

Adaptive learning system and its promise on improving student learning 智适应学习系统

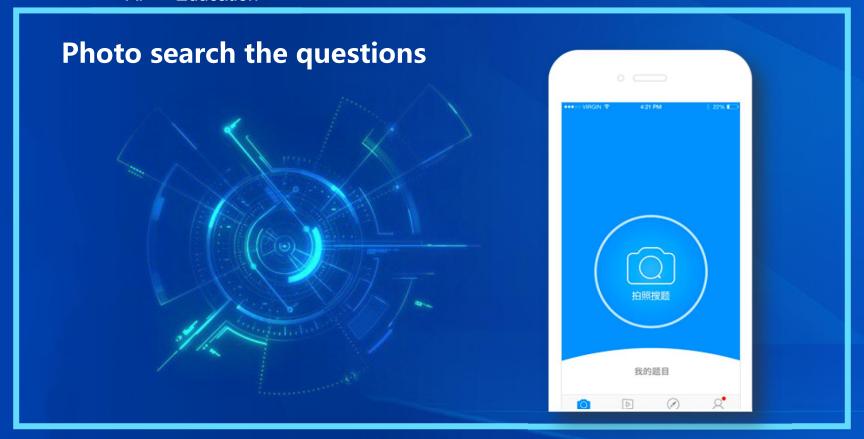
Yixue Squirrel AI

Zhen Xue



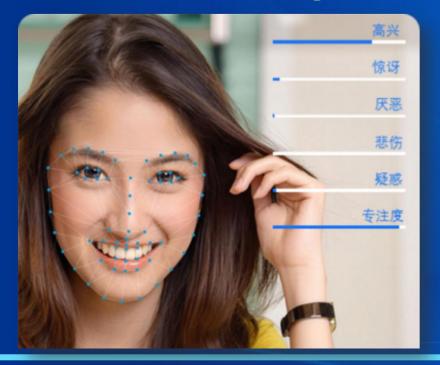








Facial expression and Emotion recognition





Composition Correction





Oral Evaluation





Robots accompany children





Automatic Speech recognition + Semantic Recognition + Search





Competency-based Learning Follow Cognitive Rules Mastery Learning The knowledge system base on frameworks algorithm

AI adaptive learning algorithm

Online personalized learning Student-centered

Increase learning efficiency

Teacher personalized tutoring

Interactive teaching, improving scores in a personalized and highly-efficient way

Big data analyses on Cloud Platform



Adaptive Learning Artificial Intelligence + Big Data

Personalised Learning Experience

Promote Student Engagement

Better Learning Outcome



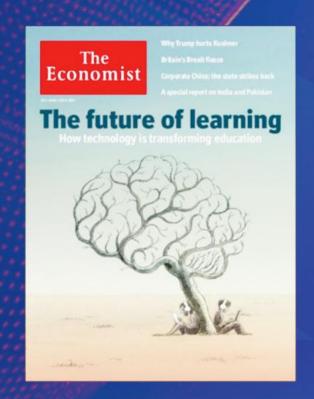
Overseas Media Report

The Economist

Person suggests that Al could make learning "more personalised, flexible, inclusive and engaging"

Forbes

Many believe adaptive learning technologies will pave the way for a pedagogical renaissance.









Snapwiz

🕹 fishtree

Knewton, a supplier of adaptive learning technology in the US, has provided more than 15 billion personalized recommendations for students'next study plans.





The development of the adaptive learning in the world

Company	Financial information	Users' information
Knewton	\$ 160+Million AccelPartners, Atomico, GSVCapital	
BYJU's	\$ 244 Million Tencent, Chan & Zuckerburg Foundation, Sequoia Capital, Sofina, Lightspeed Ventures	1,400+cities and towns in India
AltSchool	\$ 250+ Million Mark ZUckerberg, Founders Fund, Andreessen- Horowitz	
Dreambox Learning	\$ 185 Million Owl Ventures, the Rise Fund	3 million users

ALEKS \$ 100 Million

McGraw-Hill

Millions users

The development of the adaptive learning in the world

Company	Financial information	Users' information
Knowre	\$ 15.2 Million SoftBank and other investors, and acquired by Daekyo, the largest Korean education group	
Realizeit	\$ 500~ 700 million valuation	
Smart Sparrow	\$ 23.5 Million Moelis Australia Asset Management, OneVentures, and Uniseed	50,000 users
Duolingo	\$ 108 Million Google Capital, KPCB, New Enterprise Associates	200+Million users 25 Million active users
Khan Academy	\$ 18.9 Million Google, Omidyar and Network	60 million+ registered users



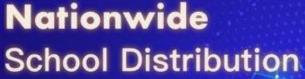


Founded by HaoyangLi in 2014.

The first company specialising in intelligent adaptive education delivered to K12 students in China.

Received total financing of 270 million Yuan from SIG, NGP, New Oriental, TAL, CASH, GreenWoods, Qinsong Fund and Zhenghe Fund.





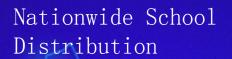


over 200 cities

over 20 provinces

Hainan 4

Guangdong 22



智适应教育济南市中区金龙大厦合作校

智适应石家庄和平路分校

智适应教育西安户县草堂路合作校

智适应教育青岛黄岛分校

智适应都江堰幸福大道校区

智适应太原杏花岭万达分校

智适应青岛李沧分校

智适应重庆沙坪坝分校

智适应教育南昌新建分校

智适应郑州二七长江分校 智适应教育南京浦口江浦分校

智适应教育杭州下城分校

智适应教育贵州花果园分校

智适应武汉光谷分校

智适应教育无锡锡东分校

智适应教育贵州观山湖分校

智适应教育武汉小东门分校

丽水莲都府前合作校

Intelligent Adaptive Learning System

delivered to K12 students in China by Yixue Inc.

Curriculum

Fine-grained knowledge map

Prerequisite network

8+ textbook versions

50,000+ knowledge points

Covers 90% areas of China

Content

Rich contents

Multi-media contents

Different difficulty levels

1,000,000+ questions

Curriculum matched

Assessment

Diagnostic pre-assessment

Adaptive delivery

Detailed assessment report

Learning recommendation

Learning analysis

Instruction

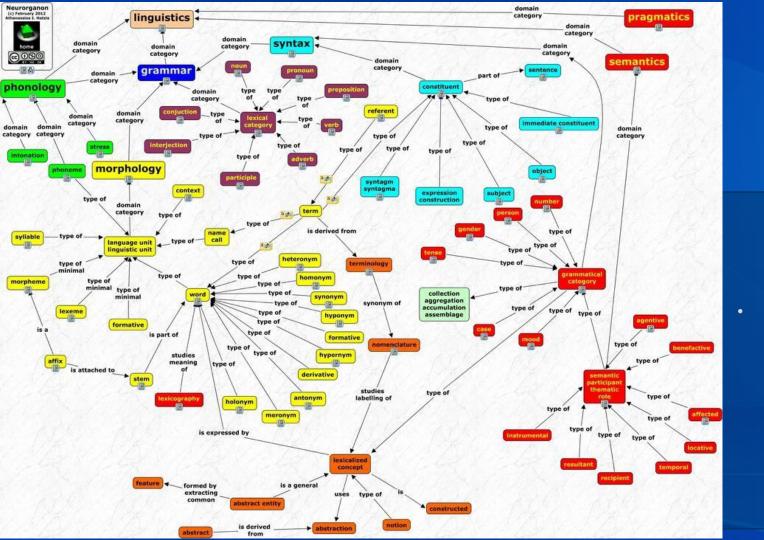
Automated

Personalised

Immediate feedback

Step-by-step explanations

Dynamically delivered



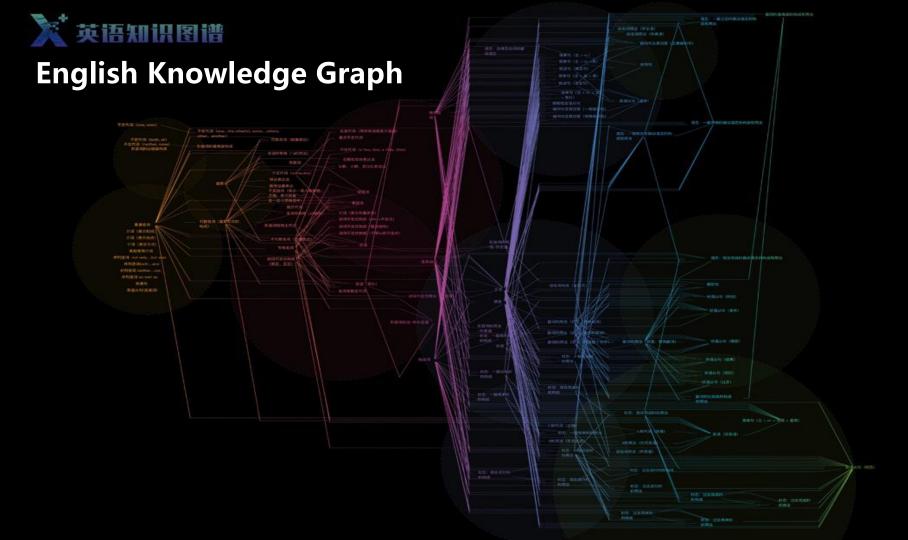


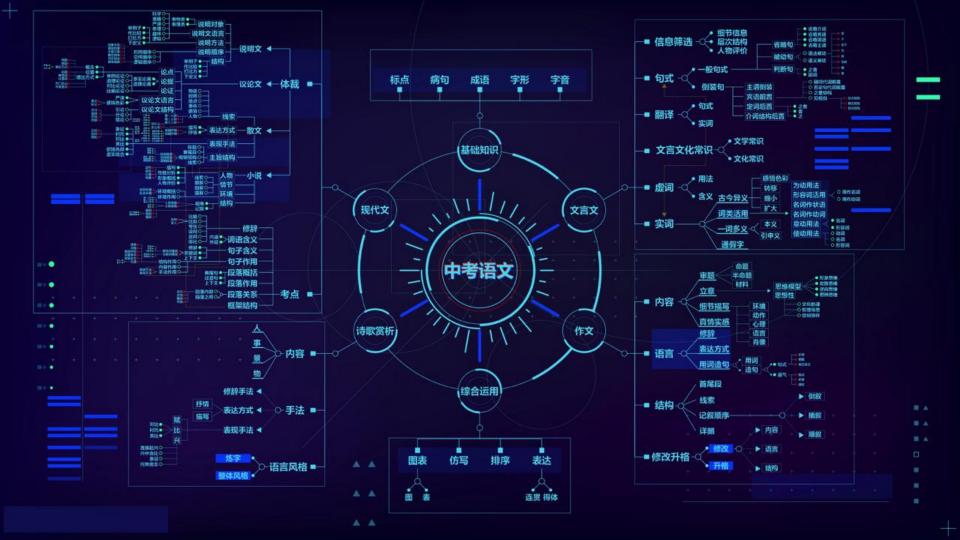
google 知识图谱

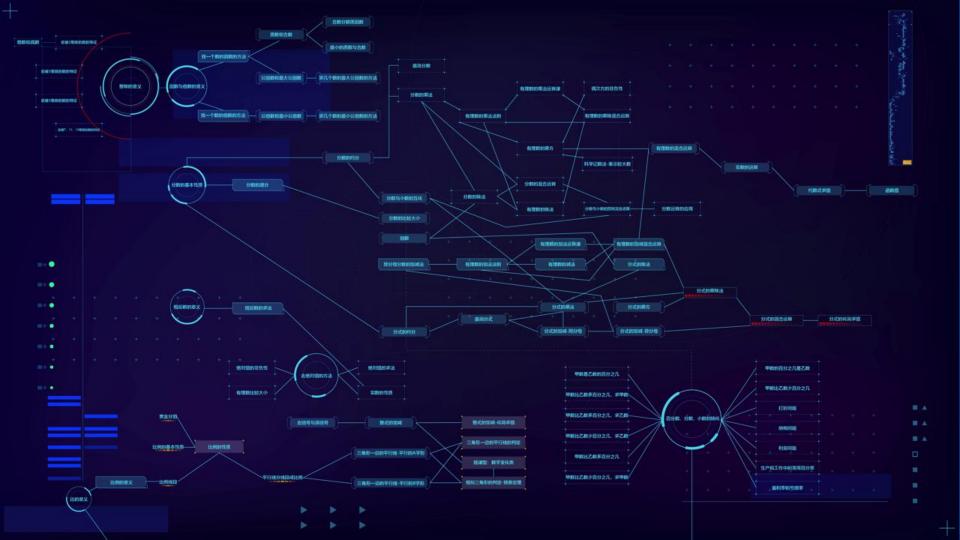
其语义网络包含超过570亿个 对象,这些不同的对象之间有 链接关系,用来理解搜索关键 词的含义

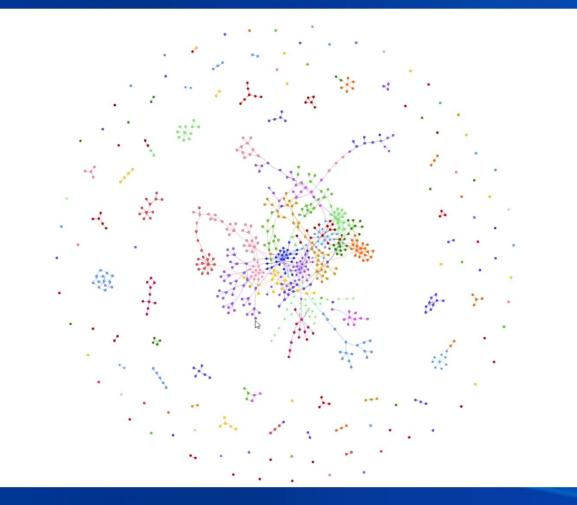












知识点拆分对比: 有理数——极课大数据



正有理数的乘方

定义识别正数和负数

有理数的概

求一个非负数的绝对值

求一个负数的绝对值

相反数的识别

自理数的减法法则

利用有理数的减法比较

科学记数法与有效数字

除以一个数相当于乘以 一个数的倒数

偶次方为非负数

计算器-基础知识

计算器-有理数

有理数的加減混合运算

有理数的加减混合运算 的运算法则 科学计数法-原数

科学记数法记大数的表示原则

科学记数法记小数的表 示原则

屋粉特征

有效数字近似数

数学常识

有数字表示事件

知识点拆分对比: 有理数——学霸君

绝对值

相反数



正有理数的乘方

非负数的性质: 绝对值

有理数的减法

有理数的乘法

科学记数法与有效数字

正数和负数

有理数的概

有理数的加减混合运算

非负数的性质—偶次方

理数的除法

科学计数法-原数

科学记数法记大数的表 示原则

|学记数法记小数的

「效数字近似数」

有理数的大小比较

有理数的混合运算

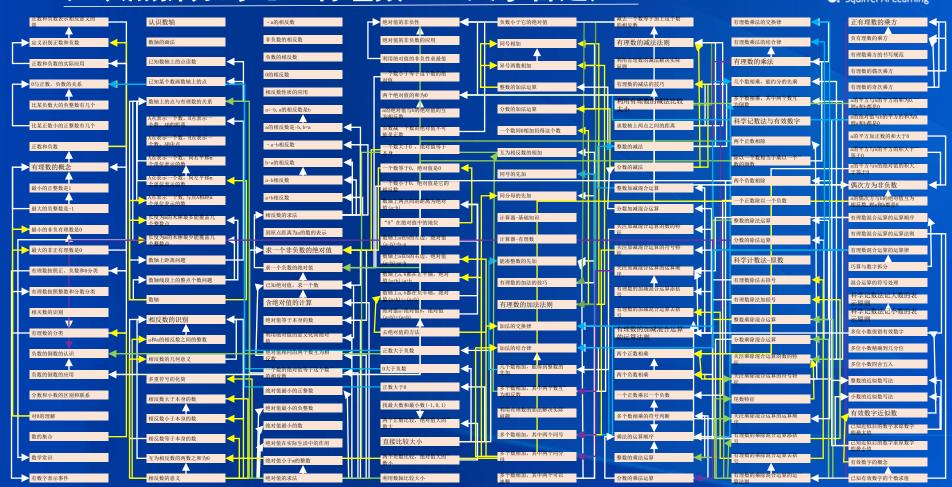
知识点拆分对比: 有理数——高木学习



认识数轴 绝对值的非负性 有理数的减法法则 绝对值的非负数的应用 数轴的画法 定义识别正数和负数 已知数轴上的点读数 正数和负数的实际应用 有理数的概念 相反数的求法 "0"在绝对值中的地位 求一个非负数的绝对值 数轴上距离问题 求一个负数的绝对值 有理数的加法的技巧 已知绝对值,求一个数 含绝对值的计算 有理数的加法法则 相反数的识别 有理数的分类 负数的倒数的认识 相反数的几何意义 负数的倒数的应用 多重符号的化简 对0的理解 直接比较大小

知识点拆分对比:有理数——乂学智适应





- Skills on common sense
- Skills on intuit. Indent. most simp. results
- Sense on to keep multiple solu. or not
- Pattern identifying skills
- Info filtering skills
- Skills on intep. flow charts
- Skills on visual. graph transf.
- Skills on creat. general models
- Skills on expl. open-ended Q.s
- Skills on transf. stat. graphs
- Skills on rep. using certain key Q's info
- · Backward reason, skills

- Number sense
- Skills on solving grid-related Qs
- meas. of non-linear objects leng. by tools

- Skills on comb. No. + graphs
- Skills on desc. and ana. Geo. shapes
- Determ. Answ.'s reasonableness

Decomposing the "skills" in Math with Yixue Squirrel Al

- Skills on simp. and solving algebraic exp.
- Skills on inden. general models
- Skills on connect. models
- Prov. new def.
- Model calc. skills

- Geom. Comput. skills on vectors
- Skills on anal. Funct. graph
- Graphing skills
- Sense on listing cases in Q.

• Skills on assoc. theorems with Qs in problem solving

• Skills on summ, and gen. simp. and transf of com. algebraic exp.





	定冠词	形容词和 副词的基 本用法	介词	介词 短语	及物 动词	不及物 动词	连系 动词	情态 动词	易混动词辨析	动词不 定式
	不定冠词	形容词副 词的比较 级	形容词副 词的最高 级	动词 短语	动调的各 种形式	陈述句	并列 连词	从属 连词	一般现在时	定语 从句
	零冠词	同义形容 词辨析	易混淆副 词辨析	感叹句	祈使句	疑问句	现在完 成时	一般将来时	一般过去时	状语 从句
	可数名词	可数名词和 不可数名词 的计量	名词所 有格	物主 代词	疑问 代词	不定代词	现在进 行时	被动语态 一般现在 时	过去进行时	并列句
	不可数名词	序数词	基数词	人称代词	反身 代词	指示 代词	被动语态一般过去时	被动语态 一般现在 时	被动语态一般将来时	宾语 从句



Eighth grade students can both learn past knowledge points of seventh grade and learn those of ninth grade in advance.







Real-time Updates of Learner Profile

- Knowledge State
- Learner Proficiency



Precise Determination of Knowledge State

- Minimal Time
- 90% Accuracy



Optimal Planning of Learning Path

- Maximise Efficiency
- Increase Performance



Most Suitable Learning Content

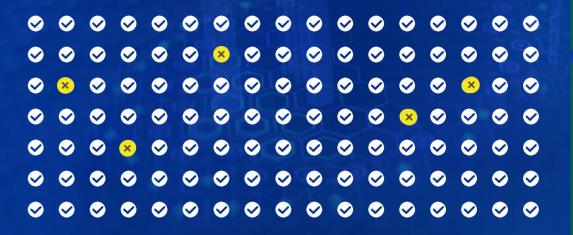
- Ability Accordance
- Goal Matched



乂学人工智能教育

精确侦测不同学生的知识漏洞

Precise Diagnosis by Yixue AI-based Adaptive Education



乂学AI教育

知识空间理论 + 信息论 快速精准检测出学生薄弱知识点

Yixue Al-based Adaptive Education Knowledge Graph + Knowledge Space Theory Precisely determine student's knowledgestate

AlphaGo

棋谱+价值网络+快速走棋技术 准确判断当前整体棋局

Chess Manual + Value Network + Fast Rollout Precisely determine the overall state



知识漏洞追根溯源

Fill the gap and target the root problem



42 Yixue Adaptive

19 System –
target the
individual
learning gap
and root cause

MOOCs 盲目补习

MOOCs – blindly review everything

乂学AI教育

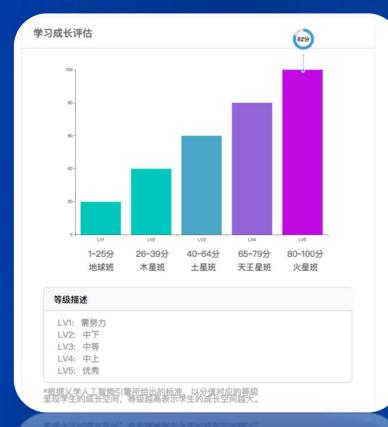
贝叶斯网络 + 贝叶斯推断 + 贝叶斯知识追踪 + 项目反应理论 实时评估知识掌握熟练程度,预测未来学习能力

Yixue Al-based Adaptive Education
Uses Bayesian Network + Bayesian Inference +
Bayesian Knowledge Tracing + IRT to precisely
determine student's current knowledge state
and forecast future student outcome.

AlphaGo

强化学习+增强式策略网络 不断修正上轮策略网络的参数

Uses Deep Learning (Policy Network)
+Reinforcement Learning to fine tune the policy
network's parameters



能力分析



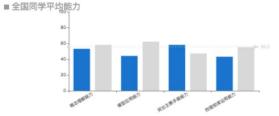


能力整体掌握率 50% ——

(图形表示本次能力维度掌握程度的占比)

能力对比图:

■我的能力







Proficiency Prediction
Recommended Knowledge Points
Probability of Reveiw
Probability of Recommendation

Logistic Regression + Bayesian Network

Genetic Algorithm



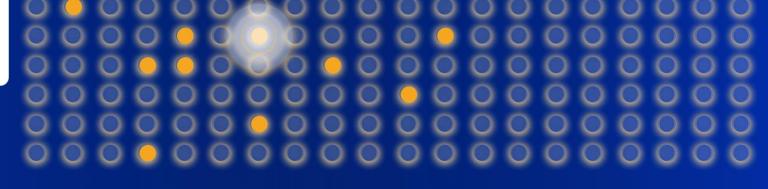
实时动态规划学习路径



Logistic Regression + Bayesian Network



Genetic Algorithm

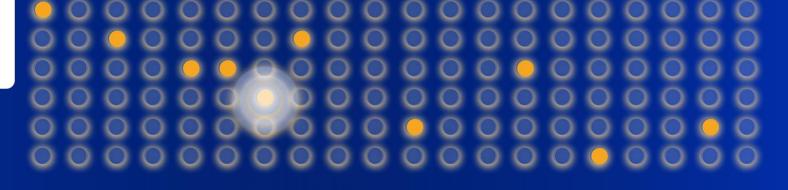


Proficiency Prediction
Recommended Knowledge Points

Probability of Reveiw
Probability of Recommendation

Logistic Regression + Bayesian Network

CABB ABCA ACAB Genetic Algorithm



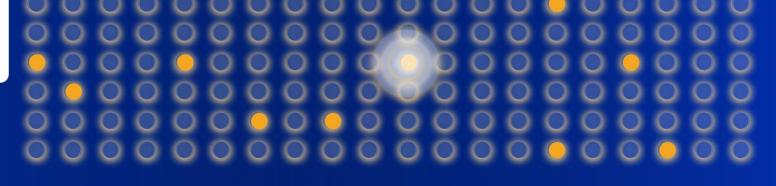
Proficiency Prediction
Recommended Knowledge Points

Probability of Reveiw
Probability of Recommendation

Logistic Regression + Bayesian Network



Genetic Algorithm



Proficiency Prediction
Recommended Knowledge Points

Probability of Reveiw
Probability of Recommendation



Q1-A

A B C D

Q1-A-B

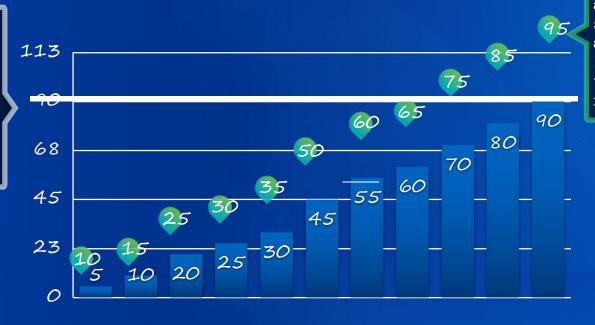
A B C D

Q1-A-B-C

 $\mathsf{A} \; \mathsf{B} \; \mathsf{C} \; \mathsf{D}$



In traditional teaching, homogenization of learning content treated different individuals without distinction



Matching the difficulty of learning content according to the students' learning ability, AI adaptive learning system half the work with double results.

每个学生掌握一个知识点所需的时间是不同的

Different students spend different amounts of time on mastering a knowledge point.





乂学AI教育

模糊逻辑+分类树+逻辑斯蒂回归+图 论+进化算法 根据学生偏好和能力推荐最合适的学 习内容和路径

Yixue Al-based Adaptive Education

Fuzzy Logic + Classification Tree + Logistic
Regression + Graph Theory + Evolutionary Algorithm
Recommend the most suitable learning content and
path according to students' preferences and abilities

AlphaGo

所有走法+蒙特卡罗搜索树 当前整体棋局下的最佳策略

AlphaGO

All possible routes + Monte Carlo Tree Search Determine the best move policy



个性化学习内容 + 个性化学习路径 + 个性化学习速度

Personalized Learning Content + Personalized Learning Path + Personalized Learning Pace

Student A

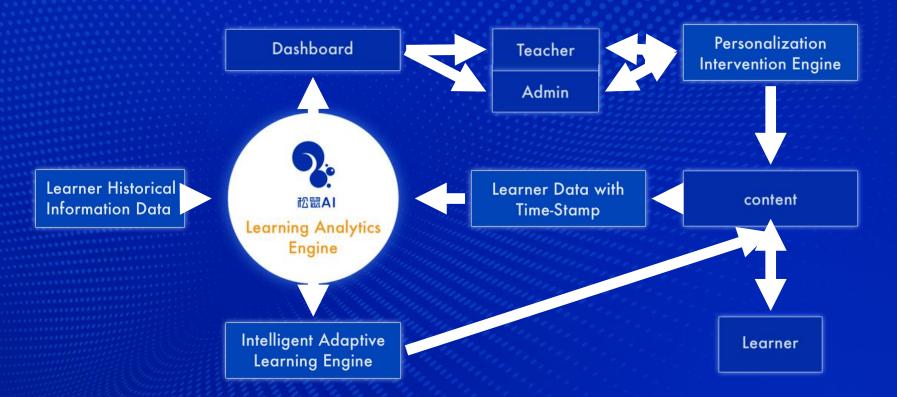
Learning Stage	Knowledge Point ID	Difficulty	Score	Weight	Result (correct/wrong) of pre-test	Time Spent
- 1	fp713	3	13	13	1	445
- 1	fp711	3	0	13	0	102
- 1	fp710	2	0	9	0	185
-1	fp709	2	0	9	0	123
- 1	fp706	1	0	4	0	57
2	fp735	3	6.25	10	0	870
2	fp728	2	5	10	0	209
2	fp730	2	3	10	0	124
3	fp758	2	10	10	0	139

Student B

Learning Stage	Knowledge Point ID	Difficulty	Score	Weight	Result (correct/wrong) of pre-test	Time Spent
1	fp717	3	13	13	1	2272
1	fp716	3	13	13	1	281
- 1	fp713	3	13	13	1	108
1	fp712	3	13	13	1	253
1	fp711	3	13	13	1	521
1	fp710	2	9	9	1	892
1	fp708	2	0	9	0	781
- 1	fp707	1	4	4	1	448
1	fp706	1	4	4	1	1203
2	fp735	3	6.25	10	0	1609
2	fp728	2	7	10	0	297
2	fp730	2	5	10	0	453
3	fp758	2	-1	10	0	591
3	fp754	-1	10	10	0	409
3	fp757	1	4.8	10	0	382



Closed-cycle













The score increase of the partner at Fortune Capital, Zhonghong Fu's child

	before	after
TOTAL	484	569
Chinese	102	126
Math	133	. 147
English	127	159
Physics	69	86
Chemical	<i>5</i> 3	51

Fortune Capital manages a fund of 22.6 Billion RMB (3.3 Billion USD). And 71 companies listed IPO out of 456 companies invested by Fortune Capital.

国内教育领域首次人机大战

First Human vs. Al Competition in Chinese K–12 Education market

乂学智适应教学机器人所教的学生,比近20年教龄的高级教师所教的学生,平均提分高出9.95分。

Yixue Al system outperformed real human by almost 40 percent in the average score gained category – 36.13 point (Al) vs. 26.18 points (human).

中学人工智能 智适应教育 实证研究报告





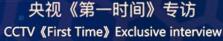




乂学教育人机大战,被100多家媒体报道

The AI vs. Human competition has been widely covered by more than 100 major media outlets including CCTV and CNBC.







美国三大卫视之一: CNBC专访

One of the Big Three TV in the U.S.: CNBC exclusive interview







































White paper

结论

这次实证研究项目通过严格设计的对比试验,综合统计分析客观全面深入地对比 AI 制造应系统和作业盒子 AIP 两个不同的系统学习的过程和结果。研究的结果显物理光学专题的学习中, 松鼠 AI 制造应系统的遇分效果比作业盒子 AIP 显著更测 超过作业盒子 AIP 12.02分,权威的第一方数立两一规构(艾璃咨询)对研究设场执行、试验数据收集、数据分析与并发成指例全分及选行审核,以确保研究统 客观性和可靠性。总之,松鼠 AI 制造原系统相对于作业盒子 AIP 在学习效果上目可靠的。

结论

这次实证研究项目通过严格设计的对比试验,综合统计分析和定 智适应系统教学和传统真人老师授课两个不同教学方式的过程和 显示,在初中数学学习中,智适应系统的微分效果比真人教学 十分。权威的第三方独立研究机构(艾瑞咨询)对研究设计。 数据分析与研究报告的全过程进行了审核,以确保研究结果的科 比试验的研究结果与前期的对比试验的研究结果。 更进一步 总之,智适应系统组对于真人是两在水场效果加外交效是最善且 "编章的人大师"之从是现在的学生现象。

结论

这次实证研究项目通过严格设计的对比试验,综合统计分析客观全面深入地对比学生通过松鼠 AI 智适应系统和学霸君 APP 两个不同的系统学习的过程和结果。研究的结果显示,在初中数 学因式分解和分式专题学习中, **松鼠 AI 智适应系统的提分效果比学霸君 APP 基著更好,提分平均超过学霸君 APP 6.36** 分。权威的第二74至中文机构(艾瑞咨询)对研究设计、试验矩场执行、试验数据收集、数据分析与劳务报告的全社段是行审核,以确保研究结果的科学性、客观性和可靠性。总之,松鼠 AI 智点成系统机对于学者对APP 在学习效果上的优势是显著且可靠的。

结论

这次实证研究项目通过严格设计的对比试验,综合统计分析客观全面深 AI 智适应系统和学而思网校两个不同的系统学习的过程和结果。研究的 次函数专题的学习中,**松鼠 AI 智适应系统的提分效果比学而思网校 B** 学而**思网校 10.0分**。权威的第三方条文研究机构(艾瑞咨询)对研究 试验数据收集、数据分析与研究报告的全世程进行审核,以确保研究结 可靠性。总之,松鼠 41 智适应系统相对于与而思网校在学习效果上的

结论

这次实证研究项目通过严格设计的对比试验,综合 AI 智适应系统和学而思网校两个不同的系统学习的 代文(说明文和记叙文)专题的学习中,松鼠 AI 年 好,提分平均超过学而思网校 9.49 分。权威的第二 计、试验现场执行、试验数据收集、数据分析与研 的科学性、客观性和可靠性。总之、松鼠 AI 智适 势是显著且可靠的。

结论

这次实证研究項目通过严格设计的对比试验,综合统计分析客观全面深入地对比学生通过松鼠 AI 智适应系统和 BOXFiSH 智能学习系统(盒子鱼)两个不同的系统学习的过程和结果。研究的结果显示,在初中英语语法专题学习中,松鼠 AI 智适应系统的提分效果比 BOXFiSH 智能学习系统(盒子鱼)显著更对,提分平均超过盒子鱼 4.82 分,仅成的第二方经过研究机构(艾瑞咨询)对研究设计、试验现场投行、试验数据收集、数据分析与研究报告的全过程进行申核以确保研究结果的科学性、各观性和可靠性。总之,松留 AL 智适应系统相对于 BOXFiSH 智能学习系统(盒仔鱼)在学习效果化的机势是显著且可靠的。



Human Teacher vs. Yixue AI System Experiment



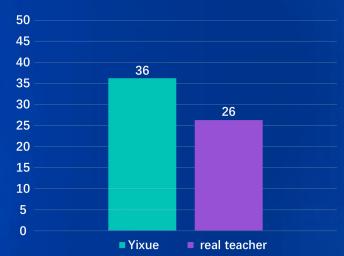
Address: Zhengzhou, Henan



Time: Oct. 1st-4th, 2017



Participants: 78 Grade Eight students



Yixue adaptive learning system helped students gain 10 points more than the real teachers did.





Media: Domestic media such as Beijing News (Dragon TV)reported this experiment.





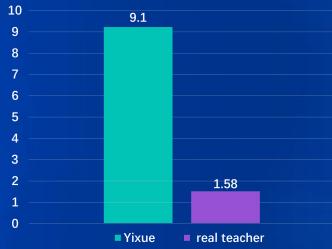
Address: Chengdu, Sichuan



Time: Apr. 29th-May.1st , 2018



Participants: 163 students



Yixue adaptive learning system helped students gain **7.52** points more than the real teachers did.





Media: TV station in Chengdu and CCTV reported this experiment.





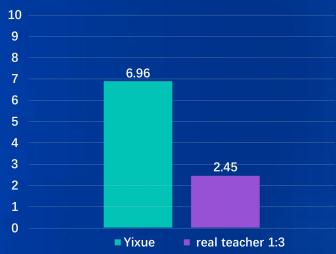
Address: Dongying, Shandong



Time: June. 15th-17th, 2018



Participants: 102 students



Yixue adaptive learning system helped students gain 4.51 points more than the real teachers did.





Media: TV station in Lijin and Lijin Education reported this experiment.

Student's learning progression





Yixue-SRI Joint Lab of AI-based Adaptive Learning







Yixue-SRI Joint Lab of Al-based Adaptive Learning

乂学-斯坦福国际研究院人工智能自适应学习联合实验室



Shanghai Yixue Educational Technology 上海乂学教育科技



Stanford Research Institute International 斯坦福国际研究院















平行AI智适应教育联合实验室

Joint Laboratory of Parallel Artificial Intelligence Adaptive Education

中国科学院自动化研究所 上海乂学教育科技有限公司

二零一八年六月

May 2017,

Academic paper Accepted by the 18th AIED Global Summit



AIED 2017

A Comparison Study of Adaptive Learning Systems in China

Zhenyue Zhu, Wei Cui, Zhaohui Xu, and Mingyu Feng

¹ University of California Irvine, USA

² Yixue Education, Shanghai, China

March 2018,

Academic paper Accepted by the 10th CSEDU Global Summit

CSEDU: The International Conference on Computer Supported Education



Yixue Adaptive Learning System and Its Promise On Improving Student Learning

Haoyang Li¹, Wei Cui¹, Zhaohui Xu¹, Zhenyue Zhu², and Mingyu Feng³

¹Shanghai YiXue Educational Technology Inc., 10 Jianguozhonglu #5110, Shanghai, China

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³Center for Technology in Learning, SRI International, 333 Ravenswood Ave, Menlo Park, CA 94025, USA {lihaoyang, cuiwei, xuzhaohui}@classba.cn, zhenyuez@uci.edu, mingyu.feng@sri.com

March 2018,

Academic paper Accepted by the 19th AIED Global Summit

Adaptive Learning Goes to China

Mingyu Feng^{1(⊠)}, Wei Cui², and Shuai Wang¹



19th International Conference on

Artificial Intelligence in Education

The Festival of Learning, London, UK

June 27-30, 2018

#AIED18

March 2018, Was invited to

speech at the UMAP conference hosted by ACM

ACM: Association for Computing Machinery





Learning From an Adaptive Learning System: Student Profiling Among Middle School Students

Shuai Wang Center for Education Research & Innovation Mingyu Feng
Center for Education Research &
Innovation

Wei Cui Yixue Education Shanghai, China



Speech at the 27th Global Al Conference IJCAI-ECAI







The Chief Architect Richard Tong held a speech at IJCAI-ECAI global conference, and discussed Al application related topics with Dr. Yann Lecun, Director of Al Research at Facebook, a founding father of convolutional nets, Director of NYU Center for Data Science











Market capitalization
Annual revenue

RMB: 93.7bn RMB: 11.9 bn RMB: 97.7bn RMB: 6.9 bn RMB: 6.8 bn

RMB: 2.3 bn RMB: 3 bn RMB: 1.8 bn RMB: 2 bn

The K12 after- School turtoring market is about RMB 500 bn The top 5 companies represent less than 5% of the market share

Main reasons

Good teachers are far fewer than enough

Teachers can only look after certain number of the students, unable to provide personalized teaching

Geographical restrictions and online/offline affect of the teaching process



The Annual Champion of Fortune China Innovation Competition 2017







Awards and Accolades

Yixue has been ranked as No. 1 in Al startups by many famous medias in China, and been awarded the Most Potential Investment Company.

- The most promising artificial intelligence company -- Iresearch
- Best Investment Value Award in the field of artificial intelligence education --Leifeng
- **创业邦** Top 50 Chinese Artificial Intelligence Innovation Companies --Entrepreneurship
- Top 50 Most Valuable Artificial Intelligence Companies -- Black horse in Entrepreneurship
- ▼ Top 30 Chinese Artificial Intelligence Innovation -- Yiou
- Top 50 star companies in new-intelligent-manufacture of Year 2017 -- Leifeng
- Pioneer in Artificial Intelligence -- Tencent Al Accelerator
- Top 100 Chinese artificial intelligence future enterprise -- "Internet Weekly" & eNet
- Cutting-edge technology products -- TMTPOST
- Most influential Chinese extracurricular tutoring brand --SINA
- Well-known online education brand --Tencent



Endorsement







最 林















Yixue Squirrel Open Al Platform

Al Adaptive Learning system + Personalized contents

=Squirrel Open Al Platform

Our commitment

"Sparkle from student's eye

Let the students using Yixue Squirrel AI have happy and confident sparkles in stead of the tired glimmer from the excessive assignments in their eyes.



"Super Al teacher"

As erudite as **Socrates**, as versatile as **Da Vinci**, and as intelligent as **Einstain**.



让每一个孩子身边都有一个像苏格拉底 + 达芬奇 + 爱因斯坦合体的AI老师

Let every child have an Al teacher like Socrates + Da Vinci + Einstein

Thank You

