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Phase5-Project / MVP.ipynb

jgoett2 Included ChatGPT classifier ba7b694 · 1 minute ago History

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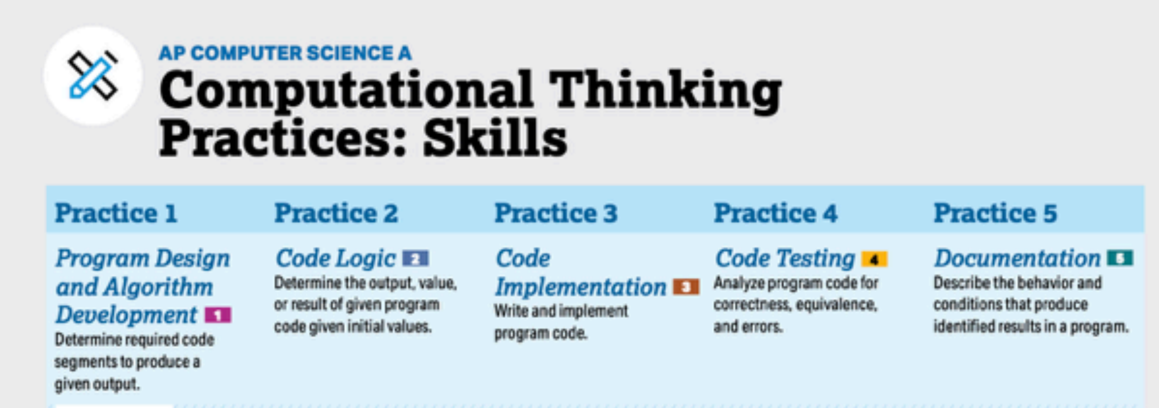
Evaluating Curriculum Rigor

Background

In my experience with high school curriculum, I have found a wide variation in the rigor of course material. This project seeks to develop a tool for evaluating the rigor of a curriculum, by measuring its alignment to the College Board's respective AP Course. This project focuses on the College Board's AP Computer Science A course, which covers a first year Java and Object Orientied Design course.

For this course, the College Board defines a set of "Computational Thinking Practices" (skills) and content that will be assessed on a year-end summative assessment to determine student's mastery of the course.

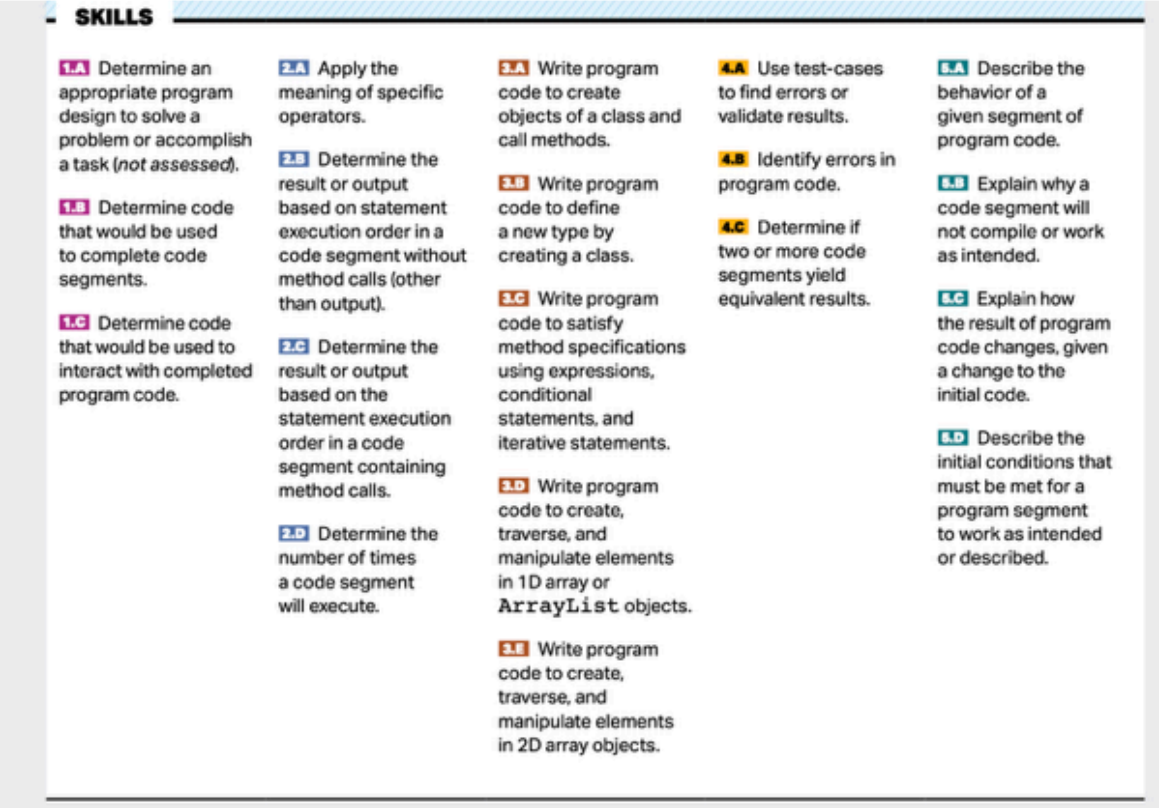
There are 5 main Computational Thinking Practices identified by the College Board, which it then breaks down into subskills:



AP COMPUTER SCIENCE A

Computational Thinking Practices: Skills

Practice 1	Practice 2	Practice 3	Practice 4	Practice 5
Program Design and Algorithm Development 1 Determine required code segments to produce a given output.	*Code Logic* 2 Determine the output, value, or result of given program code given initial values.	*Code Implementation* 3 Write and implement program code.	*Code Testing* 4 Analyze program code for correctness, equivalence, and errors.	*Documentation* 5 Describe the behavior and conditions that produce identified results in a program.



SKILLS

1.A Determine an appropriate program design to solve a problem or accomplish a task (*not assessed*).

1.B Determine code that would be used to complete code segments.

1.C Determine code that would be used to interact with completed program code.

2.A Apply the meaning of specific operators.

2.B Determine the result or output based on statement execution order in a code segment without method calls (other than output).

2.C Determine the result or output based on the statement execution order in a code segment containing method calls.

2.D Determine the number of times a code segment will execute.

3.A Write program code to create objects of a class and call methods.

3.B Write program code to define a new type by creating a class.

3.C Write program code to satisfy method specifications using expressions, conditional statements, and iterative statements.

3.D Write program code to create, traverse, and manipulate elements in 1D array or `ArrayList` objects.

3.E Write program code to create, traverse, and manipulate elements in 2D array objects.

4.A Use test-cases to find errors or validate results.

4.B Identify errors in program code.

4.C Determine if two or more code segments yield equivalent results.

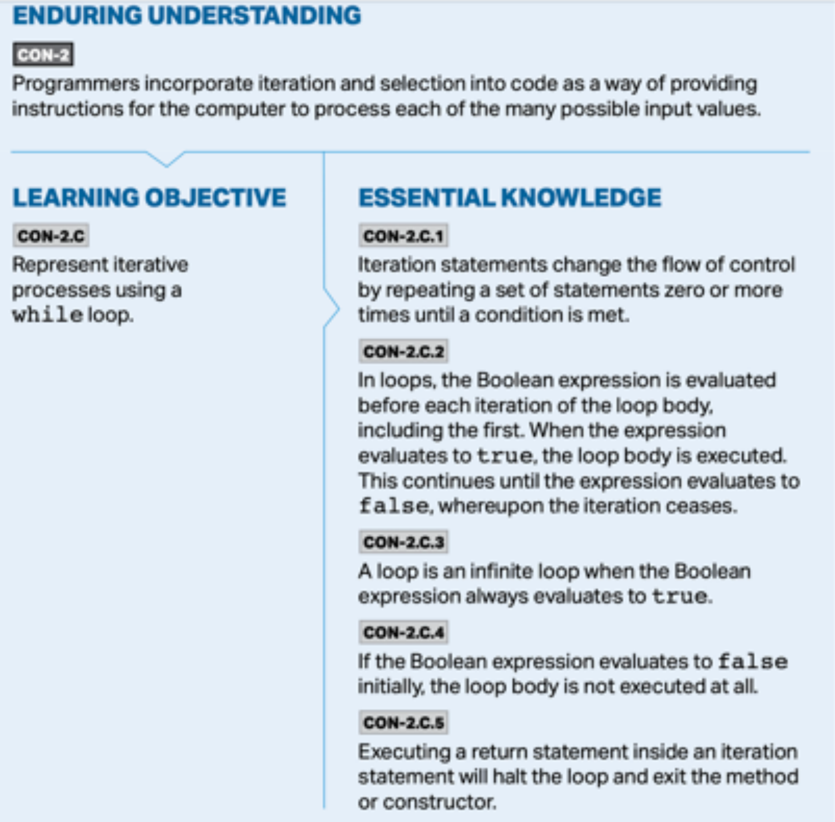
5.A Describe the behavior of a given segment of program code.

5.B Explain why a code segment will not compile or work as intended.

5.C Explain how the result of program code changes, given a change to the initial code.

5.D Describe the initial conditions that must be met for a program segment to work as intended or described.

In addition, the College Board defines a set of "Essential Knowledge" (the content) to be assessed in the course, which it organizes under 5 "Big Ideas." For example, the content for a lesson on iteration is:



ENDURING UNDERSTANDING

CON-2

Programmers incorporate iteration and selection into code as a way of providing instructions for the computer to process each of the many possible input values.

LEARNING OBJECTIVE

CON-2.C

Represent iterative processes using a `while` loop.

ESSENTIAL KNOWLEDGE

CON-2.C.1

Iteration statements change the flow of control by repeating a set of statements zero or more times until a condition is met.

CON-2.C.2

In loops, the Boolean expression is evaluated before each iteration of the loop body, including the first. When the expression evaluates to `true`, the loop body is executed. This continues until the expression evaluates to `false`, whereupon the iteration ceases.

CON-2.C.3

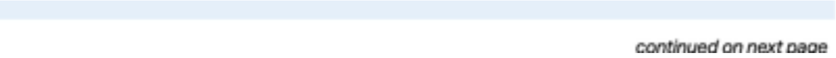
A loop is an infinite loop when the Boolean expression always evaluates to `true`.

CON-2.C.4

If the Boolean expression evaluates to `false` initially, the loop body is not executed at all.

CON-2.C.5

Executing a return statement inside an iteration statement will halt the loop and exit the method or constructor.



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Every question on the College Board's end-of-course summative exam is aligned to a particular computational thinking skill and essential knowledge. As a note, some school networks have found the College Board's standards to be very complete, and "backwards plan" their middle school and pre-AP high school courses to prepare students for the AP level work.

As a first step, this project will focus on the assessment questions used in a particular curriculum, and measure how well they align to the College Board's Computational Thinking Practice and Curriculum Framework. (As a note, AP classes in most subjects have an analagous set of thinking practices and framework standards, so one day, this work may be generalized to assess curriculums in other subject areas.)

Two questions to assess are:

1. Can a TF-IDF vectorization of College Board question prompt with a Logistic Regressor successfully classify an assessment question by Computational Thinking Practice?
2. If ChatGPT is supplied only with the College Board Framework for Computational Thinking, can it successfully identify the particular thinking practice being assessed by a question prompt?

Initial Conclusions:

1. When just classifying between two different computational thinking practices, both the Logistic Regression and ChatGPT classify with 100% accuracy

Next Steps:

1. Expand this to include all 15 computational thinking practices. Compare accuracy of Logistic Regression and ChatGPT.
2. Determine whether the classifier can also identify the "Essential Knowledge" assessed by the question, not just the computational skill.
3. Attempt to generalize the classifiers to classify non-assessment questions such as lecture material, lab questions, and homework problems.
4. Create a visualization that shows the distribution of thinking skills and content assessed over the course of the curriculum.

Classifying Questions Using Logistic Regression

As first step, this section will try to classify prompts as assessing one of these two AP Computational Thinking Practices (CTP):

1. **CTP 2.A**: Apply the meaning of specific operators. For example:
   Consider the following code segment.

   ```
   int x = 7;
   int y = 3;
   if ((x < 10) && (y < 0))
     System.out.println(""Value is: "" + x * y);
   else
     System.out.println(""Value is: "" + x / y)
   ```

What is printed as a result of executing the code segment?

2. **CTP 2.B**: Determine the results or output based on statement execution order in a code segment without method calls (except for output). For example:

Consider the following code segment.

```
int[] arr = {7, 2, 5, 3, 0, 10};
for (int k = 0; k < arr.length - 1; k++)  {
  if (arr[k] > arr[k + 1])
    System.out.print(k + "" "" + arr[k] + "" "");
}
```

What will be printed as a result of executing the code segment?

Preprocessing the Data

In this first step, we will:

1. Read in example prompts for each category.
2. Preprocess the data: tokenize, lemmatize, and look at the token frequency distribution by question category.

In [1]:

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt

from sklearn.feature_extraction.text import TfidfVectorizer
from nltk.stem import WordNetLemmatizer
from nltk.tokenize import RegexpTokenizer
from nltk import FreqDist
```

In [72]:

```
df1 = pd.read_csv("Data/Synthetic/Synthetic2A.csv")
df2 = pd.read_csv("Data/Synthetic/Synthetic2B.csv")
df = pd.concat([df1, df2])
```

Testing the Logistic Regression Classifier on the Questions

Here, we build a pipeline that does the following:

1. Preprocess Text: tokenize and lemmatize the text, vectorize using TF-IDF, restricting to 10 features.
2. Train and test a logistic regression classifier. Evaluate the model appropriately.

In [73]:

```
from sklearn.model_selection import train_test_split
from sklearn.pipeline import Pipeline
from sklearn.linear_model import LogisticRegression

from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix
from sklearn.metrics import ConfusionMatrixDisplay
```

In [74]:

```
basic_token_pattern = r"(?u)\b\w\w+\b"

tokenizer = RegexpTokenizer(basic_token_pattern)
lemmatizer = WordNetLemmatizer()

def lemmatize_text(text):
    temp = tokenizer.tokenize(text.lower())
    return [lemmatizer.lemmatize(w) for w in temp]

tfidf = TfidfVectorizer(strip_accents='ascii', tokenizer=lemmatize_text,

pipeline = [("tfidf",TfidfVectorizer(strip_accents='ascii', tokenizer=lem
             ("lr", LogisticRegression())]
pipe = Pipeline(steps=pipeline)
```

In [75]:

```
X_train, X_test, y_train, y_test = train_test_split(df["Question"], df["C

pipe.fit(X_train, y_train)
```

```
/Users/jgoett/anaconda3/envs/learn-env/lib/python3.9/site-packages/sklear
n/feature_extraction/text.py:528: UserWarning: The parameter 'token_patter
n' will not be used since 'tokenizer' is not None'
  warnings.warn(
/Users/jgoett/anaconda3/envs/learn-env/lib/python3.9/site-packages/sklear
```

```
n/feature_extraction/text.py:409: UserWarning: Your stop_words may be inco
nsistent with your preprocessing. Tokenizing the stop words generated toke
ns ['ha', 'u', 'wa'] not in stop_words.
  warnings.warn(
```

Out[75]:

```
Pipeline(steps=[('tfidf',
                 TfidfVectorizer(max_features=10, stop_words='engl
ish',
                                 strip_accents='ascii',
                                 tokenizer=<function lemmatize_tex
t at 0x1690558b0>)),
                ('lr', LogisticRegression())])
```

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On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.

In [76]:

```
y_test_pred = pipe.predict(X_test)
print(classification_report(y_test, y_test_pred))
con_mat = confusion_matrix(y_test, y_test_pred)
```

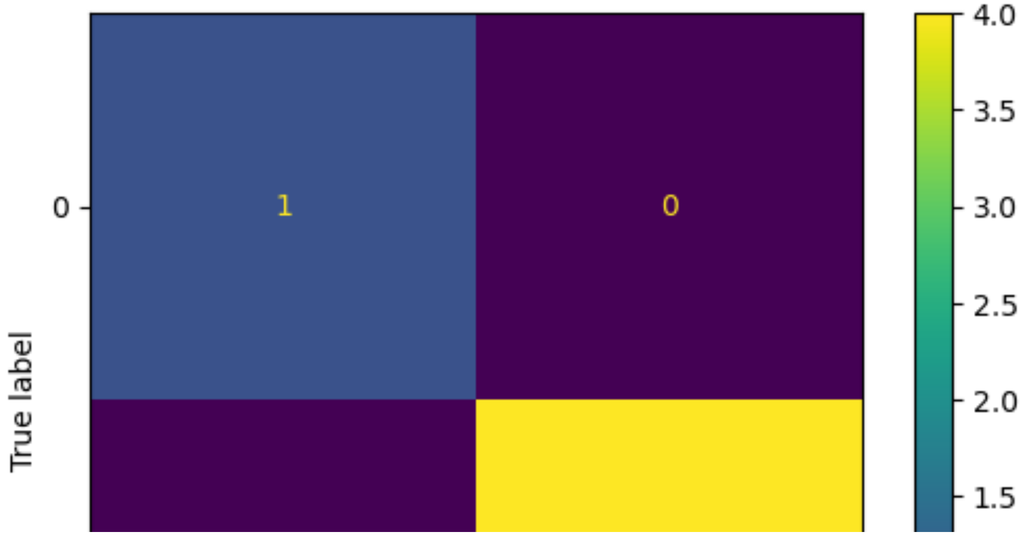
```
              precision    recall  f1-score   support

         2.A       1.00      1.00      1.00         1
         2.B       1.00      1.00      1.00         4

    accuracy                           1.00         5
   macro avg       1.00      1.00      1.00         5
weighted avg       1.00      1.00      1.00         5
```

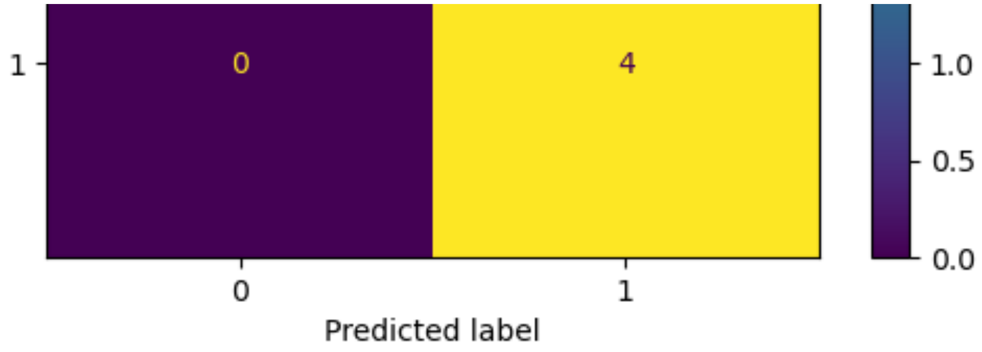
In [77]:

```
ConfusionMatrixDisplay(con_mat).plot()
```

Out[77]:

```
<sklearn.metrics._plot.confusion_matrix.ConfusionMatrixDisplay at 0x15fee
6dc0>
```





Build and Test a ChatGPT Classifier

This classifier asks ChatGPT to determine the Computational Thinking Skill being assessed in the problem.

1. Create a function call to ask ChatGPT for the classification
2. Test ChatGPT on data set and evaluate classification.

In [71]:

```
import pandas as pd
from openai import OpenAI
import os

from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix
from sklearn.metrics import ConfusionMatrixDisplay

df1 = pd.read_csv("Data/Synthetic/Synthetic2A.csv")
df2 = pd.read_csv("Data/Synthetic/Synthetic2B.csv")
df = pd.concat([df1, df2])
df.reset_index(inplace=True)
df["Classification"] = df["Classification"].str.strip(" '")
```

In [72]:

```
prompt_start = """
Here are the categories for AP questions.
2.A: Apply the meaning of specific operators
2.B: Determine the result or output based on statement execution order in

Below are example questions for each of these categories
2.A: Consider  the following  code  segment.  Assume  num is a properly
2.B: Consider  the following  code segment.  int[][]  values  = {{1,  2,

Based on these, classify the following prompt as either 2.A or 2.B.  Plea
"""
```

In [73]:

```
client = OpenAI(api_key=os.environ.get("jeff_api"))
```

```
def gpt_classify(prompt):
  response = client.chat.completions.create(
  model="gpt-4o-mini",
  messages=[{"role": "user", "content": prompt_start + prompt}]
  )
  return response.choices[0].message.content
```

In [74]:

```
df["GPT_Classify"] = df["Question"].apply(gpt_classify)
```

In [75]:

```
print(classification_report(df["Classification"], df["GPT_Classify"]));
```

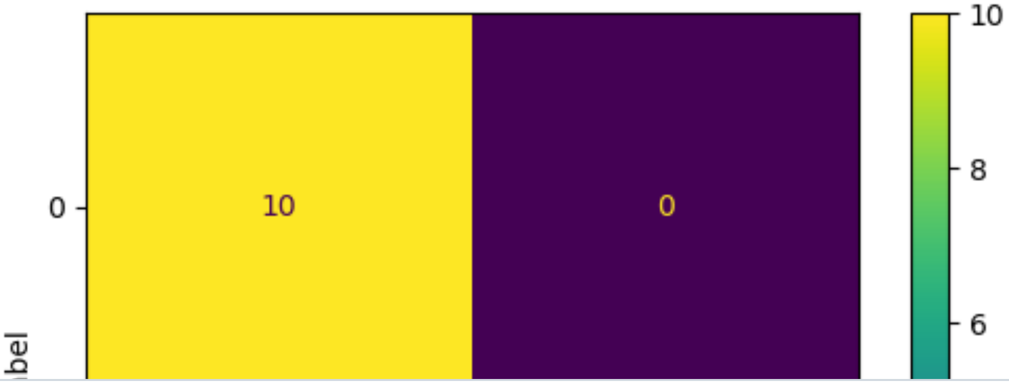
```
              precision    recall  f1-score   support

         2.A       1.00      1.00      1.00        10
         2.B       1.00      1.00      1.00        10

    accuracy                           1.00        20
   macro avg       1.00      1.00      1.00        20
weighted avg       1.00      1.00      1.00        20
```

In [76]:

```
con_mat = confusion_matrix(df["Classification"], df["GPT_Classify"])
ConfusionMatrixDisplay(confusion_matrix=con_mat).plot()
```

Out[76]:

```
<sklearn.metrics._plot.confusion_matrix.ConfusionMatrixDisplay at 0x17df04110>
```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