't bross what there are
88843	No, and I don't know what those are No, I've heard of them, but I am not part of a
88856	No, I've heard of them, but I am not part of a
88869	No, and I don't know what those are
88872	No, I've heard of them, but I am not part of a
	-
	SOComm WelcomeChange \
Respondent	
22013	Yes, definitely A lot more welcome now than last year
28243 72732	Yes, definitely A lot less welcome now than last year Not sure A lot less welcome now than last year
16793	Not sure A lot less welcome now than last year Yes, definitely Somewhat more welcome now than last year
52561	Yes, definitely Just as welcome now as I felt last year
88829	Yes, definitely Somewhat more welcome now than last year
88843	Yes, definitely Somewhat more welcome now than last year
	•

88856 88869	No, not really Somewhat less welcome now than last year Neutral A lot more welcome now than last year	
88872	Yes, definitely Somewhat more welcome now than last year	
	SONewContent Age Gender	\
Respondent		
22013	Tech articles written by other developers; Indu NaN Man	
28243	Tech meetups or events in your area NaN NaN	
72732	Tech articles written by other developers; Tech NaN Man	
16793	Tech articles written by other developers; Indu 27.0 Man	
52561	Tech articles written by other developers; Indu 31.0 Man	
•••		
88829	Tech articles written by other developers; Indu 21.0 Man	
88843	Industry news about technologies you're intere 22.0 Man	
88856	Tech articles written by other developers; Indu NaN NaN	
88869	Tech articles written by other developers 30.0 Man	
88872	Tech articles written by other developers; Cour NaN Man	
	Trans Sexuality Ethnicity Dependents \	
Respondent	Trans Solidarity Zollifer Depolation (
22013	No Straight / Heterosexual NaN Yes	
28243	NaN Straight / Heterosexual NaN Yes	
72732	No NaN NaN Yes	
16793	No Straight / Heterosexual South Asian Yes	
52561	No Straight / Heterosexual South Asian Yes	
88829	No Straight / Heterosexual South Asian No	
88843	No Straight / Heterosexual South Asian Yes	
88856	NaN NaN NaN NaN	
88869	No NaN South Asian No	
88872	No NaN NaN Yes	
	SurveyLength SurveyEase	
Respondent		
22013	Too long Easy	
28243	Too short Easy	
72732	Too long Easy	
16793	Appropriate in length Neither easy nor difficult	
52561	Too long Easy	
•••		
88829	Appropriate in length Easy	
88843	Appropriate in length Easy	
88856	NaN NaN	
88869	Too long Neither easy nor difficult	
88872	NaN Neither easy nor difficult	

[9061 rows x 84 columns]

```
[230]: filt = df['Country']=='India'
       df.loc[filt]['SocialMedia'].value_counts()
[230]: WhatsApp
                                    2990
       YouTube
                                    1820
       LinkedIn
                                     955
       Facebook
                                     841
                                     822
       Instagram
       Twitter
                                     542
       Reddit
                                     473
       I don't use social media
                                     250
       Snapchat
                                      23
       Hello
                                       5
       WeChat
                                      5
       VK
                                  4
                                      2
       Youku Tudou
       Weibo
       Name: SocialMedia, dtype: int64
[231]: Country_grp['SocialMedia'].value_counts()
[231]: Country
                    SocialMedia
       Afghanistan Facebook
                                                  15
                    YouTube
                                                   9
                    I don't use social media
                                                   6
                    WhatsApp
                    Instagram
                                                   1
       Zimbabwe
                    Facebook
                                                   3
                    YouTube
                                                   3
                    Instagram
                                                   2
                    LinkedIn
                                                   2
                    Reddit
       Name: SocialMedia, Length: 1220, dtype: int64
[232]: Country_grp['SocialMedia'].value_counts().loc['China']
[232]: SocialMedia
       WeChat
                                   403
       YouTube
                                     53
       Weibo
                                   42
       I don't use social media
                                     27
       Twitter
                                     27
       Reddit
                                     12
       LinkedIn
                                     11
       Facebook
                                      8
       Instagram
                                      7
```

```
Youku Tudou
                                     7
                                      3
       WhatsApp
       VK
       Name: SocialMedia, dtype: int64
       Country_grp['SalaryUSD'].value_counts()
[233]:
[233]: Country
                    SalaryUSD
       Afghanistan
                    0.0
                                  2
                                  1
                    1116.0
                    1596.0
                                  1
                    3996.0
                                  1
                    4464.0
                                  1
       Zimbabwe
                    30000.0
                                  1
                    42000.0
                                  1
                    45000.0
                                  1
                    70000.0
                                  1
                     180000.0
                                  1
       Name: SalaryUSD, Length: 15016, dtype: int64
[234]: Country_grp['SalaryUSD'].value_counts().loc['Germany']
[234]: SalaryUSD
       68745.0
                     184
       57287.0
                     131
       54996.0
                     127
       74474.0
                     100
       63016.0
                     94
       952668.0
                      1
       962450.0
                       1
       976176.0
                       1
       998172.0
       2000000.0
                       1
       Name: SalaryUSD, Length: 693, dtype: int64
[235]: Country_grp['SalaryUSD'].median().loc['Germany']
[235]: 63016.0
       Country_grp['SalaryUSD'].agg(['median', 'mean']).loc['Canada']
[236]: median
                  68705.000000
                 134018.564909
       Name: Canada, dtype: float64
```

```
[237]: filt =df['Country']=='India'
       df.loc[filt]['LanguageWorkedWith']
[237]: Respondent
                Assembly; Bash/Shell/PowerShell; C; C++; Java; Java...
       22013
       28243
                         C++; C#; Java; JavaScript; Objective-C; Python
       72732
                                                     Java; Python; SQL
       16793
                Assembly; Bash/Shell/PowerShell; C; C++; C#; Dart; G...
       52561
                                                       C#; JavaScript
       88829
                Bash/Shell/PowerShell;C;C++;HTML/CSS;JavaScrip...
                Bash/Shell/PowerShell;C;C++;HTML/CSS;Java;Java...
       88843
       88856
                                HTML/CSS; JavaScript; PHP; TypeScript
       88869
                                        HTML/CSS; JavaScript; PHP; SQL
       88872
                                                       Java; Ruby; SQL
       Name: LanguageWorkedWith, Length: 9061, dtype: object
[238]: df.loc[filt]['LanguageWorkedWith'].str.contains('Python',na=False).sum()
[238]: 3105
[239]: Country_grp('LanguageWorkedWith').str.contains('Python').sum()
               TypeError
                                                           Traceback (most recent call
       →last)
               <ipython-input-239-a7f3fbaf5cf8> in <module>
          ----> 1 Country_grp('LanguageWorkedWith').str.contains('Python').sum()
               TypeError: 'DataFrameGroupBy' object is not callable
[240]: Country_grp["LanguageWorkedWith"].apply(lambda x : x.str.contains('Python').
        \rightarrowsum())
[240]: Country
       Afghanistan
                                                  8
       Albania
                                                 23
       Algeria
                                                  40
       Andorra
                                                   0
       Angola
                                                   2
       Venezuela, Bolivarian Republic of...
                                               28
```

```
Viet Nam
                                          78
      Yemen
                                           3
      Zambia
                                           4
      Zimbabwe
                                          14
      Name: LanguageWorkedWith, Length: 179, dtype: int64
[255]: country_uses_python= Country_grp["LanguageWorkedWith"].apply(lambda x : x.str.
      country_uses_python
[255]: Country
      Afghanistan
                                          8
                                          23
      Albania
      Algeria
                                          40
      Andorra
                                           0
      Angola
                                           2
      Venezuela, Bolivarian Republic of ...
                                        28
      Viet Nam
                                          78
      Yemen
                                           3
      Zambia
                                           4
      Zimbabwe
                                          14
      Name: LanguageWorkedWith, Length: 179, dtype: int64
[257]: country_respondents= df['Country'].value_counts()
      country_respondents
[257]: United States
                            20949
      India
                             9061
      Germany
                             5866
      United Kingdom
                             5737
      Canada
                             3395
      Saint Kitts and Nevis
                                1
      Chad
                                1
      Timor-Leste
                                1
      Dominica
      Tonga
      Name: Country, Length: 179, dtype: int64
[259]: python_df = pd.
       python_df
```

84

```
→last)
              <ipython-input-259-96dc50b8a8e3> in <module>
          ---> 1 python_df = pd.
       →concat(['country_respondents','country_uses_python'],axis='columns',sort=False)
                2 python_df
              ~\anaconda3\lib\site-packages\pandas\core\reshape\concat.py in_
       →concat(objs, axis, join, ignore_index, keys, levels, names, verify_integrity, u
       →sort, copy)
              279
                          verify_integrity=verify_integrity,
              280
                          copy=copy,
          --> 281
                          sort=sort,
              282
                      )
              283
              ~\anaconda3\lib\site-packages\pandas\core\reshape\concat.py in_
       →__init__(self, objs, axis, join, keys, levels, names, ignore_index,_
       →verify_integrity, copy, sort)
              355
                                       "only Series and DataFrame objs are valid".
       →format(typ=type(obj))
              356
                                   )
          --> 357
                                   raise TypeError(msg)
              358
              359
                              # consolidate
              TypeError: cannot concatenate object of type '<class 'str'>'; only⊔
       →Series and DataFrame objs are valid
[260]: python_df = pd.concat([country_respondents, country_uses_python],_
       ⇔axis='columns', sort=False)
       python_df
[260]:
                              Country LanguageWorkedWith
                                20949
      United States
                                                     10083
       India
                                 9061
                                                      3105
       Germany
                                 5866
                                                      2451
      United Kingdom
                                 5737
                                                      2384
       Canada
                                 3395
                                                      1558
      Saint Kitts and Nevis
                                                         0
                                    1
       Chad
                                    1
                                                         0
```

Traceback (most recent call_

TypeError

```
Dominica
                                      1
                                                           1
                                                           0
       Tonga
                                      1
       [179 rows x 2 columns]
[263]: python_df.rename(columns={'Country': 'NumRespondents','LanguageWorkedWith': ___
        → 'NumKnowsPython'},inplace=True)
[264]: python_df
[264]:
                               NumRespondents
                                                NumKnowsPython
                                         20949
                                                          10083
       United States
       India
                                          9061
                                                           3105
       Germany
                                          5866
                                                           2451
       United Kingdom
                                          5737
                                                           2384
       Canada
                                          3395
                                                           1558
       Saint Kitts and Nevis
                                             1
                                                              0
       Chad
                                                              0
                                             1
       Timor-Leste
                                             1
                                                              1
       Dominica
                                             1
                                                              1
                                             1
                                                              0
       Tonga
       [179 rows x 2 columns]
[265]: python_df['PctKnowsPython'] = (python_df['NumKnowsPython']/
        →python_df['NumRespondents']) * 100
       python_df
[265]:
                               NumRespondents
                                                NumKnowsPython PctKnowsPython
                                                                      48.131176
       United States
                                         20949
                                                          10083
       India
                                          9061
                                                           3105
                                                                      34.267741
                                                                      41.783157
       Germany
                                          5866
                                                           2451
       United Kingdom
                                          5737
                                                           2384
                                                                      41.554820
       Canada
                                          3395
                                                           1558
                                                                      45.891016
       Saint Kitts and Nevis
                                             1
                                                              0
                                                                       0.000000
       Chad
                                                              0
                                                                       0.000000
                                             1
       Timor-Leste
                                             1
                                                              1
                                                                     100.000000
       Dominica
                                             1
                                                              1
                                                                     100.000000
       Tonga
                                             1
                                                              0
                                                                        0.000000
       [179 rows x 3 columns]
[266]: python_df.sort_values(by='PctKnowsPython',ascending=False,inplace=True)
```

1

1

Timor-Leste

[267]: python_df.head(20)

[267]:		NumRespondents	NumKnowsPython	PctKnowsPython
	Dominica	1	1	100.000000
	Timor-Leste	1	1	100.000000
	Niger	1	1	100.000000
	Sao Tome and Principe	1	1	100.000000
	Turkmenistan	7	6	85.714286
	Mauritania	7	5	71.428571
	Guinea	3	2	66.666667
	Bahamas	3	2	66.66667
	Guyana	3	2	66.66667
	Uganda	72	47	65.277778
	Iceland	49	30	61.224490
	Namibia	5	3	60.000000
	Haiti	5	3	60.000000
	Benin	5	3	60.000000
	Congo, Republic of the	7	4	57.142857
	Oman	11	6	54.545455
	Cuba	30	16	53.333333
	Republic of Korea	39	20	51.282051
	Monaco	4	2	50.000000
	South Korea	160	80	50.000000

[268]: python_df.loc['Japan']

[268]: NumRespondents 391.000000
NumKnowsPython 182.000000
PctKnowsPython 46.547315
Name: Japan, dtype: float64

[]: