SF Salaries Exercise Welcome to a quick exercise for you to practice your pandas skills! We will be using the SF Salaries Dataset from Kaggle! Just follow along and complete the tasks outlined in bold below. The tasks will get harder and harder as you go along. Import pandas as pd. import pandas as pd In [1]: Read Salaries.csv as a dataframe called sal. df=pd.read_csv("C:/Users/Mounika/Downloads/Salaries.csv") C:\Users\Mounika\anaconda\lib\site-packages\IPython\core\interactiveshell.py:3146: DtypeWarning: Columns (3,4,5,6,12) have mixed types.Specify dtype option on import or set low_memory=False. has_raised = await self.run_ast_nodes(code_ast.body, cell_name, Check the head of the DataFrame. df.head() In [17] **EmployeeName** JobTitle BasePay OvertimePay OtherPay Benefits TotalPay TotalPayBenefits Year Notes Out[17]: Agency Status GENERAL MANAGER-METROPOLITAN TRANSIT NATHANIEL FORD 0 1 167411 400184 NaN 567595.43 0 567595.43 2011 NaN San Francisco NaN **AUTHORITY 1** 2 **GARY JIMENEZ** CAPTAIN III (POLICE DEPARTMENT) 245132 155966 137811 NaN 538909.28 538909.28 2011 NaN San Francisco NaN ALBERT PARDINI NaN San Francisco **2** 3 CAPTAIN III (POLICE DEPARTMENT) 212739 106088 16452.6 NaN 335279.91 335279.91 2011 NaN CHRISTOPHER 3 4 WIRE ROPE CABLE MAINTENANCE MECHANIC 77916 56120.7 198307 NaN 332343.61 332343.61 2011 NaN San Francisco NaN **CHONG** Use the .info() method to find out how many entries there are. df.info() In [6]: <class 'pandas.core.frame.DataFrame'> RangeIndex: 148654 entries, 0 to 148653 Data columns (total 13 columns): # Column Non-Null Count Dtype -----0 Ιd 148654 non-null int64 EmployeeName 148654 non-null object 1 JobTitle 148654 non-null object BasePay 148049 non-null object OvertimePay 148654 non-null object 5 148654 non-null OtherPay 9 8 1 object 6 112495 non-null object Benefits TotalPay 148654 non-null float64 8 TotalPayBenefits 148654 non-null float64 9 Year 148654 non-null int64 0 non-null float64 10 Notes 148654 non-null object 11 Agency 12 Status 38119 non-null object dtypes: float64(3), int64(2), object(8)memory usage: 14.7+ MB What is the average BasePay? df['BasePay'].mean()[0:148646] In [30]: **TypeError** Traceback (most recent call last) <ipython-input-30-9c3fd0c81f24> in <module> ----> 1 df['BasePay'].mean()[0:148646] ~\anaconda\lib\site-packages\pandas\core\generic.py in stat_func(self, axis, skipna, level, numeric_only, **kwargs) if level is not None: 11467 return self._agg_by_level(name, axis=axis, level=level, skipna=skipna) > 11468 return self._reduce(11469 func, name=name, axis=axis, skipna=skipna, numeric_only=numeric_only 11470 ~\anaconda\lib\site-packages\pandas\core\series.py in _reduce(self, op, name, axis, skipna, numeric_only, filter_type, **kwds) 4234 4235 with np.errstate(all="ignore"): -> 4236 return op(delegate, skipna=skipna, **kwds) 4237 4238 def _reindex_indexer(self, new_index, indexer, copy): ~\anaconda\lib\site-packages\pandas\core\nanops.py in _f(*args, **kwargs) try: 70 with np.errstate(invalid="ignore"): ---> 71 return f(*args, **kwargs) 72 except ValueError as e: 73 # we want to transform an object array ~\anaconda\lib\site-packages\pandas\core\nanops.py in f(values, axis, skipna, **kwds) 127 result = alt(values, axis=axis, skipna=skipna, **kwds) 128 --> 129 result = alt(values, axis=axis, skipna=skipna, **kwds) 130 131 return result ~\anaconda\lib\site-packages\pandas\core\nanops.py in nanmean(values, axis, skipna, mask) 561 dtype_count = dtype 562 count = _get_counts(values.shape, mask, axis, dtype=dtype_count) --> 563 the_sum = _ensure_numeric(values.sum(axis, dtype=dtype_sum)) 564 565 if axis is not None and getattr(the_sum, "ndim", False): ~\anaconda\lib\site-packages\numpy\core_methods.py in _sum(a, axis, dtype, out, keepdims, initial, where) 45 def _sum(a, axis=None, dtype=None, out=None, keepdims=False, 46 initial=_NoValue, where=True): ---> 47 return umr_sum(a, axis, dtype, out, keepdims, initial, where) 48 49 def _prod(a, axis=None, dtype=None, out=None, keepdims=False, TypeError: unsupported operand type(s) for +: 'float' and 'str' What is the highest amount of OvertimePay in the dataset? In [19]: df['OvertimePay'].max() Traceback (most recent call last) <ipython-input-19-322a328310f5> in <module> ----> 1 df['OvertimePay'].max() ~\anaconda\lib\site-packages\pandas\core\generic.py in stat_func(self, axis, skipna, level, numeric_only, **kwargs) 11466 if level is not None: 11467 return self._agg_by_level(name, axis=axis, level=level, skipna=skipna) > 11468 return self._reduce(11469 func, name=name, axis=axis, skipna=skipna, numeric_only=numeric_only 11470 ~\anaconda\lib\site-packages\pandas\core\series.py in _reduce(self, op, name, axis, skipna, numeric_only, filter_type, **kwds) 4234 with np.errstate(all="ignore"): 4235 -> 4236 return op(delegate, skipna=skipna, **kwds) 4237 4238 def _reindex_indexer(self, new_index, indexer, copy): ~\anaconda\lib\site-packages\pandas\core\nanops.py in f(values, axis, skipna, **kwds) 127 result = alt(values, axis=axis, skipna=skipna, **kwds) 128 else: --> 129 result = alt(values, axis=axis, skipna=skipna, **kwds) 130 return result 131 ~\anaconda\lib\site-packages\pandas\core\nanops.py in reduction(values, axis, skipna, mask) result = np.nan871 872 else: result = getattr(values, meth)(axis) --> 873 874 result = _wrap_results(result, dtype, fill_value) ~\anaconda\lib\site-packages\numpy\core_methods.py in _amax(a, axis, out, keepdims, initial, where) 37 def _amax(a, axis=None, out=None, keepdims=False, 38 initial=_NoValue, where=True): ---> 39 return umr_maximum(a, axis, None, out, keepdims, initial, where) 40 41 def _amin(a, axis=None, out=None, keepdims=False, TypeError: '>=' not supported between instances of 'float' and 'str' What is the job title of JOSEPH DRISCOLL? Note: Use all caps, otherwise you may get an answer that doesn't match up (there is also a lowercase Joseph Driscoll). df[df['EmployeeName']=='JOSEPH DRISCOLL']['JobTitle'] In [20]: CAPTAIN, FIRE SUPPRESSION Out[20]: Name: JobTitle, dtype: object How much does JOSEPH DRISCOLL make (including benefits)? df[df['EmployeeName']=='JOSEPH DRISCOLL']['TotalPayBenefits'] 24 270324.91 Out[22]: Name: TotalPayBenefits, dtype: float64 What is the name of highest paid person (including benefits)? df[df['TotalPayBenefits']==df['TotalPayBenefits'].max()] In [25]: Id JobTitle BasePay OvertimePay OtherPay Benefits TotalPay TotalPayBenefits Year Notes Agency Out[25]: **EmployeeName Status** 0 1 NATHANIEL FORD GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY NaN San Francisco 400184 NaN 567595.43 567595.43 2011 NaN What is the name of lowest paid person (including benefits)? Do you notice something strange about how much he or she is paid? df[df['TotalPayBenefits']==df['TotalPayBenefits'].min()] JobTitle BasePay OvertimePay OtherPay Benefits TotalPay TotalPayBenefits Year Notes Id EmployeeName Agency Status Out[26]: **148653** 148654 Joe Lopez Counselor, Log Cabin Ranch 0.00 0.00 -618.13 0.00 -618.13 -618.13 2014 NaN San Francisco What was the average (mean) BasePay of all employees per year? (2011-2014)? df.groupby('Year').mean()['BasePay'] In [27]: Traceback (most recent call last) ~\anaconda\lib\site-packages\pandas\core\indexes\base.py in get_loc(self, key, method, tolerance) 2894 -> 2895 return self._engine.get_loc(casted_key) 2896 except KeyError as err: pandas_libs\index.pyx in pandas._libs.index.IndexEngine.get_loc() pandas_libs\index.pyx in pandas._libs.index.IndexEngine.get_loc() pandas_libs\hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item() pandas_libs\hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item() **KeyError**: 'BasePay' The above exception was the direct cause of the following exception: **KeyError** Traceback (most recent call last) <ipython-input-27-d6ec57df777a> in <module> ----> 1 df.groupby('Year').mean()['BasePay'] ~\anaconda\lib\site-packages\pandas\core\frame.py in __getitem__(self, key) 2900 if self.columns.nlevels > 1: 2901 return self._getitem_multilevel(key) -> 2902 indexer = self.columns.get_loc(key) if is_integer(indexer): 2903 2904 indexer = [indexer] ~\anaconda\lib\site-packages\pandas\core\indexes\base.py in get_loc(self, key, method, tolerance) 2895 return self._engine.get_loc(casted_key) 2896 except KeyError as err: raise KeyError(key) from err -> 2897 2898 2899 if tolerance is not None: **KeyError**: 'BasePay' How many unique job titles are there? In [28]: df['JobTitle'].nunique() Out[28]: 2159 What are the top 5 most common jobs? In [29]: group=df.groupby('JobTitle').count() top5=group.sort_values(by='Id', ascending=False)[:5] top5['Id'] JobTitle Out[29]: Transit Operator 7036 Special Nurse 4389 Registered Nurse 3736 Public Svc Aide-Public Works 2518 Police Officer 3 2421 Name: Id, dtype: int64 How many Job Titles were represented by only one person in 2013? (e.g. Job Titles with only one occurence in 2013?) copy_sal=df[df['Year']==2013] In [32]: group=copy_sal.groupby('JobTitle').count() count=group[group['Id']==1] count.count()['Id'] Out[32]: 202 How many people have the word Chief in their job title? (This is pretty tricky) In [35]: def find_chief(job_title): if 'chief' in job_title.lower().split(): return True else: return False df=pd.read_csv('Salaries.csv') In [36]: sum(df['JobTitle'].apply(lambda x:find_chief(x))) Out[36]: 477 Bonus: Is there a correlation between length of the Job Title string and Salary? df['title_len']=df['JobTitle'].apply(len) In [37]: df[['title_len','TotalPayBenefits']].corr() Out[38]: title_len TotalPayBenefits title_len 1.000000 -0.036878 TotalPayBenefits -0.036878 1.000000 **Great Job!**