



UFAM



JOHANNES GUTENBERG
UNIVERSITÄT MAINZ

(I) Brazilian-German Symposium on Learning Analytics
Mainz, May 12th 2023

LEARNING ANALYTICS IN INTRODUCTORY PROGRAMMING

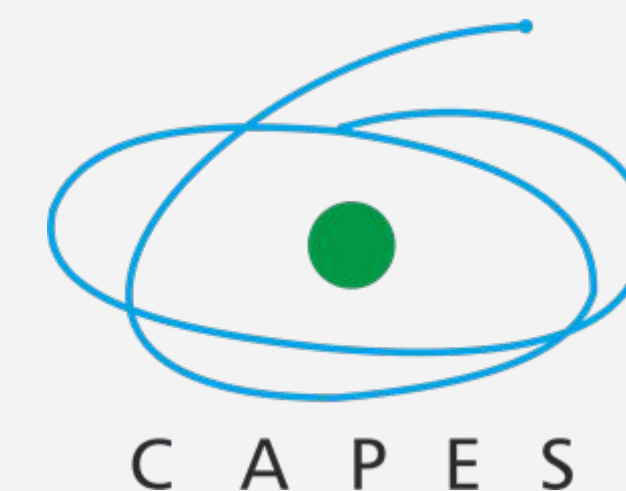
Elaine Harada Teixeira de Oliveira

Research Group on Computing Education

Institute of Computing

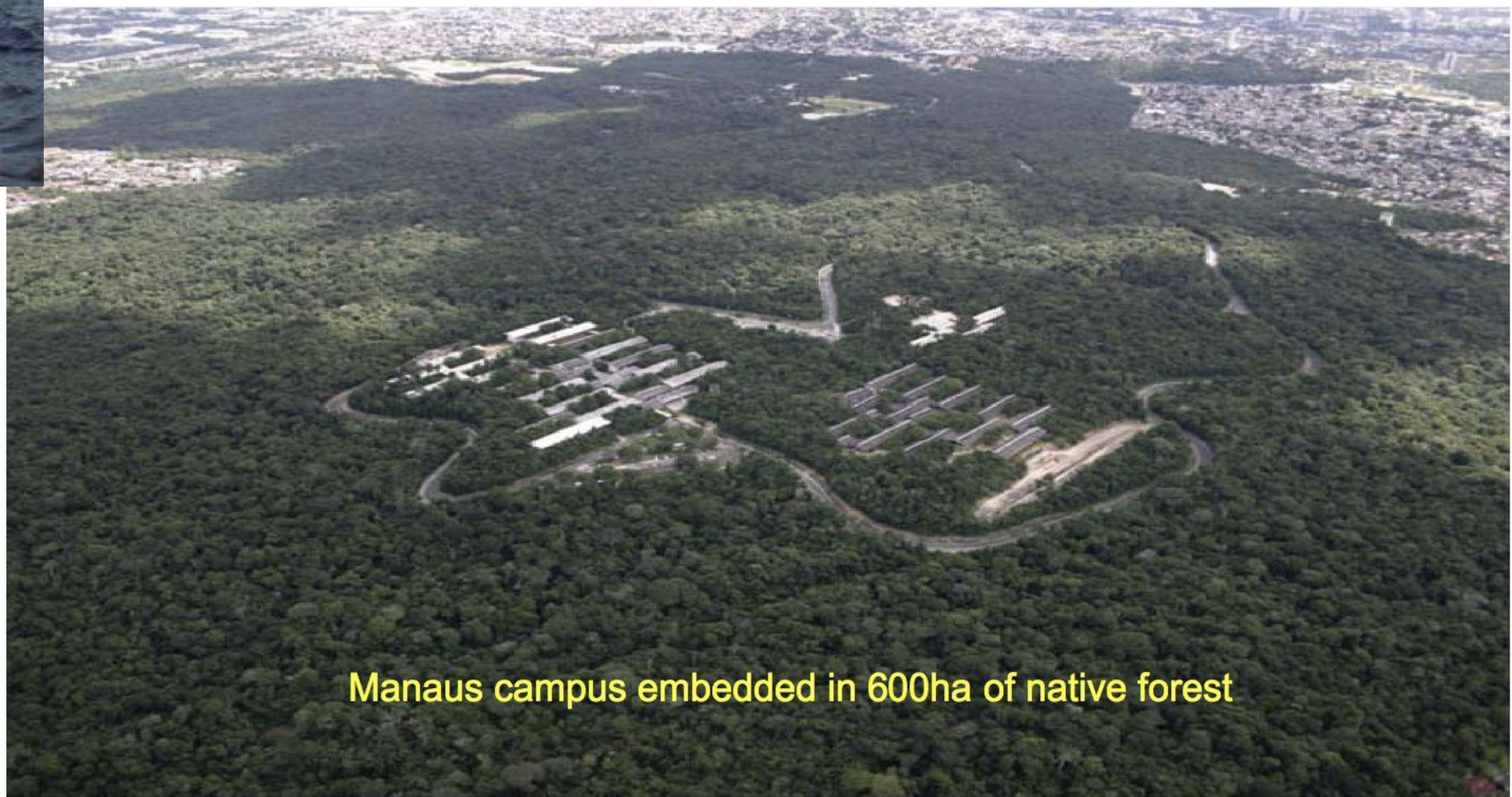
Federal University of Amazonas (UFAM)

Manaus, Amazonas, Brazil



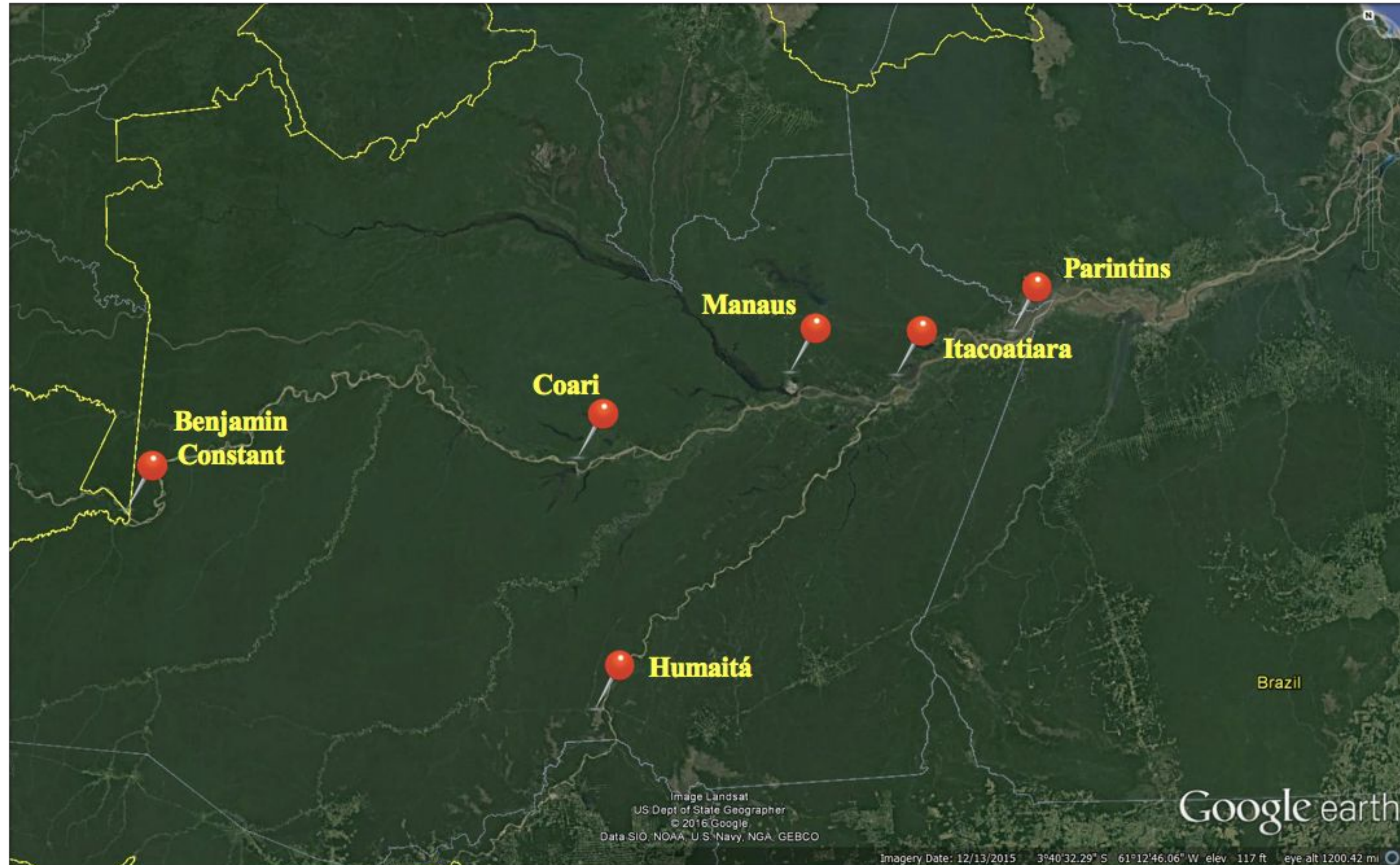
Alexander von
HUMBOLDT
STIFTUNG





Manaus campus embedded in 600ha of native forest

Amazonas state is our Campus



Acknowledgments to our former dean Prof. Hidembergue Ordozgoith da Frota

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 **Manacapuru - Vila Sião**

CEMEAM / SEDUC-AM



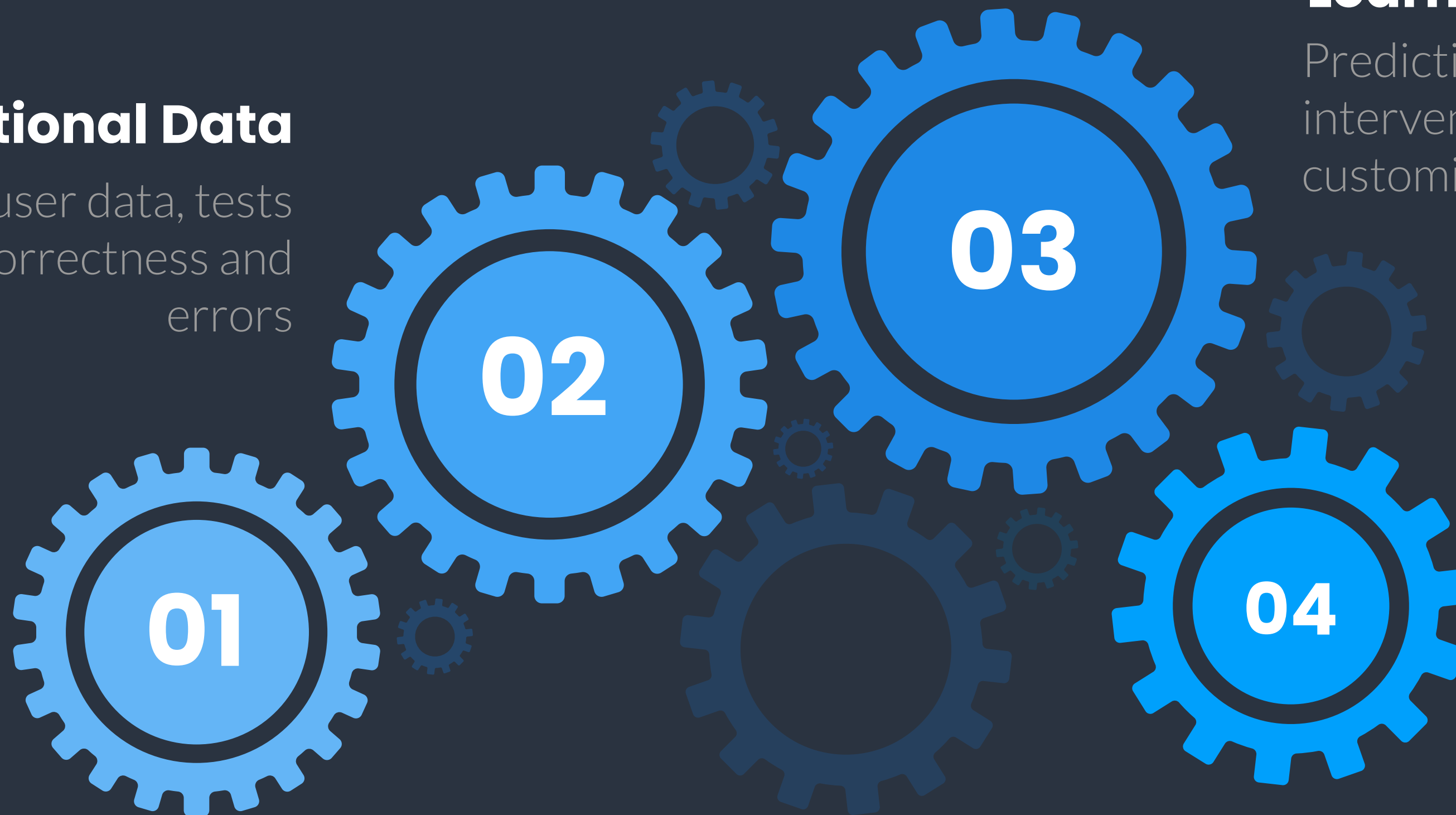
THE FOUR ENGINES

Educational Data

Interaction data, user data, tests and submissions, correctness and errors

Online Tools

Adoption of online tools for remote, hybrid and face-to-face teaching



Learning Analytics

Predictions, descriptions, interventions, recommendations, customization, etc.

Gamification

To encourage and engage

THE FOUR ENGINES

In computer courses, **online judges are essential tools to support teaching and learning activities**

Personal Data

Interaction data, user data, tests and submissions, correctness and errors

Online Tools

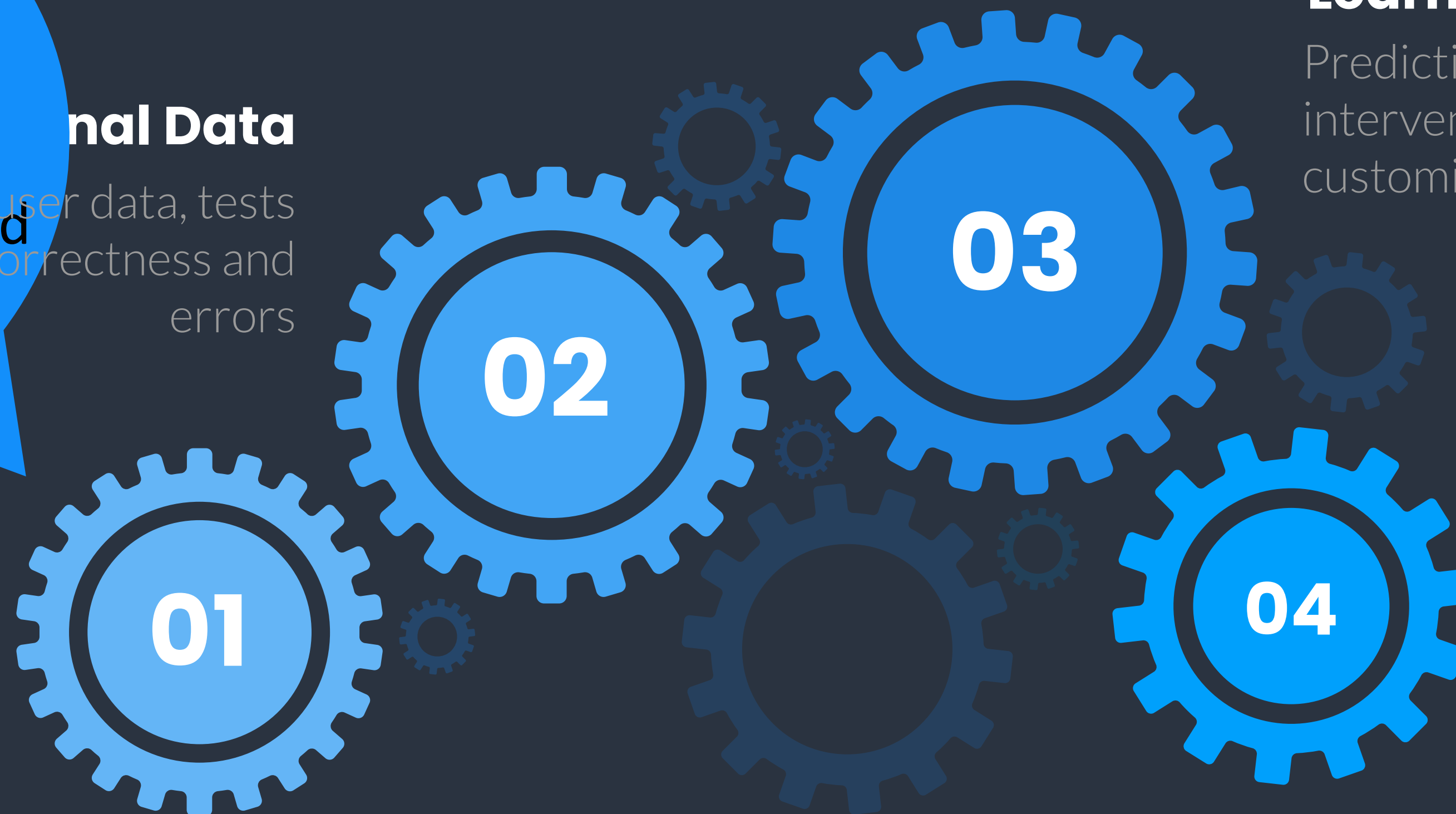
Adoption of online tools for remote, hybrid and face-to-face teaching

Learning Analytics

Predictions, descriptions, interventions, recommendations, customization, etc.

Gamification

To encourage and engage



Disciplinas >

Mensagens >

ADMINISTRAÇÃO

Usuários >

 Laboratórios >

 Docker Containers >


OUTROS

▶ Minha Conta

▶ Logout

▶ Front-end

USO DO SERVIDOR

 Memória 37%

 CPU 0.1%

<https://codebench.icomp.ufam.edu.br/>

Programming Exercises

Start

Homeworks 2

Materials

Messages

Start

Description

☐ 01

Write a program that checks whether a string entered by the user is palindrome or not.

☐ 02☐ 03☐ 04☐ 05

Tips

Grades

A palindrome is a word, phrase, or other sequence of characters that reads the same backward as forward, such as level or radar.

Input/Output Example

Input	kayak
Output	True

File Edit Search Run Tools

Python 3

★ main.py

```
1 def is_palindrome(string):
2     left_pos = 0
3     right_pos = len(string) - 1
4
5     while right_pos >= left_pos:
6         if not string[left_pos] == string[right_pos]:
7             return False
8         left_pos += 1
9         right_pos -= 1
10    return True
11
12 str = input("Please enter a string: ")
13 print(is_palindrome(str))
```



Console

Shell

```
$ python3 main.py
Please enter a string: madam
True
█
```

Students code solutions for the proposed exercises in our system

Introdução à Programação de Computadores — Turma EMEC1/C2 — professor(a) Elaine Harada Teixeira de Oliveira

Lab 5 - Vetores e Strings

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SOBRE

ANDIE

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Materiais 24

Mensagens 2

Cartas 1

Gamificação

Início

01

02

03

04

05

06

07

08

09

10

11

12

13

14

15

16

17

Notas

"uns" não podem estar seguidos de ponto;

2. Use a função `ones()`, do módulo `numpy`, bem como sua opção `dtype=int`.

Exemplos de Entrada e Saída

Entrada	6
Saída	[1 1 1 1 1 1]

Resultado

Parabéns! Seu esforço e desempenho enchem nosso mundo de riquezas! Por isso, um baú com 5 moedas de ouro surgiu nesta dimensão.

Arquivo

Editar

Buscar

Executar

Ferramentas

Python 3

main.py

Testar Código F7

Submeter Código F8

Encerrar Execução F9

```
1 # Não se esqueça
2 from numpy import
3
4 # Leitura do tamanho do vetor
5 N = int(input("Informe o tamanho do vetor: "))
6
7 vetor = ones(N, dtype=int)
8
9 print(vetor)
```

Console

Shell

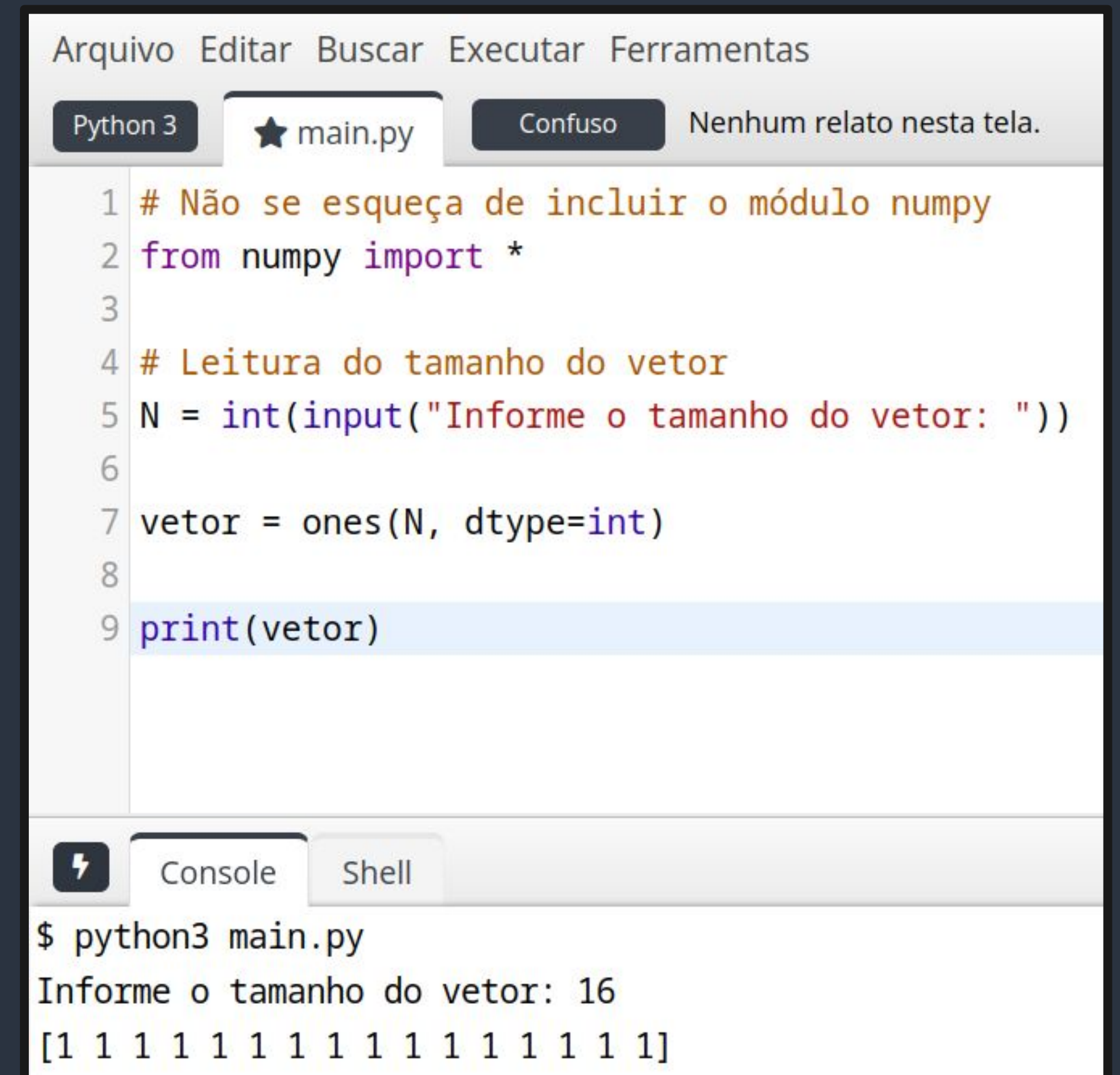
Parabéns, seu código está correto!

When the student submits the solution of a given exercise, the system instantly informs if his solution is correct or wrong.

<https://codebench.icomp.ufam.edu.br/>

DATA COLLECTION IN ONLINE JUDGES

- ✓ Data generated by online judges differs from data generated by other types of web applications
 - ✓ Tests and submissions
 - ✓ Compiler/interpreter error messages
 - ✓ Code development process
- ✓ **Research opportunities on the use of Learning Analytics in online judge systems are wide and diverse**



The screenshot displays an online judge system interface. At the top, there is a menu bar with options: 'Arquivo', 'Editar', 'Buscar', 'Executar', and 'Ferramentas'. Below this, a status bar shows 'Python 3', a star icon next to 'main.py', a 'Confuso' button, and the text 'Nenhum relato nesta tela.'.

The main area contains a code editor with the following Python code:

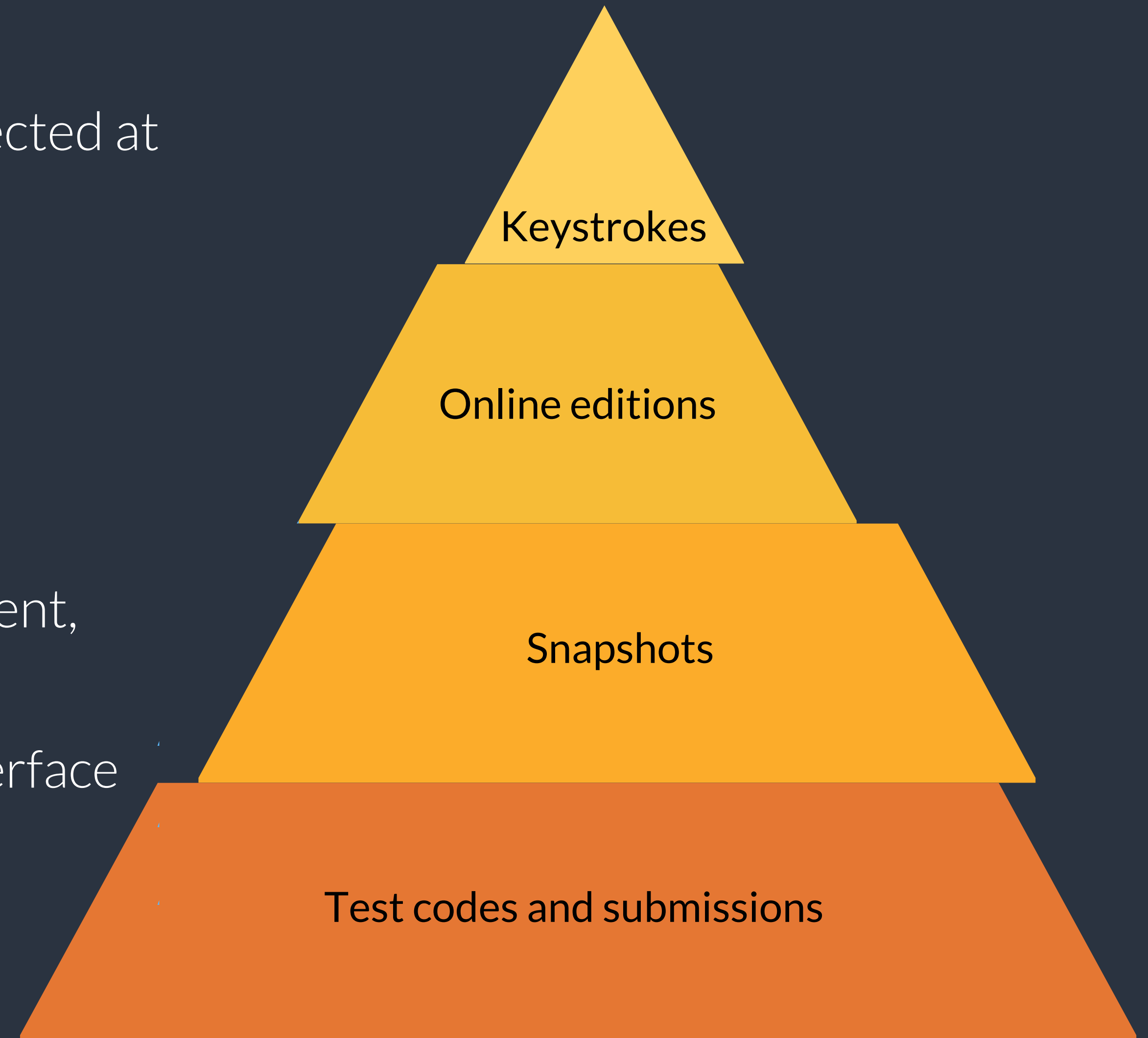
```
1 # Não se esqueça de incluir o módulo numpy
2 from numpy import *
3
4 # Leitura do tamanho do vetor
5 N = int(input("Informe o tamanho do vetor: "))
6
7 vetor = ones(N, dtype=int)
8
9 print(vetor)
```

Below the code editor, there is a console window with tabs for 'Console' and 'Shell'. The 'Console' tab is active, showing the execution output:

```
$ python3 main.py
Informe o tamanho do vetor: 16
[1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1]
```


DATA GRANULARITY

- ✓ The code development process can be collected at different levels of granularity
- ✓ Each level is associated with a data size and collection frequency
- ✓ In **CodeBench**, this collection is done at keystroke granularity
- ✓ In addition to the activities in the environment, the following are collected:
 - ✓ Mouse movements and clicks in the interface
 - ✓ Learning resources accessed
 - ✓ Logins and logouts
 - ✓ Activities on the gamification platform





<https://codebench.icomp.ufam.edu.br/dataset>

CodeBench (<http://codebench.icomp.ufam.edu.br>) is a Programming Online Judge developed by the Institute of Computing (IComp) of the Federal University of Amazonas, Brazil. Through Codebench, teachers can provide lists of programming exercises to their students, who in turn must develop solutions for each exercise through an embedded IDE. Once a student submits a source code for a given exercise, the system instantly notifies the student whether him/her solution is correct or not.

The CodeBench automatically logs all actions performed by students on embedded IDE during their attempts to solve the proposed exercises. This dataset contains all logs collected from CS1 students during 2016 to 2021.

Releases

CodeBench Dataset 1.6

- This release of the dataset contains all logs collected from CS1 students during the years 2016 to 2021. Each academic year is divided into two semesters.
- Obs: Because of the COVID-19 pandemic that started in 2020, the semesters 1 and 2 of such year occurred throughout 2021. In 2020, there was a single semester (Emergency Remote Education), where only 3 classes of IPC were taught.
- Release date: 2022-10-21
- Download options:
 - A file per semester: [2016-1](#), [2016-2](#), [2017-1](#), [2017-2](#), [2018-1](#), [2018-2](#), [2019-1](#), [2019-2](#), [2020-ERE](#), [2020-1](#), [2020-2](#), [2021-1](#) and [2021-2](#).
- Release statistics:

	2016-1	2016-2	2017-1	2017-2	2018-1	2018-2	2019-1	2019-2	2020-ERE	2020-1	2020-2	2021-1	2021-2	Total
CS1 classes	9	5	10	5	9	5	9	7	3	7	6	7	8	90
Total number of students	471	172	463	177	465	180	489	297	492	228	200	224	219	4077
Homework exercises	681	447	1278	556	1550	893	1559	1116	420	1008	882	962	1180	12532
Exam exercises	124	110	163	103	182	107	176	138	8	12	8	154	195	1480

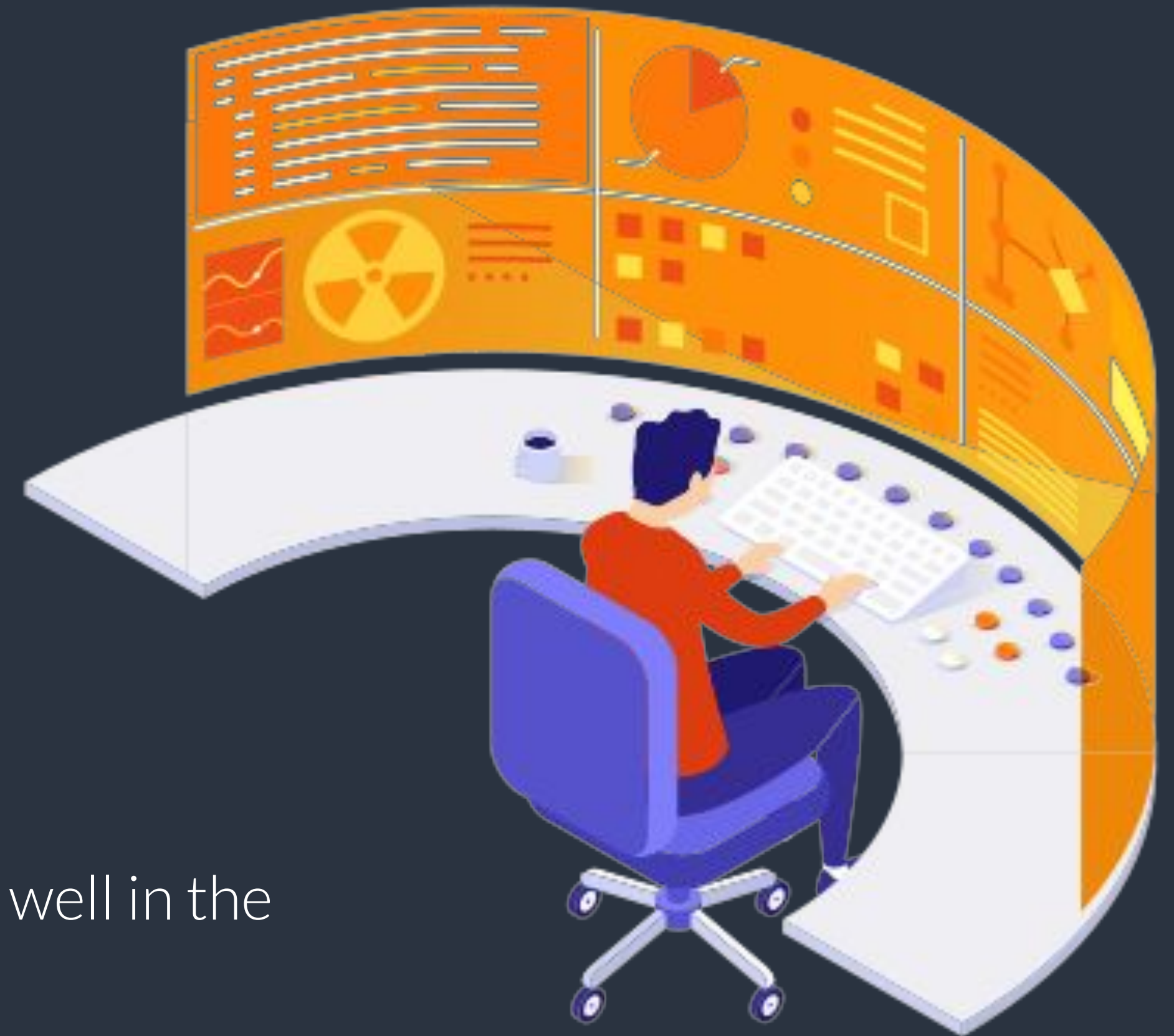
Since 2013, CodeBench has been used by about 6700 students and has more than 5600 exercises.

<https://codebench.icomp.ufam.edu.br/dataset>

```
2017-3-13 17:28:44.965#viewportChange#0
2017-3-13 17:28:46.733#change#{"from":{"line":2,"ch":0},"to":{"line":2,"ch":0},"text":["p"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:46.885#change#{"from":{"line":2,"ch":1},"to":{"line":2,"ch":1},"text":["r"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:47.109#change#{"from":{"line":2,"ch":2},"to":{"line":2,"ch":2},"text":["i"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:47.373#change#{"from":{"line":2,"ch":3},"to":{"line":2,"ch":3},"text":["n"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:47.605#change#{"from":{"line":2,"ch":4},"to":{"line":2,"ch":4},"text":["t"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:50.369#change#{"from":{"line":2,"ch":5},"to":{"line":2,"ch":5},"text":["()"],"removed":[""],"origin":"+input"}
2017-3-13 17:28:50.369#keyHandled#"('
2017-3-13 17:28:52.083#change#{"from":{"line":2,"ch":6},"to":{"line":2,"ch":6},"text":["\\\""],"removed":[""],"origin":"+input"}
2017-3-13 17:28:52.083#keyHandled#"'\
2017-3-13 17:30:31.907#viewportChange#0
2017-3-13 17:30:56.332#mousedown#{"isTrusted":true}
2017-3-13 17:30:56.349#focus#
```


DASHBOARDS IN ONLINE JUDGE SYSTEMS

- ✓ High rate of failures and dropouts in programming disciplines, notably for STEM courses, is a serious and recurring problem.
- ✓ One way to deal with this problem is to provide information and recommendations that help teachers to mitigate student difficulties.
 - ✓ Which students are having difficulty in the subject?
 - ✓ What are the best exercises for each student?
 - ✓ What aspects does the student need to improve to do well in the discipline?
 - ✓ Which students are 'cheating' on assignment lists?



DASHBOARDS IN ONLINE JUDGE SYSTEMS

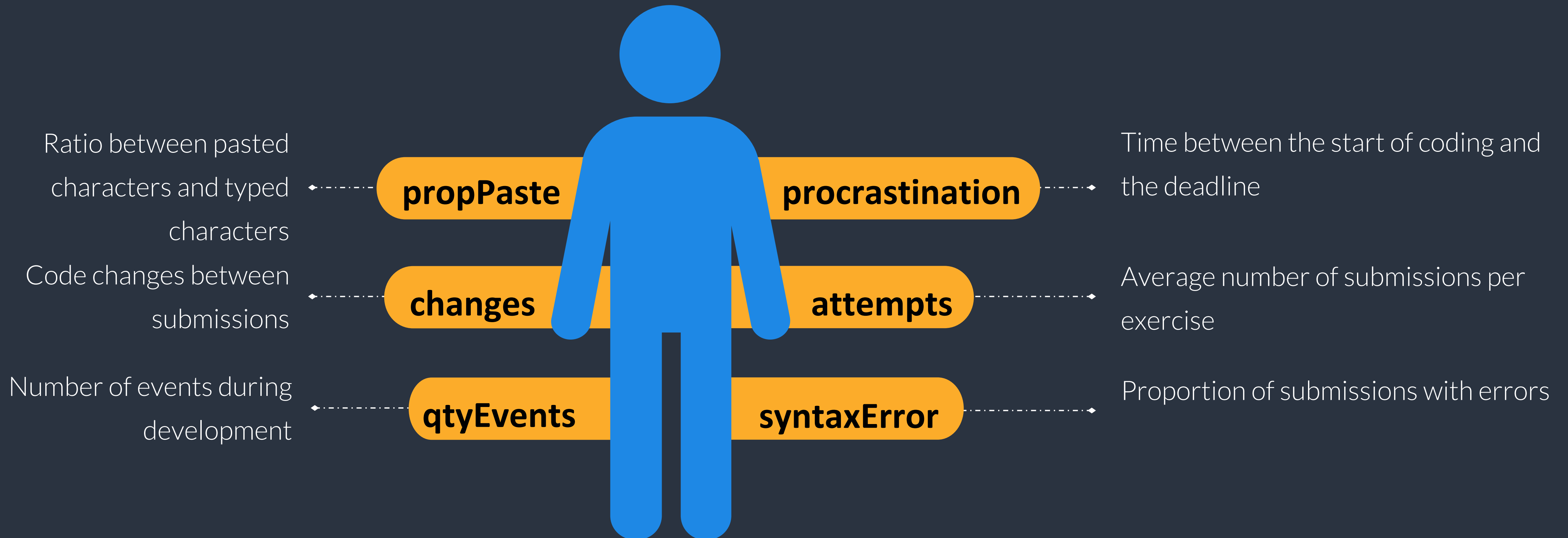
Would it be possible to answer all these questions through the **usage of logs** of online judges?

- ✓ High rate of failures and dropouts in program disciplines, notably for STEM courses, is a serious recurring problem.
- ✓ One way to deal with this problem is to provide information and recommendations that help teachers to mitigate student difficulties.
- ✓ Which students are having difficulty in the subject?
- ✓ What are the best exercises for each student?
- ✓ What aspects does the student need to improve to do well in the discipline?
- ✓ Which students are 'cheating' on assignment lists?



PROGRAMMING PROFILES

- ✓ To answer the questions, we generate a **programming profile** for each student. from attributes extracted from the online judge's logs



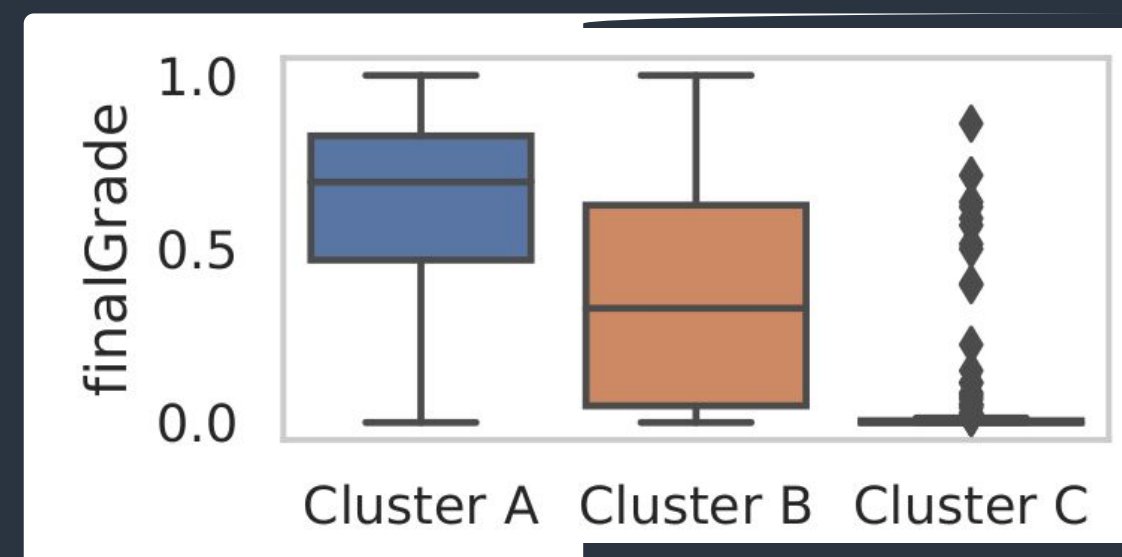
WHO ARE THE STUDENTS WITH DIFFICULTY?

EFFECTIVE AND INEFFECTIVE ATTITUDES

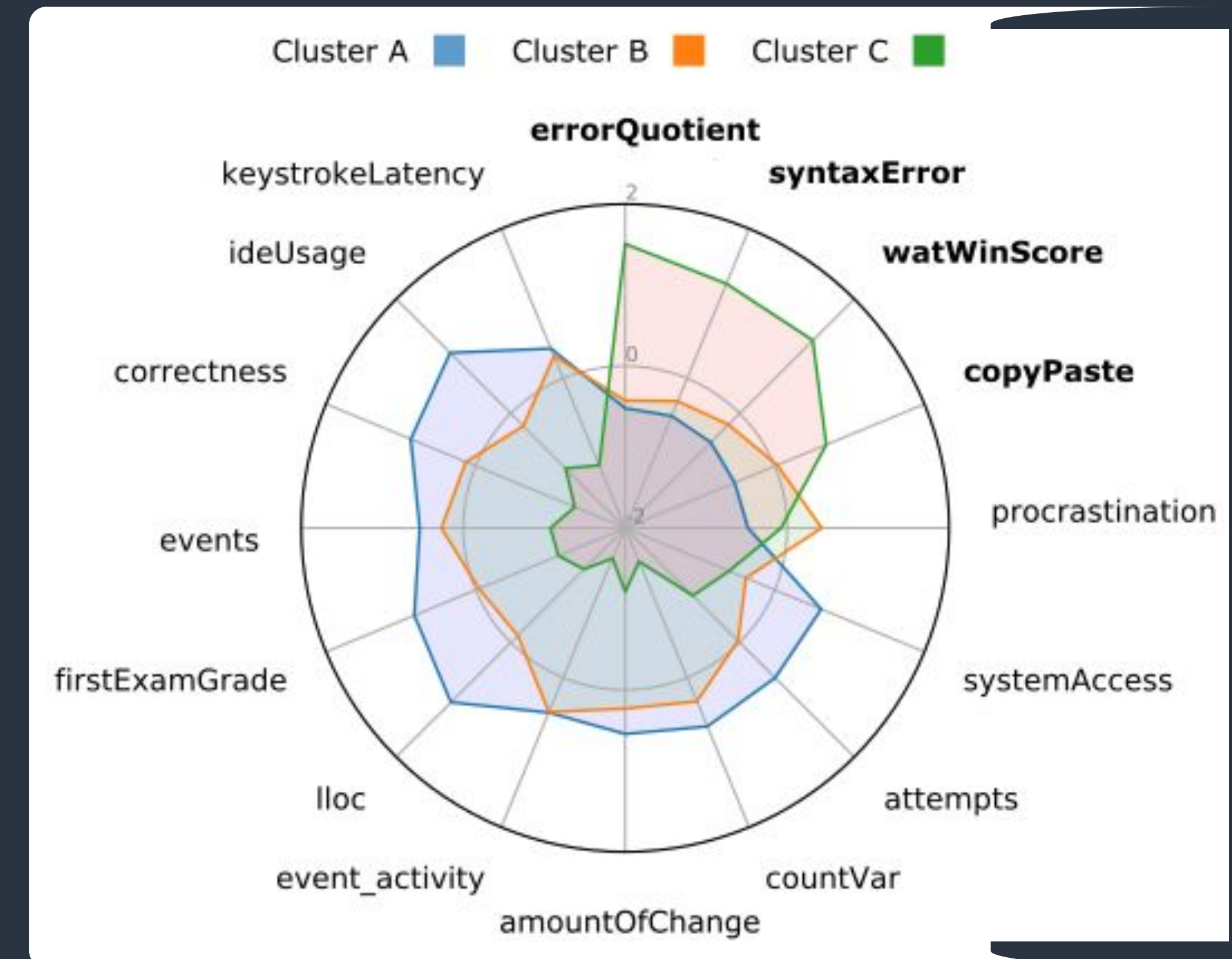


- ✓ Using clustering techniques (K-means) on programming profiles, students are grouped into 3 large groups:

- ✓ Effective, average and non-effective students



- ✓ The graph on the side shows that the student's grade is directly related to the student's behavior in the online judge



PERFORMANCE PREDICTION



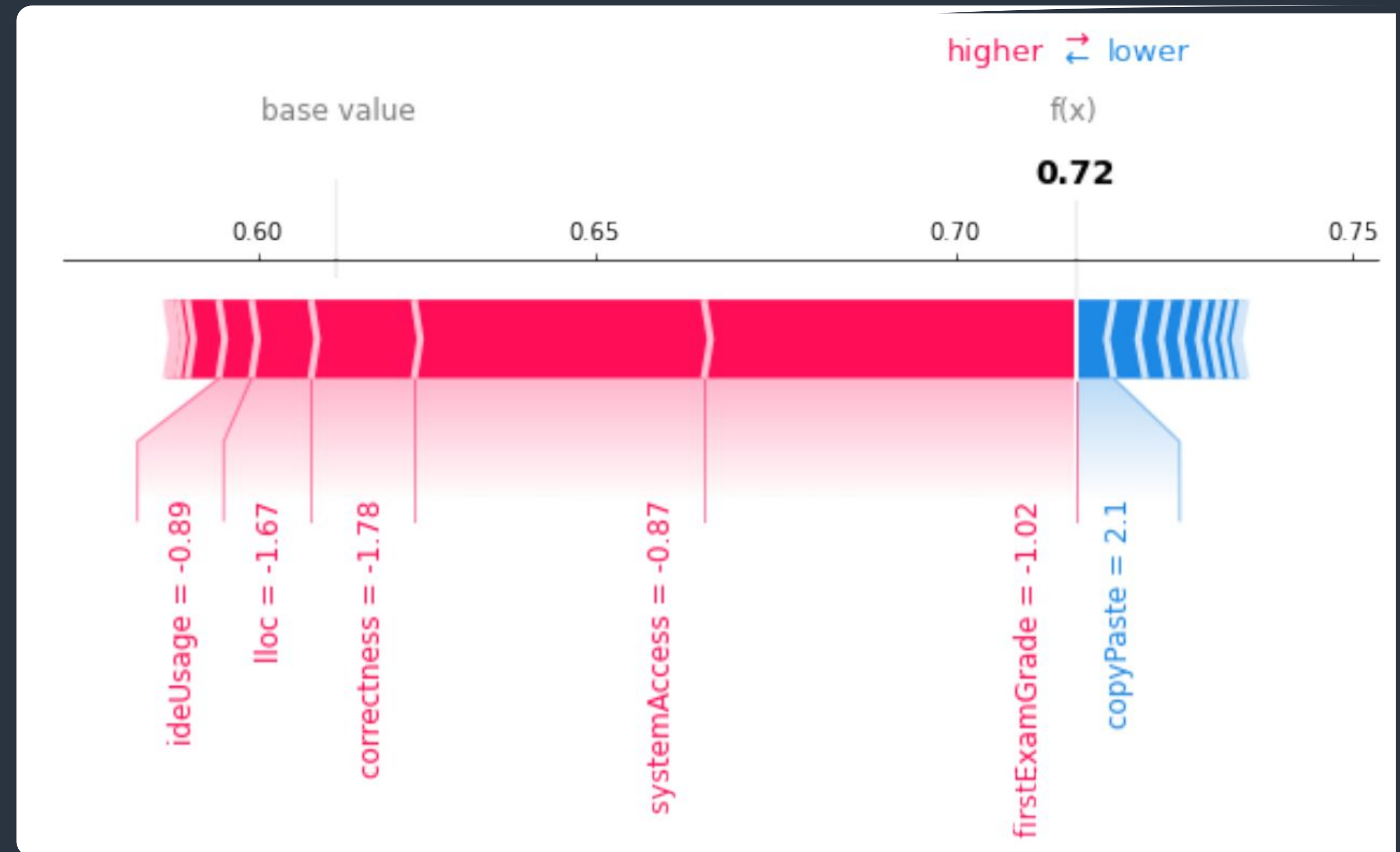
- ✓ To deal with the high failure and dropout rates, it is essential to identify struggling students in advance.
- ✓ Using Deep Learning around programming profiles, it was possible to predict student performance with an accuracy of 82.5% in the first two weeks of class.
- ✓ With advance performance prediction, teachers can:
 - ✓ Provide extra assignments for students who do well in the class
 - ✓ Provide personalized support for struggling students



EXPLAINING EFFECTIVE AND INEFFECTIVE BEHAVIORS



- ✓ In addition to predicting performance, prediction methods such as SHAP, based on games theory, are able to explain the results of their predictions.
- ✓ Early prediction empowered by its explanation may lead to better interventions.

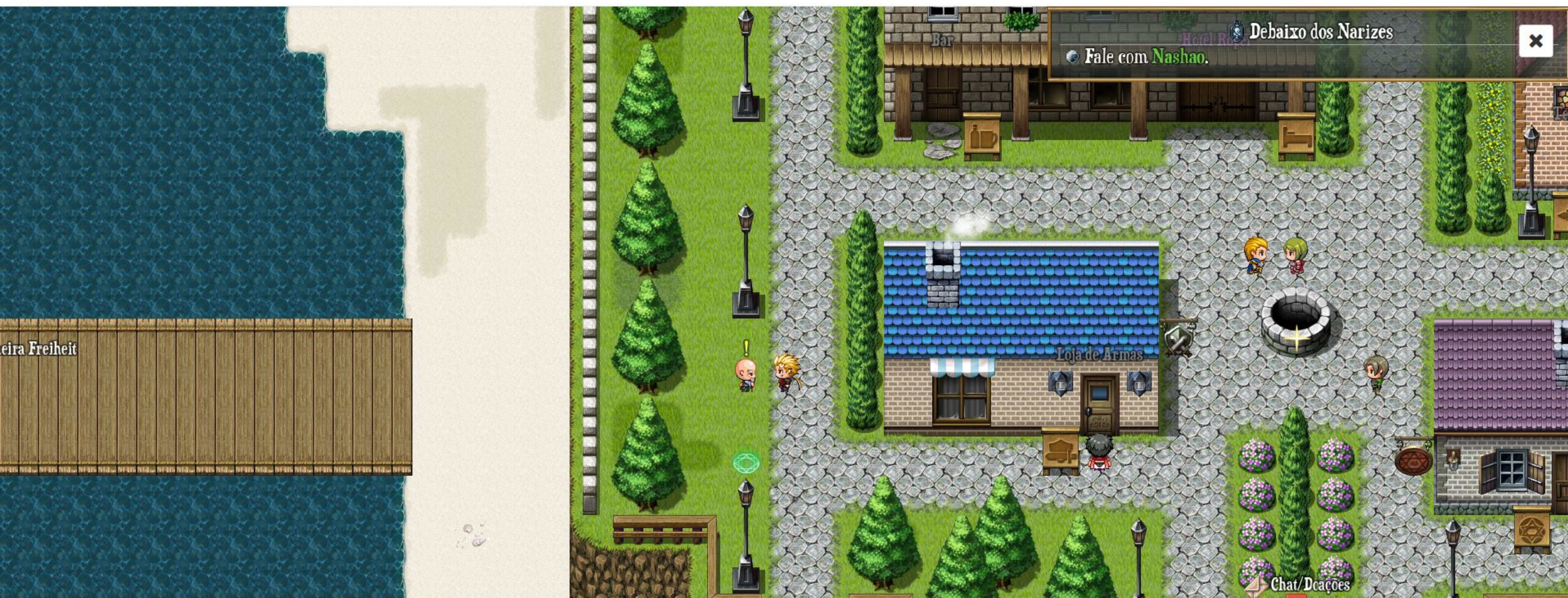


STIMULATING EFFECTIVE BEHAVIORS

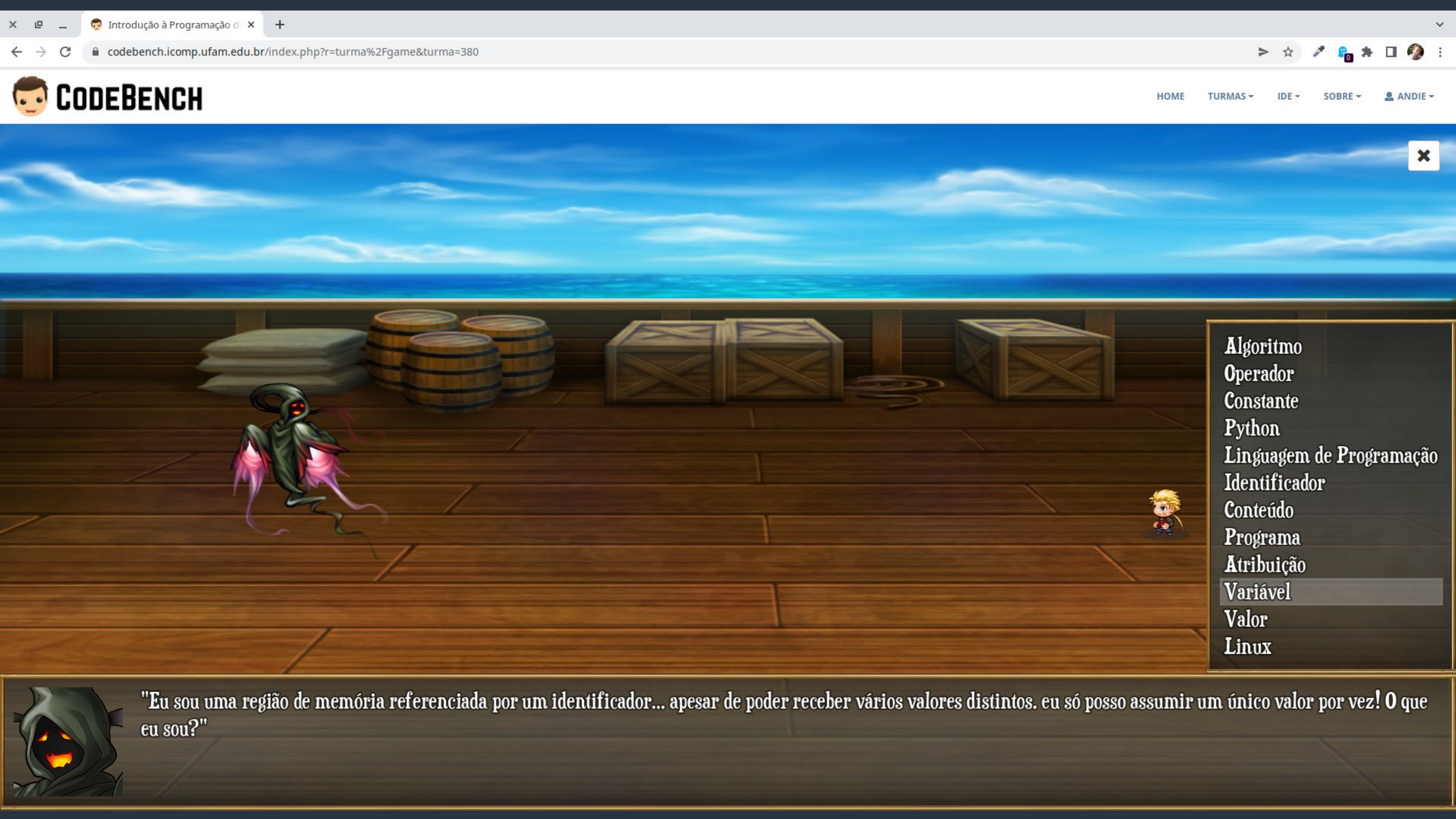


- ✓ We already know what behaviors lead to good performance in programming disciplines
- ✓ In this way, would it be possible to use customized gamification to encourage each student to behave in a more effective way?
- ✓ Gamification in CodeBench is based on RPG games, in which students need to learn programming to break free from a virtual world where they are trapped.





Nesta fase de sua jornada. você precisa achar **Stuark** e derrotá-lo!



- Algoritmo
- Operador
- Constante
- Python
- Linguagem de Programação
- Identificador
- Conteúdo
- Programa
- Atribuição
- Variável
- Valor
- Linux



"Eu sou uma região de memória referenciada por um identificador... apesar de poder receber vários valores distintos. eu só posso assumir um único valor por vez! O que eu sou?"

Introdução à Programação de Computadores

codebench.icomp.ufam.edu.br/index.php?r=turma%2Fgame&turma=380

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Elaine Harada Teixeira de Oliveira - Turma EMEC1/C2

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Cartas

Gamificação

Sob o Domínio de Marduk

Abrir Jogo

Enredos da gamificação:

Geral

Capítulo 1

Capítulo 2

Capítulo 3

Capítulo 4


Capítulo 5

Capítulo 6

Final

Você e um grupo de amigos foram presos em um mundo virtual controlado por um ser extremamente poderoso chamado Marduk. Esse reino virtual, uma espécie de Matrix, é chamado de Midgard e foi desenvolvido através de uma tecnologia computacional muito sofisticada. A única forma de se libertar desse reino virtual é através de um portal mágico protegido por um monstro, a terrível Quimera, uma besta virtual muito impiedosa e poderosa. Como o mundo virtual foi desenvolvido através de tecnologia computacional e de linguagens de programação disponíveis no mundo real, a única forma de vencer a Quimera e se proteger dos demais perigos do mundo virtual é através do conhecimento de programação. Estudar programação faz você aumentar seu poder, possibilitando que você se transforme em um ser realmente poderoso, conhecido no mundo virtual como **CodeMestre**.

Guerreiros e Guerreiras — Grupo Ouro 1



Maurício Viana Carvalho


Nível 18 Experiência 21129 x23712


Vida

640/640

Energia

108/108





Sandro Gomes Pinheiro


Nível 11 Experiência 5591 x1948


Vida

500/500

Energia

80/80






Pedro José Martins

Nível 10 Experiência 3985 x1199


Vida

480/480



Definições de termos

CARTAS DE RECOMPENSA (CARTAS DE THORIEL)



São as cartas sorteadas para um aluno quando um exercício é resolvido corretamente. As recompensas são: moedas, pontos de experiência, abertura de novos locais exploráveis e progressão nos capítulos. Também conhecidas como **cartas de Thoriel**.

EXPERIÊNCIA

Pontos de experiência (EXP) podem ser sorteados ao fim da resolução de exercícios, encontrados explorando os mapas, e realizando missões.

NÍVEIS

Indica o nível de evolução do aluno. Quanto maior o nível, mais poderoso ele se torna. O nível é definido pela

DETECTING PLAGIARISM USING LEARNING ANALYTICS



- ✓ In the initial programming classes, the codes developed by the students tend to be simple and small, making it difficult to use conventional plagiarism detection techniques.
- ✓ In this way, instead of using traditional techniques, we chose to analyze the students' behavior during the creation of codes in the online judge's IDE
- ✓ Starting from the premise that the behavior of those who are pasting is different from those who are actually solving the exercises, we arrived at the following results:

	Precisão	Revocação	Medida-F
Plágio	0.806	0.844	0.824
Não-plágio	0.846	0.809	0.827
Média	0.827	0.826	0.826

- ☐ Bloco de Exercícios 1

- ☐ Bloco de Exercícios 2

- ☐
- Bloco de Exercícios 3**

- ☐
- Bloco de Exercícios 4

- ☐ Bloco de Exercícios 5

- ☐
- Bloco de Exercícios 6**

- ☐ **Bloco de Exercícios 7**

- ☐
- Bloco de Exercícios 8**

- ☐ Bloco de Exercícios 9

- ☐
- Bloco de Exercícios 10**

- ☐ **Bloco de Exercícios 11**

- ☐
- Bloco de Exercícios 12**

vetores

Moleza!

 Detalhes do Exercício

Similaridade de códigos

Cada campo da tabela abaixo mostra o índice de similaridade entre os códigos de dois alunos para este exercício.

Similaridade de códigos

Cada campo da tabela abaixo mostra o índice de similaridade entre os códigos de dois alunos para este exercício.

	Adna Alencar Oliveira	Adriele Mota Abdalla	Ana Albuquerque Marques	Ana Maria Arantes	Ana Paula Urique Martins	Ariany Heinz Marinho	Artemis Carvalho Brito	Beatriz Machado Lopes	Bruno Carvalho	Bruno Santos Dantos	Chistiano Haran Martines	Emily Leão Oliveira	Felipe Coutinho Brito	Gabriel Oliveira Vieira	Giovana Rodrigues Mourão	Gustavo Reis de Lima	Helmer Branches Oliveira	Hugo Bezerra Marcondes	Isabela Andrade Freitas	Izequiel Coelho	Jamile
Adna Alencar Oliveira	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Adriele Mota Abdalla	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Ana Albuquerque Marques	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Ana Maria Arantes	0%	0%	0%	100%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Ana Paula Urique Martins	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Ariany Heinz Marinho	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Artemis Carvalho Brito	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Beatriz Machado Lopes	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Bruno Carvalho	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Bruno Santos Dantos	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Christiano Haran Martines	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Emily Leão Oliveira	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%	0%
Felipe Coutinho Brito	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%	0%
Gabriel Oliveira Vieira	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%	0%
Giovana Rodrigues Mourão	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%	0%
Gustavo Reis de Lima	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%	0%
Helmer Branches Oliveira	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%	0%
Hugo Bezerra Marcondes	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%	0%
Isabela Andrade Freitas	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%	0%
Izequiel Coelho	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%	0%
Jamile	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	0%	100%

OTHER RESEARCH INVOLVING LEARNING ANALYTICS

- ✓ **Classification of difficulty of programming exercises:** by analyzing the behavior of students when proposed to an exercise, it is possible to infer the difficulty of it.
- ✓ **Detecting plagiarism:** by analyzing the behavior of students in the system, we're trying to identify the characteristics of who is 'cheating'.
- ✓ **Automatic detection of students feeling confused:** by analyzing the behavior of students in the system, it is possible to identify students who are feeling confused in a given exercise.
- ✓ **Group formation:** by analyzing the students' learning paths, we'll analyse the best collaborative techniques and group arrangements.



NEW CODEBENCH



- ✓ In 2023, version 3.0 of the CodeBench system will be launched, which is more secure, scalable and modern
- ✓ The new system will be released to institutions that want to conduct research involving online judges and learning analytics
- ✓ Some features of the new system:
 - ✓ Support for multiple languages
 - ✓ Support for multiple institutions
 - ✓ Support for creating study materials and interactive learning objects
 - ✓ Classroom (similar to Google Classroom)



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Universidade Federal do Amazonas

PT-BR

Lonie I Student

main.c

area.c

rectangle.c

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```
#include <stdio.h>
#include <math.h>
int main()
{
    int x1, y1, x2, y2, x, y, distance;

    // take first point's coordinates
    printf("Enter coordinates of first point: ");
    scanf("%d %d", &x1, &y1);

    // take second point's coordinates
    printf("Enter coordinates of second point: ");
    scanf("%d %d", &x2, &y2);

    x = (x2 - x1);
    y = (y2 - y1);

    distance = sqrt(x * x + y * y);

    // display result
    printf("Distance = %d", distance);

    return 0;
}
```

CONSOLE

SHELL

Console

Caso de Teste 1

EXECUTAR

Entrada 16

Saída 0 1 1 2 3 5 8 13 21 34

00:33:05

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O

Universidade Federal do Amazonas

ENUNCIADO

Escreva um programa que imprima o fatorial de um valor informado na entrada. Em matemática, o fatorial de um número natural n , representado por $n!$, é o produto de todos os inteiros positivos menores ou iguais a n .

DICAS

É importante não se esquecer dos casos bases, isto é, dos fatoriais de 0 e de 1.

CASOS DE TESTE DE EXEMPLO

Caso de Teste 1

EXECUTAR

Entrada 16

Saída 0 1 1 2 3 5 8 13 21 34

main.c

area.c

rectangle.c

```
1 #include <stdio.h>
2 #include <math.h>
3 int main()
4 {
5     int x1, y1, x2, y2, x, y, distance;
6
7     // take first point's coordinates
8     printf("Enter coordinates of first point: ");
9     scanf("%d %d", &x1, &y1);
10
11    // take second point's coordinates
12    printf("Enter coordinates of second point: ");
13    scanf("%d %d", &x2, &y2);
14
15    x = (x2 - x1);
16    y = (y2 - y1);
17
18    distance = sqrt(x * x + y * y);
19
20    // display result
21    printf("Distance = %d", distance);
22
23    return 0;
24 }
25
```

CONSOLE

SHELL

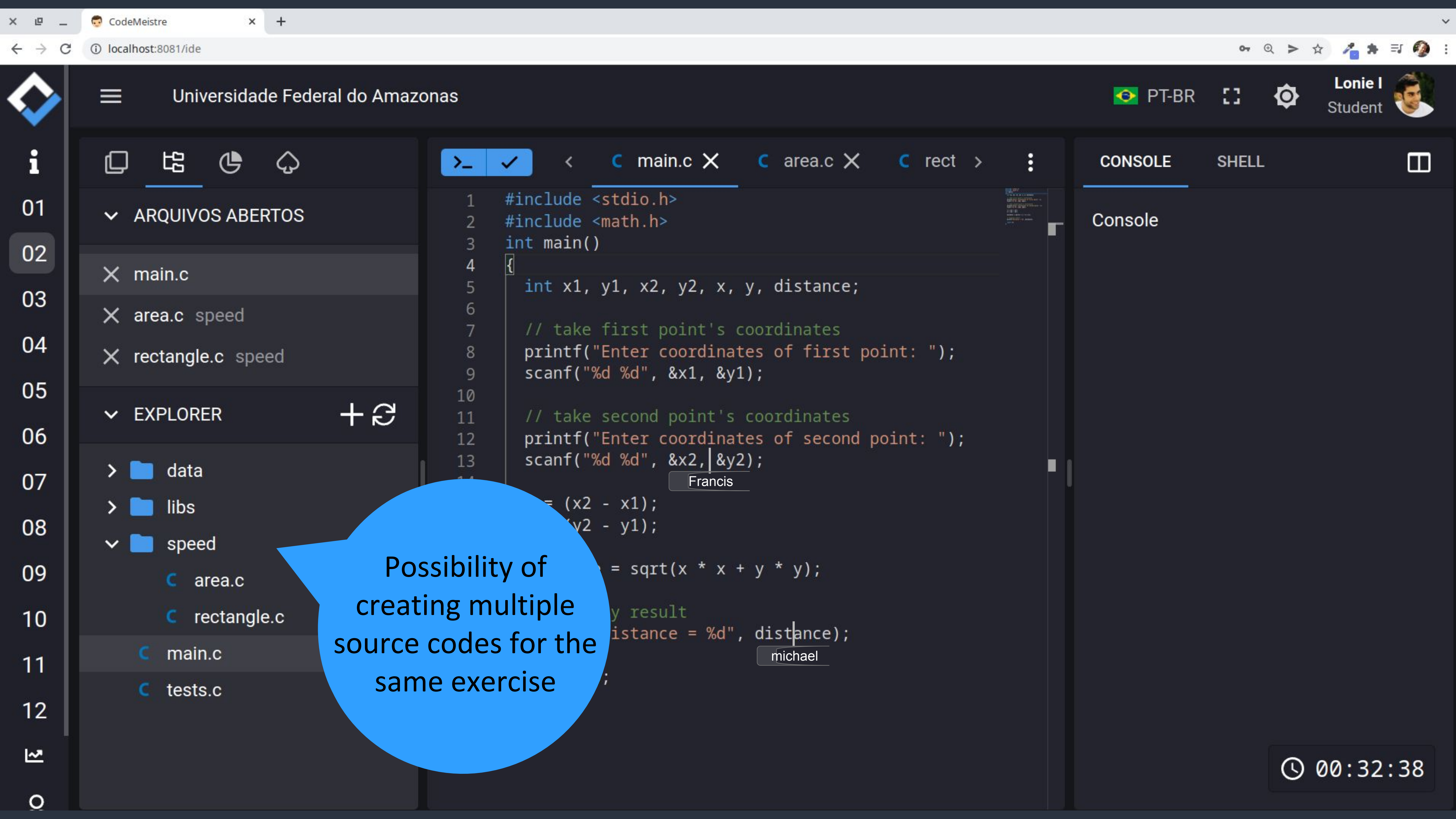
Console

Possibility of creating group work, where students will develop the code collaboratively

Francis

michael

00:33:05





UFAM



JOHANNES GUTENBERG
UNIVERSITÄT MAINZ

(I) Brazilian-German Symposium on Learning Analytics
Mainz, May 12th 2023

Would you like to collaborate? :)

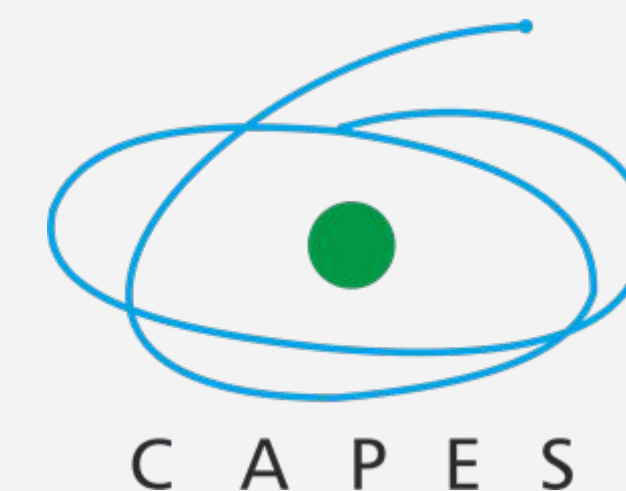
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Alexander von
HUMBOLDT
STIFTUNG

