```
In [1]: # Load dataset
        import pandas as pd
        image_feature_train = pd.read_csv('dataset/image_feature_train.csv', hea
        der=None)[1].fillna(value='')
        question feature train = pd.read csv('dataset/question feature train.cs
        v', header=None)[1].fillna(value='')
        y train = pd.read csv('dataset/y train.csv', header=None)[1].fillna(valu
        e='')
        image feature val = pd.read csv('dataset/image feature val.csv', header=
        None)[1].fillna(value='')
        question feature val = pd.read csv('dataset/question feature val.csv', h
        eader=None)[1].fillna(value='')
        y_val = pd.read_csv('dataset/y_val.csv', header=None)[1].fillna(value=''
        )
        image feature test = pd.read csv('dataset/image feature test.csv', heade
        r=None)[1].fillna(value='')
        question_feature_test = pd.read_csv('dataset/question_feature_test.csv',
        header=None)[1].fillna(value='')
        print(y train.shape)
        print(y_val.shape)
        (20000,)
```

(2000,)

```
In [2]: # One hot encoding
        import numpy as np
        from sklearn.feature_extraction.text import CountVectorizer
        def one_hot_transform(text):
            count = CountVectorizer()
            bag = count.fit_transform(text).toarray()
            return bag
        image feature = pd.concat([image feature train, image feature val, image
        _feature_test], axis=0)
        question_feature = pd.concat([question_feature_train, question_feature_v
        al, question_feature_test], axis=0)
        image feature transformed = pd.DataFrame(one hot transform(image feature
        ))
        question_feature_transformed = pd.DataFrame(one_hot_transform(question_f
        eature))
        X = pd.concat([image_feature_transformed, question_feature_transformed],
        axis=1)
        X train = X[:20000]
        x \text{ val} = x[20000:22000]
        X_{\text{test}} = X[22000:22100]
        print(X_train.shape)
        print(X val.shape)
        print(X test.shape)
        (20000, 3572)
```

(2000, 3572) (100, 3572)

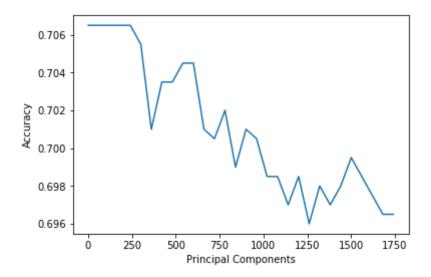
```
In [3]: # Dimension reduction
        from sklearn.metrics import accuracy score
        from sklearn.decomposition import PCA
        from sklearn.neural_network import MLPClassifier
        from sklearn.neighbors import KNeighborsClassifier
        from sklearn.linear_model import LogisticRegression
        import matplotlib.pyplot as plt
        %matplotlib inline
        # X_train = X_train[:4000]
        # y train = y train[:4000]
        principal_com = []
        accuracy = []
        for i in range(1, 1800, 60):
            pca = PCA(n_components=i)
            pca.fit(X_train)
            X_train_reduced = pca.transform(X_train)
            X_val_reduced = pca.transform(X_val)
            model = LogisticRegression()
            model.fit(X_train_reduced, y_train)
            y_val_predicted = model.predict(X_val_reduced)
            accuracy.append(accuracy score(y val, y val predicted))
            principal com.append(i)
        plt.plot(principal_com, accuracy)
        plt.xlabel("Principal Components")
        plt.ylabel("Accuracy")
        plt.show()
```

```
/anaconda3/lib/python3.7/site-packages/sklearn/linear model/logistic.p
y:433: FutureWarning: Default solver will be changed to 'lbfgs' in 0.2
2. Specify a solver to silence this warning.
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2. Specify a solver to silence this warning.
 FutureWarning)



```
In [5]: pca = PCA(n_components=61)
    pca.fit(X_train)
    X_train_reduced = pca.transform(X_train)
    X_val_reduced = pca.transform(X_val)

model = LogisticRegression()
    model.fit(X_train_reduced, y_train)
    y_val_predicted = model.predict(X_val_reduced)

print("Accuracy on test set: {:.2f}".format(accuracy_score(y_val_predicted, y_val)))
```

Accuracy on test set: 0.71

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2. Specify a solver to silence this warning.
 FutureWarning)

```
In [ ]: # Ensemble learning
        from sklearn.linear model import LogisticRegression
        from sklearn.ensemble import VotingClassifier
        from sklearn.ensemble import BaggingClassifier
        from sklearn.ensemble import AdaBoostClassifier
        from sklearn.tree import DecisionTreeClassifier
        from sklearn.svm import SVC
        from sklearn.neural network import MLPClassifier
        pca = PCA(n_components=0.99)
        pca.fit(X_train)
        X train reduced = pca.transform(X train)
        X_val_reduced = pca.transform(X_val)
        #logistic = LogisticRegression()
        mlp = MLPClassifier(hidden_layer_sizes=(2048,4096,4096),max_iter=1000,ra
        ndom_state=42,activation='relu',solver='adam')
        bagging = BaggingClassifier(max samples=50)
        boost = AdaBoostClassifier(base estimator=DecisionTreeClassifier(max dep
        th=10), n estimators=500, learning rate=0.1)
        svc = SVC(random state=42)
        for model in [mlp, bagging, boost, svc]:
            model.fit(X_train_reduced, y_train)
            y_val_predicted = model.predict(X_val_reduced)
            print(accuracy_score(y_val_predicted, y_val))
In [ ]:
In [33]: # Predict test data
        model = SVC()
        model.fit(X train reduced, y train)
        X test reduced = pca.transform(X test)
        y_test_predicted = model.predict(X_test_reduced)
        print(y test predicted)
        /anaconda3/lib/python3.7/site-packages/sklearn/svm/base.py:196: FutureW
        arning: The default value of gamma will change from 'auto' to 'scale' i
        n version 0.22 to account better for unscaled features. Set gamma expli
        citly to 'auto' or 'scale' to avoid this warning.
          "avoid this warning.", FutureWarning)
        1 1
         In [34]: data = pd.DataFrame(y_test_predicted)
        data.to csv('prediction.csv', index=False, header=False)
In [ ]:
```