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## Motivation

- Can human-machine collaboration improve open-domain neural story generation?
- Can it improve specific story aspects, as well as overall quality?

Previous approaches to human-machine collaboration offer limited interaction. We design a system that enables human interaction at multiple stages of the process: [story-planning](#), [story-writing](#), [diversity controls\\*](#), and [model-selection](#).

### Sample Interaction

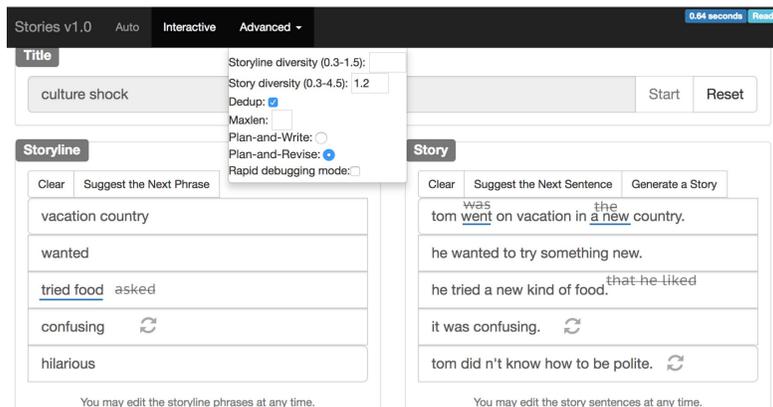
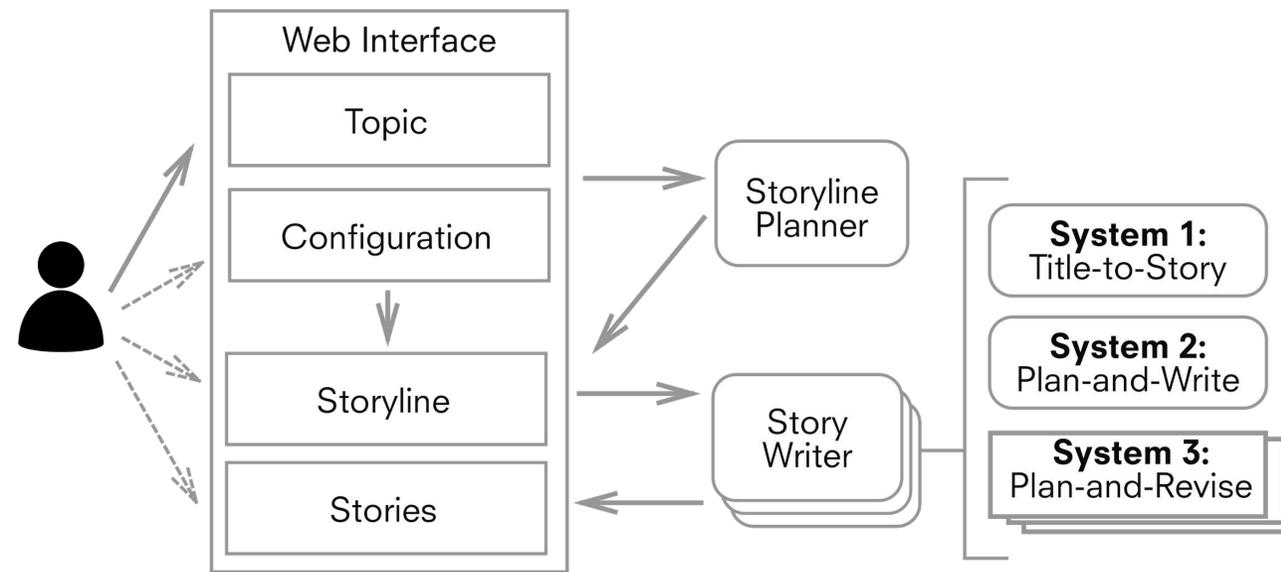


Figure 1: full-interaction capabilities, annotated with user actions from an example study. Interaction is iterative: a user can edit or regenerate any element at any time.

We conduct user studies for multiple interaction scenarios. We constrain experiments to 10 minutes, and explore *full-interaction*, *story-only*, *storyline-only*, and *diversity-only* variations.

\**diversity controls* are softmax temperatures, which control the unusualness of system generations

## Demo Diagram



## Metrics

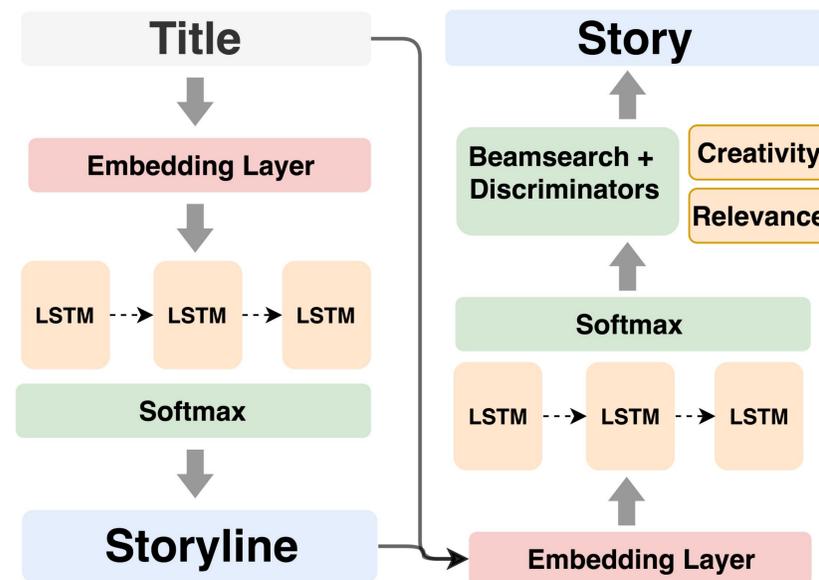
### Self-reported (subjective)

Subjects self-report on their engagement, satisfaction with their story, and perception of story quality.

### Independent Ranking

Independent human judges are asked to rank all stories from 1-5 under eight experiment conditions for **Overall Quality**, **Relevance**, **Creativity**, and **Causal-Temporal Coherence**.

## System



## Data

**ROC Stories:** 98,162 commonsense stories data split into 8:1:1 for training, dev and test sets. Storylines are extracted via RAKE (a keyword extraction algorithm) as in Yao et al (2019).

## Results

Experiment	Overall	Creative	Relevant	C-T
Machine	2.34	2.68	2.46	2.54
Diversity only	2.50	2.96	2.75	2.81
Storyline only	3.21	3.27	3.88	3.65
Story only	3.70*	<b>4.04</b>	3.96*	<b>4.24</b>
All	3.54	3.62	3.93*	3.83
All + Creative	<b>3.73</b>	3.96*	3.98*	3.93*
All + Relevant	3.53*	3.52	<b>4.05</b>	3.91*
All + C-T	3.62*	3.88*	4.00*	3.98*

Table 1: Results for all experiments. Best scores per metric are bolded, scores not significantly different ( $\alpha = 0.1$ , per Wilcoxon Signed-Rank Test) are starred. C-T stands for Causal-Temporal Coherence, the + experiments are the extensions where the user focuses on improving a particular quality.

- humans tasked with improving a specific story aspect are successful at doing so
- interaction at both *planning* and *writing* stages improves story quality 10-50% over the less interactive baselines.
- additional interaction increases user self-reported satisfaction.

We adapt the **Plan-and-Write** system; a storyline planning to story generation pipeline (Yao et al 2019) to enable interaction at the story-planning stage. We include their Title-to-Story baseline (no planning stage) and create a new **Plan-and-Revise** system, which incorporates two discriminators for *Relevance* and *Creativity*, as in Holtzman et al. (2018).