# Data-to-text generation across domains? Take trivial templates & fuse them one-by-one!

## Data-to-Text Generation with Iterative Text Editing

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### **Summary**

- We generate text from RDF triples by iteratively fusing simple templates for each predicate with a neural model.
- Our approach maximizes semantic accuracy of the text with strict entity matching and limited vocabulary of the model.
- Text generation is possible even without any in-domain examples: zero-shot domain adaptation.

## Data & Templates

## Datasets

- WebNLG (Gardent et al., 2017) DBpedia
- E2E (Dušek et al. 2019) restaurants
- + **DiscoFuse** (Geva et al. 2019) sentence fusion
- > Training data:  $lex(n \text{ triples}) + \text{template} \rightarrow lex(n+1 \text{ triples})$
- > Templates: automatically extracted from the datasets (+ fallback)



**X<sub>i-1</sub>** = Dublin is the capital of Ireland. **t<sub>i</sub>** = (Ireland, **language**, English)

English is spoken in Ireland. One of the languages of Ireland is English. English is the official language of Ireland. **X<sub>i-1</sub> lex(t<sub>i</sub>)** = Dublin is the capital of Ireland. English is spoken in Ireland.



**X<sub>i</sub>** = Dublin is the capital of Ireland, where English is spoken.

 Dublin is the capital of Ireland., where English is spoken in Ireland.
 ✓
 0.9

 Dublin is the capital of Ireland., where English is spoken in Ireland.
 ✓
 0.9

 Dublin is the capital of Ireland. English is the language spoken in Ireland.
 ✓
 0.4

 ...
 ...
 ...

 Sentence Fusion
 Beam Filtering + LMScorer

Template Selection

...

## Approach

- LaserTagger (Malmi et al., 2019): a BERT-based text-editing model trained for sentence fusion
- LMScorer: a pretrained GPT-2 language model (Radford et al., 2019) used for scoring the sentences
- Decoding algorithm

for each triple t<sub>i</sub> do

 $X'_i$  = concatenate the text  $X_{i-1}$  and a template for the triple  $t_i$ apply the sentence fusion model (LaserTagger) on  $X'_i$ filter the fusion hypotheses in the beam with entity matching  $X_i$  = select the best fusion hypothesis with LMScorer

## **Results & Future Work**

### ➤ Results

- the model beats the baseline ( $\sim$ 5-8 BLEU), but not SOTA
- a fused sentence with no entities missing is generated in 50-70% of steps
- otherwise a fallback is used  $\rightarrow$  entities preserved in all cases
- the model trained on DiscoFuse is able to perform simple sentence fusion on both WebNLG and E2E datasets
- Future work: improving the sentence fusion model;
   flexible sentence ordering; better entity matching

#### **Triples** (Albert Jennings Fountain, deathPlace, New Mexico Territory); (Albert Jennings Fountain, birthPlace, New York City); (Albert Jennings Fountain, birthPlace, Staten Island)

- **Text**  $X_0$  Albert Jennings Fountain died in New Mexico Territory.
- **Text**  $X_1$  Albert Jennings Fountain, who died in New Mexico Territory, was born in New York City.
- **Text**  $X_2$  Albert Jennings Fountain, who died in New Mexico Territory, was born in New York City, <u>Staten Island</u>.

**Reference** Albert Jennings Fountain was born in Staten Island, New York City and died in the New Mexico Territory.

0.8

0.3

0.7

• • •

LMScorer



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