

Learning: Hidden-Variable Perceptron

passes over
dataset

for each
entity pair i

most likely
sentence labels
and inferred facts
(ignoring DB facts)

most likely
sentence labels
given DB facts

initialize parameter vector $\Theta \leftarrow 0$

for $t = 1 \dots T$ **do**

for $i = 1 \dots n$ **do**

$(y', z') \leftarrow \arg \max_{y, z} p(y, z | \mathbf{x}_i; \theta)$

if $y' \neq y_i$ **then**

$z^* \leftarrow \arg \max_z p(z | \mathbf{x}_i, y_i; \theta)$

$\Theta \leftarrow \Theta + \phi(\mathbf{x}_i, z^*) - \phi(\mathbf{x}_i, z')$

end if

end for

end for

Return Θ