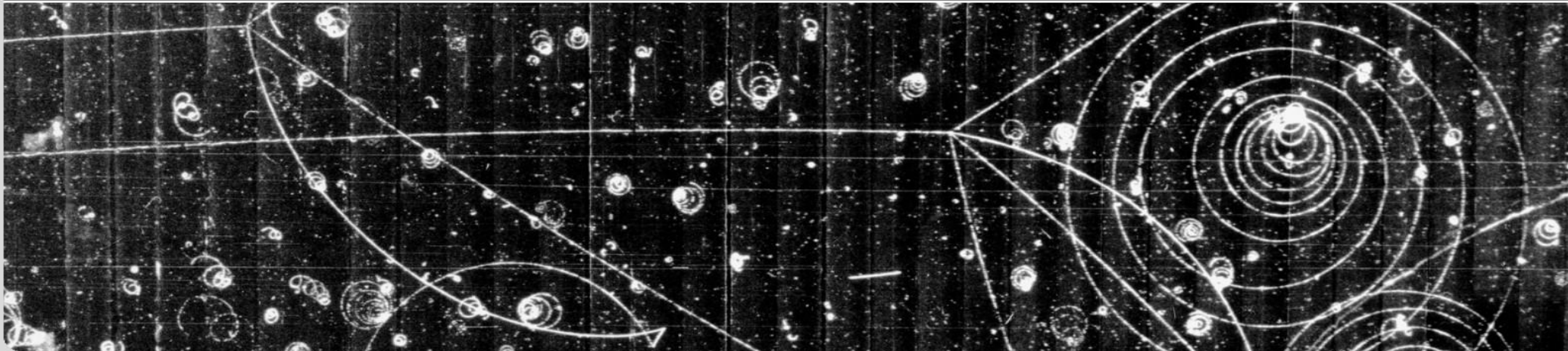


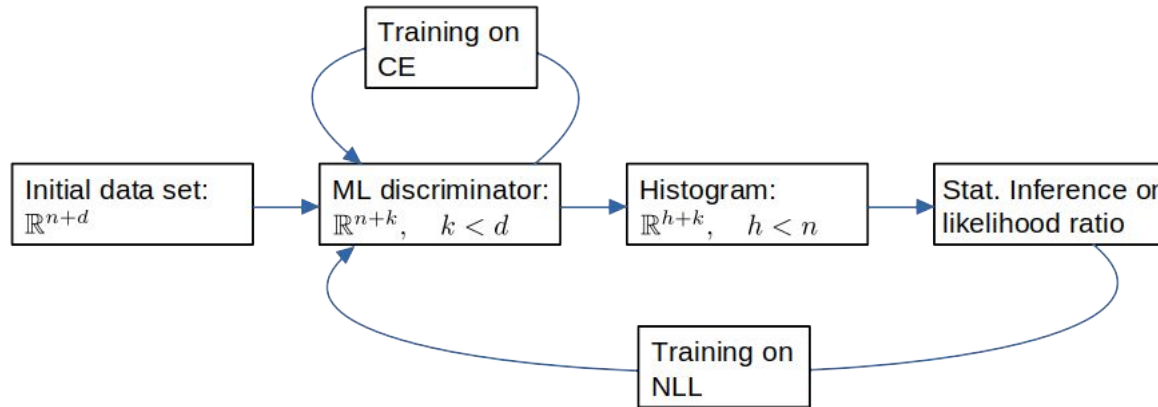
# ML Projects at ETP - CMS

Lars Sowa et al.

Institute for Experimental Particle Physics



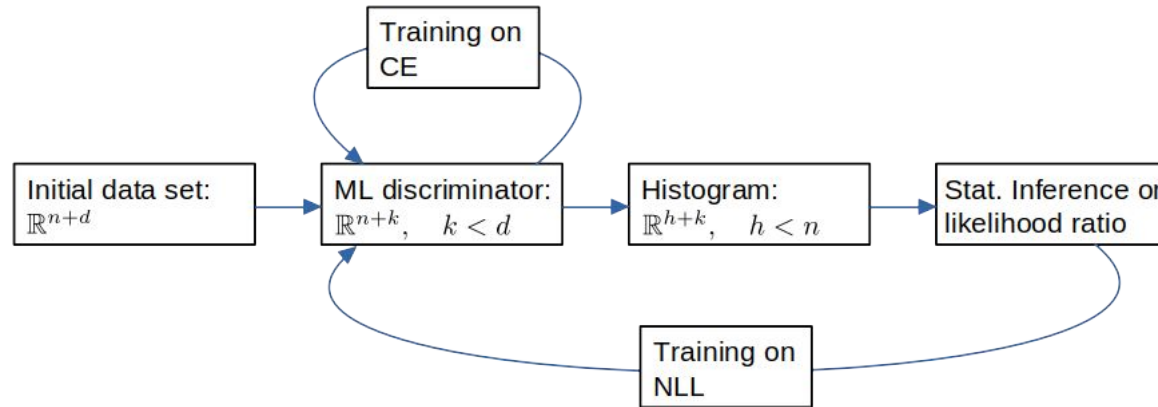
# Systematic-Aware Training



Reduce systematic uncertainties with  
NLL training

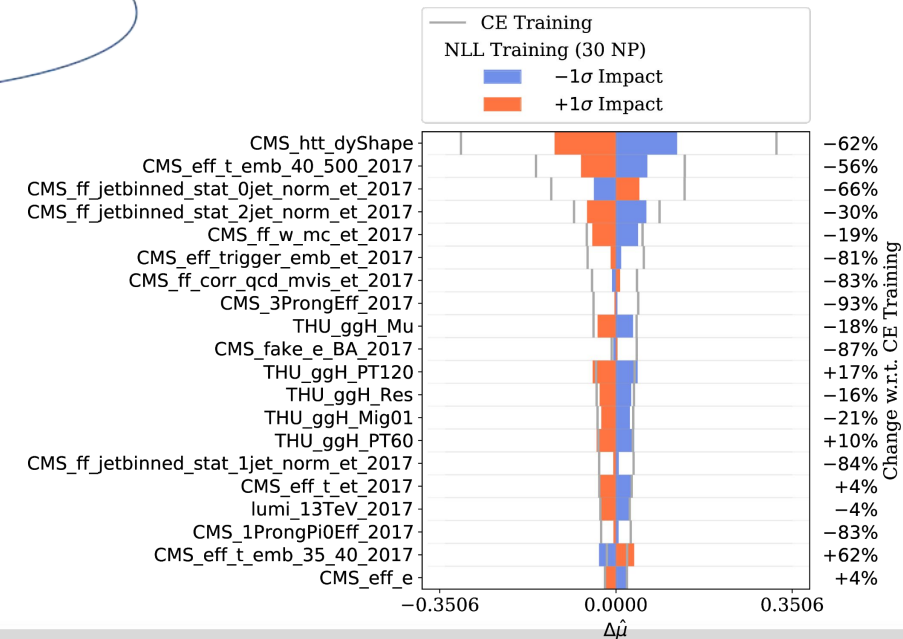
$$\mathcal{L}(\theta) = \prod_{i=1}^h \mathcal{P}(d_i | \mu s_i + b_i + \eta \Delta_i) \cdot \mathcal{N}(\eta)$$

# Systematic-Aware Training



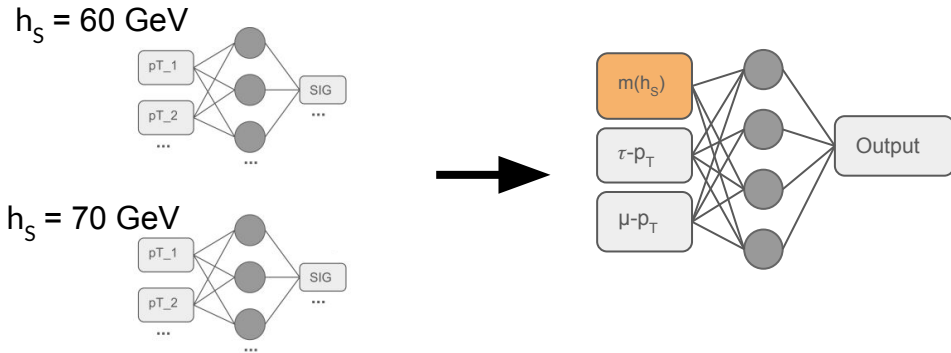
Reduce systematic uncertainties with NLL training

$$\mathcal{L}(\theta) = \prod_{i=1}^h \mathcal{P}(d_i | \mu s_i + b_i + \eta \Delta_i) \cdot \mathcal{N}(\eta)$$

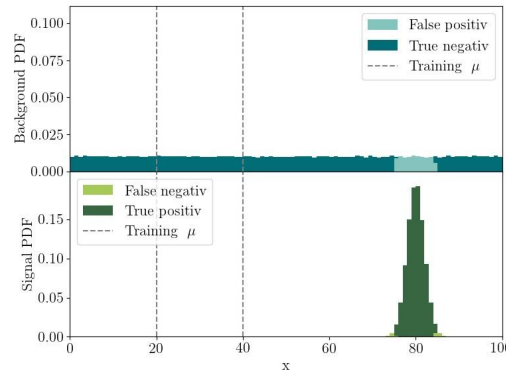


# Parametric Neural Networks (PNNs) for NMSSM Studies

- Use PNNs for large ranges of signal hypotheses

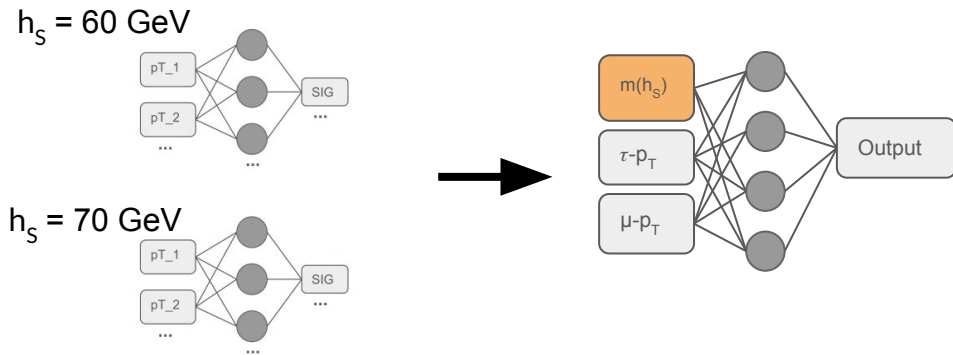


- Reduce training effort
- Great inter-/extrapolation

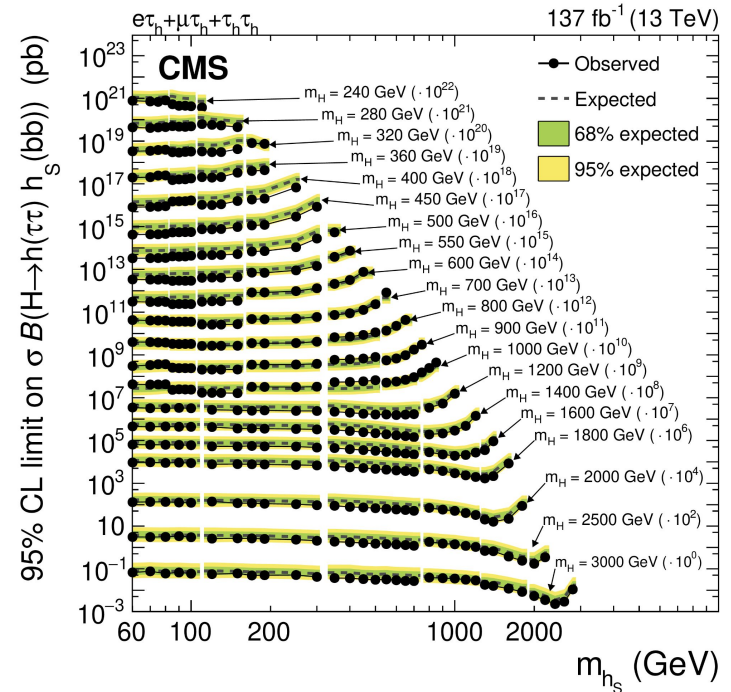
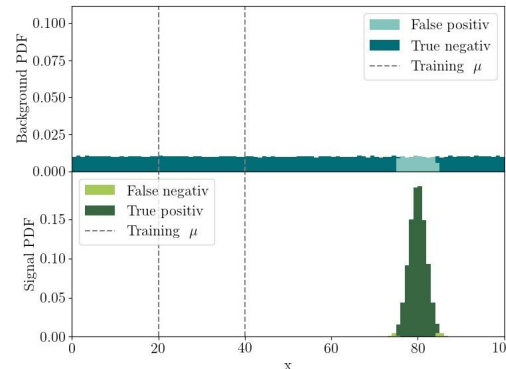


# Parametric Neural Networks (PNNs) for NMSSM Studies

- Use PNNs for variable scans



- Reduce training effort
- Great inter-/extrapolation

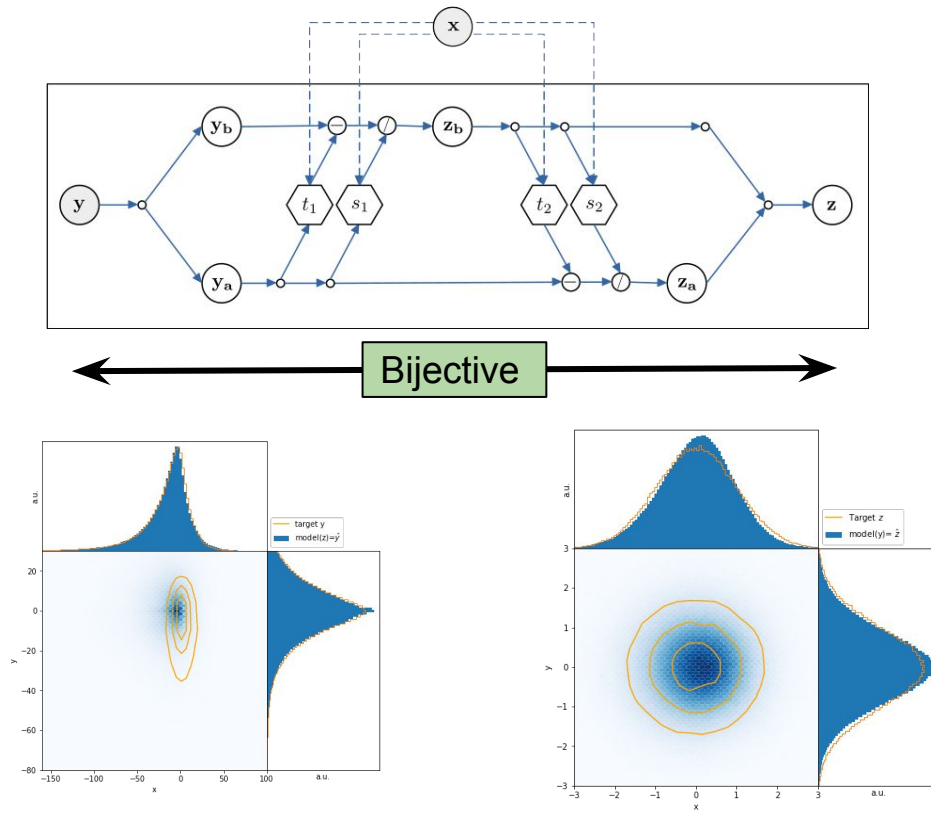


# Normalizing Flows

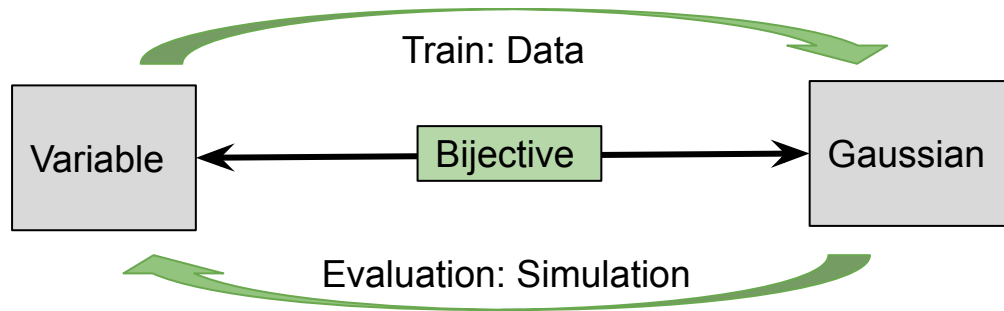
- Learn bijective and probability-preserving functions
- Bonus: use conditions  $x$

→ Unfolding

- Example: Fix mismatch between simulation and data



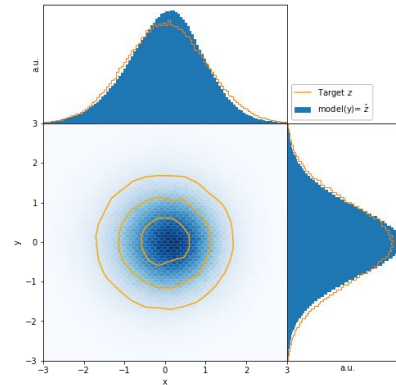
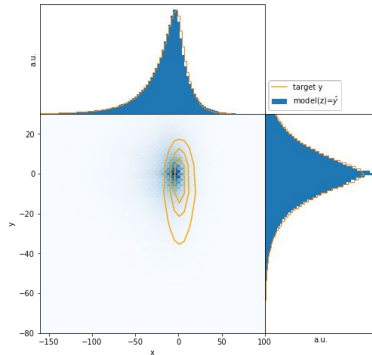
# Normalizing Flows



- Learn bijective and probability-preserving functions
- Bonus: use conditions  $x$

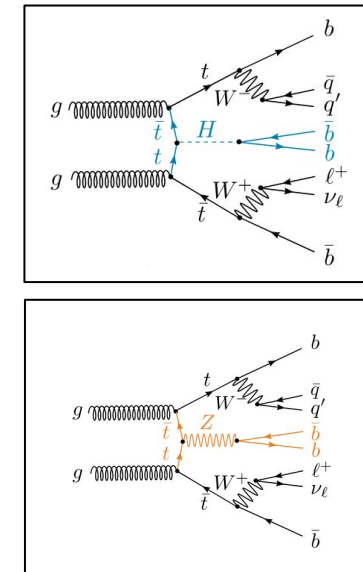
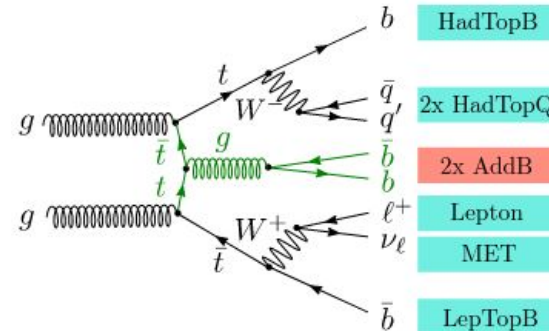
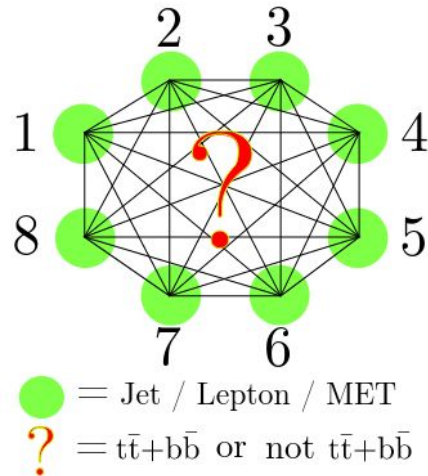
→ Unfolding

- Example: Fix mismatch between simulation and data



# Graph Neural Networks for Identification Tasks

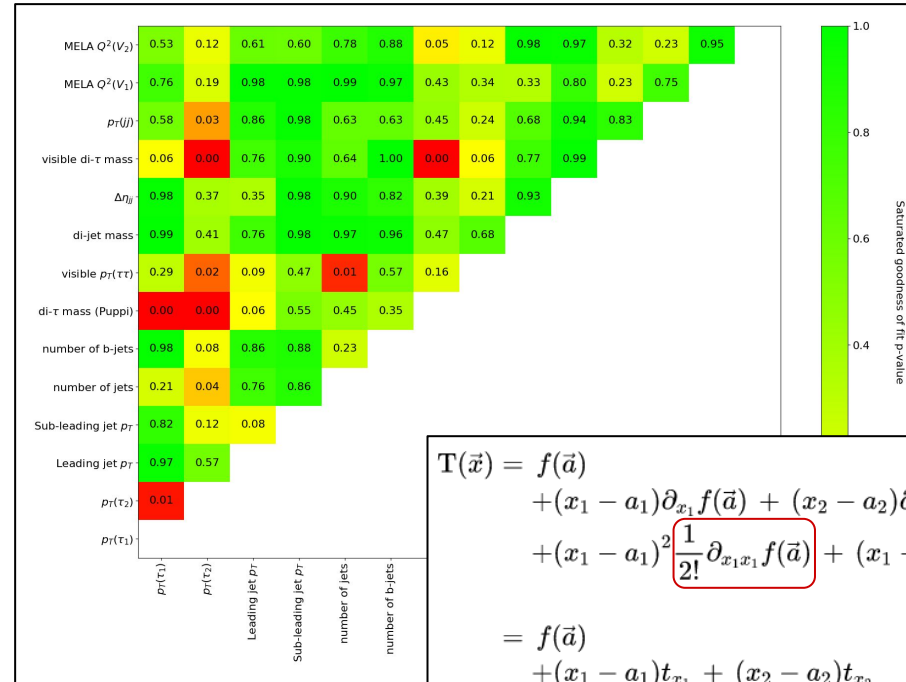
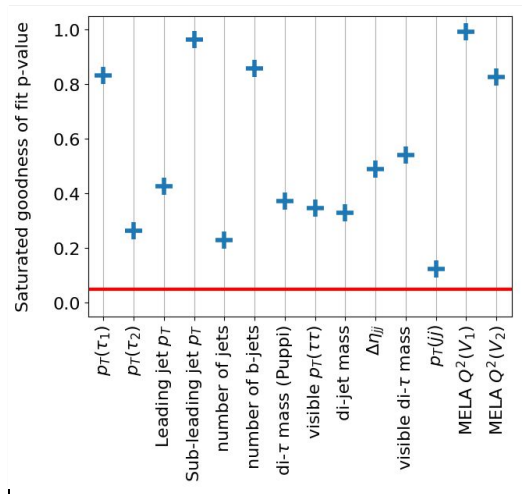
## Graph level classification for $t\bar{t}+X$ processes





# Interest in Automatized Input Space Validation

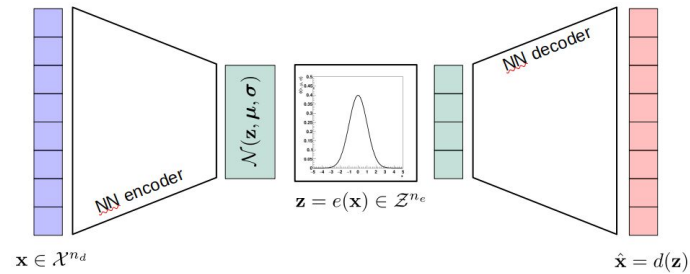
Automatized way of validating and understanding NN feature spaces, based on objective statistical measures (e.g. here based on >1200 GoF tests):



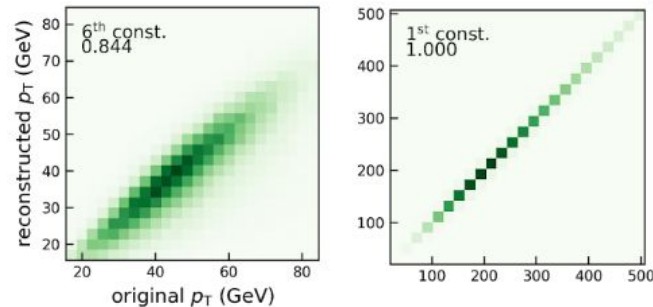
$$\begin{aligned}
 T(\vec{x}) &= f(\vec{a}) \\
 &+ (x_1 - a_1) \partial_{x_1} f(\vec{a}) + (x_2 - a_2) \partial_{x_2} f(\vec{a}) \\
 &+ (x_1 - a_1)^2 \frac{1}{2!} \partial_{x_1 x_1} f(\vec{a}) + (x_1 - a_1)(x_2 - a_2) \partial_{x_1 x_2} f(\vec{a}) + (x_2 - a_2)^2 \frac{1}{2!} \partial_{x_2 x_2} f(\vec{a}) \\
 &= f(\vec{a}) \\
 &+ (x_1 - a_1) t_{x_1} + (x_2 - a_2) t_{x_2} \\
 &+ (x_1 - a_1)^2 t_{x_1 x_1} + (x_1 - a_1)(x_2 - a_2) t_{x_1 x_2} + (x_2 - a_2)^2 t_{x_2 x_2}
 \end{aligned}$$

# Further Interest in Probabilistic Generative NNs

## ■ GANs or VAEs for FastSim Projects (HL-LHC)



## ■ Anomaly detection



**Thank you for your attention!**