```
import numpy as np
import pandas as pd
import sklearn
import matplotlib.pyplot as plt
import seaborn as sns
import warnings
warnings.simplefilter(action='ignore', category=FutureWarning)
ratings = pd.read_csv("https://s3-us-west-2.amazonaws.com/recommender-tutorial/ratings.csv")
ratings.head()
movies =
pd.read csv("https://s3-us-west-2.amazonaws.com/recommender-tutorial/movies.csv")
movies.head()
n_ratings = len(ratings)
n movies = ratings['movield'].nunique()
n_users = ratings['userId'].nunique()
print(f"Number of ratings: {n ratings}")
print(f"Number of unique movield's: {n_movies}")
print(f"Number of unique users: {n_users}")
print(f"Average number of ratings per user: {round(n_ratings/n_users, 2)}")
print(f"Average number of ratings per movie: {round(n ratings/n movies, 2)}")
user_freq = ratings[['userId', 'movieId']].groupby('userId').count().reset_index()
user_freq.columns = ['userId', 'n_ratings']
user_freq.head()
mean rating = ratings.groupby('movield')[['rating']].mean()
lowest_rated = mean_rating['rating'].idxmin()
movies.loc[movies['movield'] == lowest_rated]
highest_rated = mean_rating['rating'].idxmax()
movies.loc[movies['movield'] == highest rated]
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ratings[ratings['movield']==highest rated]
ratings[ratings['movield']==lowest rated]
movie_stats = ratings.groupby('movield')[['rating']].agg(['count', 'mean'])
movie_stats.columns = movie_stats.columns.droplevel()
from scipy.sparse import csr matrix
ratings[ratings['movield']==highest rated]
ratings[ratings['movield']==lowest rated]
movie stats = ratings.groupby('movield')[['rating']].agg(['count', 'mean'])
movie_stats.columns = movie_stats.columns.droplevel()
from scipy.sparse import csr_matrix
def create X(df):
  N = df['userId'].nunique()
  M = df['movield'].nunique()
  user mapper = dict(zip(np.unique(df["userId"]), list(range(N))))
  movie mapper = dict(zip(np.unique(df["movield"]), list(range(M))))
  user_inv_mapper = dict(zip(list(range(N)), np.unique(df["userId"])))
  movie_inv_mapper = dict(zip(list(range(M)), np.unique(df["movield"])))
  user index = [user mapper[i] for i in df['userId']]
  movie_index = [movie_mapper[i] for i in df['movield']]
  X = csr_matrix((df["rating"], (movie_index, user_index)), shape=(M, N))
  return X, user_mapper, movie_mapper, user_inv_mapper, movie_inv_mapper
X, user_mapper, movie_mapper, user_inv_mapper, movie_inv_mapper = create_X(ratings)
```

from sklearn.neighbors import NearestNeighbors

```
def find_similar_movies(movie_id, X, k, metric='cosine', show_distance=False):
  Finds k-nearest neighbours for a given movie id.
  neighbour ids = []
  movie_ind = movie_mapper[movie_id]
  movie_vec = X[movie_ind]
  k+=1
  kNN = NearestNeighbors(n_neighbors=k, algorithm="brute", metric=metric)
  kNN.fit(X)
  if isinstance(movie vec, (np.ndarray)):
    movie_vec = movie_vec.reshape(1,-1)
  neighbour = kNN.kneighbors(movie vec, return distance=show distance)
  for i in range(0,k):
    n = neighbour.item(i)
    neighbour ids.append(movie inv mapper[n])
  neighbour_ids.pop(0)
  return neighbour ids
movie titles = dict(zip(movies['movield'], movies['title']))
movie id = 1
similar ids = find similar movies(movie id, X, k=10)
movie_title = movie_titles[movie_id]
print(f"Because you watched {movie_title}")
for i in similar ids:
  print(movie_titles[i])
```