We propose a symmetry-aware generative model. Our model discovers which (approximate) symmetries are present. We leverage this information to improve data efficiency.







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prototype



Prototypes and Transformation Distributions

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Generative Model





Some Design Choices, Illustrated





(b) Flexible $p_{\psi}(\eta \mid \hat{\mathbf{x}})$

3. $\hat{\mathbf{x}}$ is *fully*-invariant to transformations:



