#### HOW CAN MONOLINGUAL DATA BE USED TO IMPROVE NMT?

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## **Shallow Fusion**

$$\log p = \log p^{\mathsf{TM}} + \beta \log p^{\mathsf{LM}}$$

# Deep Fusion

$$\log p \propto y_t^T (W_o f_o(\mathbf{s}_t^{LM}, \mathbf{s}_t^{TM}, y_{t-1}, c_t) + b_o)$$

 $s_t^{TM}$  - hidden state of translation model

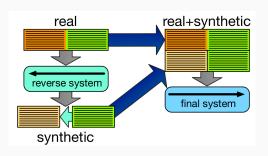
 $\boldsymbol{s}_{t}^{\textit{LM}}$  - hidden state of language model

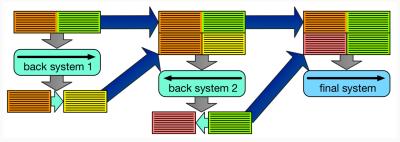
 $f_o$  - single layer NN

c+ - attention vector

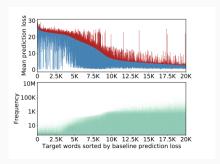
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### ITERATIVE BACK-TRANSLATION FOR NEURAL MACHINE TRANSLATION





### BACK-TRANSLATION SAMPLING BY TARGETING DIFFICULT WORDS



$$\mathfrak{D} = \{ \forall y_i \in V_t \colon freq(y_i) < \eta \}$$

$$\mathfrak{D} = \{ \forall y_i \in V_t : \hat{\ell}(y_i) > \mu \land \sigma(\ell(y_i)) > \rho \}$$

$$Sim(C_m, C_p) = cos(\mathbf{v}(C_m), \mathbf{v}(C_p))$$