

## Sequence to sequence models

## Refinements to beam search

Length normalization
$$P(y^{(t)}, y^{(t)}) = P(y^{(t)} | x, y^{(t)})$$

$$P(y^{(t)} | x, y^{(t)}) = P(y^{(t)} | x, y^{(t)})$$

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$$P(y^{(t)} | x$$

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## Beam search discussion

Beam width B?

Small B: worse result, faster

Unlike exact search algorithms like BFS (Breadth First Search) or DFS (Depth First Search), Beam Search runs faster but is not guaranteed to find exact maximum for arg max P(y|x).