

# Let's Talk It Out: A Chatbot for Effective Study Habit Behavioral Change

**Xiaoyi Tian\***, Zak Risha, Ishrat Ahmed,  
Arun Balajiee Lekshmi Narayanan, Jacob Biehl  
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University of Florida\*  
University of Pittsburgh

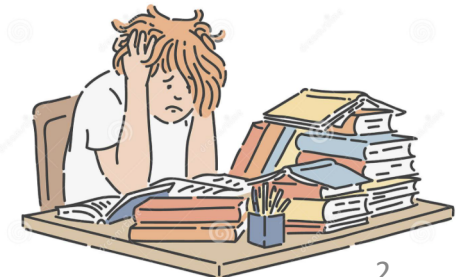
# Introduction

First-year college experience can be very challenging

- Transition to new environment
- Inadequate study habits and skills (Chamundeswari, 2014)
- High attrition rates, particularly in Computer Science (CS)

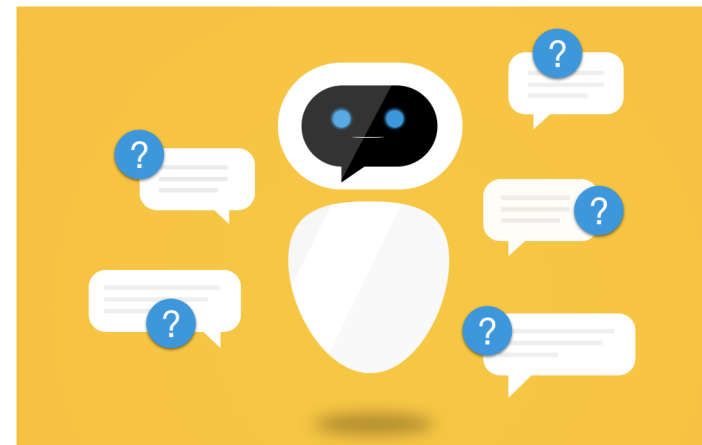
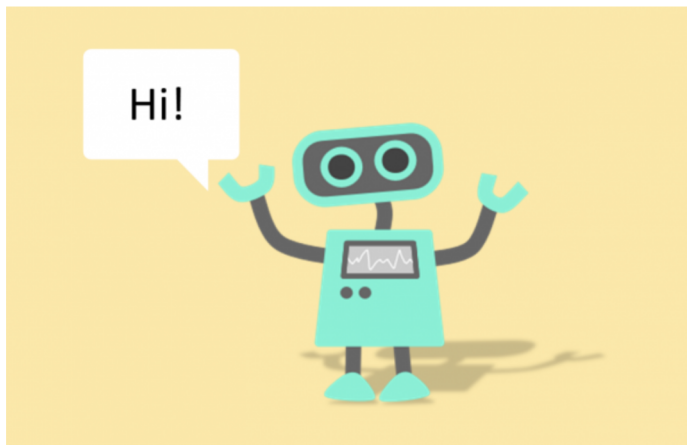
Remote learning environments under COVID-19

- More supports are needed



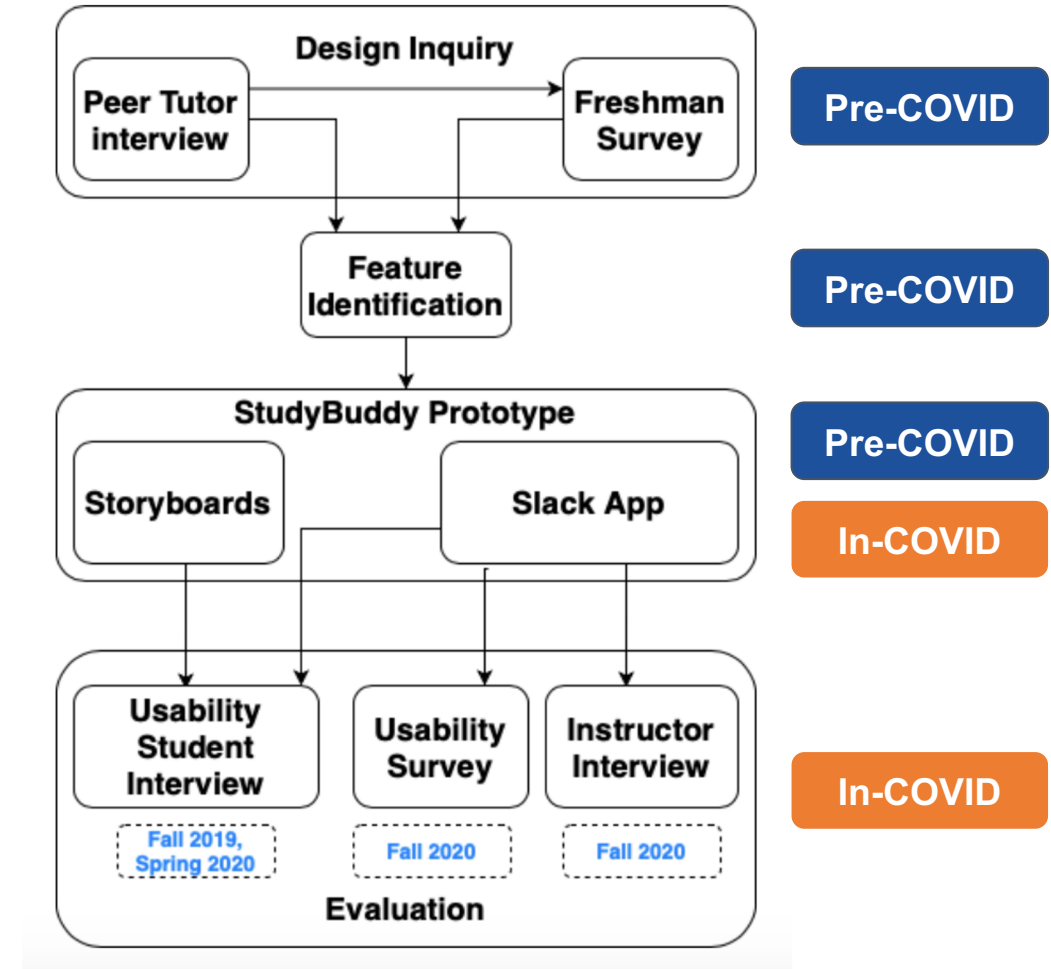
# Chatbots as persuasive technology may help

- Aim to change everyday behavior
  - Journaling food (Lukof et al, 2017)
  - Self-reflection at work (Williams et al, 2018)
- Our goal: Design a chatbot for study behavioral change



# Outline

- Design inquiry
- *StudyBuddy* features and prototypes
- Evaluation and design recommendation
- Conclusion

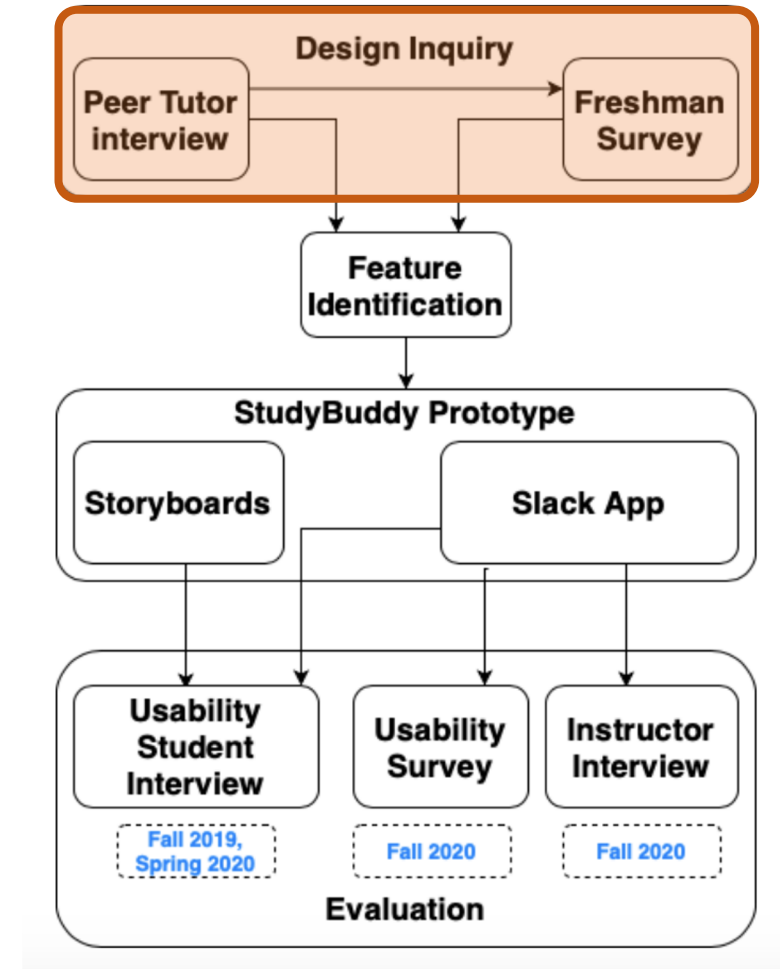


Design Flowchart



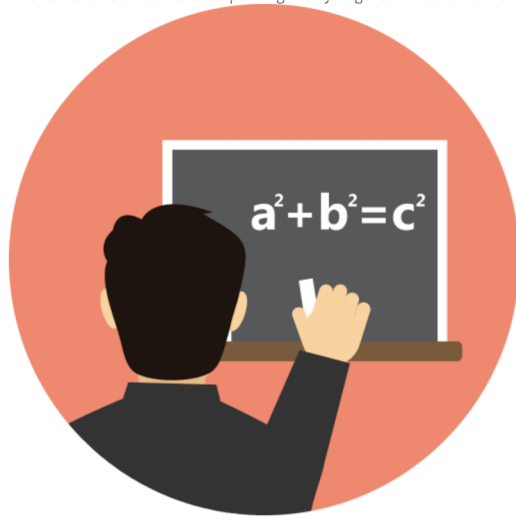
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Design Flowchart

# Design Inquiry



## Peer-tutor interview

3 CS peer tutors



## In-class Survey

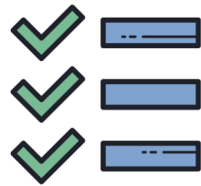
83 students  
(94% freshman)

# Design Inquiry Findings

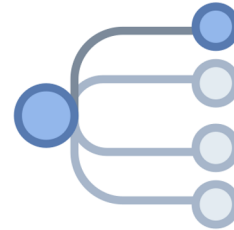
- Common challenges first-year students are facing



Time management



Task management



Lack of domain  
knowledge

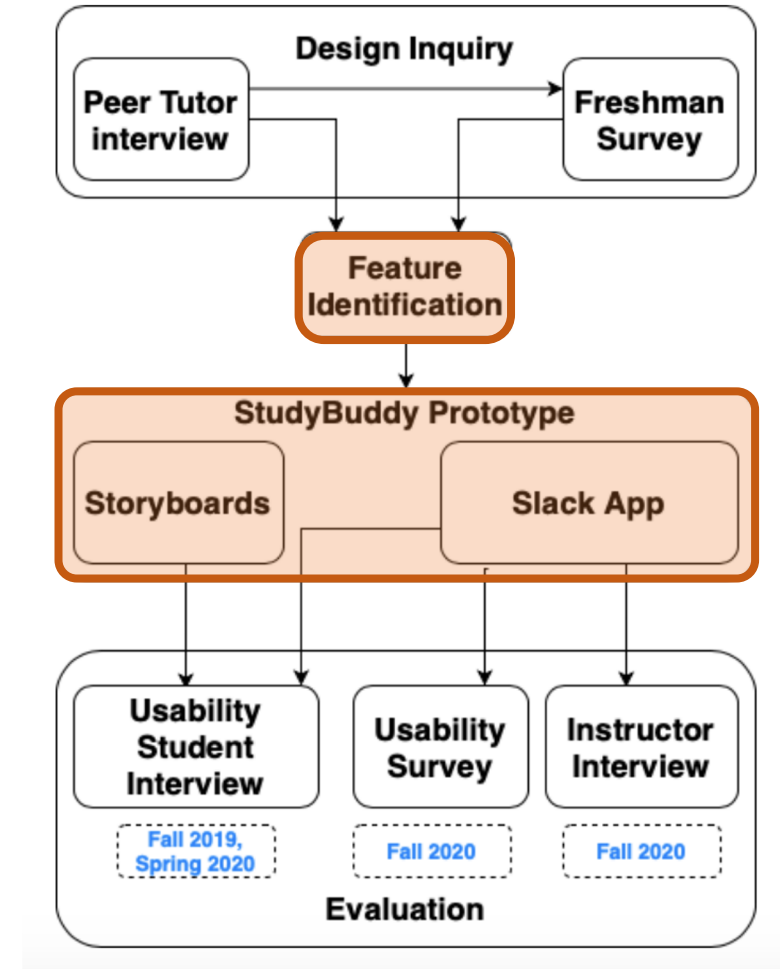


Unfamiliar with  
academic resources

- Expressed interest in using chatbot for study behaviors
- Perceived useful of chatbot features

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Design Flowchart

# StudyBuddy Features



Insider tips



Reminders



connecting  
to a tutor



Study habit  
feedback



Task  
breaking-down



recommending  
academic resources

# StudyBuddy Prototypes



Insider tips



Reminders



Study habit  
feedback



Task  
breaking-down



## Slack App



**StudyBuddy** ☆



Messages

About



**Study Buddy** APP 12:39 PM May 31st, 2020 ▾

Awesome! Our next step is implementing you pseudo code using IDE. Have you done it yet?



**Freshman User** 12:39 PM

no



**Study Buddy** APP 12:39 PM

Okay. Let's try to implement your pseudo code. Have the JDK installed on your machine (duh!). Then open the IDE and start programming. Don't forget to do unit testing as you're programming!



**Freshman User** 12:40 PM

Message StudyBuddy



# StudyBuddy Prototypes



Insider tips



Study habit  
feedback



: If you're stuck with something, try visualizing, pen and paper! (*functional tip*)



Task  
breaking-down



## Slack App



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Message StudyBuddy



# StudyBuddy Prototypes



Insider tips



: If you're stuck with something, try visualizing, pen and paper! (*functional tip*)



Study habit  
feedback



: It's okay to take a break. (*motivational tip*)

Task  
breaking-down



## Slack App



**Study Buddy** APP 12: May 31st, 2020

Awesome! Our next step is implementing you pseudo code using IDE. Have you done it yet?



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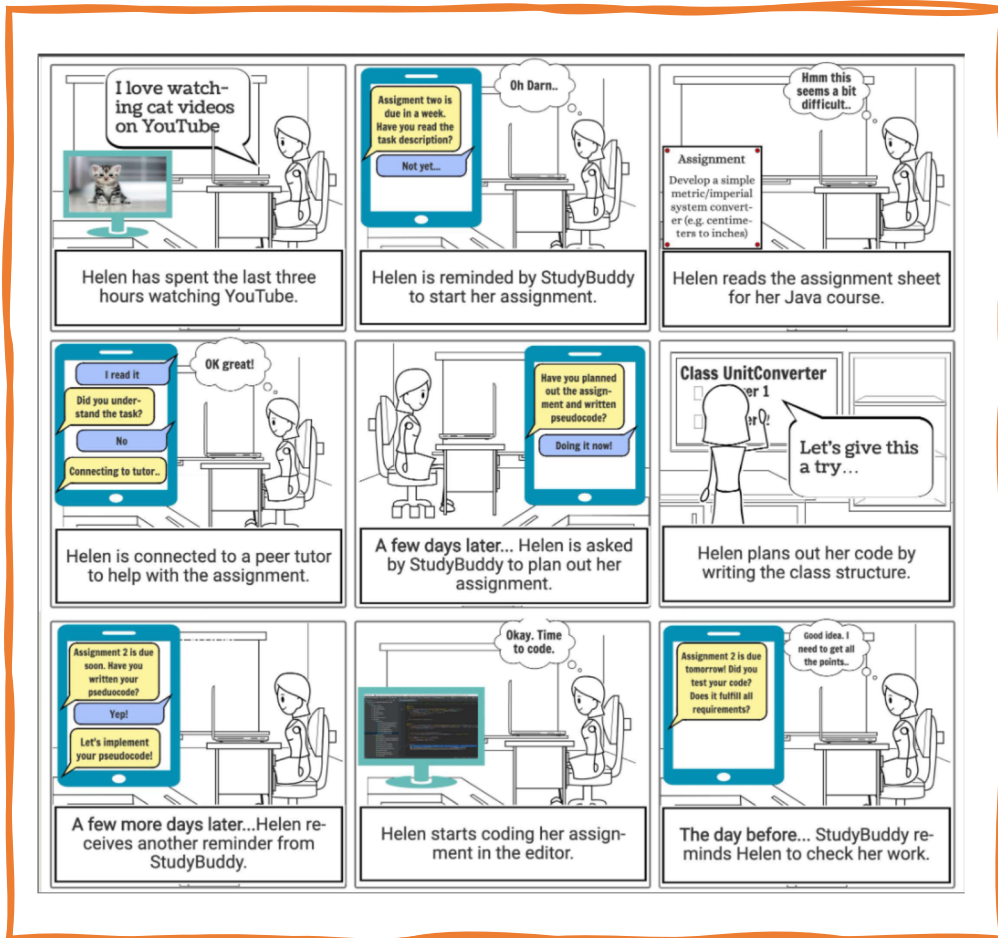
**Freshman User** 12:40 PM


Message StudyBuddy






# StudyBuddy Prototypes: Storyboards

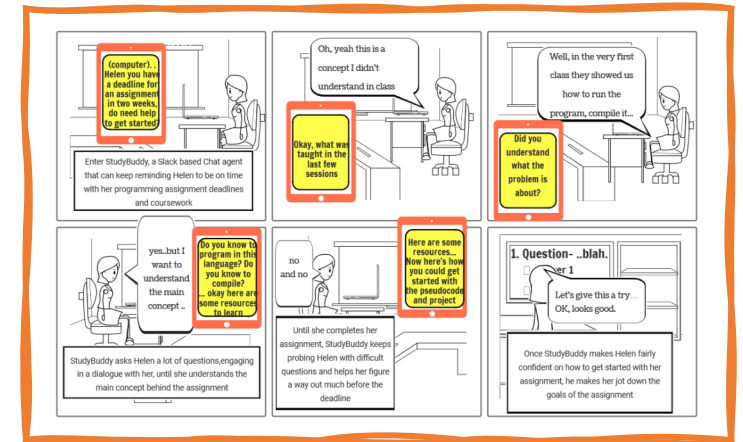
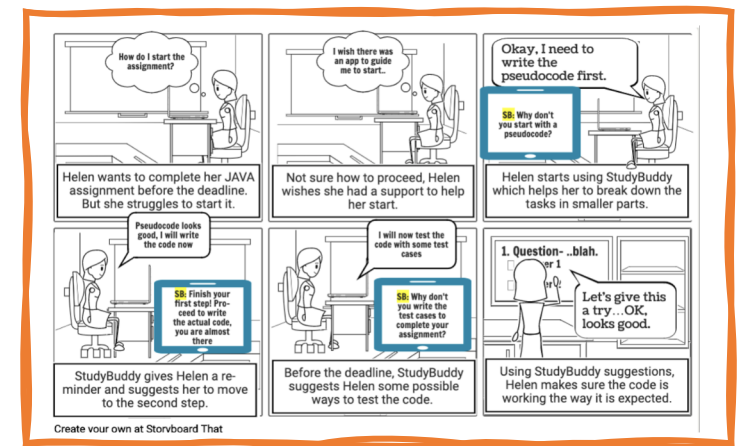




connecting  
to a tutor

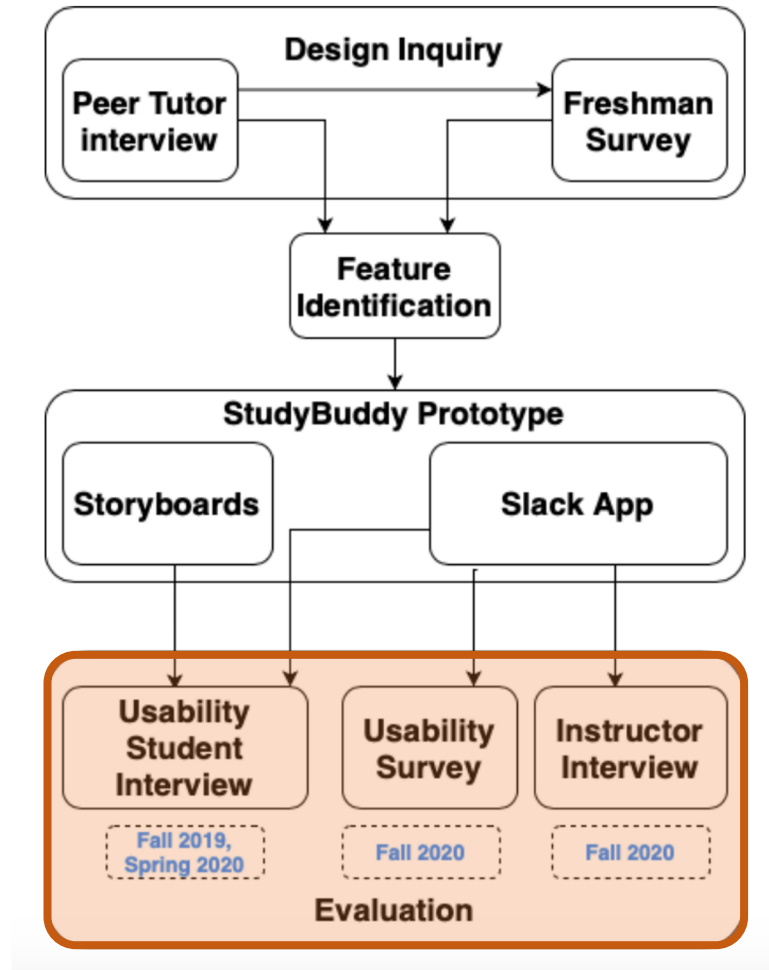


recommending  
academic resources



# Outline

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Design Flowchart

# Evaluation



## Student Interview

8 students  
first-year and senior  
students



## Usability Survey

117 students  
All year groups of  
undergrads



## Instructor Interview

5 CS course instructors



# Design recommendations

- Building Trust with Users
- Personalizing the Chatbot Experience
- Gender and Individual Differences
- Immediate Help vs. Long-term Sustainable Support
- Design for a Context-Aware Chatbot



# Design recommendations

- Building Trust with Users
- Personalizing the Chatbot Experience
- Gender and Individual Differences
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# Student interview findings

- Variations of perception of different tips among individuals

Overall ranking	Category	Tip content	Ranking by each participant (The darker indicates higher rank)							
			f1	f2	f3	f4	s1	s2	s3	s4
1	Functional	If you're stuck with something, try visualizing, pen and paper!	1	1	6	3	2	1	3	1
2		Before you write the program, try to visualize the entire idea in your mind, come up with the main cases, write the algorithm, have a pseudo code. Then, your programming will be faster and have less bugs.	2	3	1	2	3	2	6	2
3		Always write code in incrementally functional bits.	5	2	3	4	9	6	4	6
5		It is always a good idea to write functions in your program	6	7	5	5	6	4	5	5
6		To debug a program you can place print statements (a quick and dirty way).	8	6	7	1	7	3	8	4
9		The debugger is your friend.	7	5	8	7	8	9	7	3
10		Algorithms is what makes us separate from others, try to be good at them!	9	8	9	6	10	8	9	7
4	Motivational	If you're studying late in the night, make sure to get some sleep before the test.	4	4	10	8	1	5	1	9
7		....it's okay to take a break.	10	10	2	9	4	7	2	8
8		When the going gets tough, the tough gets going!	3	9	4	10	5	10	10	2
11		Coffee is your second friend.	11	11	11	11	11	11	11	10





# Student interview findings

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1	Functional	If you're stuck with something, try visualizing, pen and paper!	1	1	6	3	2	1	3	1	
2		Before you write the program, try to visualize the entire idea in your mind, come up with the test cases, write the algorithm, then pseudo code. Then, your program will be easier to debug.	2	2	2	2	3	2	6	2	
3		Always write code in incrementally functional bits.	3	3	3	4	9	6	4	6	
5		It is always a good idea to write functions in your program.	4	4	4	5	6	4	5	5	
6		To debug a program you can place print statements (the dirty way).	5	5	5	6	7	3	8	4	
9		The debugger is your friend.	6	6	7	7	8	9	7	3	
10		Algorithms is what makes us separate from others, try to be good at them!	7	7	8	8	10	8	9	7	
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8			When the going gets tough, the tough gets going!	10	10	2	9	4	7	2	8
11	Coffee is your second friend.		3	9	4	10	5	10	10	2	
			11	11	11	11	11	11	11	10	

Functional

In CS, you can ONLY achieve motivation if you succeed in a project.  
- Senior student 2



# Student interview findings

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1		If you're stuck with something, try visualizing, pen and paper!	1	1	6	3	2	1	3	1
2		Before you write the program, try to visualize the entire idea in your mind, come up with the main cases, write the algorithm, then pseudo code. Then, your program will be easier to write.	2	2	4	2	3	2	6	2
3	Functional	Always write code in incrementally functional bits.	5	2	3	4	9	6	4	6
5		It is always a good idea to write functions in your program.	6	7	5	5	6	4	5	5
6		To debug a program you can place <i>- Senior student 2</i> (a dirty way).	8	6	7	1	7	3	8	4
9		The debugger is your friend.	7	5	8	7	8	9	7	3
10		Algorithms is what makes us separate from others, try to be good at them!	9	8	9	6	10	8	9	7
4		If you're studying late in the night, make sure to get some sleep before the test.	4	4	10	8	1	5	1	9
7	Motivational	...it's okay to take a break.	10	10	2	9	4	7	2	8
11		When you're debugging, get On! Coffee is your second friend. <i>- Senior student 4</i>	11	11	11	11	11	11	11	10

Functional

In CS, you can ONLY achieve motivation if you succeed in a project.

- Senior student 2

Motivational

I will feel closer to the bot if it has a fun personality.

- Senior student 4





# Student interview findings

- Variations among individuals



## Design Lesson Learned 1:

# Personalizing the chatbot experience

Overall ranking	Category	Tip content	Ranking by each participant (The darker indicates higher rank)							
			f1	f2	f3	f4	s1	s2	s3	s4
1		If you're stuck with something, try visualizing, pen and paper!	1	1	6	3	2	1	3	
2		Before you start coding, think about the problem you're trying to solve.	2	2	5	4	3	2	4	
3	Functional	Always use comments to explain your code.	3	3	4	5	4	3	5	
5		It is a good idea to have a plan before you start coding.	4	4	3	2	5	4	2	
6		To debug your code, try to isolate the problem.	5	5	2	6	6	5	3	
9		The debugger is your friend.	6	6	1	7	7	6	6	
10		Algorithms is what makes computers work. Try to understand it.	7	7	7	8	8	7	7	
4		If you're studying late in the night, make sure to get some sleep before the test.	8	8	8	9	9	8	8	
7	Motivational	....it's okay to take a break.	9	9	9	10	10	9	9	
8		When the going gets tough, the tough gets going!	10	10	10	11	11	10	10	
11		Coffee is your second friend.	11	11	11	11	11	11	11	



# Student usability survey

- Unified Theory of Acceptance and Use of Technology (UTAUT)

Self Management of Learning

Trust

Effort Expectancy

Performance Expectancy

Satisfaction

Behavioral Intention

**High Behavioral Intention**



# Student usability survey

- Unified Theory of Acceptance and Use of Technology (UTAUT)

Self Management of Learning

Trust

Effort Expectancy

Performance Expectancy

Satisfaction

Behavioral Intention

**Female higher than male**



# Student usability survey

• UTAUT



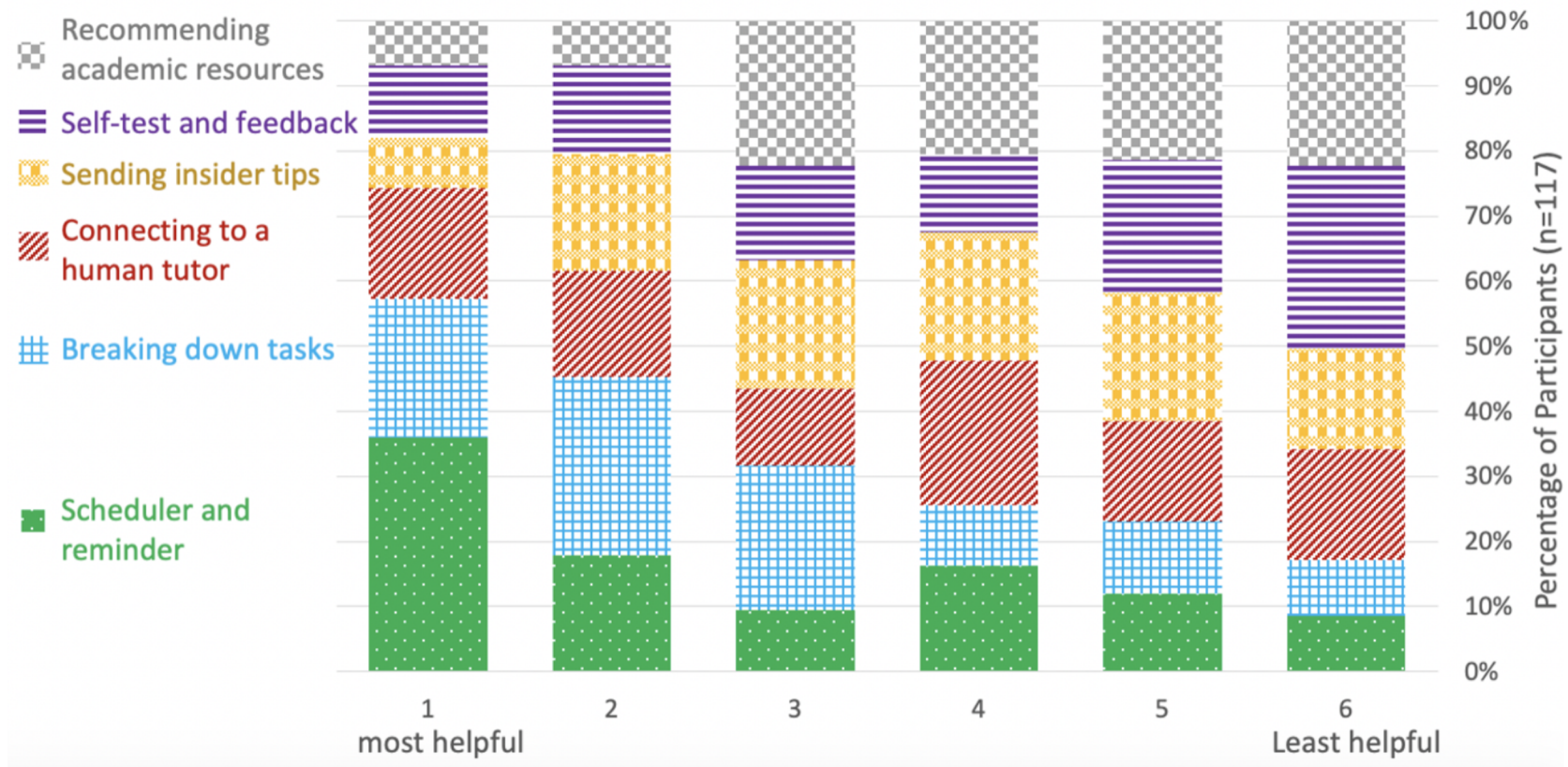
Design lesson learned 2

Gender and individual  
differences

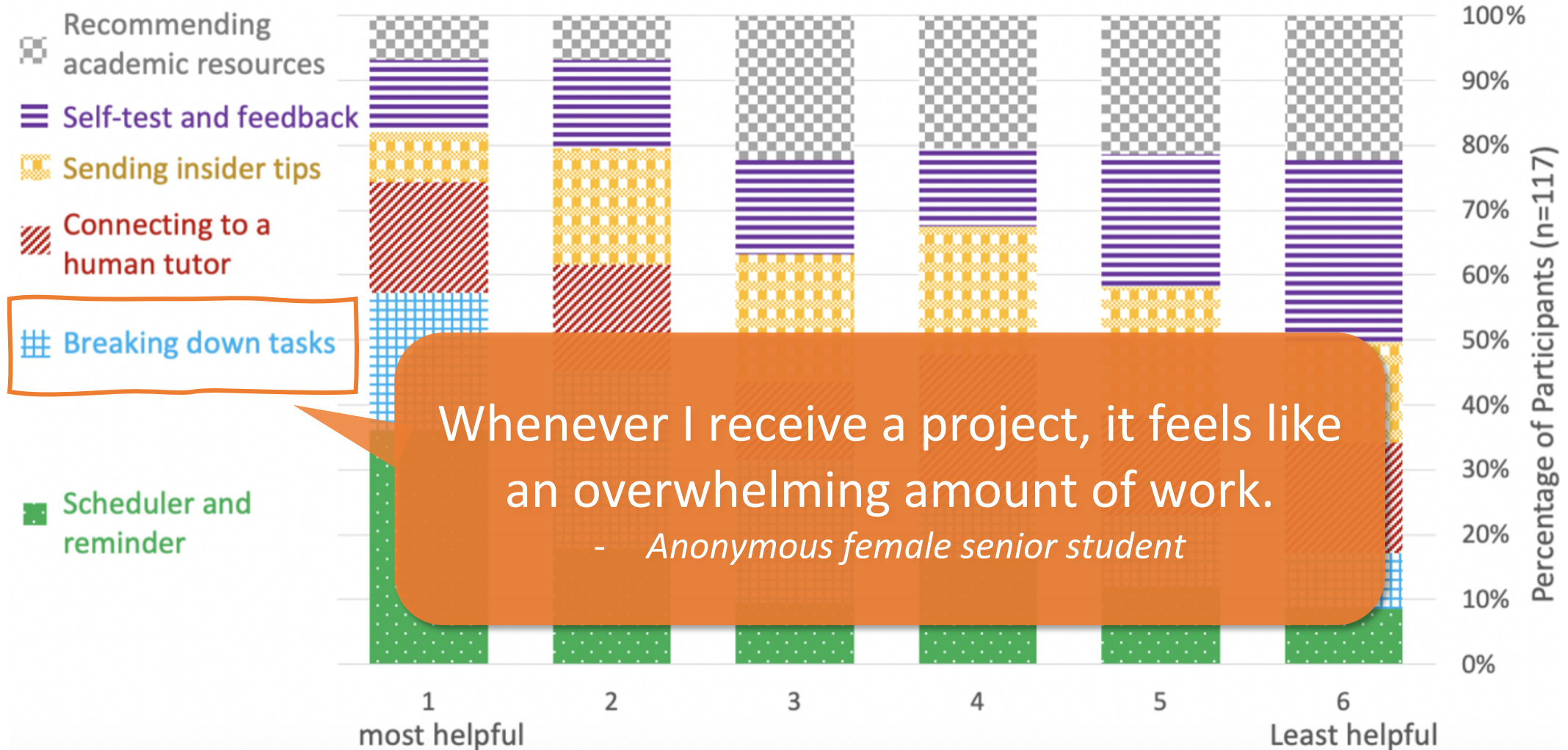


# Student usability survey

- Student ranking of designed features

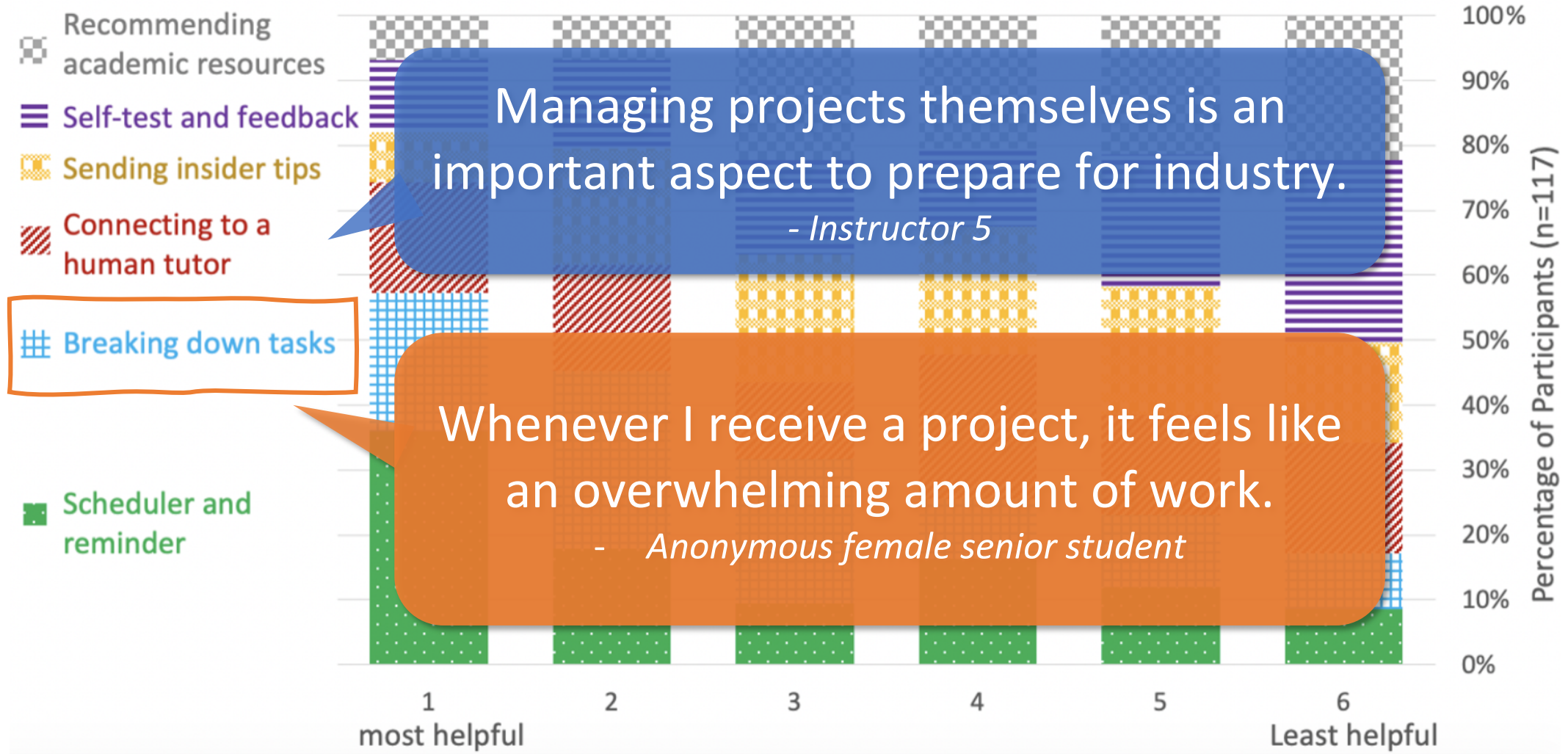


# Feature Perception: instructors vs. students

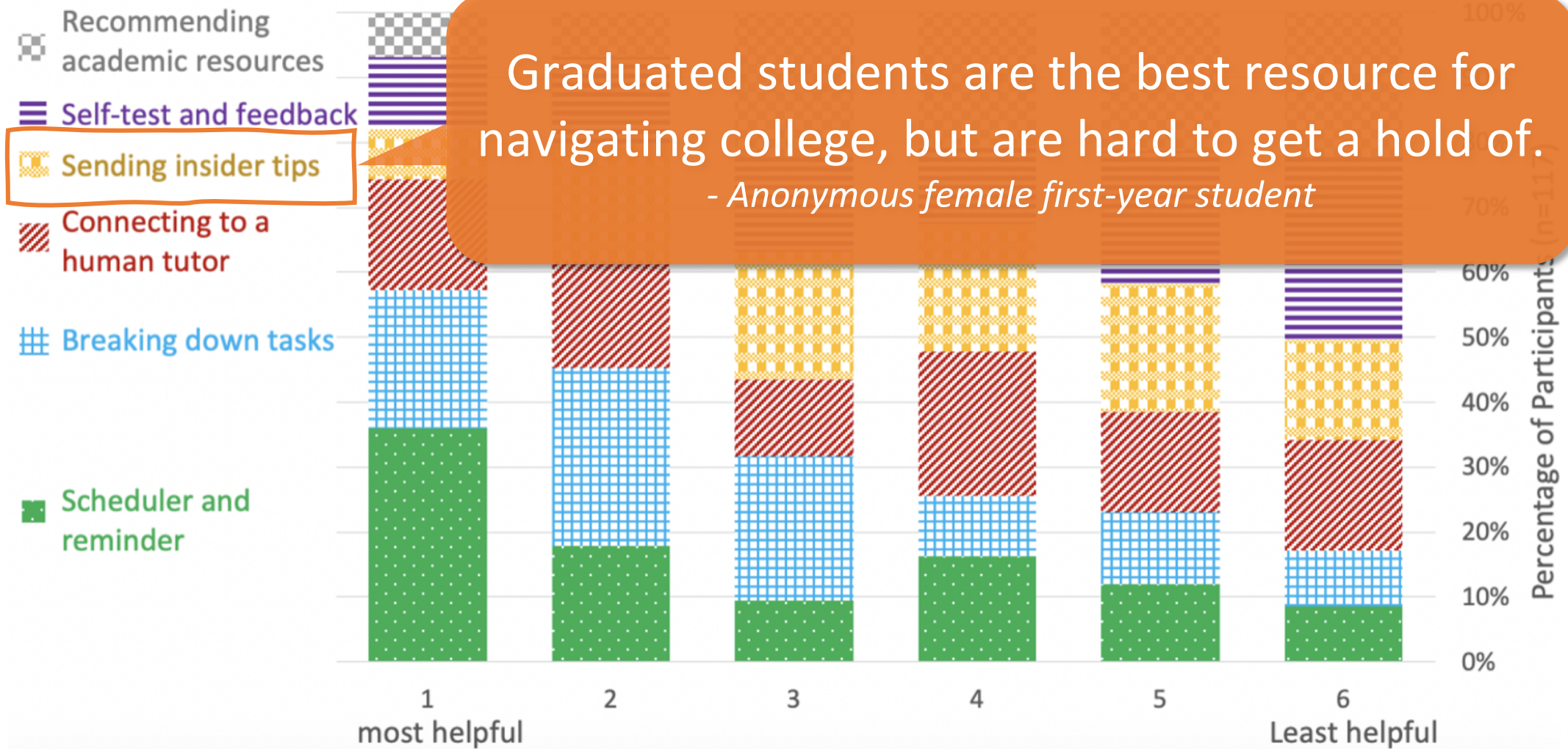




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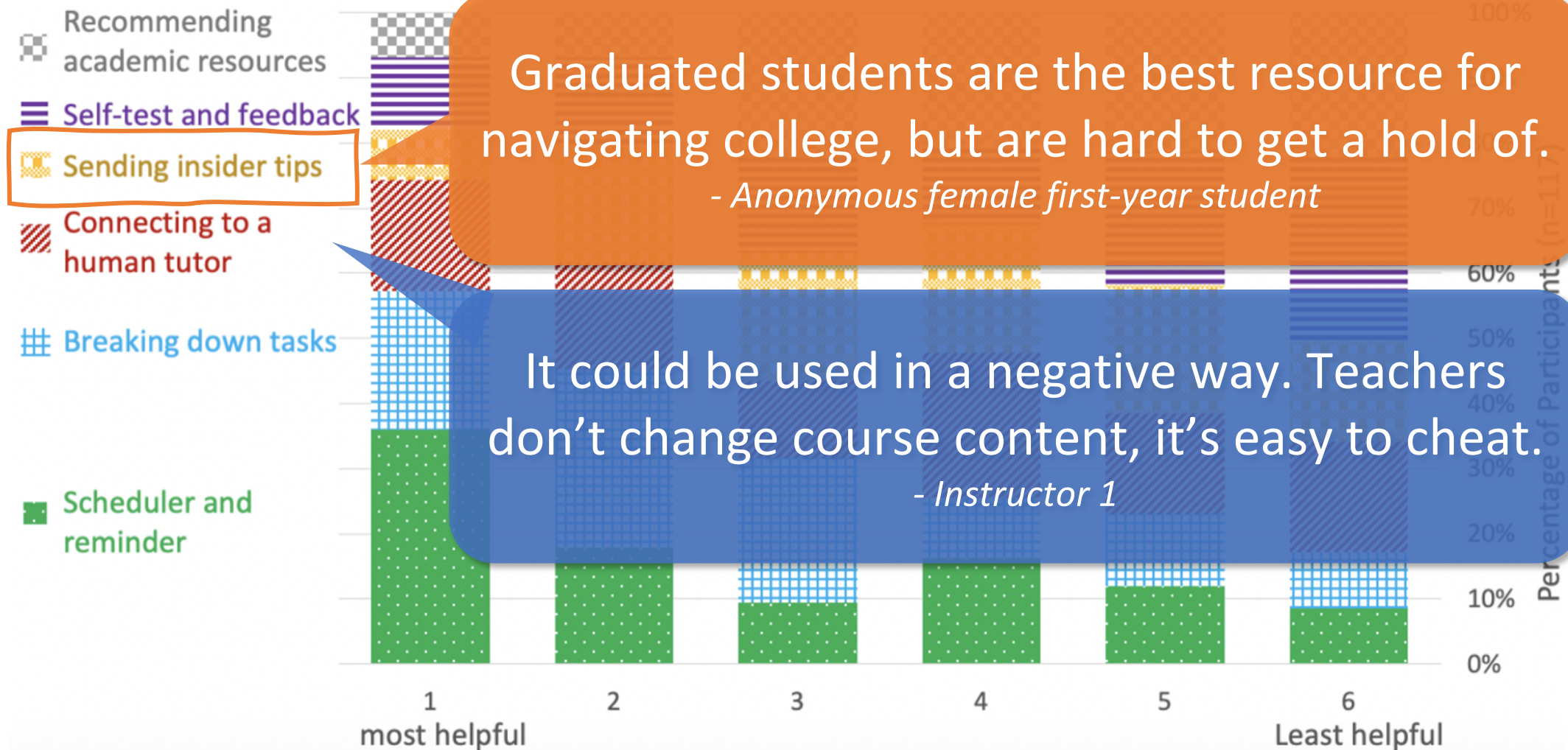


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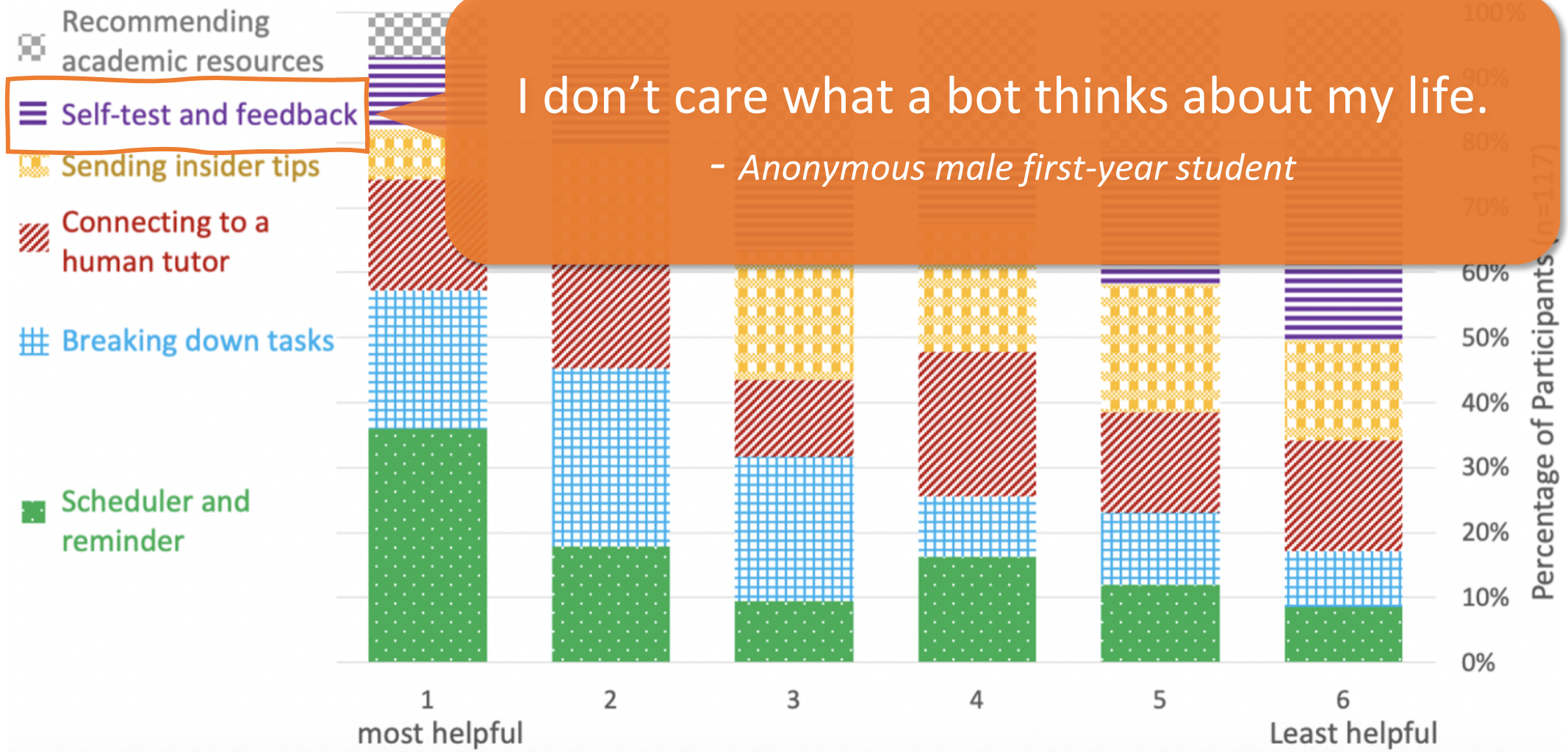




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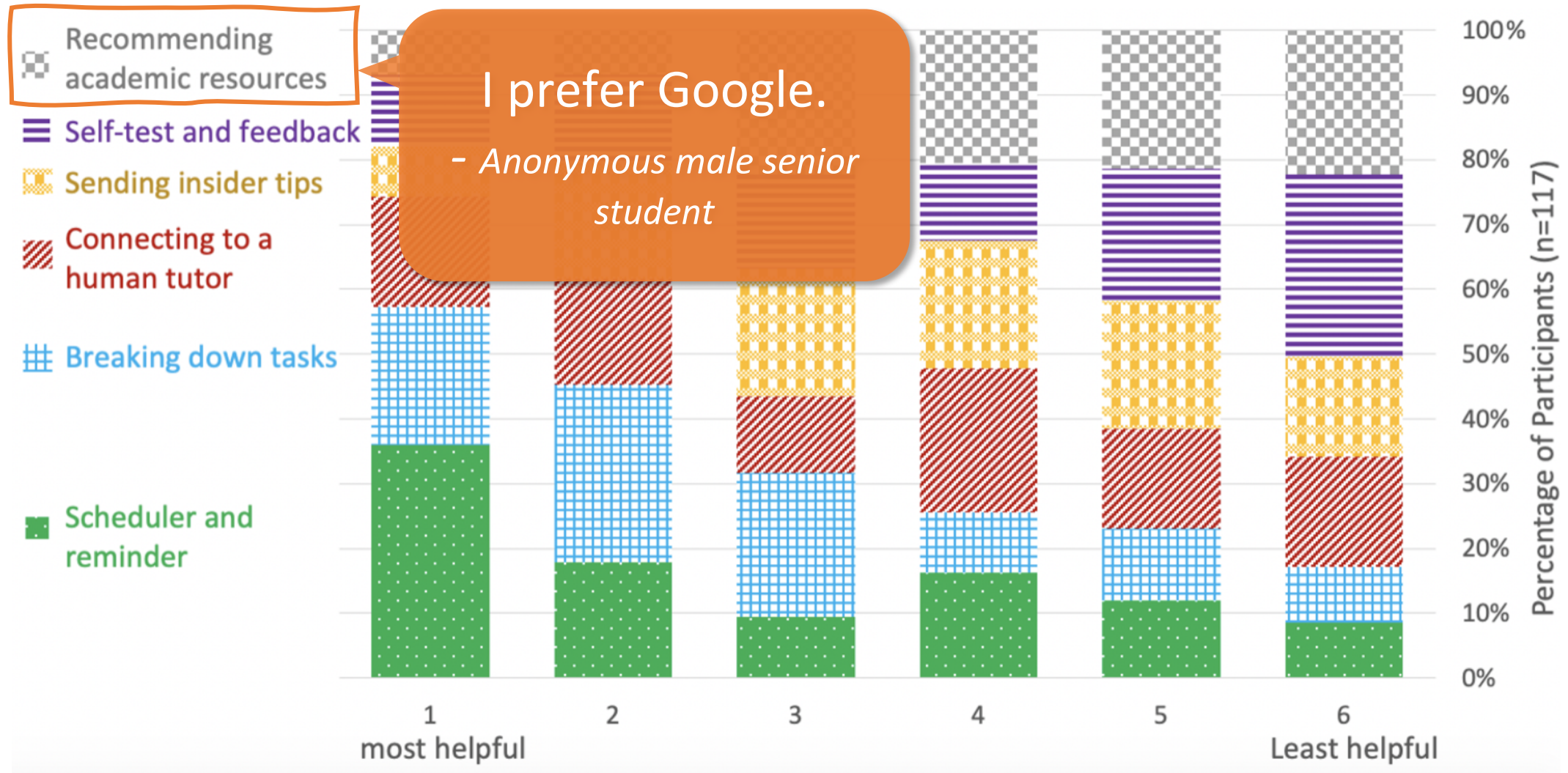


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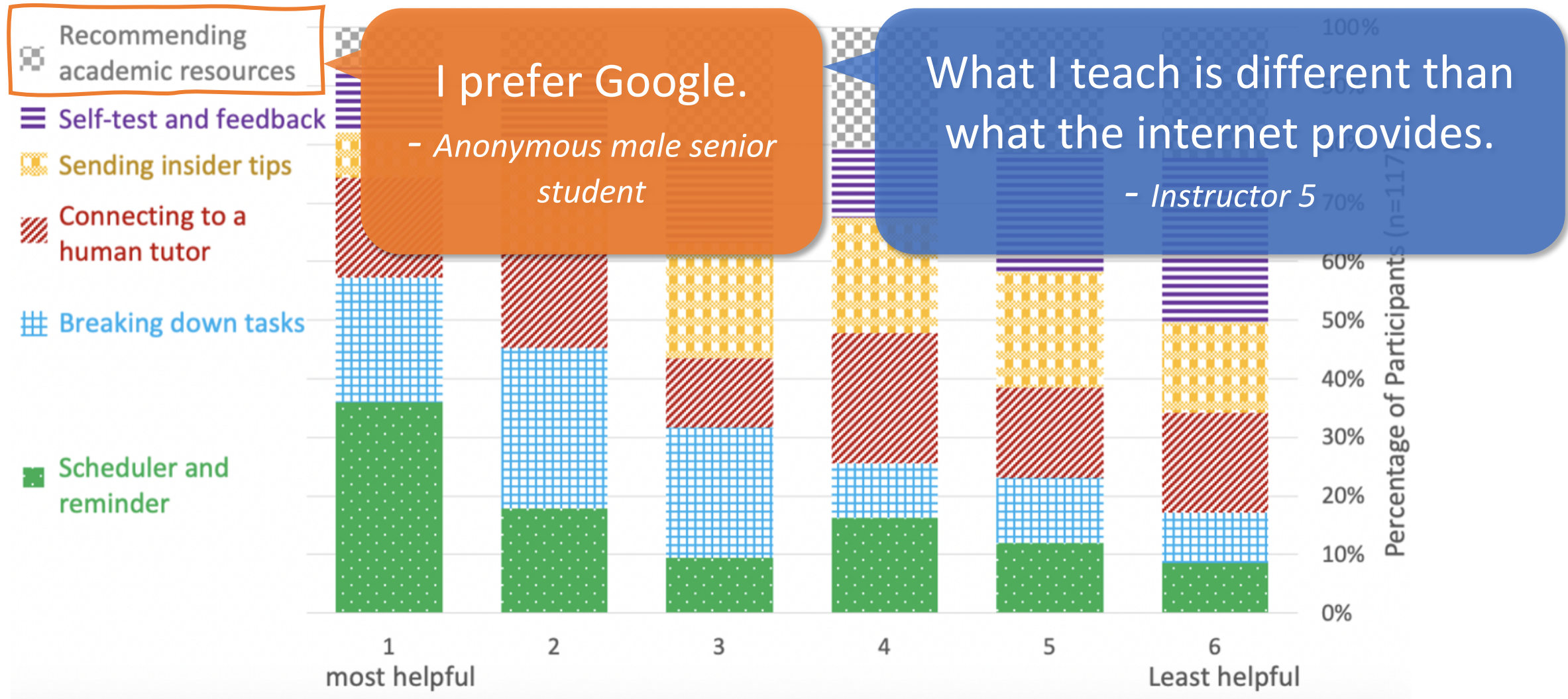




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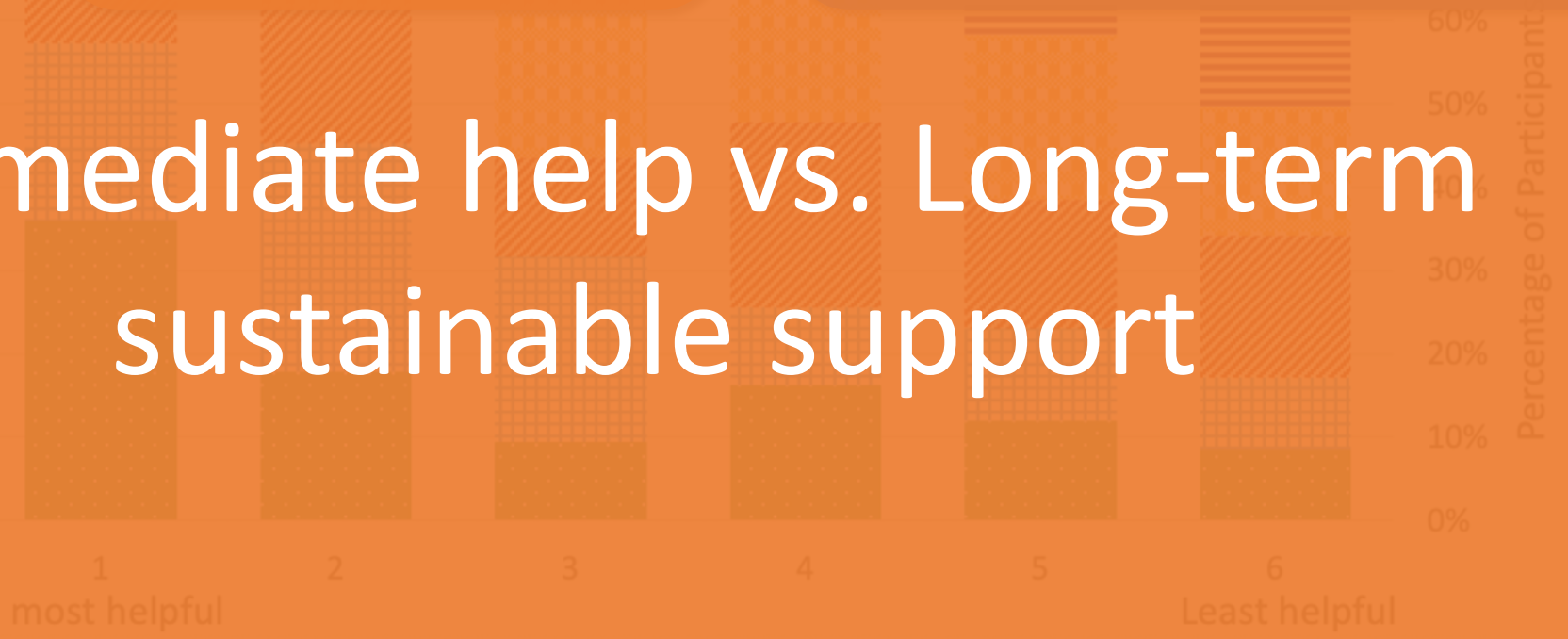


# Feature Perception: instructors vs. students



## Design Lesson Learned 3

Immediate help vs. Long-term sustainable support





# Future work

- Long-term adaptation
- Early detection of students in higher risks
- Department decision-making
  - Curriculum formation
  - Teaching resource allocation
- Support distance education



# Key Takeaways

- Our prototype of a chatbot to improve study habits was perceived useful by students, though was influenced by factors like gender and individual experiences.
- In designing a chatbot for behavioral change, we need to **personalize the experience** based on the user and context.
- To ensure continued use, a chatbot should balance between offering **immediate help** and **long-term sustainable support**.

# Thanks

## Authors



Xiaoyi Tian



Zak Risha



Ishrat Ahmed



Arun Balajiee  
Lekshmi Narayanan



Jacob Biehl

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## Contact

Xiaoyi Tian  
[tianx@ufl.edu](mailto:tianx@ufl.edu)  
[www.txiaoyi.com](http://www.txiaoyi.com)