

Investigación sobre el desarrollo del pensamiento computacional en la educación

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Conferencias de investigación para posgrado
Programa de doctorado en ingeniería informática

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Motivation

Coding in schools

- One of the main trends in the educational landscape worldwide
- Code to learn vs learn to code
- Huge disparity of criteria in terms of target ages, approaches, methodologies...
- Lack of standarization due to the lack of research in this field
- **Urgent attention from academia is required: assessment, transference and affecting factors**

Five broad categories of technologies

- Unplugged
- Arrow-based visual environments
- Block-based visual environments
- Textual programming languages
- Connected with the physical world

Which technologies are using educators at schools?

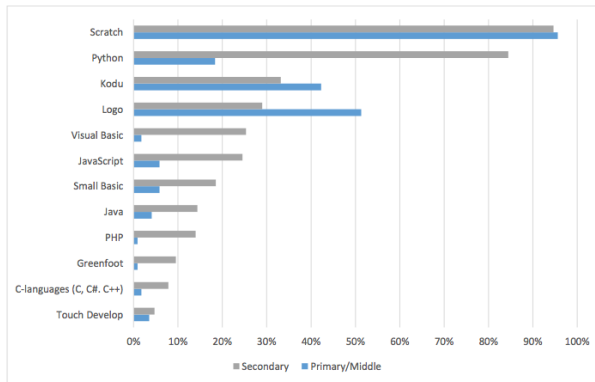






Figure: Programming languages taught at primary and middle schools (blue) and secondary/high schools (gray) [Sentance, 2015].

Scratch statistics

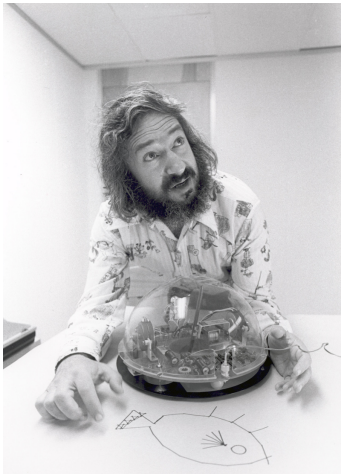
Community statistics at a glance

 79.992.196 projects shared,
 73.423.777 users registered,
 485.431.586 comments posted,
 29.357.862 studios created
...and growing!

Website traffic last month

 617.234.430 pageviews
 94.915.820 visits
 29.986.750 unique visitors

The pioneers



Logo programming language

- Developed in the 1960s
- Millions of students learnt to program at school during the 1970s and 80s
- “Disappeared” from the educational landscape since mid-90s

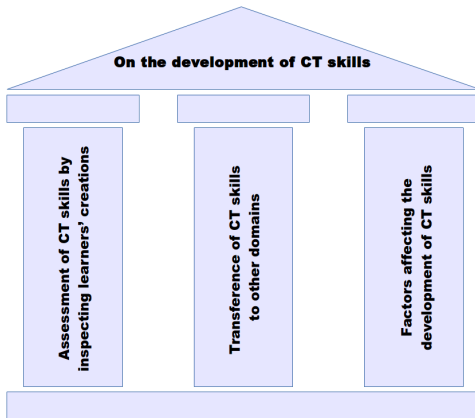
Seymour Papert's picture: jgora.net

Worrying signs from England

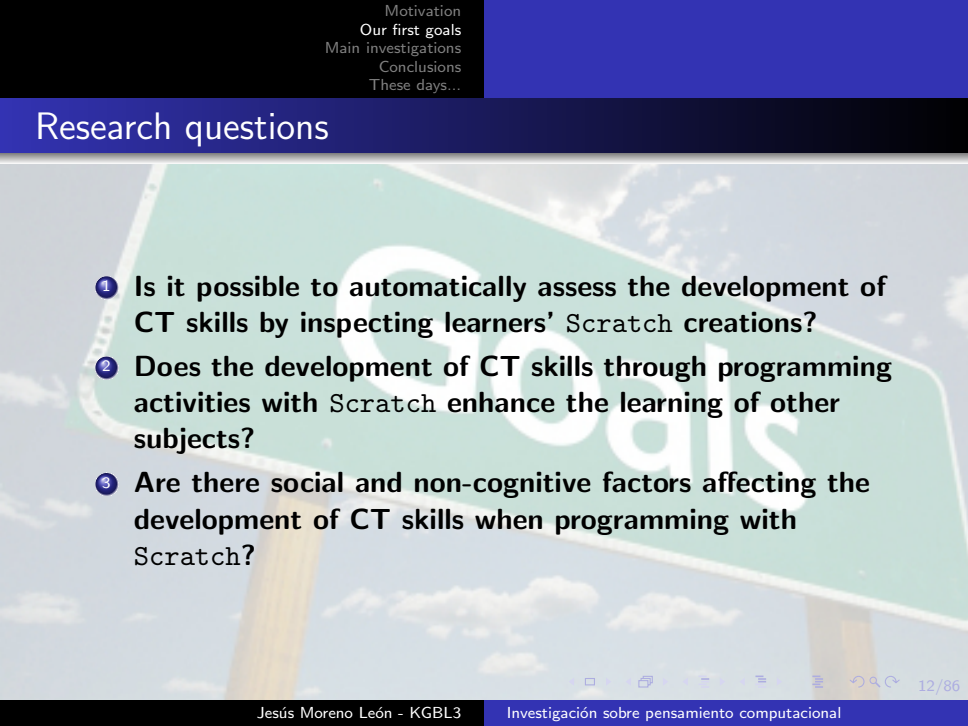
- “Only a small fraction of pupils choose, or have the option to choose, to take qualifications at GCSE (5.5%) or A level (1.7%)”
- “teachers just do not have the knowledge to teach this subject”
- “computer science could become a niche subject, taught in only a few schools”

Our first goals

The three pillars of our research

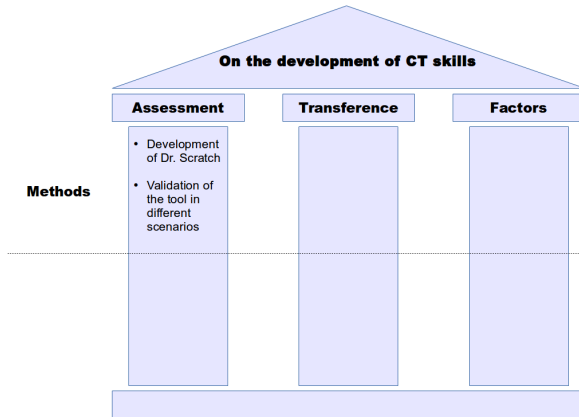


Research questions

- 
- 1 Is it possible to automatically assess the development of CT skills by inspecting learners' Scratch creations?
 - 2 Does the development of CT skills through programming activities with Scratch enhance the learning of other subjects?
 - 3 Are there social and non-cognitive factors affecting the development of CT skills when programming with Scratch?

Main investigations

Methodology



A formative assessment tool for Scratch projects

- Could we create a lint-like tool to support learners and educators?
- Dr. Scratch, inspired by Scrape and is based on Hairball

First step: extending the features of Hairball

branch: master | hairball / hairball / plugins / duplicate.py

bboe on Apr 15 Merge caching support.

2 contributors

44 lines (34 sloc) | 1.56 kb

Raw Blame History

Plug-ins to detect bad programming habits

- 1 Characters that use the default, non-meaningful name that Scratch assigns to new objects
- 2 Repetition of code

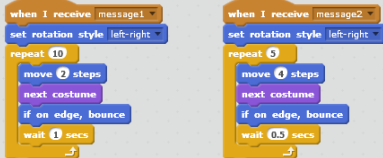
```
1 """This module contains the DuplicateScripts plugin.
2
3 from __future__ import annotations
4 from hairball.plugins import Plugin
5
6
7 class DuplicateScripts(Plugin):
8
9     """Plugin to detect bad programming habits.
10
11     def __init__(self):
12         """Initialize an instance of the DuplicateScripts plugin."""
13         super(DuplicateScripts, self).__init__()
14         self.total_duplicate = 0
15         self.list_duplicate = []
16
17     def finalize(self):
18         """Output the duplicate scripts detected."""
19         if self.total_duplicate > 0:
```

Bad/default naming of sprites



Repetition of code

Example of repeated code



Solution to avoid repeated code



Blocks should be created to avoid repetition of code

Scratch projects repository analysis

	Default names	Duplicated scripts	Defined blocks
Projects	79	62	17
Mean	5.94	7.23	1.11
Median	3	2	0
Maximum	67	71	25

Table: Analysis of 100 ramdonly downloaded Scratch projects

Second step: development of the CT assessment feature

Remixing other researchers' ideas

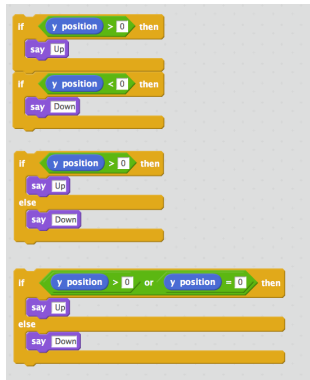
- New frameworks for studying and assessing the development of CT [Brennan and Resnick, 2012].
- Progression of Early CT Model [Seiter and Foreman, 2013].
- Evaluation of games to gauge understanding of programming concepts [Wilson et al., 2012].
- Towards the Automatic Recognition of CT for Adaptive Visual Language Learning [Koh et al., 2010].

Assessment of CT

CT dimension	Basic	Developing	Proficient
Data representation	modifiers of sprites properties	operations on vars	operations on lists
Logical Thinking	if	if else	logic operations
User interactivity	green flag	key pressed, sprite clicked, ask and wait, mouse blocks	when %s is >%s, video, audio
Algorithmic notions of flow control	sequence of blocks	repeat, forever	repeat until
Abstraction and problem decomposition	more than one script and more than one sprite	def block	when I start as clone
Parallelism	Two scripts on green flag	Two scripts on key pressed, two scripts on sprite clicked on the same sprite	Two scripts on when I receive message, two scripts when %s is >%s, two scripts on when backdrop change to
Synchronization	wait	Broadcast, when I receive message, stop all, stop program, stop programs sprite	wait until, when backdrop change to, broadcast and wait

Table: Level of development for each CT dimension

Assessment of CT: Logical Thinking



Different levels of development of logical thinking: basic (top), developing (center) and proficient (bottom).

Assessment of CT: an example



CT dimension	Basic	Developing	Proficient
Data representation	modifiers of sprites properties	operations on vars	operations on lists
Logical Thinking	if	if else	logic operations
User interactivity	green flag	key pressed, sprite clicked, ask and wait, mouse blocks	when %s is >%s, video, audio
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Evaluation of *Catch me if you can* (available at <https://scratch.mit.edu/projects/138397021/>)

Assessment of CT: an example

```
chen@th:~$ hairball -p mastery.Mastery Catch\ me\ if\ you\ can.sb2
Catch me if you can.sb2
{'Abstraction': 0, 'Parallelization': 0, 'Logic': 1, 'Synchronization': 0, 'FlowControl': 2, 'UserInteractivity': 2, 'DataRepresentation': 1}
Total mastery points: 6/21
Average mastery points: 0.86/3
Overall programming competence: Basic
```

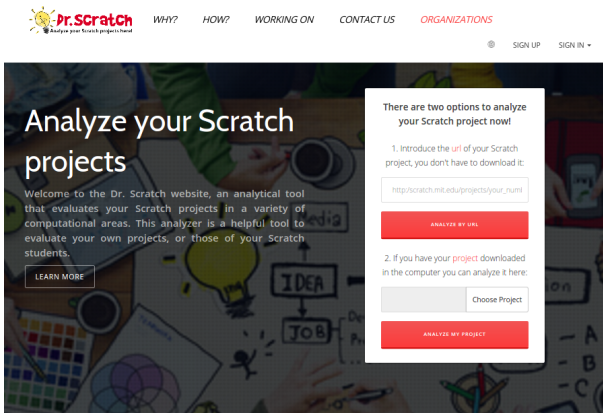
Evaluation of *Catch me if you can* (available at
<https://scratch.mit.edu/projects/138397021/>)

Web-based service: Dr. Scratch

The screenshot shows the Dr. Scratch (alpha version) website. At the top, there is a dark header with the text "Doctor Scratch (alpha version)" on the left and two input fields for "Username" and "Password" on the right, followed by a green "Sign in" button. Below the header, the main content area has a light gray background. It features the title "Dr. Scratch (alpha version)" in a large, bold font, followed by the subtitle "Analyze your Scratch projects here!". A paragraph of text describes the tool: "Welcome to the Dr. Scratch website, an analytical tool that evaluates your Scratch projects in a variety of computational areas. We provide feedback on aspects such as abstraction, logical thinking, synchronization, parallelization, flow control, user interactivity and data representation." Below this, another paragraph states: "This analyzer is a helpful tool to evaluate your own projects, or those of your Scratch students." Underneath, there is a text input field, a blue "Choose file" button with a folder icon, and a blue "Submit" button. At the bottom of the page, there are three columns of links: "Help" (with an information icon) linking to "Slides used in Scratch Conference, MIT 2014"; "Contact" (with a folder icon) linking to "If you have any questions, comments or ideas to improve Dr. Scratch, please feel free to contact us: jesus.moreno (at) programarios.es"; and "Community" (with a person icon) linking to "Join us! Meet other users and share experiences".

Alpha version of the tool, presented during the Scratch Conference 2014 at the MIT (Cambridge, MA, USA)

Web-based service: Dr. Scratch



Present version of the tool, developed after the Google RISE
Award 2015

Web-based service: Dr. Scratch

The screenshot displays the Dr. Scratch web interface. At the top left is the logo with a lightbulb and the text "Dr. Scratch" and "Analyze your Scratch projects here!". To the right are social media icons (Twitter, Email) and a "HELP" button. The main header reads "DR. SCRATCH(BETA VERSION)".

The interface is divided into two main sections. The left section, titled "Score: 6/21" with a "Tweet" button, features a cartoon cat character and the text: "The level of your project is... BASIC! You're at the beginning of a great adventure... Keep it up! Come back to your Scratch project." Below this is a "Project certificate" section with the URL <https://scratch.mit.edu/projects/138391021/> and a "Download" button.

The right section, titled "Level up", contains a table showing progress for various Scratch concepts:

Level up	Level
Flow control	3/3
Data representation	1/3
Abstraction	0/3
User interactivity	2/3
Synchronization	0/3
Parallelism	0/3
Logic	1/3

Feedback report

Web-based service: Dr. Scratch

Dr. Scratch

DR. SCRATCH(BETA VERSION)

Logic

Logic Data representation Parallelism Synchronization User interactivity Flow control Abstraction

Duplicated scripts Incorrect names Dead code Attribute initialization

Instructions related to logical thinking can help your projects are dynamic, **so that they behave differently depending on the situation**. In the stories, for example, these instructions are not as important as they usually have a linear structure we always want to run the same way, but in other projects, such as video games are essential to perform different actions depending on the situation.

If you get 0 points...

The most basic block you can start working logical thinking is this:

How this block works? When execution reaches this point, the condition on the block is evaluated, and if this is true, the set of blocks that are within the if executed. In the example, if the character is touching the blue color, he says I reached the goal!

If you get 1 point...

Ideas to improve the score

Validation Process

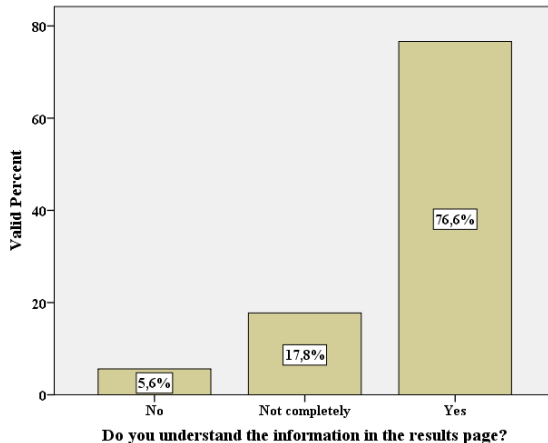
- Ecological validity
- Convergent validity
- Discriminant validity

Validation Process: Ecological Validity (I)

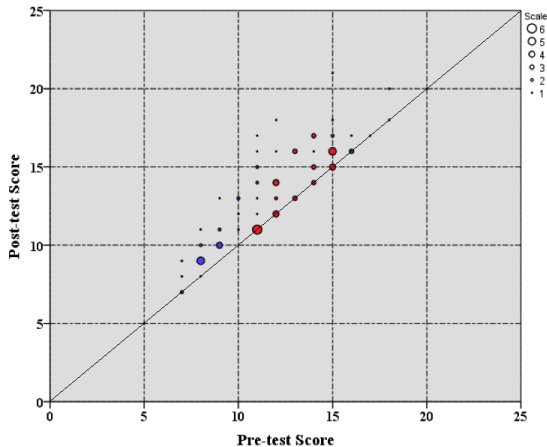
Ecological validity

- Are young learners able to analyze their projects and independently learn from the tips that the tool provides?
- Workshops with over 100 students (10 to 14 years) in 8 schools

Validation Process: Ecological Validity (II)



Validation Process: Ecological Validity (and III)



Validation Process: Convergent Validity (I)

Convergent validity

- Comparison of the evaluations provided by Dr. Scratch with other measurements of similar constructs
 - (Human) expert evaluators
 - Software engineering complexity metrics

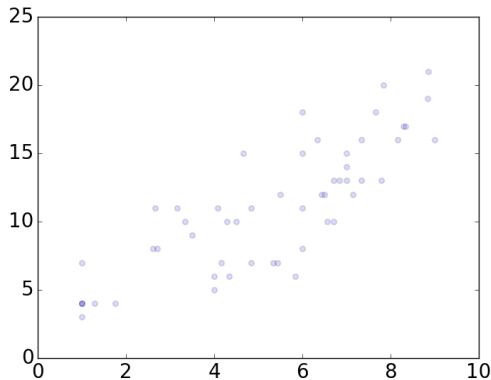
Background picture: Joanna Bourne

Validation Process: Convergent Validity (II)

Comparison with human experts

- Programming contest for students (Google, FECyT)
- Jury: 16 experts in computer science education
- 4 groups of evaluators, average years of experience with Scratch: 3.5 to 4 years
- 53 projects, 450 evaluations

Validation Process: Convergent Validity (III)



Scatter plot for experts evaluation (x-axis) and Dr. Scratch assessment (y-axis).

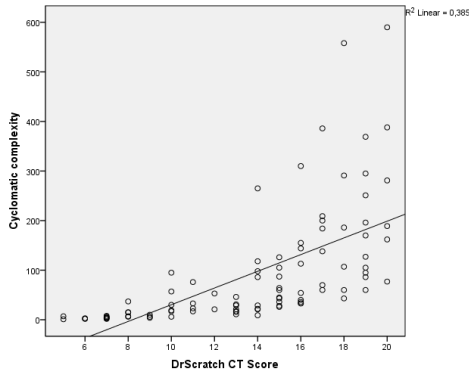
Validation Process: Convergent Validity (IV)



Metric	Value
Cyclomatic complexity	3
Vocabulary	14
Length	14
Volume	66.42
Difficulty	53.30
Effort	293.86

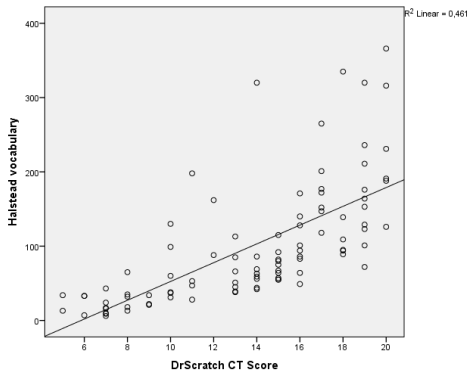
Implementation of CC and Halstead's analyzer for Scratch projects

Validation Process: Convergent Validity (V)



Scatter plot for Dr. Scratch assessment (x-axis) and Cyclomatic Complexity (y-axis).

Validation Process: Convergent Validity (and VI)



Scatter plot for Dr. Scratch assessment (x-axis) and Halstead's vocabulary (y-axis).

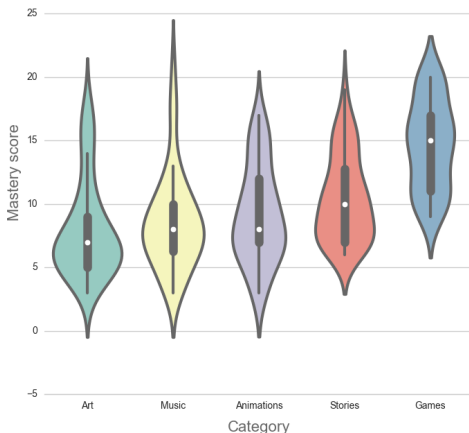
Validation Process: Discriminant Validity (I)

Discriminant validity

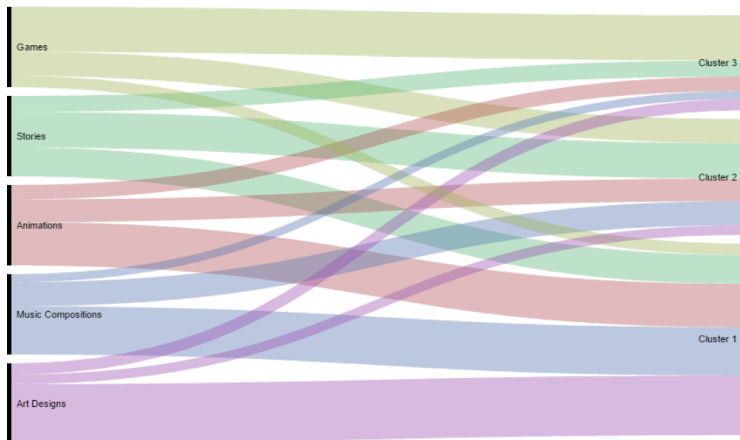
- Projects shared in the Scratch repository are categorized under one or more project types: games, animations, music, art and stories.
- Is Dr. Scratch able to detect differences in the CT dimensions developed when programming different types of projects?

Background picture: Bodie Pyndus

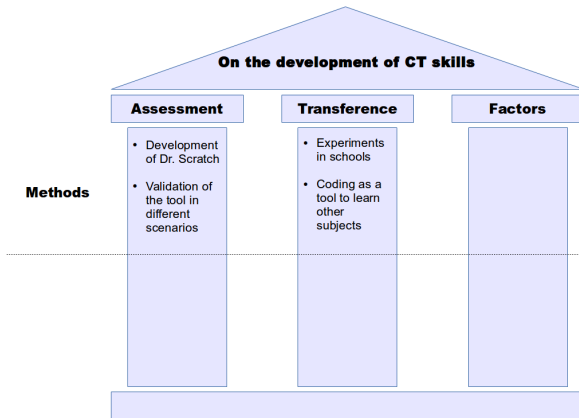
Validation Process: Discriminant Validity (II)



Validation Process: Discriminant Validity (and III)



Methodology

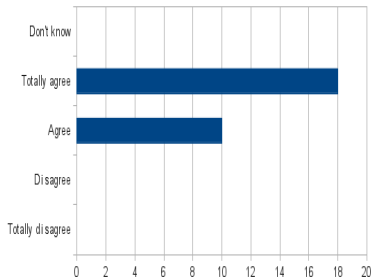


Coding in the English classroom (I)

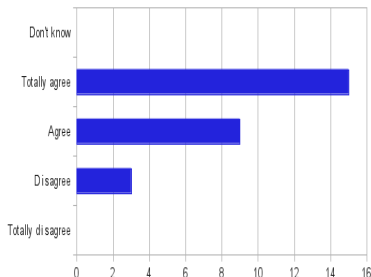
The study

- Quasi-Experimental Design
- 65 students, 4th and 5th graders
- Control groups and experimental groups
- Pre and Post tests
- Surveys

Coding in the English classroom (II)



Scratch helped me to learn English



Scratch made me want to learn more English

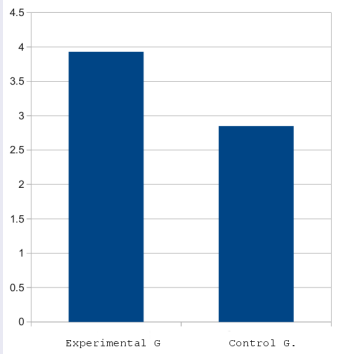
Coding in the English classroom (III)

	Experimental group	Control group
Initial test	5.05	5.13
Final test	7.7	7.55
Improvement	2.65	2.42

Table: Pre-test and Post-test results

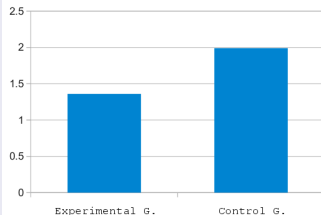
Coding in the English classroom (and IV)

4th grade



Teacher with coding experience

5th grade



First-time programmer teacher

Coding in the Maths classroom (I)

The study

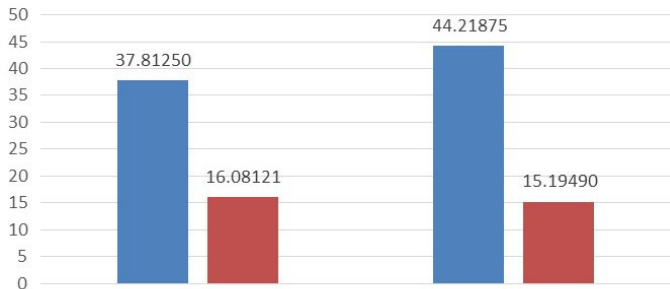
- Quasi-Experimental Design
- 42 students, 6th grade
- Control groups and experimental groups
- Pre and Post tests
- 3 months

Coding in the Maths classroom (II)

Mathematical processes investigated

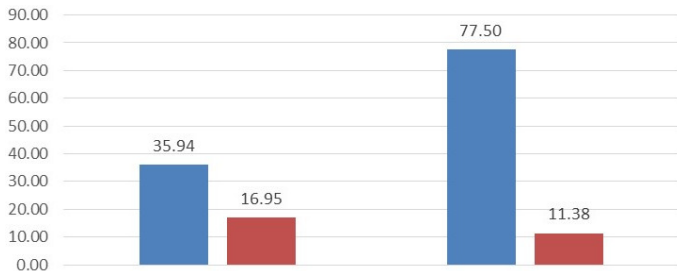
- Modeling of processes and reality phenomena
- Reasoning (making predictions and justifying arguments)
- Problem formulation and problem solving
- Exercising (comparison and execution of procedures and algorithms)
- Following guidelines set by the Ministry of National Education of Colombia

Coding in the Maths classroom (III)



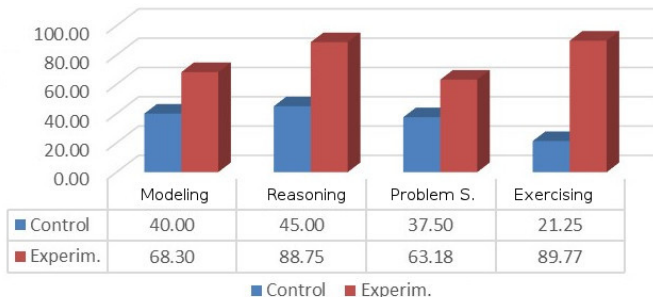
Pre-test. Mean and deviation for control (left) and experimental (right) groups.

Coding in the Maths classroom (IV)



Post-test. Mean and deviation for control (left) and experimental (right) groups.

Coding in the Maths classroom (and V)



Post-test comparison. Means obtained for the control and experimental groups by mathematical process.



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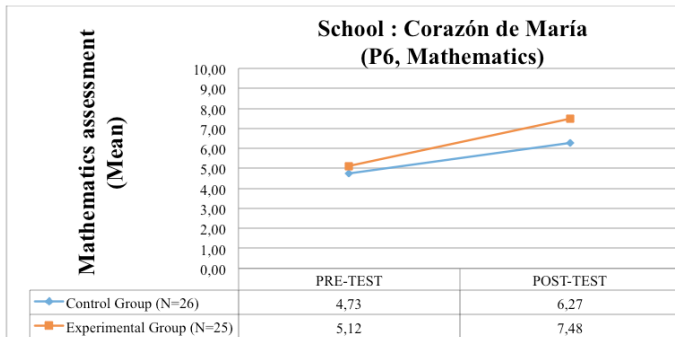
Las nuevas tecnologías como herramienta de expresión



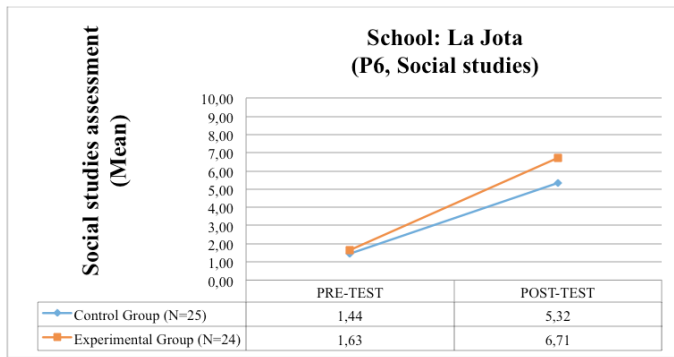
Comparing three quasi-experimental research designs (II)

School	Grade	n (control)	n (exp.)	Subject
Corazón de María	6th	26	25	Math
La Jota	6th	25	24	Social studies
La Inmaculada	2nd	15	14	Language arts

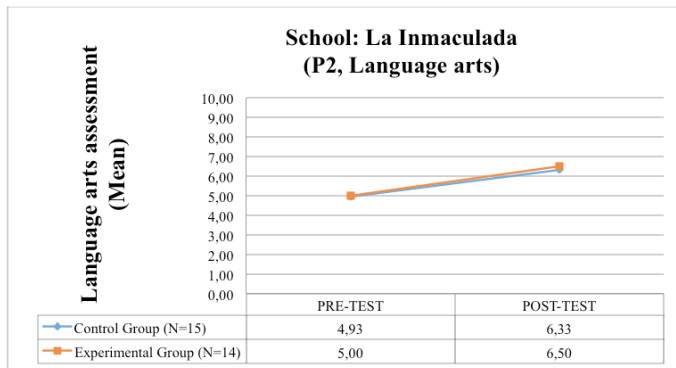
Comparing three quasi-experimental research designs (III)



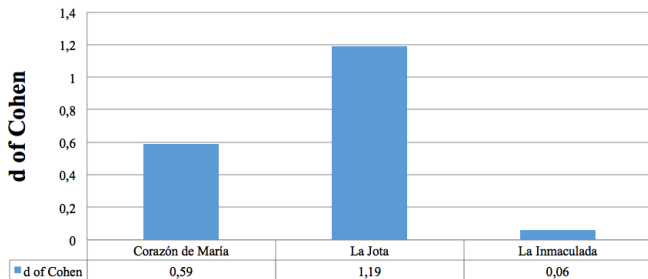
Comparing three quasi-experimental research designs (IV)



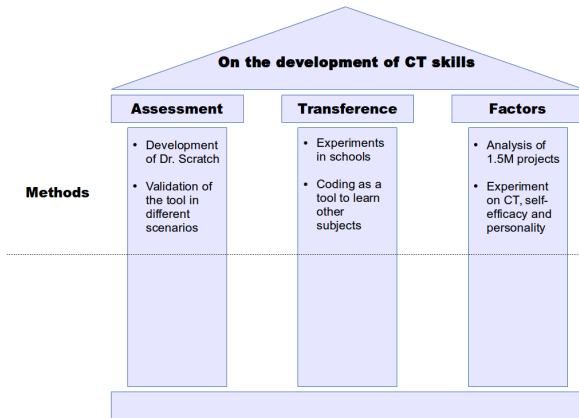
Comparing three quasi-experimental research designs (V)



Comparing three quasi-experimental research designs (and VI)



Methodology



How socialization affects the learning of coding skills (I)

Data set of public activity in the Scratch online community during its first five years of activity (2007–2012)

- **1,056,951 users**
- **1,928,699 projects**
- **120,097 galleries**
- **1,313,200 friends**
- **7,788,414 comments in projects**

Background picture: xkl

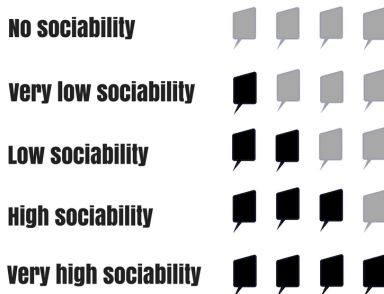
How socialization affects the learning of coding skills (II)

Measuring the sophistication of the projects from three points of view:

- **Breadth:** range of different features that programmers use
- **Depth:** amount with which programmers use those features
- **Finesse:** user's ability to solve programming problems effectively and creatively

How socialization affects the learning of coding skills (III)

Sociability is measured as the sum of the social actions:
number of favorites, galleries, friends and comments



How socialization affects the learning of coding skills (IV)

4 groups of users using the quartiles of the the number of days that they spend in the community

very short time

short time

Long time

Very long time

0-21

22-79

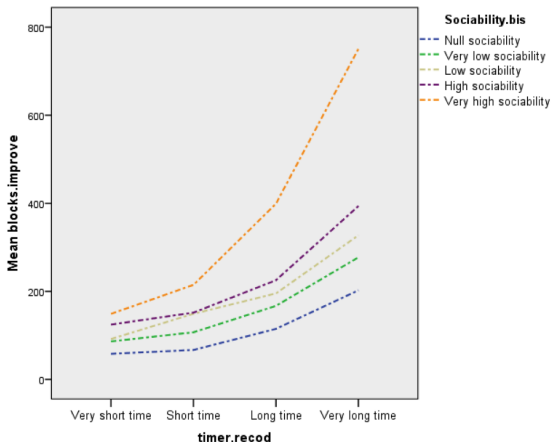
80-264

> 264

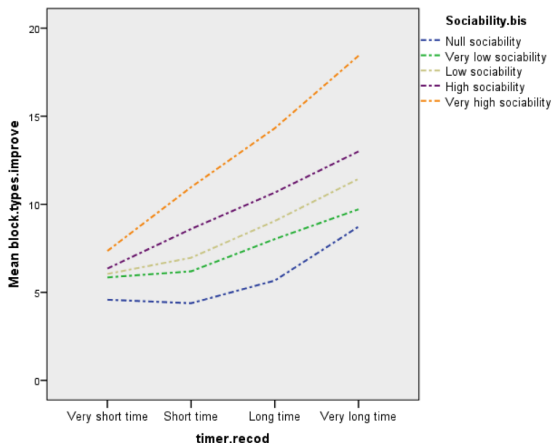
Days in the community



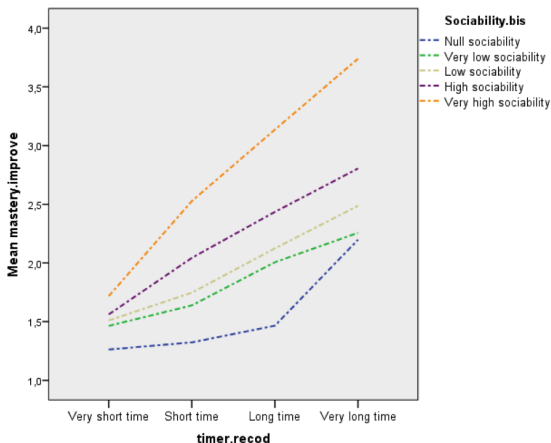
How socialization affects the learning of coding skills (V)



How socialization affects the learning of coding skills (VI)



How socialization affects the learning of coding skills (VII)



Non-cognitive factors of CT (I)

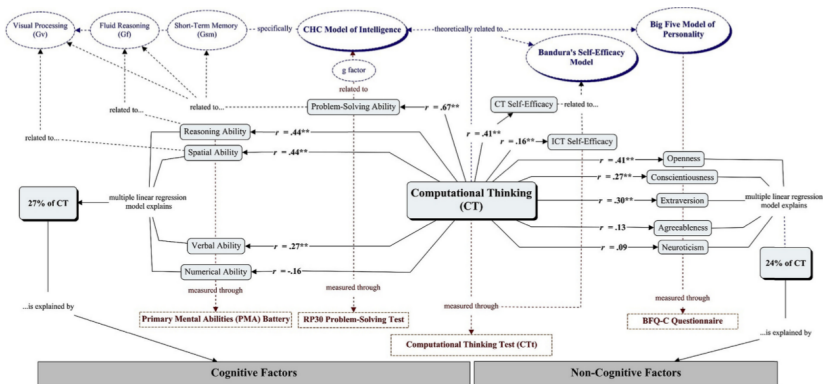
The study

- Correlations between CT, self-efficacy and the dimensions of the Big Five model of personality: Openness to Experience, Conscientiousness, Extroversion, Agreeableness, and Neuroticism.
- 1,251 students from 24 schools, enrolled in CS from 5th to 10th grade
- CTt [Román-González, 2015] and some additional self-efficacy items
- 99 students took the Big Five Questionnaire-Children version [Barbaranelli et al., 2003]

Non-cognitive factors of CT (II)

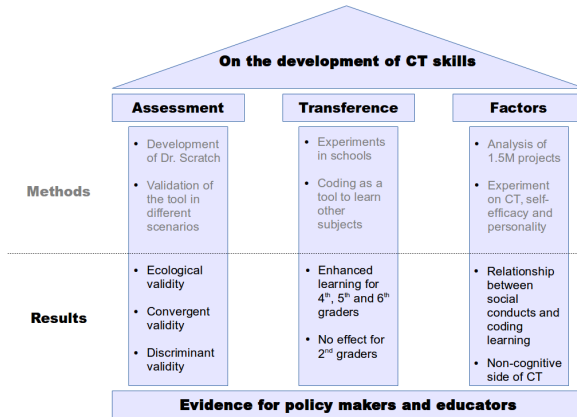
- As expected, positive correlations with Openness and Conscientiousness
- Unexpectedly, positive correlation with Extraversion
- Positive correlation with CT-Self efficacy (medium size difference in favor of males)

Non-cognitive factors of CT (and III)



Nomological network of CT including cognitive and non-cognitive factors

Summary of results



Conclusions

Who is using Dr. Scratch?

- Learners and educators from all over the world: over 500,000 analyzed projects since August 2015
- Scholars:
 - To analyze students' performance
 - To assess teachers' CT and programming skills
 - To find *code smells* and quality issues
 - To validate other tools
 - As part of an evaluation framework

Transference of CT across the K-12 curriculum

- School level: differences based on the age of the students
- School subject: simple vs complex subjects
- Teacher training: great impact

Social and non-cognitive factors affecting CT

- Educators could choose between platforms for learning to program based on their social and software evolution features
- The one-size-fits-all approach is leaving some students, especially adolescent girls, behind
- A diversity of computing contexts must be offered

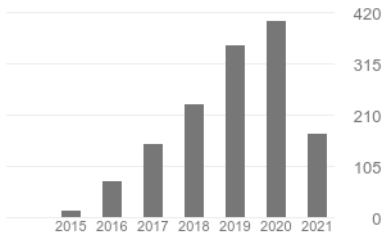
Main publications

- Jesús Moreno-León, Gregorio Robles, and Marcos Román-González. **Towards Data-Driven Learning Paths to Develop Computational Thinking with Scratch**. IEEE Transactions on Emerging Topics in Computing, 2020.
DOI: 10.1109/TETC.2017.2734818. JCR Q1
- Marcos Román-González, Juan-Carlos Pérez-González, Jesús Moreno-León and Gregorio Robles. **Extending the nomological network of computational thinking with non-cognitive factors**. Computers in Human Behavior, 2018.
DOI:10.1016/j.chb.2017.09.030. JCR Q1
- Jesús Moreno-León, Marcos Román-González, Casper Hartevelt, and Gregorio Robles. **On the automatic assessment of computational thinking skills: A comparison with human experts**. In Proceedings of the 2017 CHI Conference Extended Abstracts on Human Factors in Computing Systems, CHI EA '17, pages 2788–2795, New York, NY, USA, 2017. ACM.
DOI: 10.1145/3027063.3053216. GGS Conference Rating: CORE A++
- Jesús Moreno-León, Gregorio Robles, and Marcos Román-González. **Examining the relationship between socialization and improved software development skills in the Scratch code learning environment**. Journal of Universal Computer Science, 22(12):1533–1557, 2016.
DOI: 10.3217/jucs-022-12-1533. JCR Q4

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These days...

An assessment tool for the community
Evidence for educators and policy makers
Impact
Future research

Lots of things to be done...



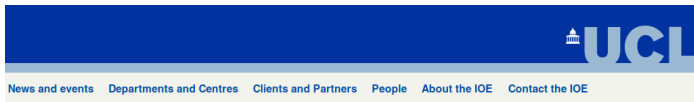
Background picture: mountainmadness.com

These days...

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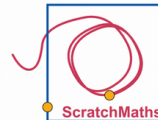
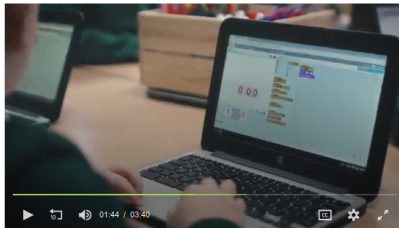
(Really) big samples
Artificial Intelligence

Replication of the Scratch Maths project



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ScratchMaths



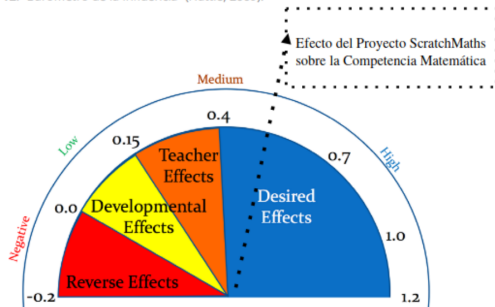
Contact us

UCL Knowledge Lab
Department of Culture, Communication and

Replication of the Scratch Maths project



Gráfico 12. "Barómetro de la influencia" (Hattie, 2009).



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Learning Machine Learning



The screenshot shows the homepage of the LearningML website. At the top left is a small cartoon green alien logo. The header text reads "LearningML - AI made easy". To the right of the header is a navigation menu with links: "QUÉ ES", "POR QUÉ", "APRENDER", "BLOG", "ÚNETE", "ACERCA DE", and "CONTACTO", followed by a Spanish flag icon. Below the header is a large illustration of the same green alien character interacting with a control panel and a device. A green button labeled "Comenzar" (Start) is overlaid on the illustration. Below the illustration are three main sections, each with an icon and a title:

- Recopila datos** (Icon: image gallery): Recopila textos o imágenes sobre algo que quieras clasificar de forma automática y añádelos a LearningML indicando a qué clase pertenece cada uno de ellos. Estos datos constituyen el conjunto de entrenamiento.
- Crea un modelo** (Icon: gear): Construye con LearningML un modelo capaz de clasificar correctamente otros datos distintos, aunque similares, a los del conjunto de entrenamiento.
- Construye una aplicación** (Icon: smartphone): Exporta tu modelo de Machine Learning a Scratch y programa una aplicación con capacidad para clasificar datos sobre el tema que hayas elegido. ¡Enhorabuena! ¡has incorporado Inteligencia Artificial a tu programa Scratch!.

At SIGCSE 2021

RESEARCH-ARTICLE

Evaluation of an Online Intervention to Teach Artificial Intelligence with LearningML to 10-16-Year-Old Students



Authors: Juan David Rodríguez-García, Jesús Moreno-León, Marcos Román-González, Gregorio Robles

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Published: 03 March 2021

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AI investigation with over 6K students



Investigación sobre el desarrollo del pensamiento computacional en la educación

Jesús Moreno León - KGBL3

Conferencias de investigación para posgrado
Programa de doctorado en ingeniería informática

17/06/2021



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