

## Sequence to sequence models

## Error analysis on beam search

## Example

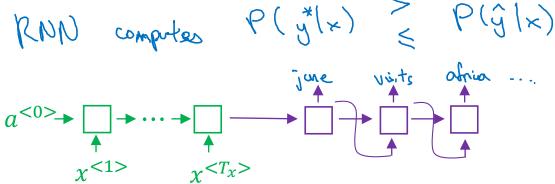
>RNN >Beam Seal

BT

Jane visite l'Afrique en septembre.

Human: Jane visits Africa in September.

Algorithm: Jane visited Africa last September.  $(\hat{y}) \leftarrow RNN$  computes  $P(\hat{y}|x) \geq P(\hat{y}|x)$ 



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## Error analysis on beam search

P(y\*(x)

Human: Jane visits Africa in September.  $(y^*)$ 

Algorithm: Jane visited Africa last September.  $(\hat{y})$ 

Case 1: 
$$P(y^*|x) > P(\hat{y}|x) \leq$$

ag max P(y/x)

Beam search chose  $\hat{y}$ . But  $y^*$  attains higher P(y|x).

Conclusion: Beam search is at fault.

 $y^*$  is a better translation than  $\hat{y}$ . But RNN predicted  $P(y^*|x) < P(\hat{y}|x)$ .

Conclusion: RNN model is at fault.

Error analysis process

Human	Algorithm	$P(y^* x)$	$P(\hat{y} x)$	At fault?
Jane visits Africa in September.	Jane visited Africa last September.	2 × 10-10	1 x 10-10	BR CRR:

Figures out what faction of errors are "due to" beam search vs. RNN model

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