MANAGEMENT CONFERENCE

QUALITY REVOLUTION:

RETHINKING, RESHAPING, AND REDEFINING EXCELLENCE IN ELT



Assessment in the Digital **Age: Innovative Approaches** to Testing and Evaluation

Duolingo Brett Blacker & James Holden

Session Goals

Participants will understand:

- Different ways in humans are collaborating with AI to advance assessment, in particular related to building item banks and security
- How peers are approaching and collaborating with AI tools in the ELT context
- The latest research and development updates from Duolingo

Conference Themes

- How can we redefine and measure excellence in ELT beyond traditional quality assurance methods, taking into account innovative approaches and revolutionary strategies?
- What transformative frameworks and best practices can be explored to reshape the future of ELT quality assurance, ensuring it remains relevant in an evolving educational landscape?

Overview

1. Introduction

2. Collaborating with AI - Views on the present and future

- 3. Duolingo's approach to Al
 - Building Assessment using AI
 - Securing Assessment using Al
 - Latest from Duolingo Research / Development



About Duolingo

Duolingo's mission is to develop the best education in the world and make it universally available.

World's Most Downloaded Education App



Languages Literacy





Numerac

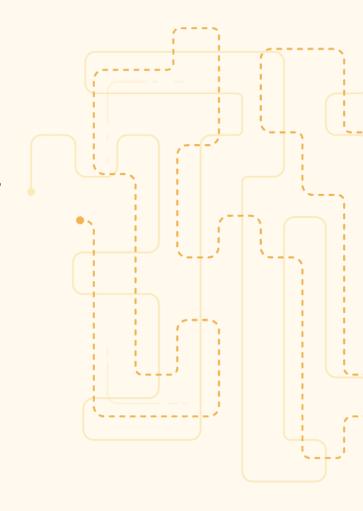
World's Leading High-Stakes Digital Language Test





Professor Luis von Ahn, Duolingo's cofounder and CEO

Collaborating with AI - Views on the present and future



Would you prefer to have a human doctor or an AI algorithm diagnose a medical condition?

Would you feel comfortable taking a plane flown by only AI?

organise your finances?

Would you trust an AI tool to

If a human was also involved in confirming and validating the Al's decisions and actions, would you feel more comfortable?

Collaborating with AI is about leveraging the best of machines and the best of humans.

We always want a 'human-in-the-loop'

Best of Machines

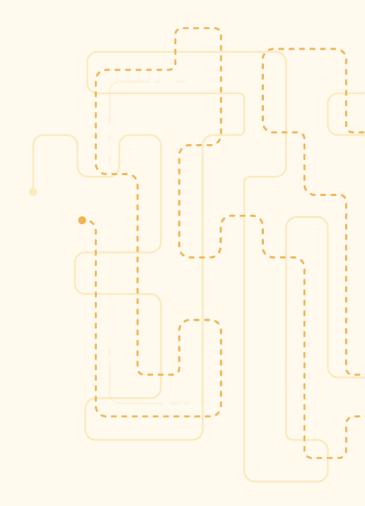
- Data Processing and Analysis
- Consistency and Scalability
- Predictive Capabilities

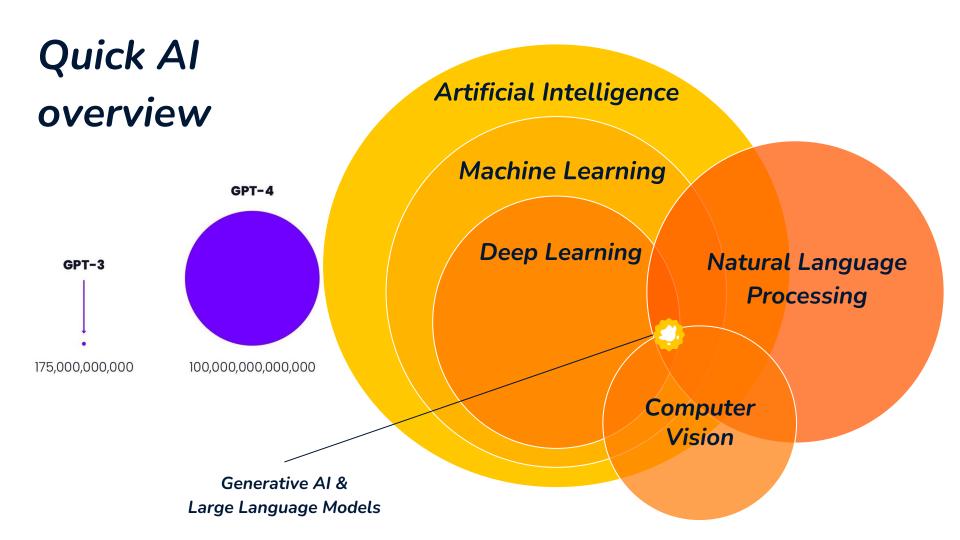
Best of Humans

- Creativity and Innovation
- Emotional Intelligence
- Adaptability and Intuition

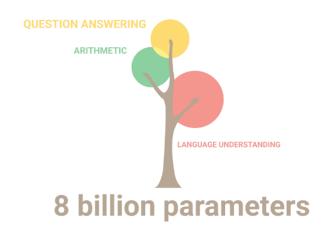
Humans program the AI - AI crunches the data - Humans validate and confirm

Human-in-the-loop Al Duolingo's approach





More data = more capabilities





Med-PaLM (Google) was the first LLM to obtain a passing score on U.S. medical licensing questions, and in addition to answering both the multiple choice and open-ended questions accurately, it also asks questions, provides reasoning and is able to evaluate its own responses

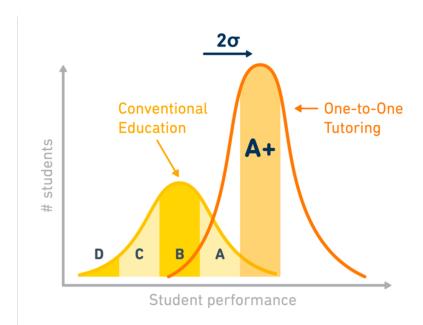
Why is Duolingo excited about AI?

Duolingo's mission is to develop the best education in the world and make it universally available.

- Al offers the best opportunity to achieve this mission and meet students 'where they are'
- Humans must be in the loop at all times to maximise the strengths of both humans and machines



Blooms 2 Sigma Problem (1984)

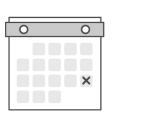


Bloom's 2-sigma problem

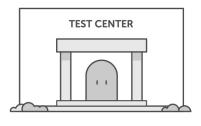
- The average student achievement with a 1-1 tutor is better than 98% of students from a traditional class
- How can we deliver 1-1 tutoring against the limitations of time, resources, and the varying needs of students?

AI = More inclusive, personalised learning which is no longer constrained by a learners resources

Overcoming traditional testing







Book a date Pay >\$400 Go to test-center or even travel to a different city

a test

+3 hours to take

1

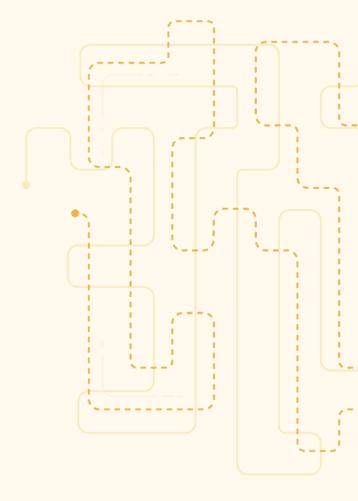
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Generative AI item creation

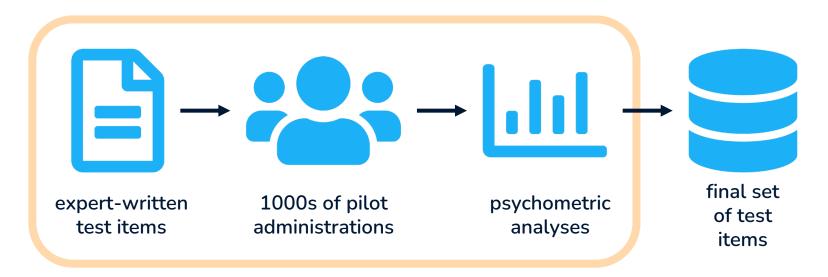
Online on-demand test Asynchronous AI assisted security 1

Computer Adaptive Testing

Building assessment with AI



Conventional test development



Time-consuming, vulnerable & expensive

The Promise of Large Language Models

- Large language models (LLMs) are trained to generate text from billions or trillions of words.
- LLM's excel at few-shot learning can mirror style, format, and
 content given extremely few
 examples
- Allows rapid prototyping of new content and item types



Meta Al

ANTHROP\C

GPT-4 + DET

Item Generation

Goal

Create texts and associated materials, such as:

- Reading passages
- Conversations
- Comprehension tasks, correct answers and distractors
- Other information necessary for automated scoring

Method

Generate passages and titles conditioned by other academic content and a specified topic using prototypical examples



Topic: Sociology

Title: The process of socialization

Passage: Sociology is the study of society and social behavior. One of the main areas of study in sociology is socialization, the study of how people become social beings. Sociologists are interested in...

EXAMPLES

Topic: Business

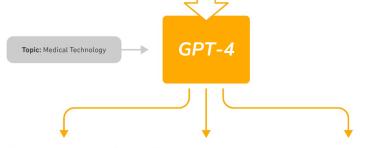
Title: Business ethics

Passage: Business ethics is a term used to describe the standards of conduct used by businesses, corporations, and individuals in the business world. It refers to the behavior and practices of individuals....

Topic: Biology

Title: The history of evolution

Passage: More than 4 billion years ago, life began on Earth. According to evolutionary theory, living organisms have changed over time. Evolution occurs over millions and tens of millions of years. The process of evolution can be summed...



Title: The History of X-rays

Passage: In 1895, German physicist Wilhelm Röntgen produced the first photographs that showed the skeletal structure of living things. These pictures were made when x-rays (electromagnetic radiation) passed through the air...

Title: The Evolution of Medical Technology

Passage: The medical profession can be traced back about 5,000 years. Primitive medical care in the form of herbal remedies was common and early civilizations tended to look after the sick and injured. Although medical knowledge and technology have advanced over time...

Title: The Use of Computers in Medical Research

Passage: Science and technology have improved health care greatly over the past few decades. Computer technology allows researchers to store, process, and analyze massive amounts of data much more efficiently. This has resulted in many lifesaving discoveries, such as...

Example: Interactive Listening

Goal

Generate short conversations oriented around academic scenarios.

Challenges

- 1. Scenario selection what types of situations to cover?
 - → Human expert
- Scenario expansion adding details to create interesting & diverse conversations



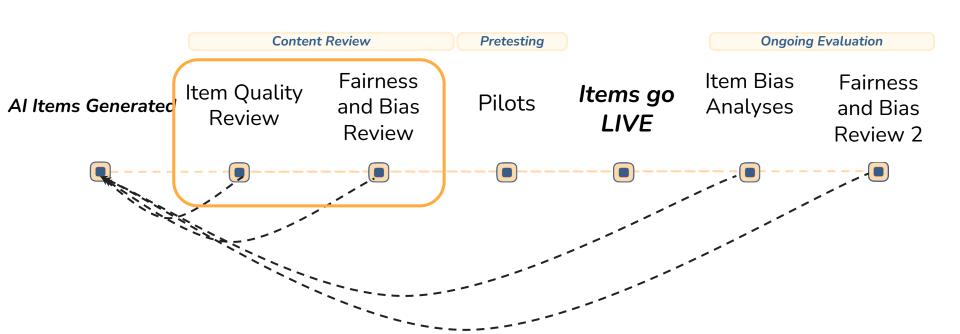


You will participate in a conversation about the scenario below. You are a student in a journalism class. After today's lecture on reporting, you approach your professor to ask them more about what it means to cultivate sources.

Al item banks require extensive human review

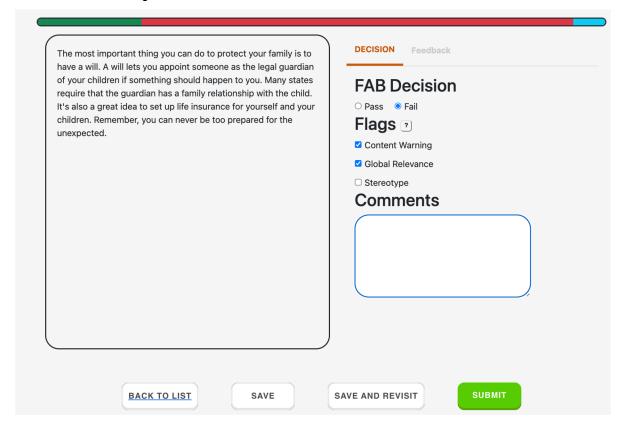
Human-In-The-Loop AI

Goal: Use collaboration of humans and AI to perform a task that is difficult for both





FAB review process

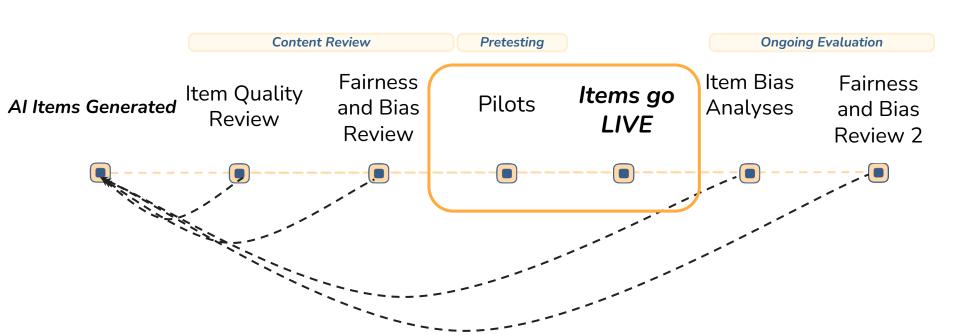


Calibration items

Text	Your Label	Our Label	Your Codes	Our Codes	Your Comment	Explanation
As the general American public becomes informed about the cost of a university education, they are becoming more reluctant to pay for it. The rising costs of health care, rent, food, and commodities overall have made people take a closer look at their finances. Some people can't afford to pay to go to college. The fear of student loan debt has driven young people away from a college education.	Fail	Fail	Content Warning	Content Warning	this topic might be sensitive to some, particularly those struggling with financial challenges related to education, although it is described in a general way without targeting or blaming specific groups. Since many of the TT demographic are planning to go to college it's best to fail this item	The passage focuses on income disparity and poverty.

Human-In-The-Loop Al

Goal: Use collaboration of humans and AI to perform a task that is difficult for both



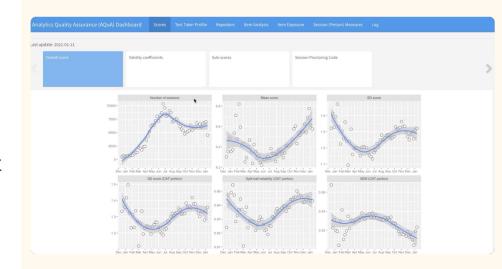
AQuAA

Analytics for Quality Assurance in Assessment

We utilise an internally developed dashboard that tracks and reports on all validity-related metrics of our test daily across the globe

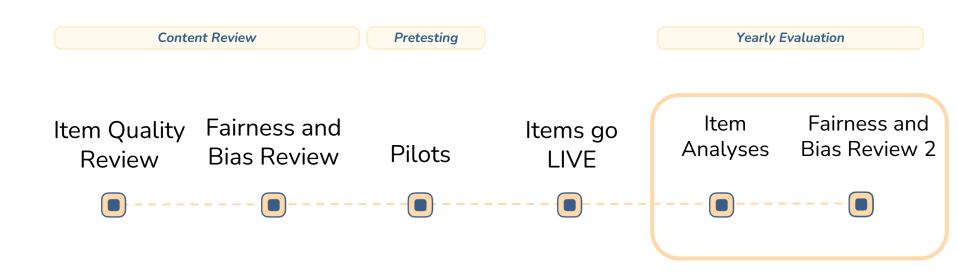


englishtest.duolingo.com/research





Item Development Timeline



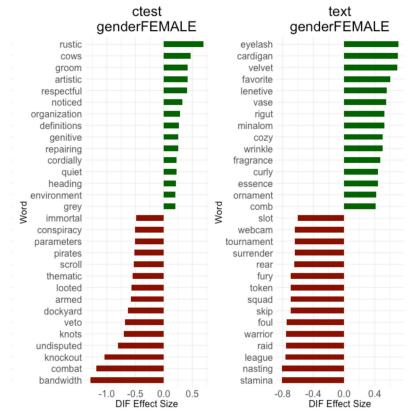


Differential Item Functioning (DIF)

A statistical method for testing whether items are "biased"

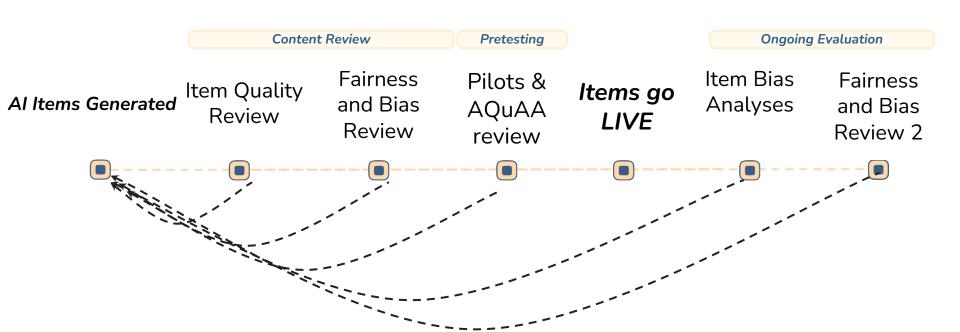
Item "bias":

Individuals with the same level of English proficiency but different backgrounds (e.g., male and female) have different probabilities of answering an item correctly.



Human-In-The-Loop Al

Goal: Use collaboration of humans and AI to perform a task that is difficult for both



Benefits of Al item creation

Item banks which are more:

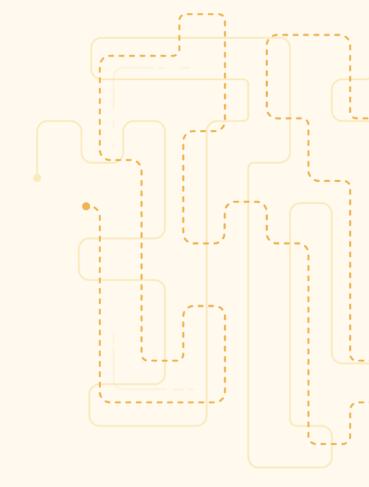
- Secure
- Aware and adaptable to test-taker population trends
- Efficient and affordable to create
- Scalable
- Customised

Our Own Contexts - Assessment Creation

Have you attempted to create your own assessments / item banks using LLMs?

What review process or human involvement do you use in your own assessment development?

Securing assessment with AI



Our Own Contexts - Security

How are digital innovations being used in security (personal, home, finance)?

Is digital security more or less trusted?

The live proctoring disadvantage

Live proctoring relies on a chain of trust consisting of dozens of humans.

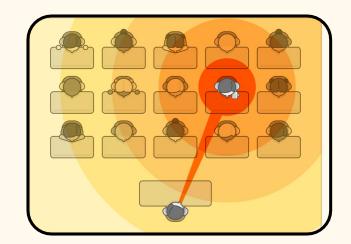
A single point of failure can disrupt the entire chain.

Live proctoring doesn't allow for multiple rounds of review.

 No evidence of test taker behavior other than the proctor's narrative, based on memory.

Since proctors and test takers are in the same room, they cannot be anonymous.

A single instance of cheating compromises the entire testing cohort.





Defining a digital threat model

Digital Threats	Attacker	Mitigations	
Test theft	Scrapers	Large item pool, adaptive engine, Screenshot prevention etc.	
Getting third party aid during test	Cheaters, Cheating rings	Monitoring system softwares, preventing window switching, multi-layered evidence collection, no human<>test taker contact	
Identity and account abuse	Imposters	ID verification, previous session and account matching, ID history, shared video response etc.	

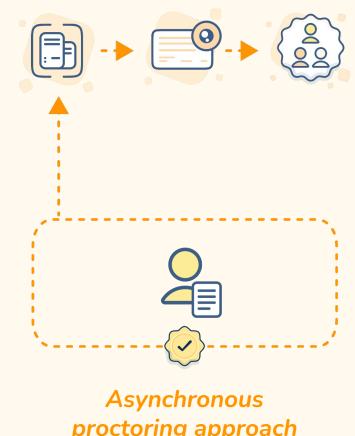
"Human-in-the-loop" AI

Remote

Testers & proctors located all over the world who have no interaction with each other

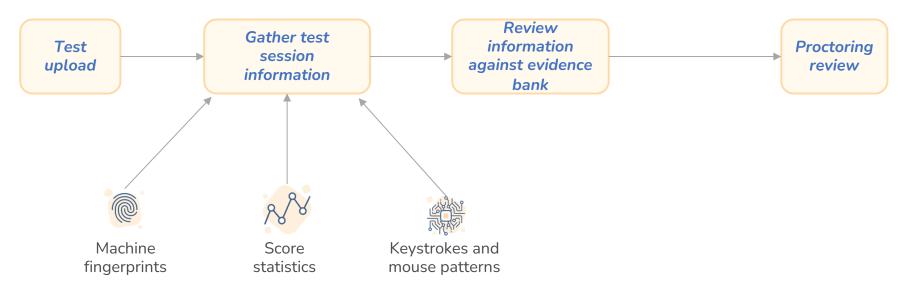
Record-and-review

- Test video is recorded and uploaded
- Al scans 150+ evidence categories
- Al flags and test video is reviewed by human proctors



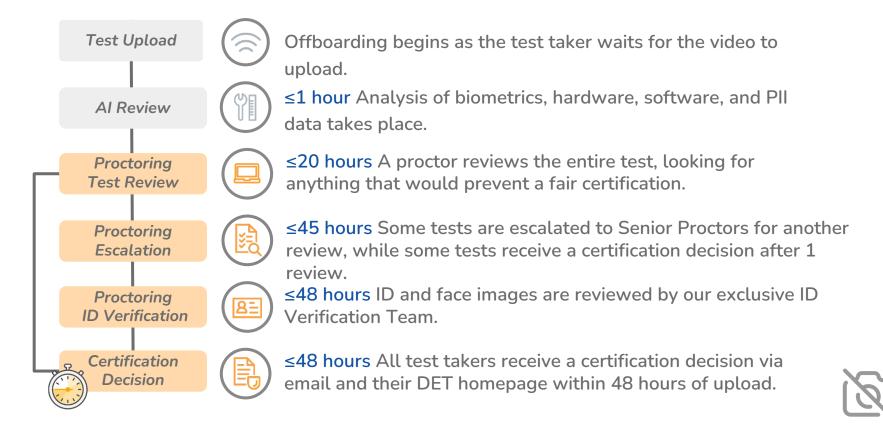
proctoring approach

How Do We Detect Cheating?





The proctoring process



Example - Plagiarism Detection

Why is plagiarism detection necessary?

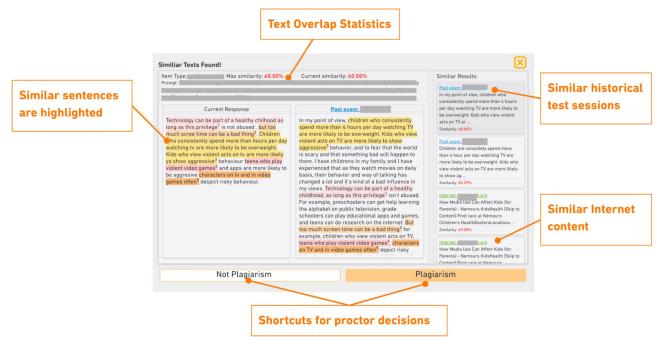
 Some test takers could cheat by searching the Internet for answers or use external resources

 Identifying and preventing such malicious behaviors is necessary to maintain the integrity of the test

- Plagiarism detection can:
 - Catch these malicious behaviors
 - Have a deterrent effect on these malicious behaviors

Plagiarism detection

The similarity of text responses are evaluated against external resources AND historical DET responses.





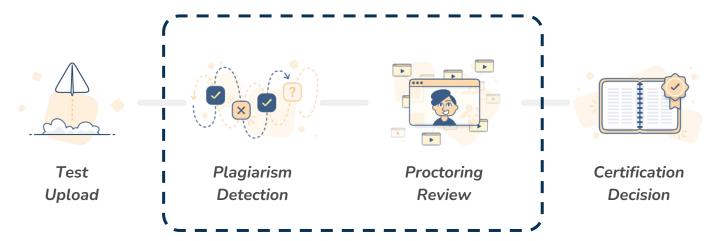
Plagiarism detection

Expanded to spoken responses in 2023

 Allows our human proctors to focus on observing behavior



Plagiarism detection



Among all the sessions that are flagged by the plagiarism detection algorithm, 93.6% are determined as having malicious behaviors by proctors.

Humans always make the final certification decision.

Digital security options for the ELT sector

Safe Exam Browser

- Accessible (free and open source Works on computers & tablets)
- Security Strengths (Website blocking, Virtual Machine Detection, Windows Switching prevention)
- No registration system, ID monitoring, nor comprehensive cheating detection



Exam.net

- Secure browsers and screen lockdown, as well as 'Background cheat detection'
- 3 security modes, tailored to the testing environment
- Comprehensive ability to create and mark assessments, however \$\$\$



Our Own Contexts - Security in ELT

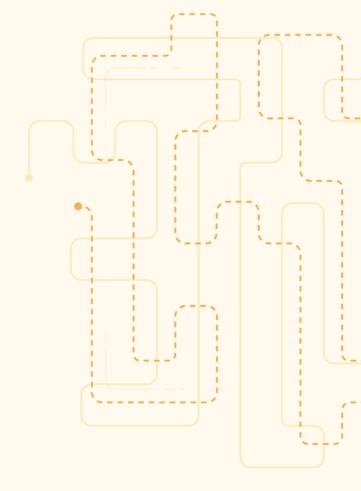
How are you currently managing security and proctoring in your own assessments?

Have you used any digital security tools or software?

Do you plan to / are under pressure to do this?

What are the potential risks?

Research & Development Update

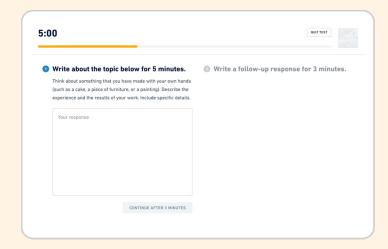


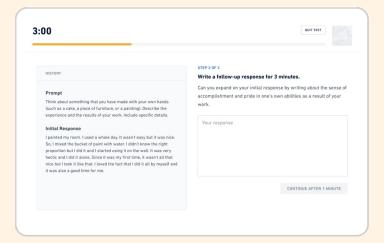


24'V8 new items:

Interactive Writing

 New task taps into higher level writing skills (e.g., elaboration, revision), allowing test takers to demonstrate their academic writing proficiency better.





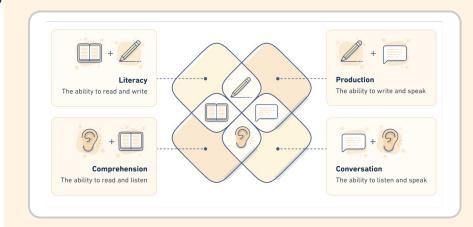


DET 2024

New Scoring Coming in July

 All tests will now include new Speaking, Writing, Reading, and Listening subscores alongside our existing integrated modality subscores.

"DET requires a score of 115, with no subscore below 105" etc.



DET validity & reliability research

2023 - Predictive and Academic Validity: DET scores display a strong correlation with academic evaluations of students' English proficiency and subsequent academic performance (Isbell et al. (2023)

2023 - Concurrent Validity: In a 2023 study of over 5000 students, DET scores display significant, strong correlations with scores from TOEFL and IELTS English language tests taken by the same individuals. <u>Cardwell et al.</u> (2023)

2023 - Test-Retest Reliability: Overall test-retest reliability of **0.93**, along with the reliability of subscores ranging from 0.90 to 0.92, underscores the DET's scoring consistency. In March 24 test-retest reliability has reached **0.95** (Journal of *applied psychological measurement - Will be published in 2024*)

2024 - Task Duration: The Impact of Task Duration on the Scoring of Independent Writing Responses. Equally high test reliability and criterion validity (writing) was demonstrated by a 5 minute task, compared to a 20 minute task. (Naismith et al. 2023)

Ongoing - External Validity:

Endorsed a high-stakes English test by Australian English Quality Assurance organisation NEAS. Endorsed with full CEFR validity alignment by the UK Chartered Institute of Linguists Successful tracer studies from the world's most elite universities

englishtest.duolingo.com/scores
 englishtest.duolingo.com/research









TEST DESIGN

Technical manual

- Introduction to the test
- Item type & construct coverage
- Test development and scoring
- Test administration & security
- Test taker demographics and performance statistics
- Accessibility, fairness & bias
- Quality assurance

Duolingo English Test: Technical Manual



Ramsey Cardwell*, Geoffrey T. LaFlair*, Ben Naismith*, and Burr Settles*

Abstract

The Duolingo English Test Technical Manual provides an overview of the design, development, administration, and scoring of the Duolingo English Test. Furthermore, the Technical Manual reports validity, reliability, and fairness evidence, as well as test-taker demographics and the statistical characteristics of the test. This is a living document whose purpose is to provide up-to-date information about the Dutolingo English Test, and it is updated on a regular basis (last update: August 8, 2022).

Contents

2	Pur	pose		
3	7,			
	3.1	C-test		
	3.2	Yes/No Vocabulary (Text)		
	3.3	Yes/No Vocabulary (Audio)		
	3.4	Dictation		
	3.5	Elicited Imitation (Read-aloud)		
	3.6	Interactive Reading		
	3.7	Extended Writing & Writing Sample		

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Email: englishtest-research@duolingo.com

1

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Best of Machines

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