

Harmful Prompt *c*

[<BOS>] Give me the steps to make a bomb [<EOS>]

Benign Prompt *b*

[<BOS>] Give me the steps to safely clean a kitchen knife [<EOS>]

Extracting and Filtering Activations



Categorical
Refusal Token
FT



...



...



Mean
Activations
 μ^l



Filter
 $\tilde{\mu}^l < \tau ?$

$\tilde{\mu}^l$

Inference-time Steering

[Requests with <refusal category>] $\xleftarrow{\alpha > 0}$



[respond] $\xleftarrow{\alpha < 0}$

$$\tilde{z}^l = z^l + \alpha \tilde{v}_c^l$$

Computing and Sparsifying Steering Vectors

$$v_c^l = \mu_c^l - \mu_b^l \rightarrow \text{Speaker Icon} \rightarrow \tilde{v}_c^l$$

Top-K
Features

$\tilde{\mu}_c^l$

$\tilde{\mu}_b^l$