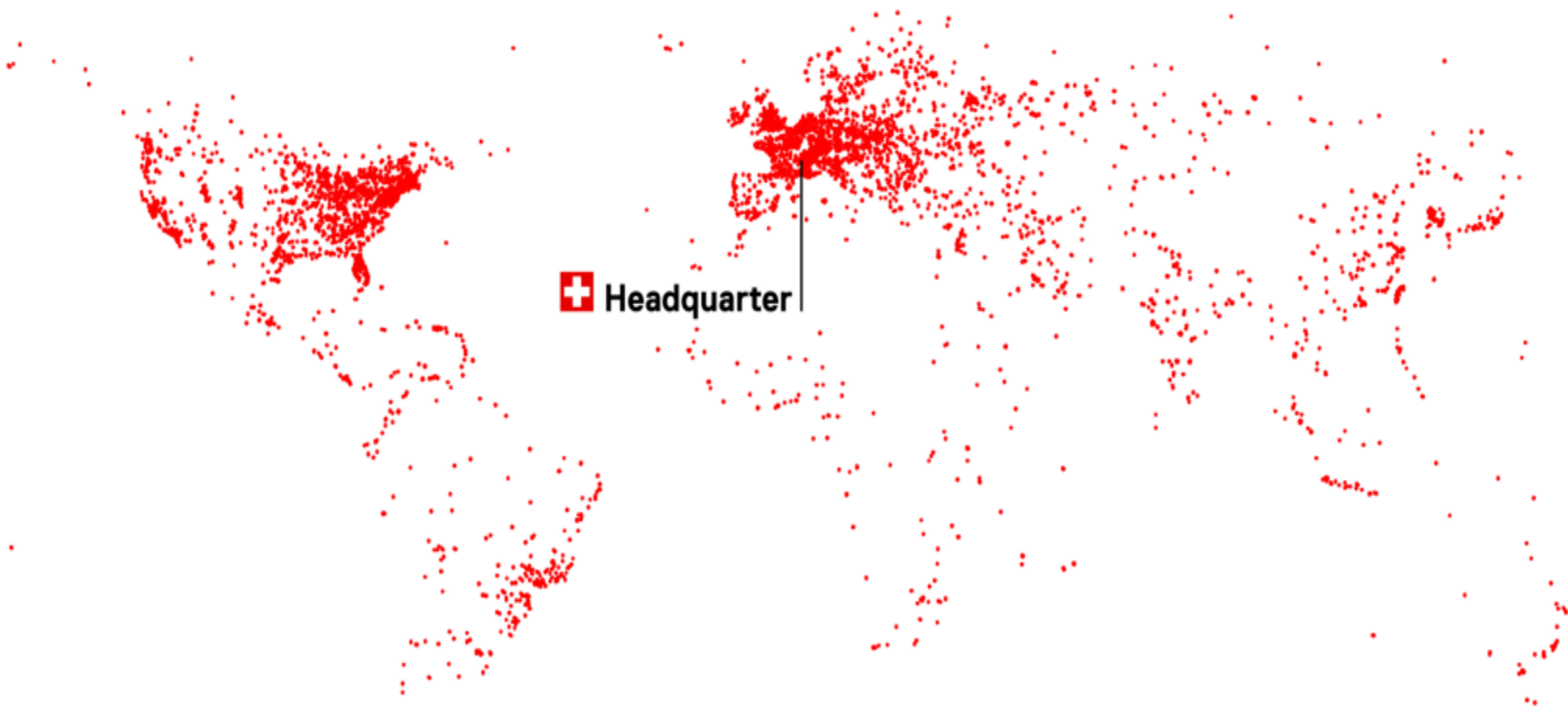


Education as a computational science

Pierre Dillenbourg, EPFL

EPFL CAMPUS

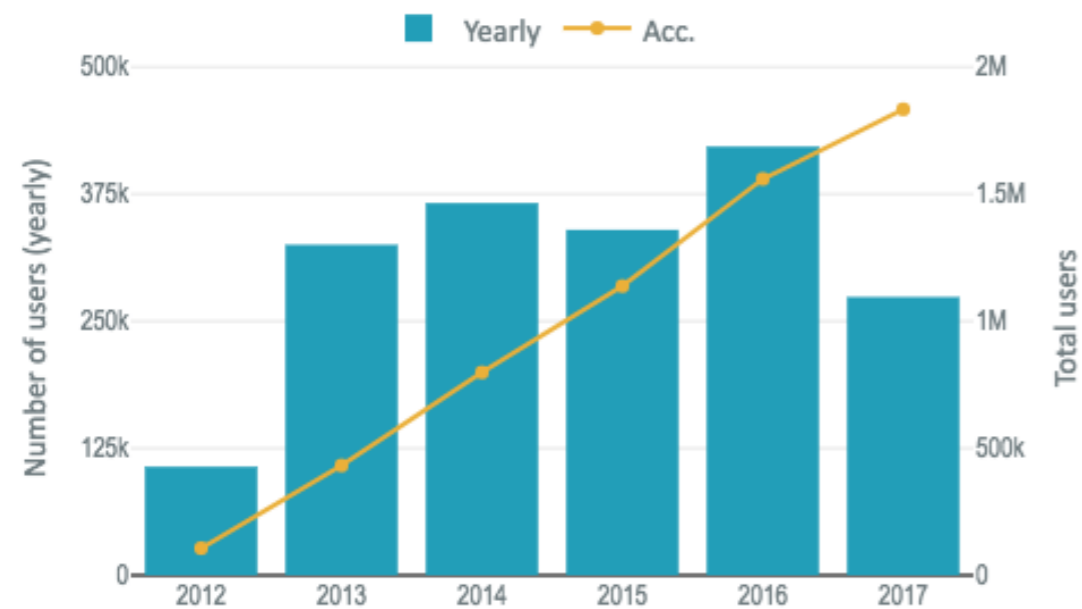


© EPFL CEAT/CEDE, 2014, J. Chenal, M. Bonriposi, P. Jermann

EPFL MOOCS: 1'908'876

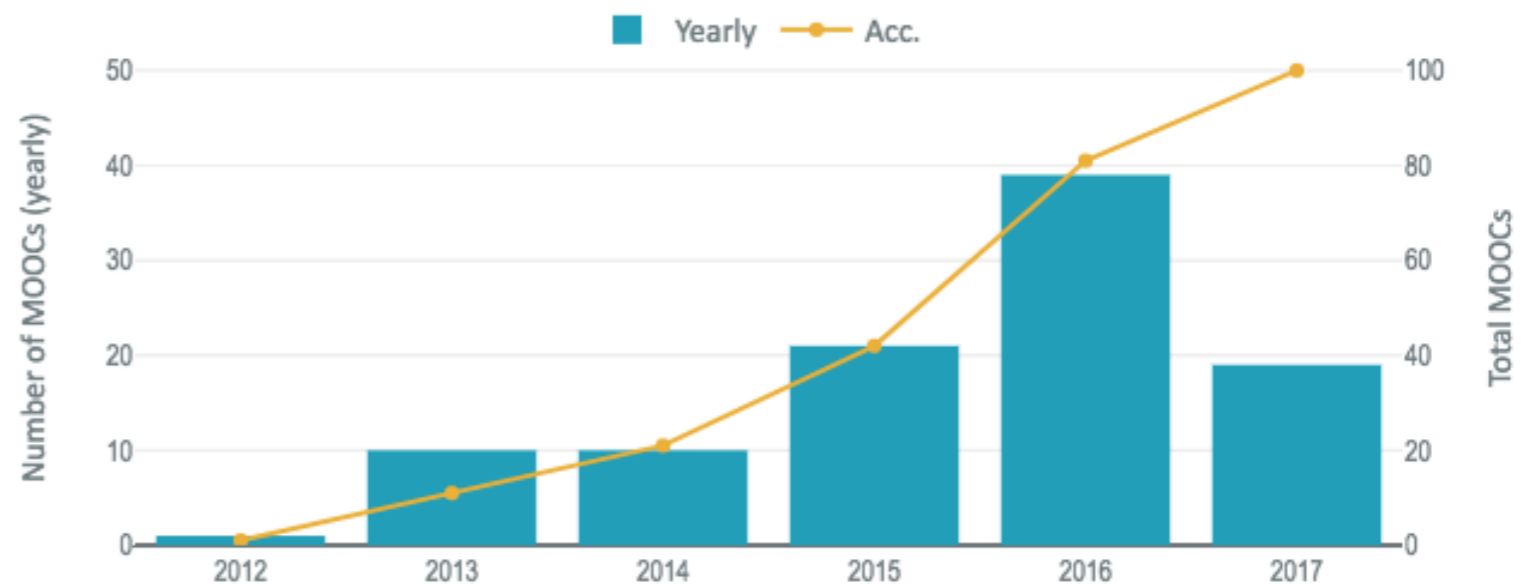
Hype is over but MOOCs continue to grow

Number of registrations per year

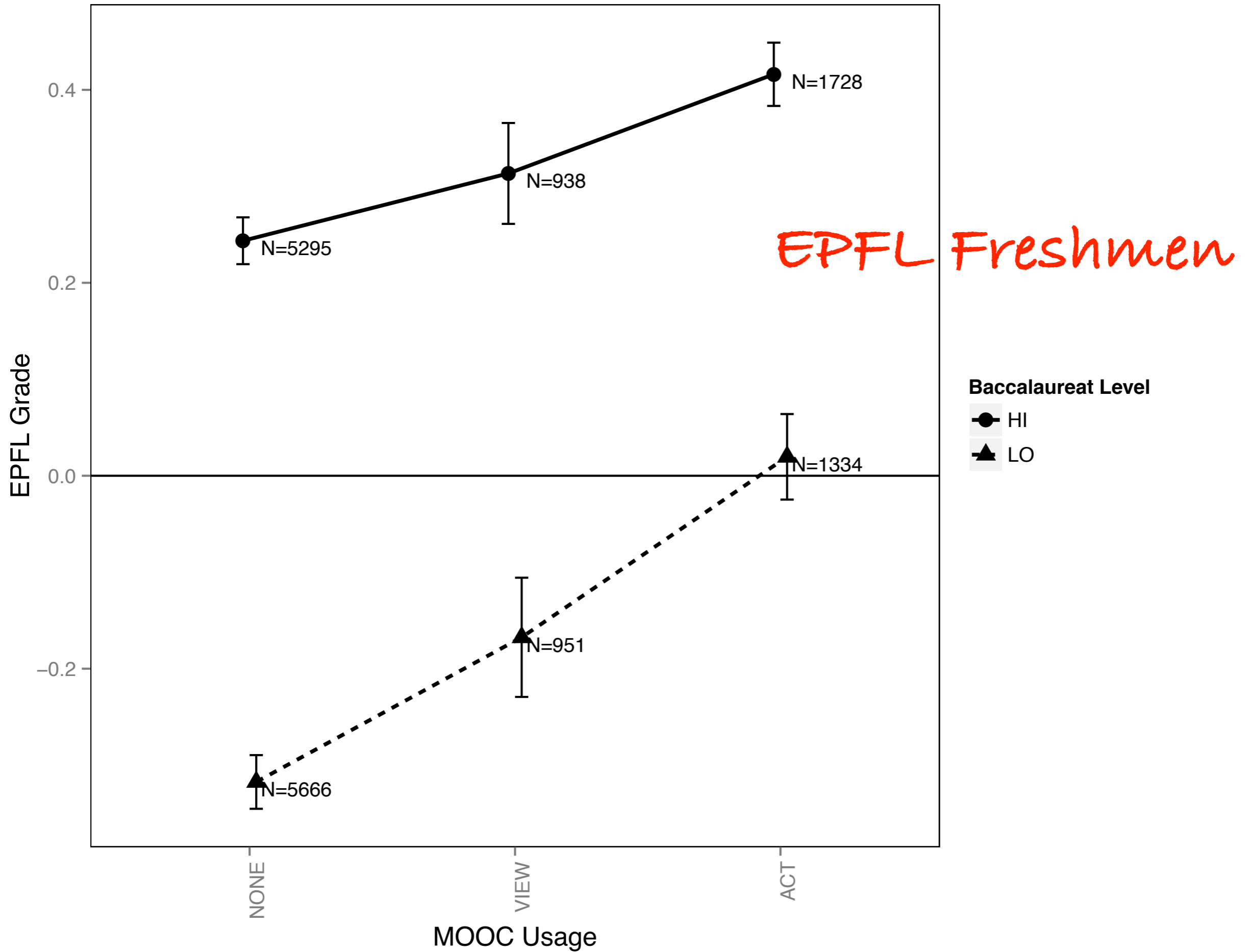


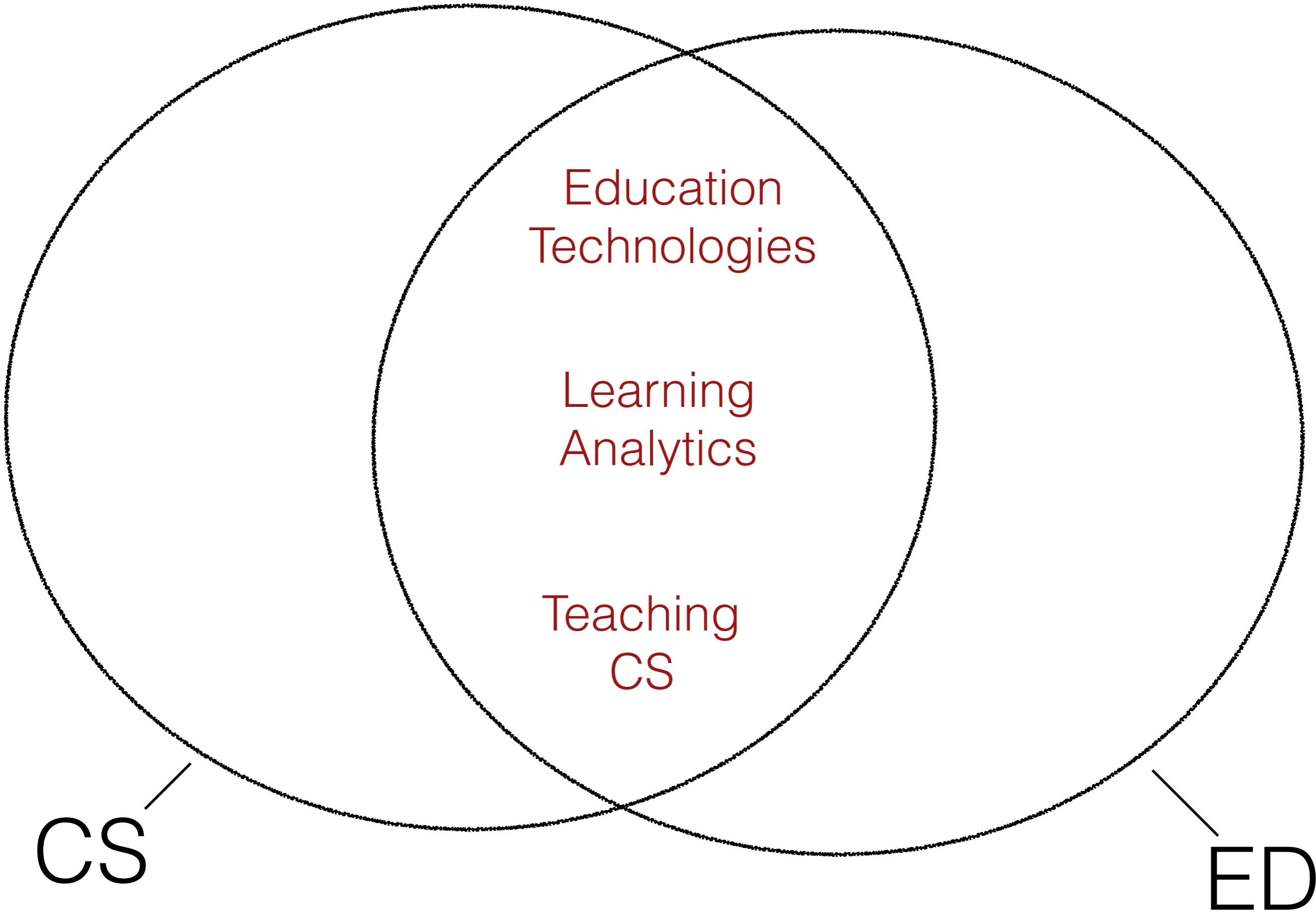
1'815'471 Registrations
97'510 Passed

MOOCs launched each year



77 Courses Online
35 Courses In Preparation





CS

ED

Education
Technologies

Learning
Analytics

Teaching
CS

e-learning ??????????

Pierre Dillenbourg, EPFL



Swarm Cellulo (Ayberk Ozgur, Wafa Johal, P. Dillenbourg)

Swarm Interactions



CS

ED

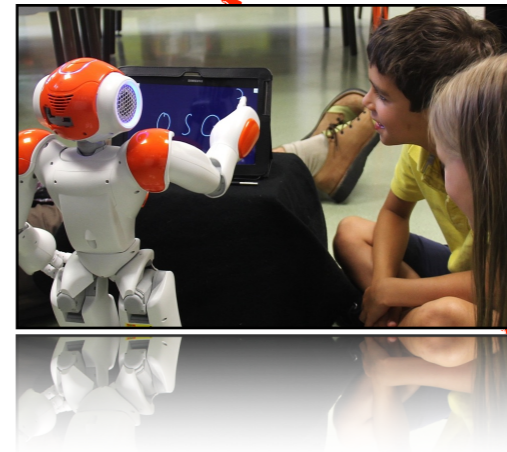
Education Technologies



**Swarm
Interactions**



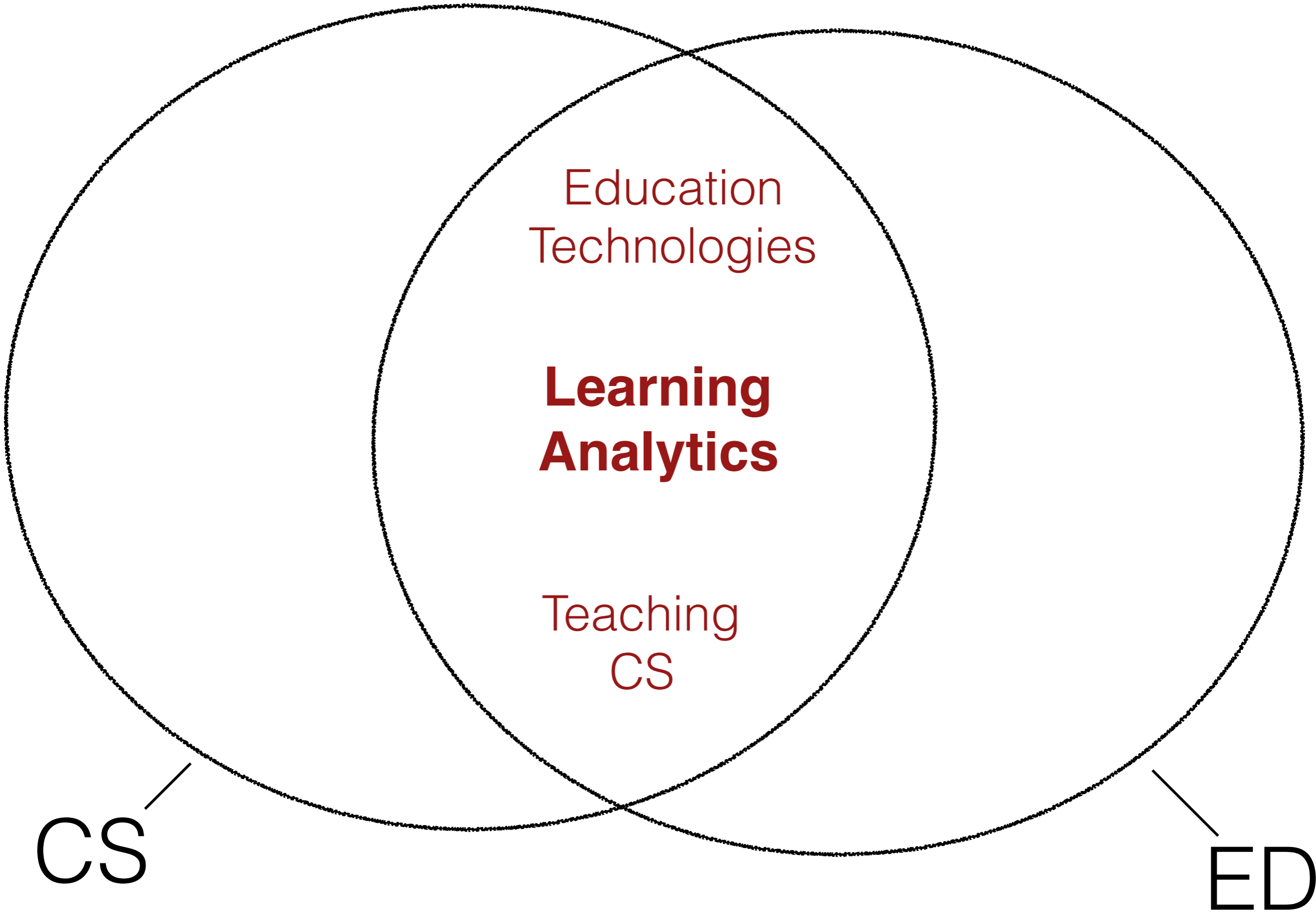
**Teachable
Agents**



CS

ED

Education Technologies



CS

ED

Education
Technologies

**Learning
Analytics**

Teaching
CS

learning Analytics

predict, classify, decide, 'explain'

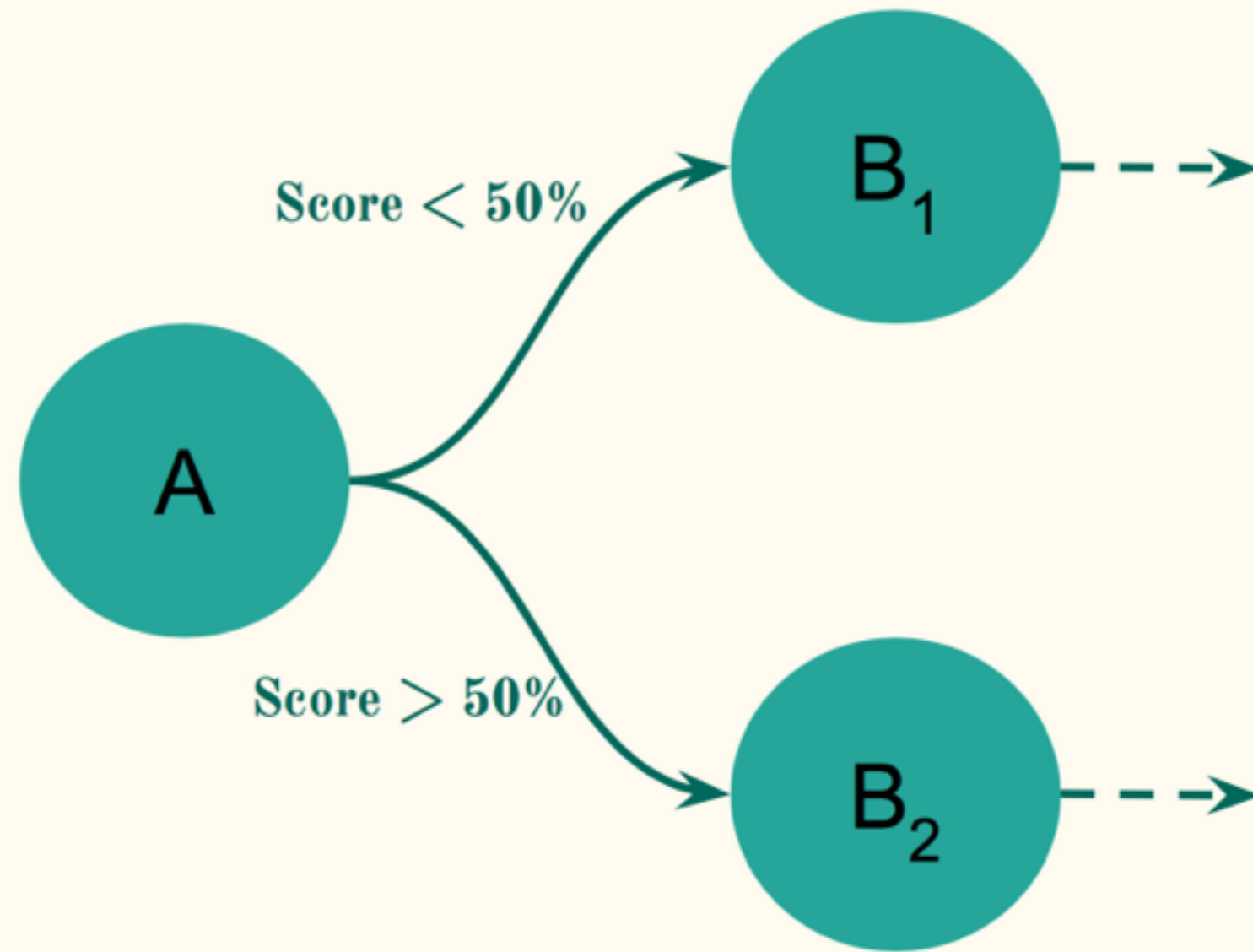
SVM, KMC, DNN, RNN, ZAM, POMDP



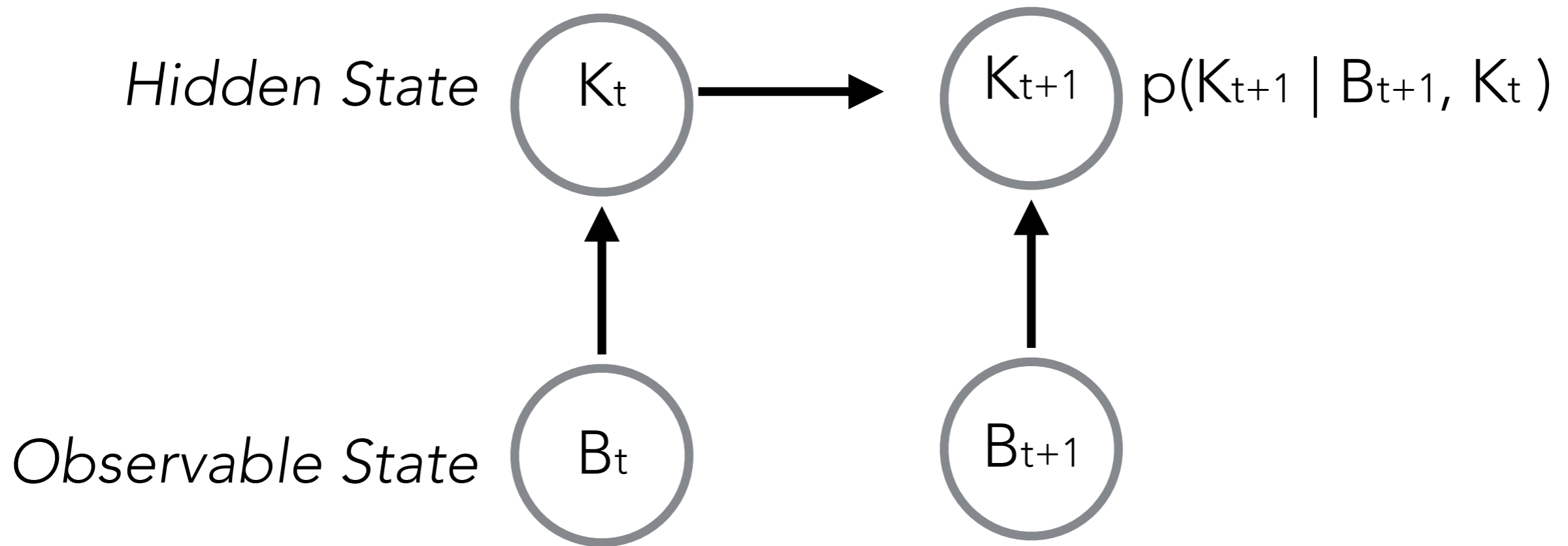
Computational
Models

Education
Research

Adaptive systems



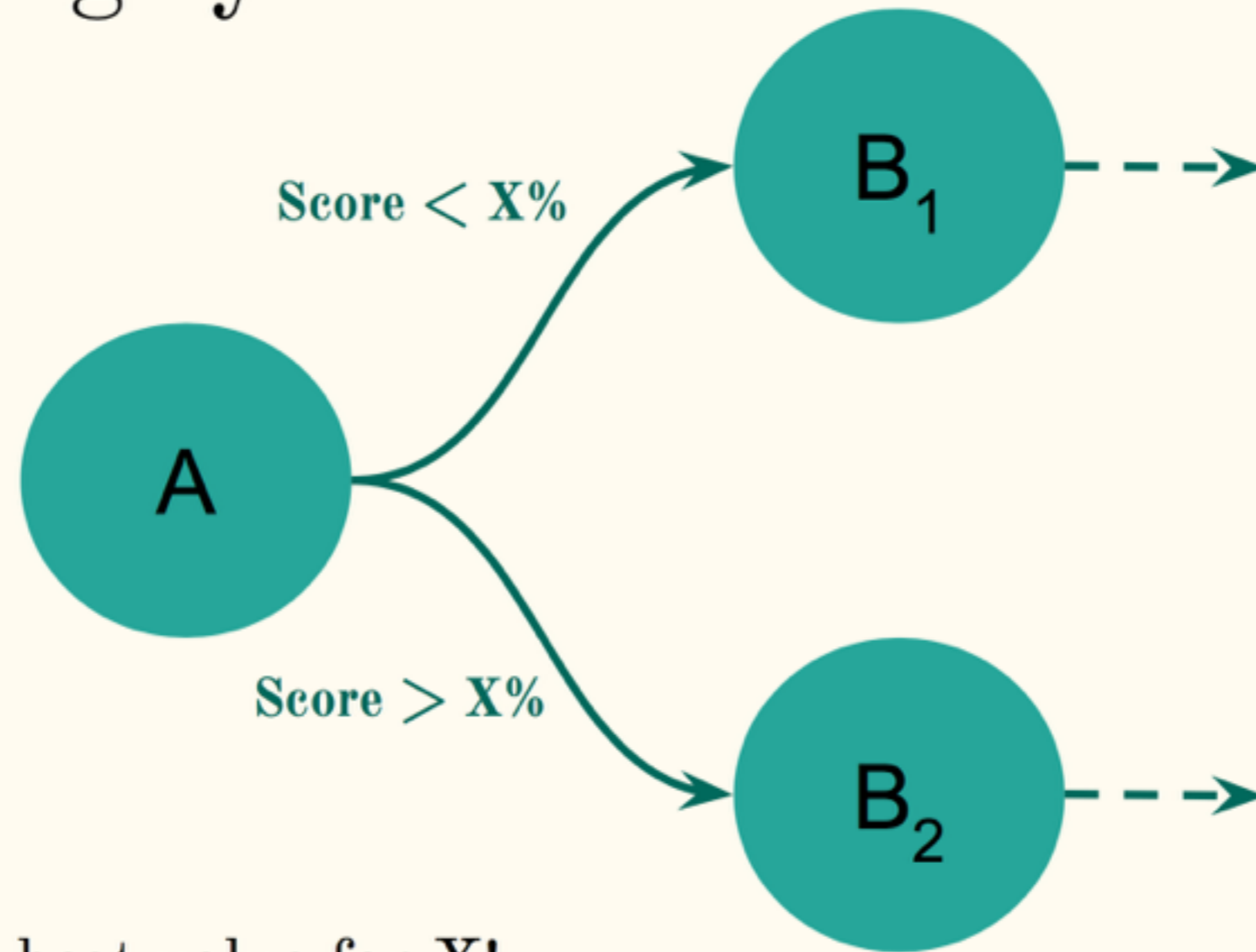
Bayesian Knowledge Tracing



$$p(K_t = \text{'skill-x'} | B_t = \text{'correct answer'}) = 1 - \text{Guess}$$

$$p(K_t = \text{'skill-X'} | B_t = \text{'incorrect answer'}) = 0 + \text{Slip}$$

Self-Improving systems



Find the best value for X!

Improve the management
of education systems



Computational
Models

Education
Research

What about modeling learning

outsider technology-based environments ?

Campus Analytics

pre-requisites

$p(\text{Succeed (CS243)} \mid \text{Failed (CS201)})$

carreer

$p(\text{Salary} > T \mid \{\text{INF201, MA203, INF233, ...}\})$

recommender

78% of those who select CS243 also selected CS411

.....

how deep ?

Relevant Behavioral Abstractions

(Features)



Computational
Systems

Education needs explainable AI

Education
Research

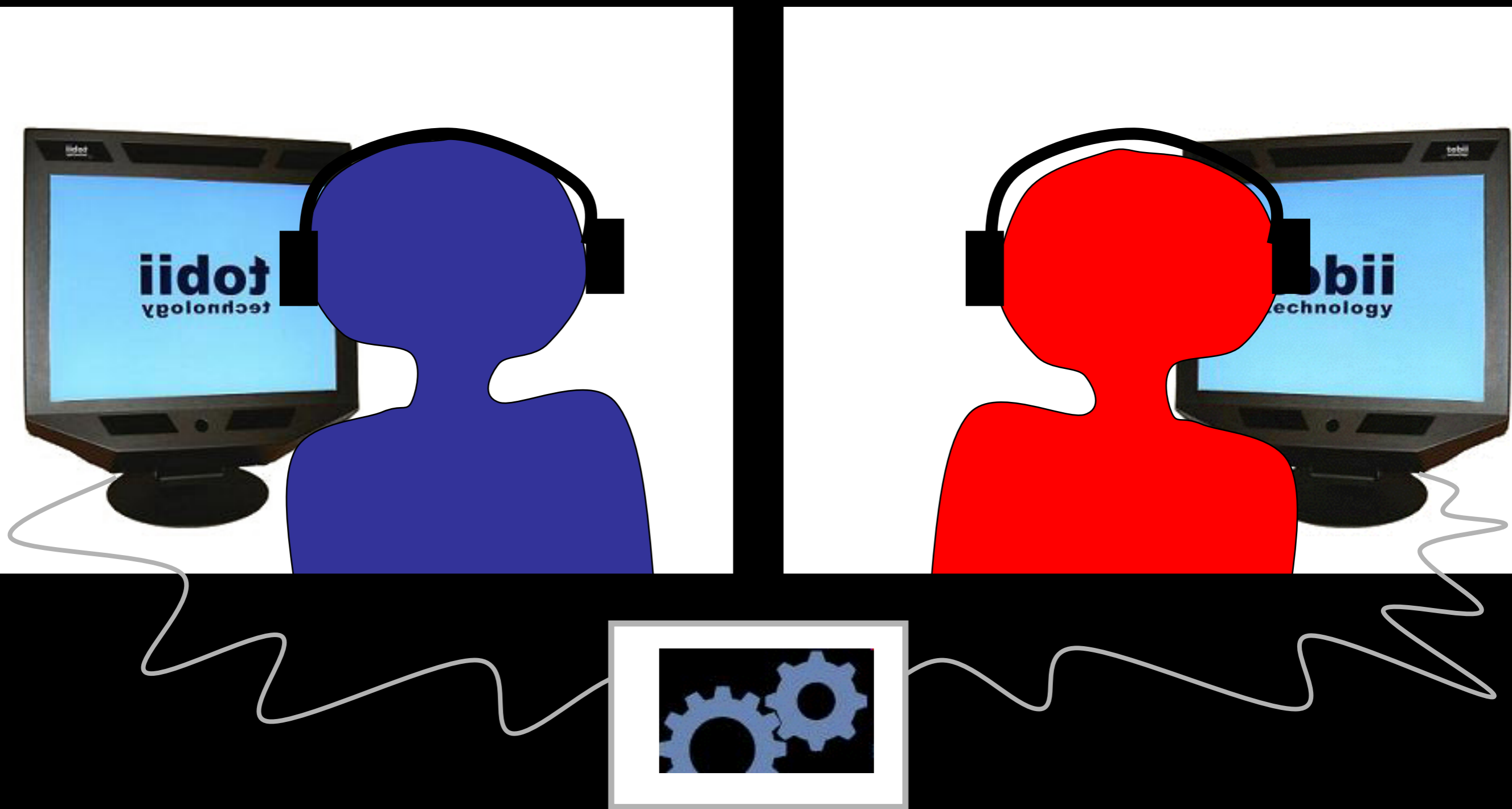
Equics

Pierre Dillenbourg, EPFL

Relevant Behavioral Abstractions (Features)

$$\text{gaze}(a) = f(\text{gaze}(b))$$

Gaze Recurrence



DUET - Dual Eye-Tracking
Pair programming experiment

Low gaze recurrence



ÉCOLE POLYTECHNIQUE
FÉDÉRALE DE LAUSANNE

P. Jermann, M.-A. Nüssli & P. Dillenbourg

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Supported by the Swiss National Science Foundation
(grants #K-12K1-117909 and #PZ00P_126611)

DUET - Dual Eye-Tracking
Pair programming experiment

High gaze recurrence



ÉCOLE POLYTECHNIQUE
FÉDÉRALE DE LAUSANNE

P. Jermann, M.-A. Nüssli & P. Dillenbourg

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Supported by the Swiss National Science Foundation
(grants #K-12K1-117909 and #PZ00P_126611)

Relevant Behavioral Abstractions

$$\text{gaze}(\text{listener}) = f(\text{gaze}(\text{speaker}))$$

Feature: Gaze recurrence

Context: Collaborative learning

Eye tracking experiment on MOOC Video

Following teacher's references

Gaze of students' watching Scala course by Prof. Martin Odersky (EPFL, Switzerland)



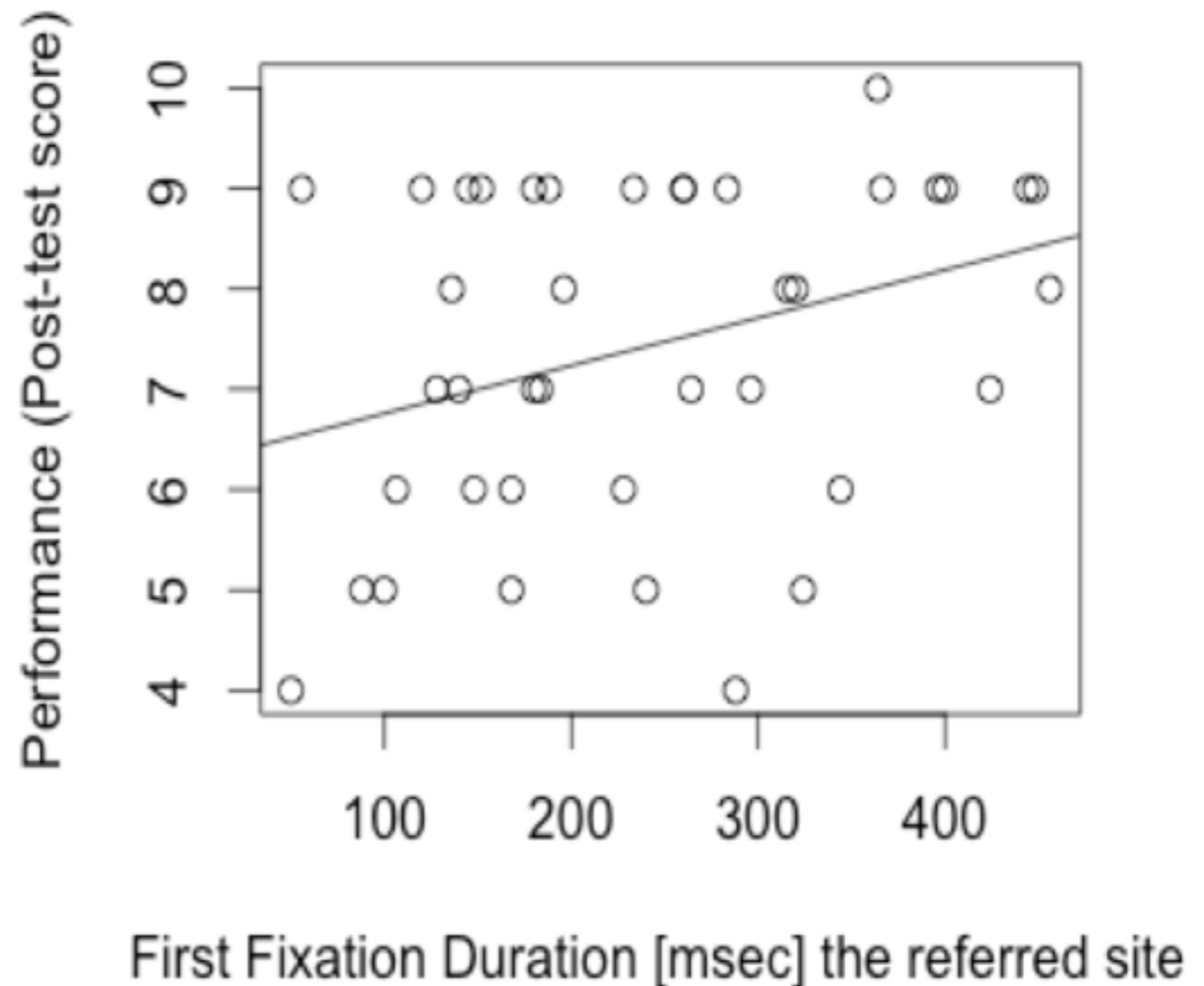
K. Sharma, P. Jermann, P. Dillenbourg

@ CHILI – <http://chili.epfl.ch>

Supported by the Swiss National Science Foundation
(Grants CR1211_132996 and PZ00P2_126611)

Relevant Behavioral Abstractions

gaze (learner) = f (reference (teacher))



Feature: *Withmeness*

Context: *Lecturing*



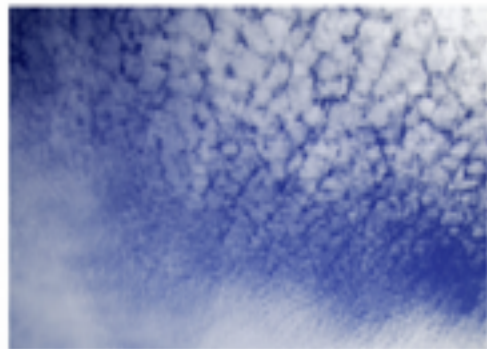
No Visual Aid

Pointer

Gaze

Cirrocumulus Clouds

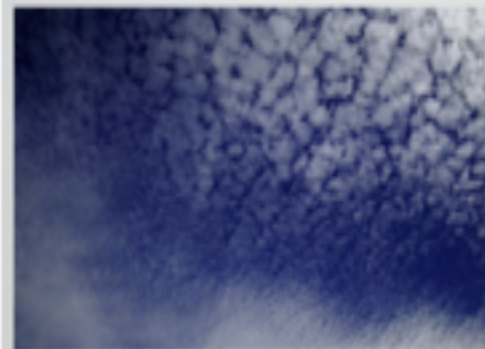
High & Puffy



Ce

Cirrocumulus Clouds

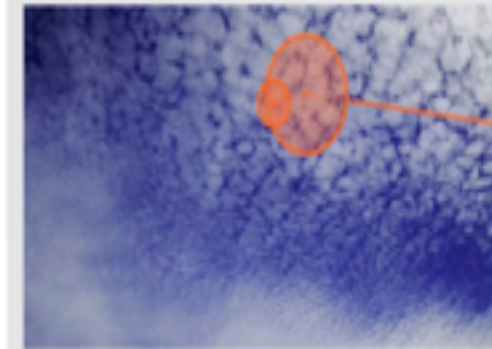
High & Puffy



Ce

Cirrocumulus Clouds

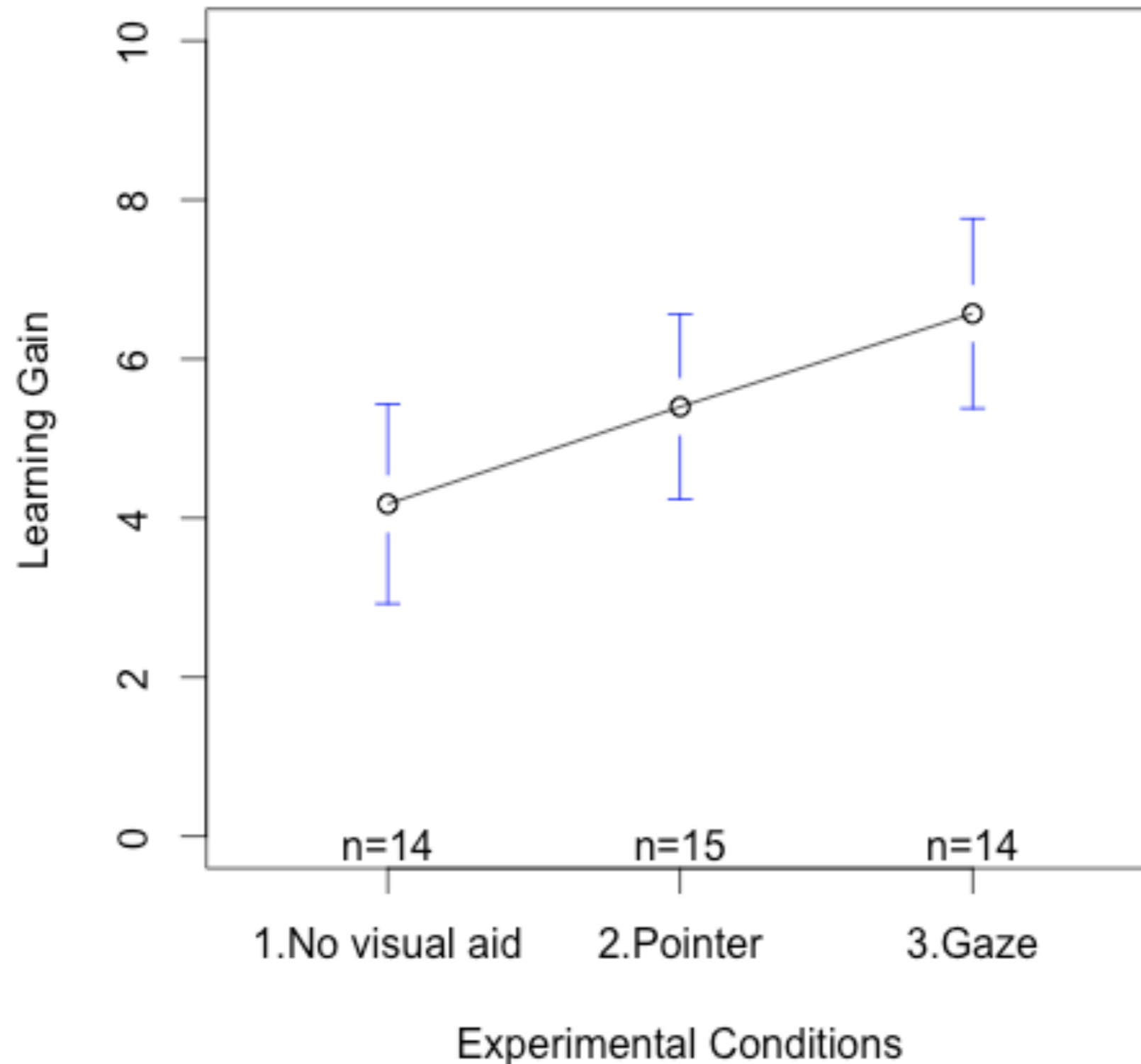
High & Puffy



Ce

“...they look like a bunch of little grains arranged together...typically a group of very small elements”

Do finger-based or gaze-based deictics enhance learning ?



Relevant Behavioral Abstractions

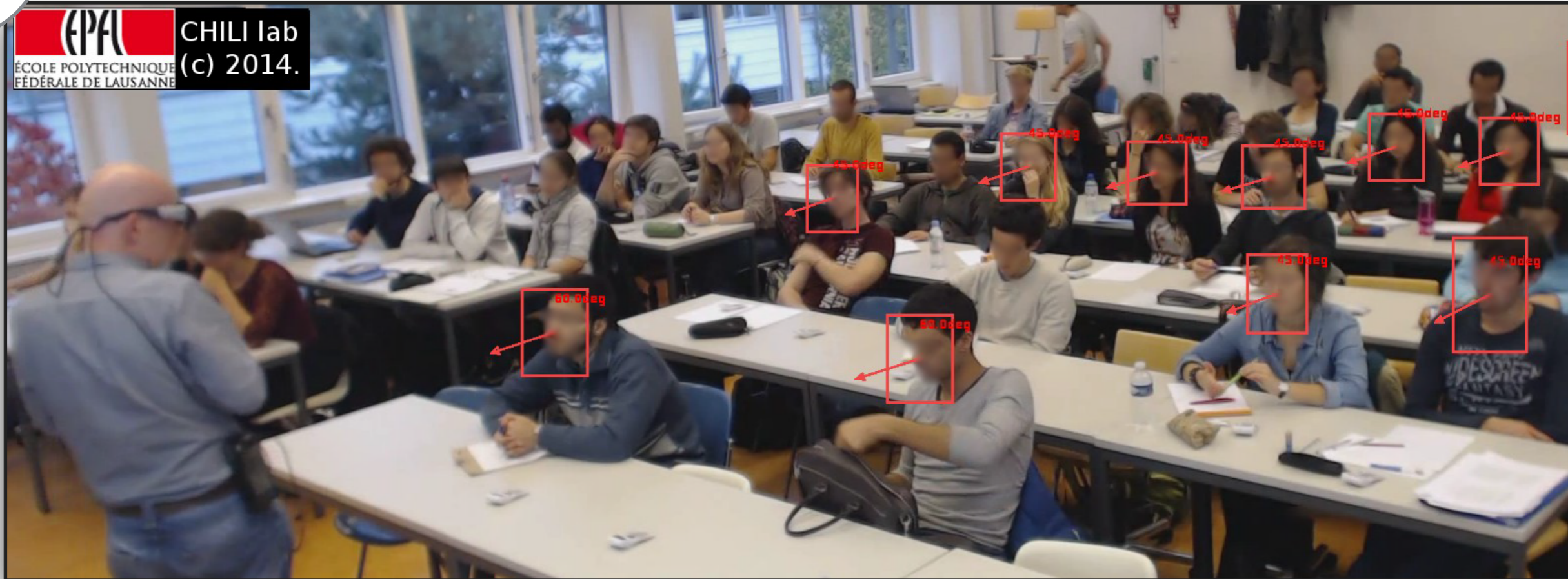
gaze (learner) = f (gaze (teacher))

Feature: 'Withmeness'

Context: Lecturing

Modeling in the wild ?

K_t



B_t

Kernel	Features	Score	Cohen's kappa
RBF(c=1.31, g=0.0211)	Distance, Head travel norm., Num. still periods	61.86%	0.30
RBF(c=1.21, g=0.11)	Period, Row, Head travel norm., Mean duration still	61.72%	0.32
RBF(c=1.11, g=0.061)	Head travel norm., Mean duration still	60.42%	0.28
RBF(c=1.4, g=0.04)	Period, Distance, Row, Mean duration still	59.23%	0.30

Relevant Behavioral Abstractions

gaze (learner) = f (location (teacher))

Feature: Head rotations

Context: Lecturing



activity (teacher) = f (gaze (teacher))

L. Prieto, K. Sharma, L. Kidzinsky, P. Dillenbourg

Education brings nice challenges

(1) Explainability



Computational
Models

Education
Research

Education brings nice challenges

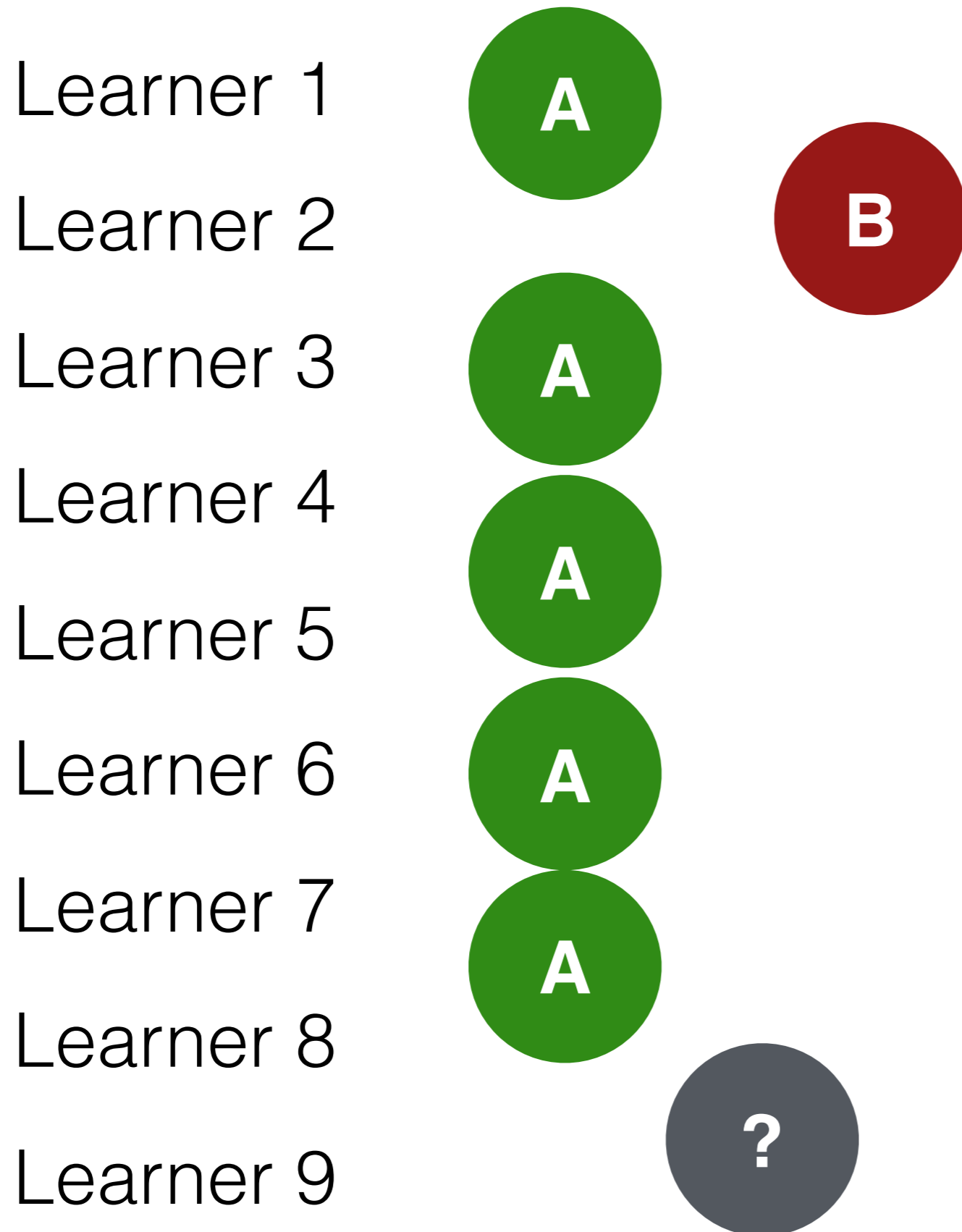
(2) Cold Start

Integrate expert's knowledge

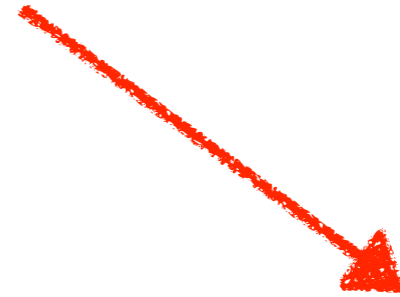
Use simulation with synthetic students

Education brings nice challenges

(3) Exploration Exploitation Tradeoff



Education
Context



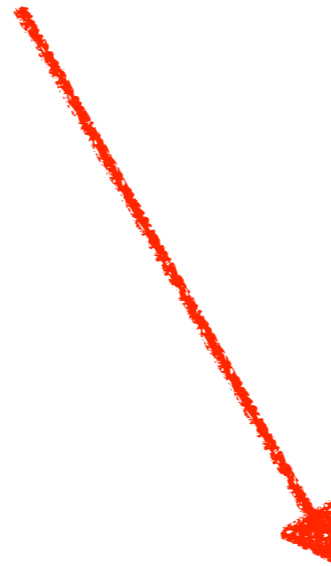
Explainable AI



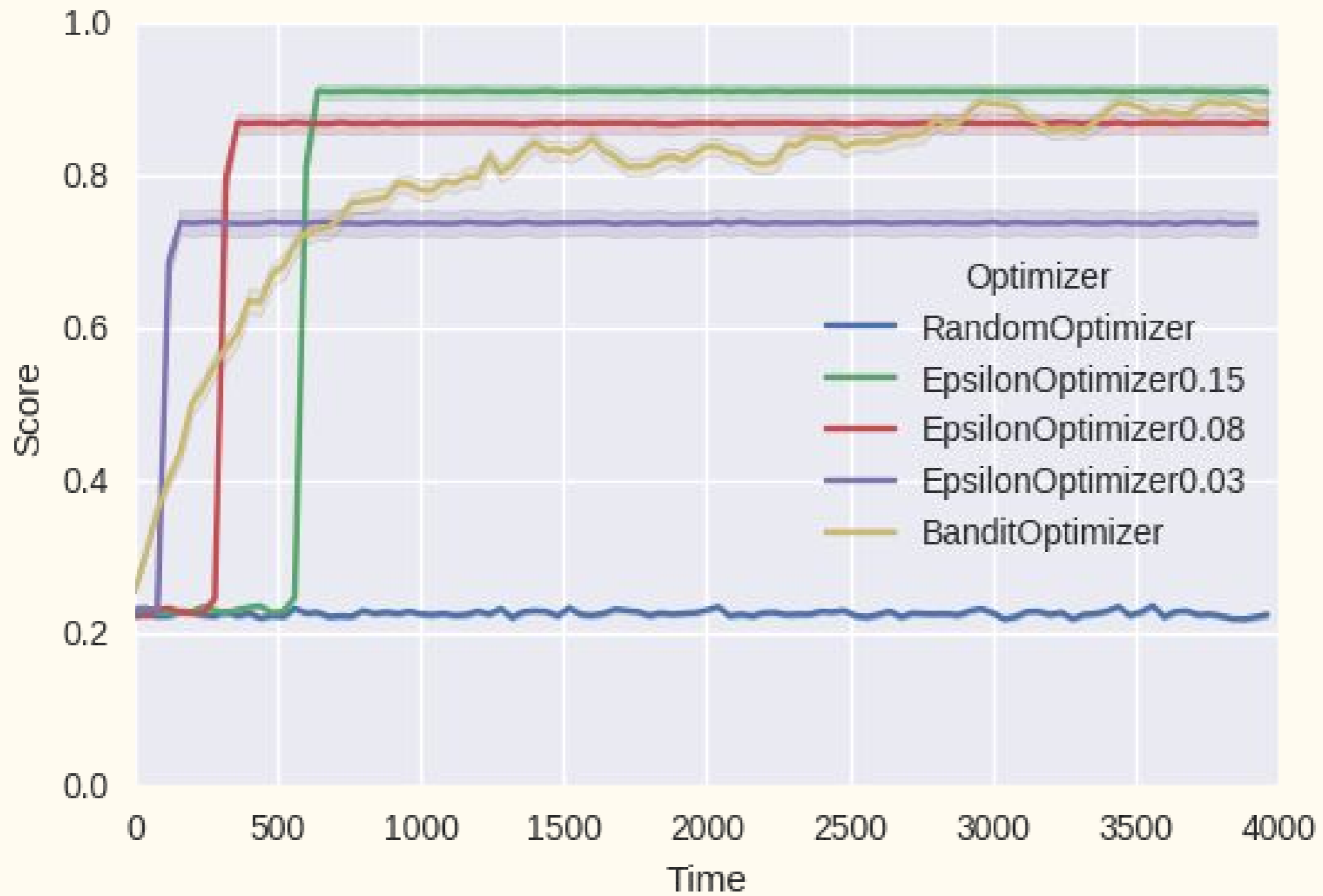
Cold Start



Exploration/
Exploitation
Trade-OFF



Cohorte Simulations



Louis Faucon, Pierre Dillenbourg, EPFL

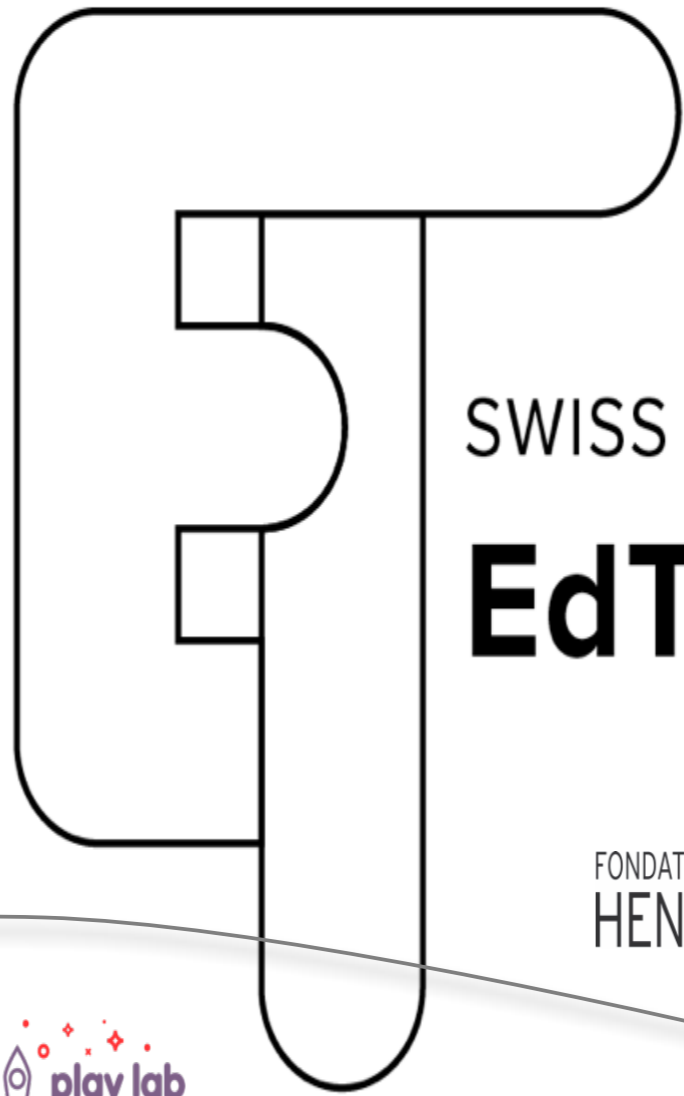
Education is a computational science

EPFL Center for Learning Sciences

EPFL
Innovation Park



digital**switzerland**



SWISS



EdTech Collider

FONDATION
HENRIMOSER

JACOBS
FOUNDATION
Our Promise to Youth



PocketCampus




Little Vista

Rosie

LABSTER



An aerial photograph of a large, modern EPFL building at dusk. The building has a curved, multi-level design with a glass facade that is illuminated from within. The sky is a mix of orange, pink, and blue. In the background, there are mountains and a body of water. Five white circular callout bubbles with yellow borders are positioned above the building, each connected to the building by a thin white vertical line. The bubbles contain the following text: 'Center Learning Sciences', 'MOOCs', 'Collider', 'Compu. Thinking', and 'Lake of Piaget'.

Center Learning Sciences

MOOCs

Collider

Compu.
Thinking

Lake of
Piaget

EPFL Digital Education Ecosystem

Social Sciences

Education

Psychology

Sociology

Ethnology

Anthropology

Economics

Political Sciences

Linguistics

History

Demography

Management

.....

Humanities

Modern Languages

Old Language

Littérature

Philosophy

Religion

Art

Musicology

Museology

History

.....

This is not one science !!!

And.....

Education

Docimology

Didactics

Instructional Psychology

Instructional Design

Learning Technologies

History of Education

Sociology of Education

Economy of Education

Special Education

Psychology

Cognitive psychology

Social psychology

Psychometry

Clinical psychology

Differential Psychology

Developmental Psychology

Sociology