

Storyfier: Exploring Vocabulary Learning Support with Text Generation Models

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A Dictionary

Target words: athlete × avid × frequently × **cramp** × cream × + New Word

Word info.: **cramp** /kræmp/ n. Definition: a sudden painful tightening of muscle in a part of the body. 中文: 痉挛, 绞痛

Examples: A cramp is a sudden, strong pain in a muscle like the calf or back.

[Learn words with story](#)

☒ Read Story > ☐ Story Cloze Test > ☐ Co-write Story

2 + step bars & buttons

Title: cramp

Tom was an **avid** **athlete**. He **frequently** ran marathons. One day he got a **cramp**.

Tom tried **cream** but it did n't help. He had to go to the hospital.

Next step

C Story cloze test

☒ Read Story > ☒ Story Cloze Test > ☐ Co-write Story

Tom was an athlete frequently. He frequently ran marathons

One day he got a cramp. Tom tried cream but it did n't help.

He had to go to the hospital.

Submit You got 3/5 correct

Previous step Next step

E Story writing (human only)

cane breadth cease blitch amid

I

Grammar Err.:

The story has successfully used 0 target words (5 left).

Your turn: 0 words.

D Story co-writing with AI

☒ Read Story > ☒ Story Cloze Test > ☒ Co-write Story

athlete avid frequently cramp cream

3 Start turn with human first

I was an athlete.

I was an avid marathoner.

I frequently <Tab> sentence 4.1

Alas, I got a cramp.

I tried the cream but it did not work. <Tab> sentence 4.2

Grammar Err.:

The story has successfully used 5 target words (0 left).

turn: 20 words V.S. turn: 13 words.

5 Simplify the writing feedback

Lexical Diversity # of words: 33 ▲, # of unique words: 27 ▲, Type-token ratio: 0.818 ▼

Lexical Coherence Trigram repetition: 0 -, Sentence coherence: 0.575 ▲

Previous step Next step

Motivation

- Existed tools fall short in 2 aspects:



Only leverage existing materials



lack of flexibility



Use language receptively



lack of prodctive task to master usage of words

Design & develop phases

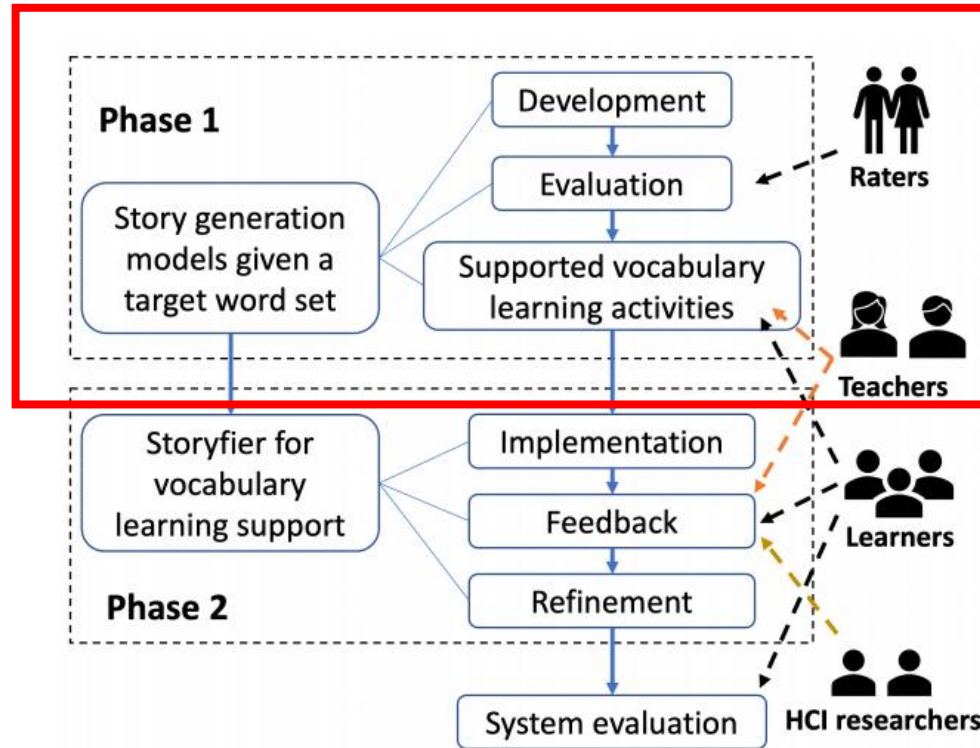


Figure 1: Our two-phases design and development process of *Storyfier* with teachers, learners, and HCI researchers.

In the whole 2-phases develop procedure, phase 1 mainly consists of 3 steps:

- develop **story generation model**;
- **validation** of the model;
- **explore learning activities** supported by this model.

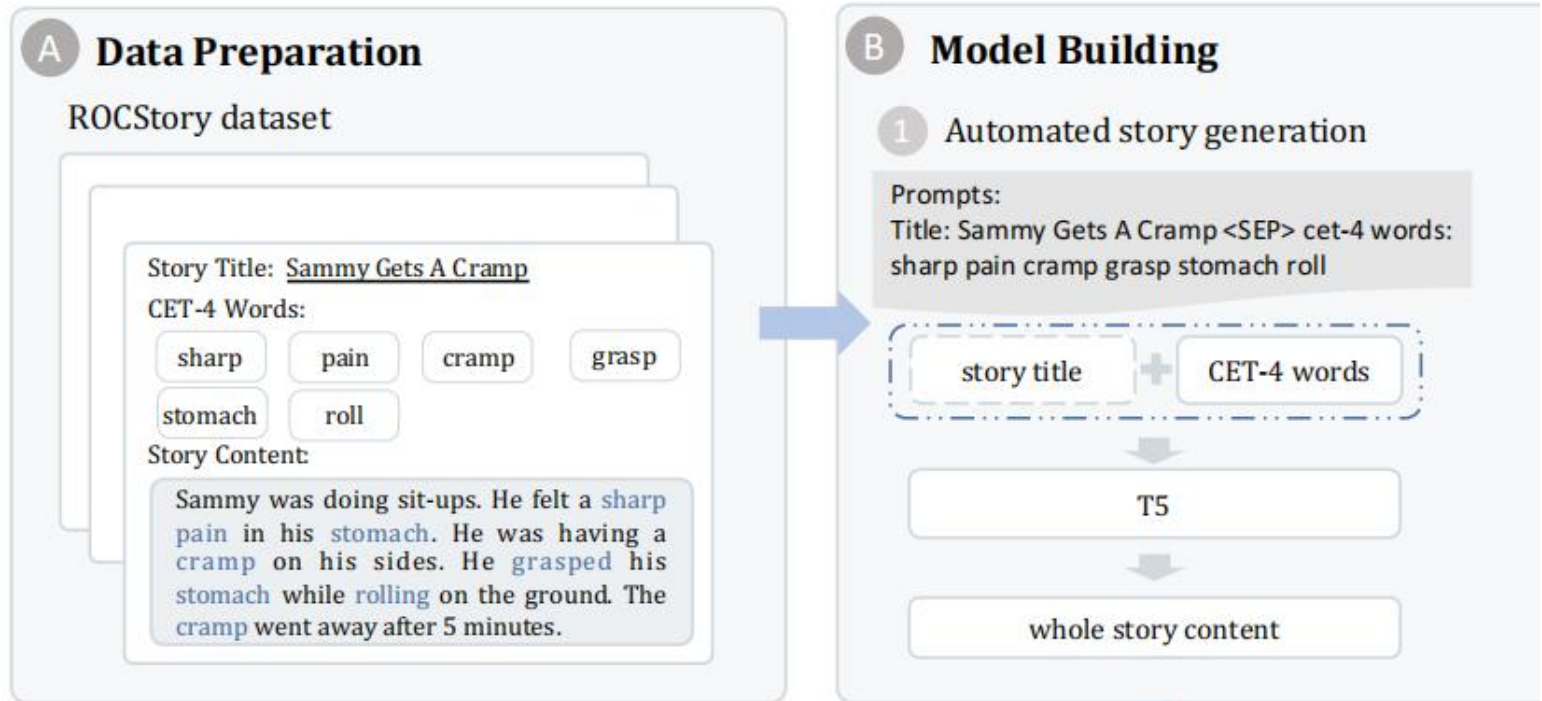
Model development

- Target: controllable model which can generate stories with target word sets

Attributes	Values
# of stories	101,661
# of words	4,640,319
Average story length	45.65
Average sentence length	7.80
Average readability	57.14
Coverage of CET-4 words	89.52%



tuple: { *story title*, *target words*, *story sentences* }



Model validation

- **Validating object:** 20 human-machine story pairs

20 stories from ROCstory with varied difficulty levels of contained words

20 stories generated by model based on corresponding story title and contained words

- **Validation methods:** technical and human

Automatically evaluated



	Grammar	Type-token ratio	Trigram repetition	Sentence coherence
Human	1.00	0.75	0.01	0.42
Machine	1.00	0.77	0.01	0.43

Evaluated by English skilled people



	Coherence *	Relevance *	Interestingness	Overall
Human	4.53	4.58	4.08	4.26
Machine	3.92	4.33	3.97	4.01



Adequate

Explore learning activities



- Explore possible activities by conducting **semi-structured interviews**
- **interviewees:** skilled English **teacher** and well-experienced **students** in using vocabulary learning tools



Interact with rough interface to try generative model and brainstorm



Providing ideas of leveraging generative model to support vocabulary learning



- Story reading
- Cloze test
- Turn-taking writing

Design & develop phases

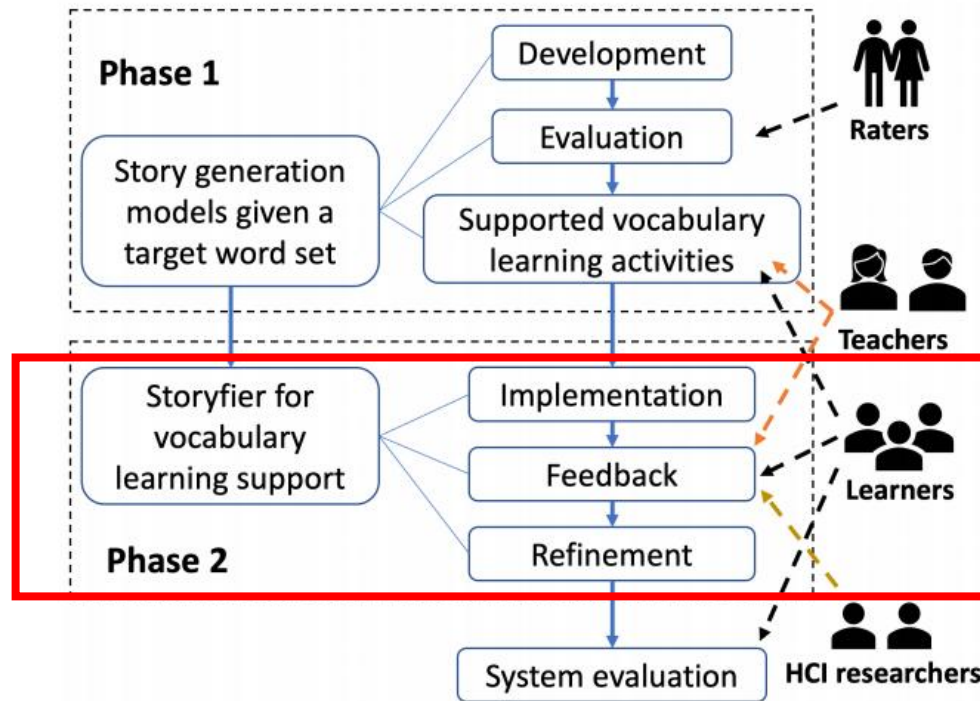


Figure 1: Our two-phases design and development process of *Storyfier* with teachers, learners, and HCI researchers.

In the whole 2-phases develop procedure, phase 2 mainly consists of 3 steps:

- system **implementation**;
- tests for **feedback**;
- **refinement** according to feedback.

design process about how to implement storyfier

System implementation

Target words: athlete × avid × frequently × **cramp** × cream × + New Word

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Learn words with story

Read Story

Story Cloze Test

Co-write Story

Title: cramp

Tom was an **avid** **athlete** . He **frequently** ran marathons . One day he got a **cramp** .

Tom tried **cream** but it did n't help . He had to go to the hospital .

Next step

1 + Chinese translations

2 + step bars & buttons

Dictionary

Story reading

Read Story

Story Cloze Test

Co-write Story

Tom was an athlete frequently . He frequently ran marathons

One day he got a cramp . Tom tried cream but it did n't help .

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Submit

You got 3/5 correct

Previous step

Next step

Story cloze test

cane breadth cease bitch amid

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Story writing (human only)

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Story Cloze Test

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athlete avid frequently cramp cream

3 Start turn with human first

I was an athlete .

I was an avid marathoner .

I frequently <Tab> sentence 4.1 run marathons.

Alas , I got a cramp .

I tried the cream but it did not work . <Tab> sentence 4.2 I tried the cream but it did not work

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5 Simplify the writing feedback

Lexical Diversity

of words: 33 , # of unique words: 27 , Type-token ratio: 0.818

Lexical Coherence

Trigram repetition: 0 - , Sentence coherence: 0.575

Previous step

Next step

Tom was an avid athlete .

He did exercise frequently .

He got a cramp while running .

Story co-writing with AI

9

Test for feedback & refinement

- **Target:** not to evaluate system effectiveness but to **improve** with quick feedback

Usability test with **12 ESL learners**

- Storyfier is **more useful** than baseline with out context;
- Some **have difficulties in writing** next sentence in turn-taking writing.

Workshop with **English teachers**

- Maximize 3 activities's value by chaining into a flow;
- Add main **translation**

Workshop with **HCI researchers**

- Use **clear widgets** in learning flow;
- **Remove metrics** to reduce distraction

refinement after test and workshops

System refinement

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Title:

Tom was an **avid** **athlete**. He **frequently** ran marathons. One day he got a **cramp**.

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1 + Chinese translations

2 + step bars & buttons

B Story reading

☒ Read Story > ☒ Story Cloze Test > ☐ Co-write Story

C Story cloze test

Tom was an **athlete**. He **frequently** ran marathons.

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E Story writing (human only)

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👤 Your turn: 0 words.

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D Story co-writing with AI

3 Start turn with human first

👤 I was an **athlete**.

🤖 I was an **avid** marathoner.

👤 I **frequently** <Tab> sentence 4.1 run marathons.

🤖 Alas, I got a **cramp**.

👤 I tried the **cream** but it did not work. <Tab> sentence 4.2 I tried the cream but it did not work.

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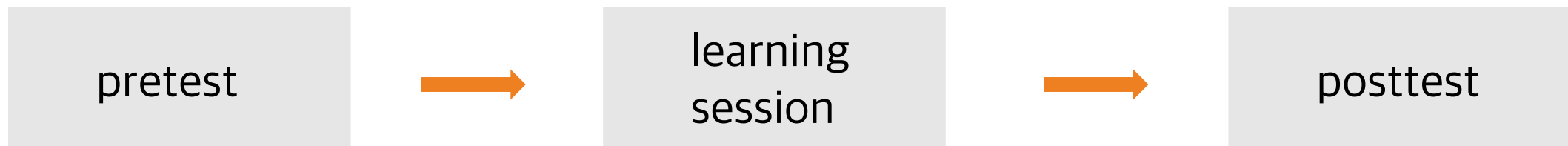
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Experiment

- **Subjects:** 28 ESL Chinese students (1 / 12 have not passed CET-4)
- **Conditions:** 2 (with vs. without AI features) x 2 (read-only vs. read-cloze-write activities)
- **Research Questions:**
 - Learning outcome
 - Experience
 - Perceptions towards Storyfier
- **Procedure:**



verify the impact of Storyfier on vocabulary learning

Experiment

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I was an **athlete**.

I was an **avid** marathoner.

I **frequently** run marathons.

Alas, I got a **cramp**.

I tried the **cream** but it did not work.

4.1 sentence

4.2 sentence

Grammar Err.: I tried the cream but it did not work.

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- Read-only
 - with AI A+B
 - without AI A
- Read-cloze-write
 - with AI A+B+C
 - without AI A+B+D

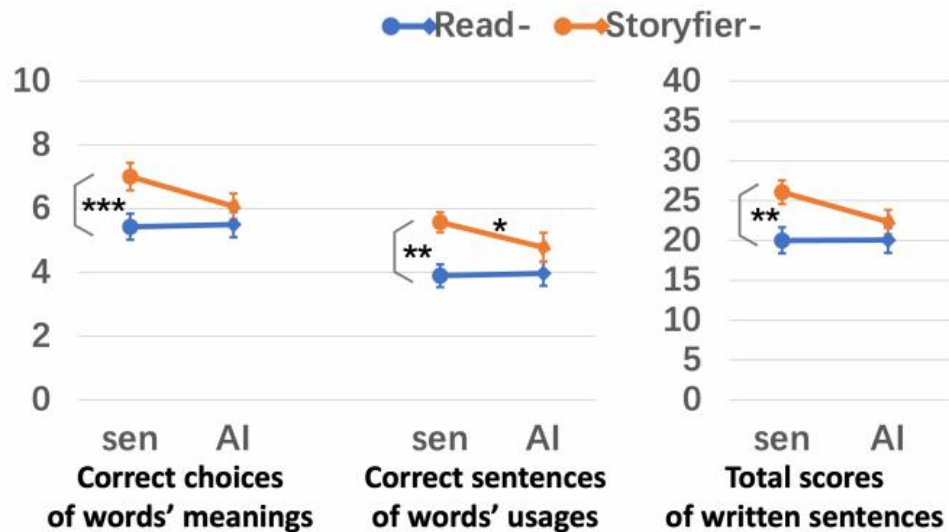


Figure 5: RQ1 results regarding numbers of correct choices on target words' meanings, numbers of sentences that correctly use target words, and total scores of the written sentences in each condition. ***: $p < 0.001$, **: $p < 0.01$, *: $p < 0.05$.

- Read-cloze-wirte learning session has **better performance** comparing to plain reading session;
- Storyfier's **AI features reduce learning gains** on retention words' meanings in read-cloze-wirte learning session.

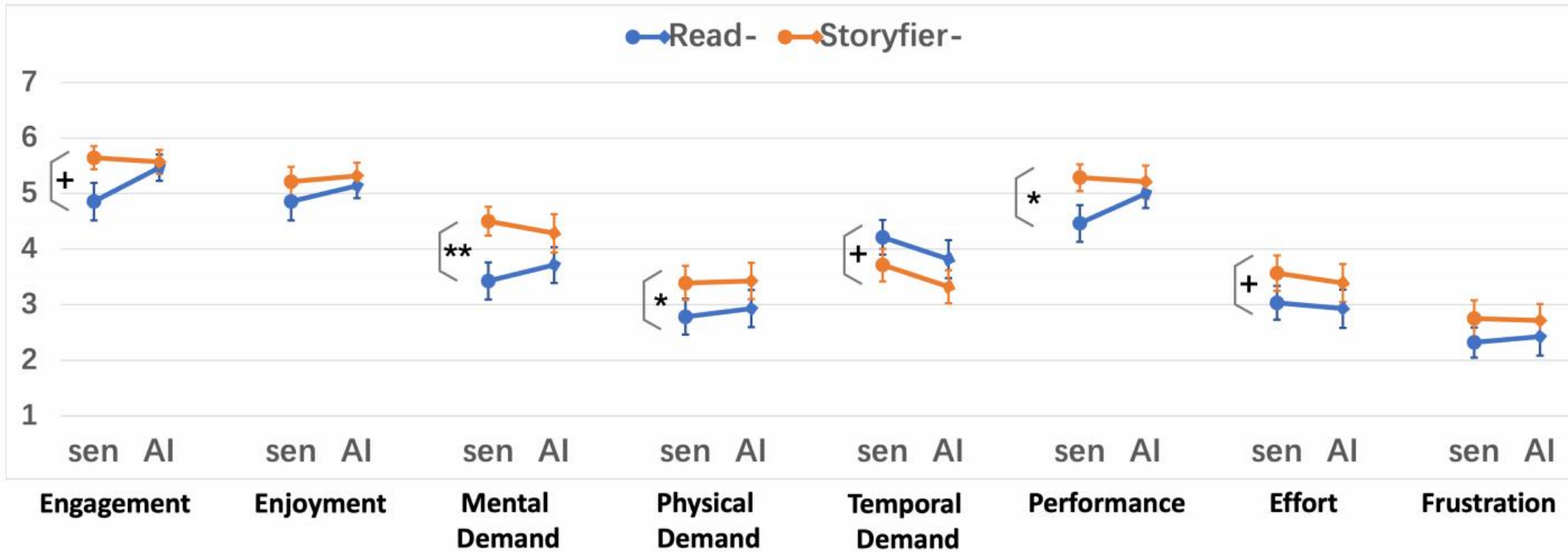


Figure 6: RQ2 results regarding perceived engagement, enjoyment, and workload in vocabulary learning sessions with Read-sen, Read-AI, Storyfier-sen, and Storyfier-AI interfaces. **: $p < 0.01$, *: $p < 0.05$, +: $p < 0.1$.

Analyses and results

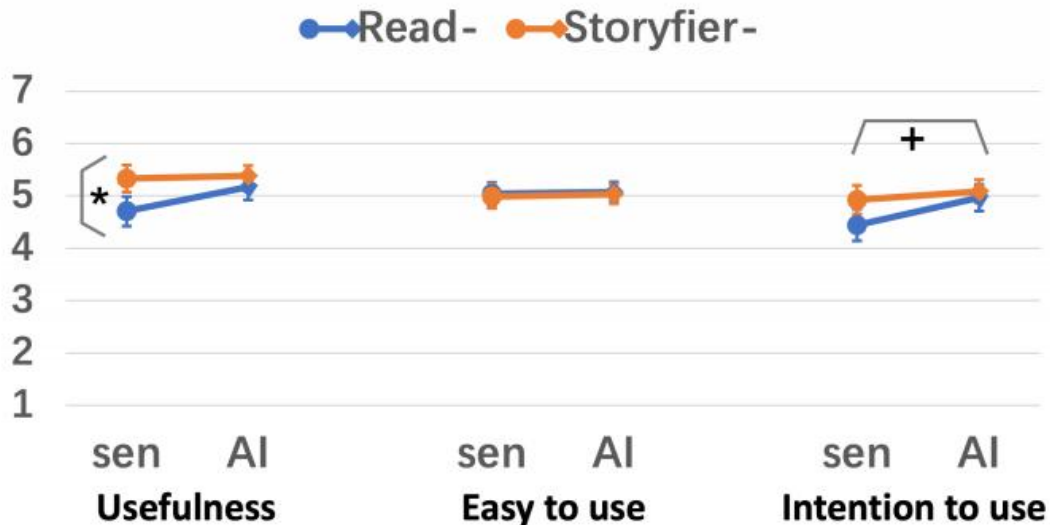


Figure 7: RQ3 results regarding user perceptions with each interface. *: $p < 0.05$, +: $p < 0.1$.

- quantitative:
 - prefer read-cloze-writing session than read-only;
 - find AI-generated stories more useful and feel ready to use in read-only session.
- qualitative:
 - participants generally prefer Storyfier with AI generative models;
 - model should be further improved regarding coherence, complexity and style of content.

- **generative model:**
 - **not enough coherent** when 5 target words are not naturally relevant;
 - stories contain unknown words -> content too **complex**.
- **learning activities:**
 - read-cloze-writing session provides **more learning gains**.
- **impact of generative model in learning:**
 - though AI-generated stories do not improve learning gains -> more **coherent** content could help;
 - AI support leads to reduced learning gains in read-cloze-writing sessions -> participants favor **assistance** from generative model in writing.

Discussion

design consideration

- integrate **mutiple activities** to provide in-situ assistance;
- provide **feedback** relevant to learning goals;
- **balance** machine and human **efforts**

limitation

- Only consider **main meaning** of vocabularies;
- **quality** of stories (balance trade-off between simplicity and coherence);
- no quantitative evaluation of contribution from cloze and writing **seperately**.

Thank you