

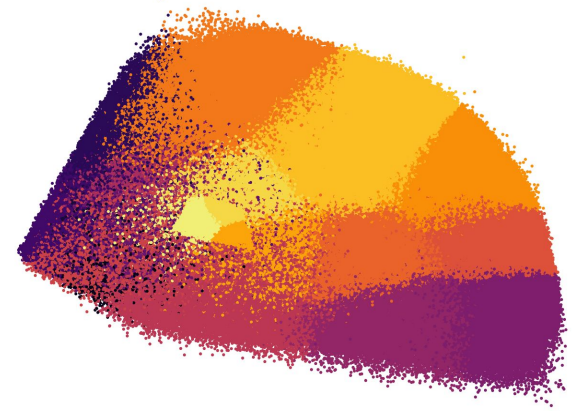
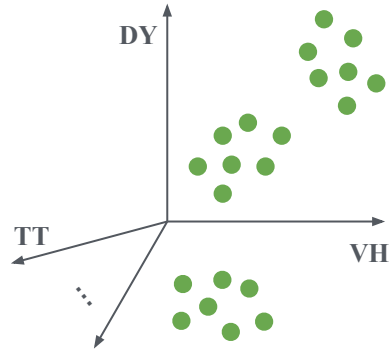


Federal Ministry
of Education
and Research

Funded by



Deutsche
Forschungsgemeinschaft
German Research Foundation



Binning High-Dimensional Classifier Output for HEP Analyses through a Clustering Algorithm

Svenja Diekmann, Niclas Eich & Martin Erdmann

ACAT 2022
28.10.22



RWTHAACHEN
UNIVERSITY

Thank you for voting

Binning High-Dimensional Classifier Output for HEP Analyses through a Clustering Algorithm

Svenja Diekmann, Niclas Eich & Martin Erdmann - RWTH Aachen University

Motivation & Context

- search for VH
- specialised analysis for $gg \rightarrow ZH$ production
- yet unmeasured
- small cross section:
 - need for sensitivity enhancement

Process Assignment by DNN

VH

DY

TT

ST

VV(V)

TTX

W-jets

Standard Approach:

- projection to 1 dimension
- loss of information

High dimensional output:

$$E_1 = (P_{top}, P_{WV}, P_{TT}, \dots)$$

$$E_2 = (P_{top}, P_{WV}, P_{TT}, \dots)$$

$$E_3 = (P_{top}, P_{WV}, P_{TT}, \dots)$$

...

New Approach:

- keep all dimensions
- no loss of information

High-Dimensional Clustering

K-Means Clustering Algorithm:

- random initialisation of k cluster centers
- eventwise assignment to closest cluster
- iterative update of cluster centers by **mean** of assigned events

Binning from Clusters

Identify clusters as bins for likelihood fit

Convergence

Agnostic binning algorithm in high-dimensional space

Visualisation of clusters after convergence by Principal Component Analysis in 2D $k = 20$

Resulting Histograms

- clustering creates high signal and high background regions
- cluster index has no physical meaning
 - sorted by the total signal contribution (red line)

Sensitivity Enhancement

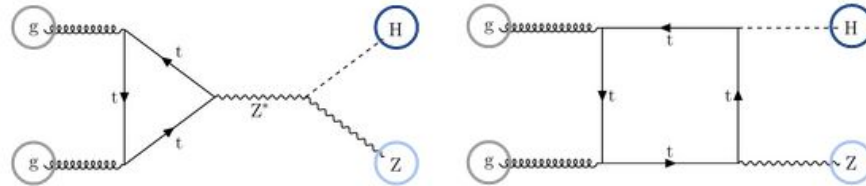
Sensitivity increase for high numbers of clusters:

- improvement compared to the standard method including statistical uncertainties

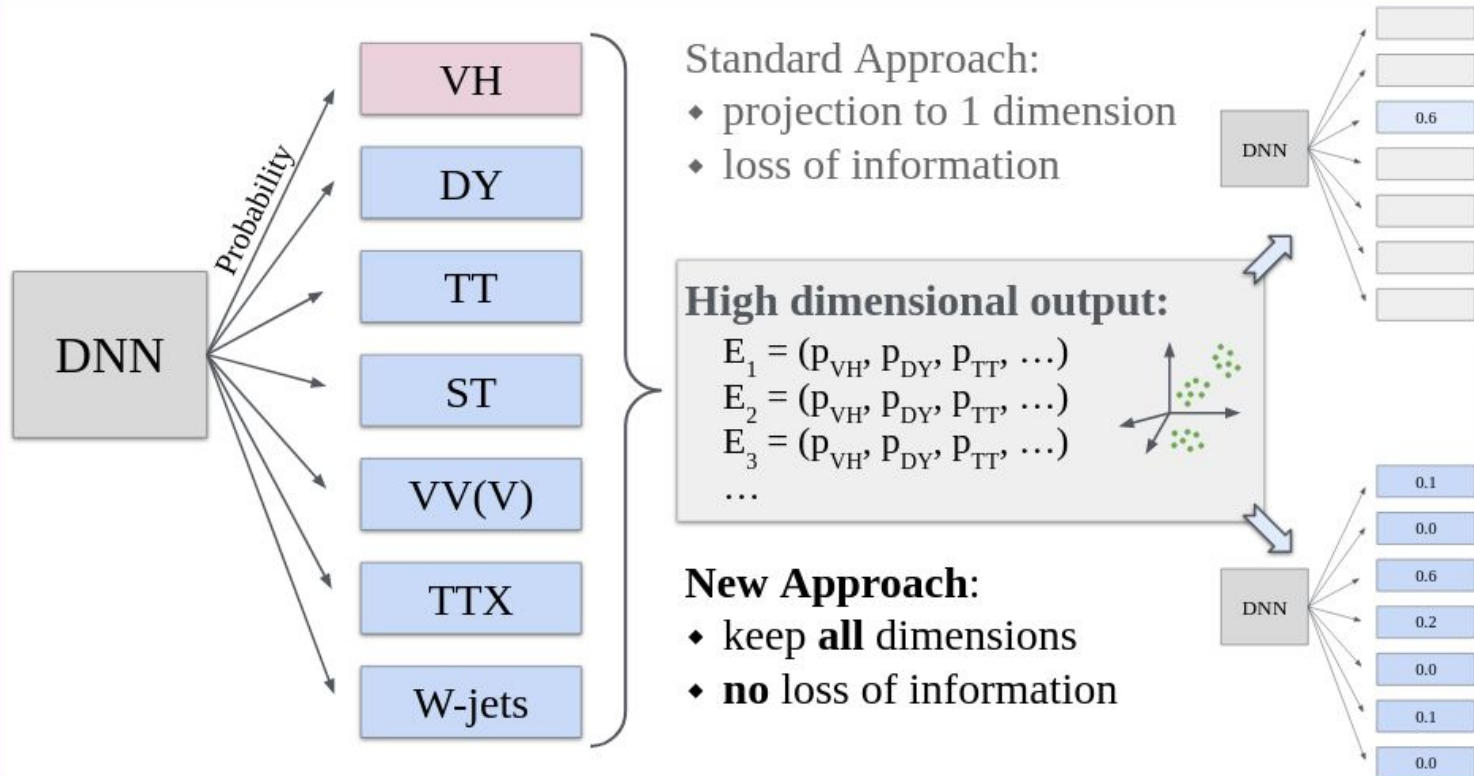
ACAT 2022 - svenja.diekmann@cern.ch DFG Deutscher Forschungsgemeinschaft RWTH AACHEN UNIVERSITY

Motivation & Context

- ◆ search for **VH**
- ◆ specialised analysis for **$gg \rightarrow ZH$** production
- ◆ yet unmeasured
- ◆ small cross section:
 - ◇ need for sensitivity enhancement



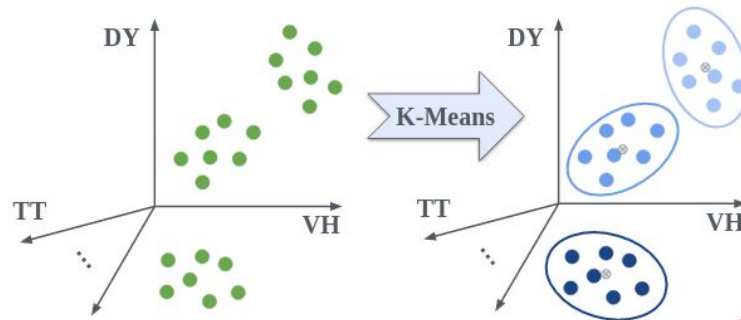
Process Assignment by DNN



High-Dimensional Clustering

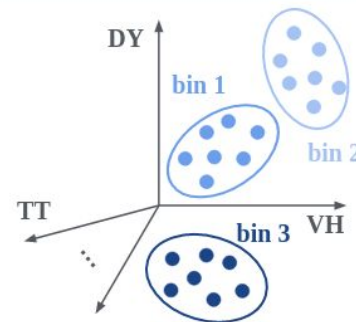
K-Means Clustering Algorithm:

- ♦ random initialisation of k cluster centers
- ♦ eventwise assignment to closest cluster
- ♦ iterative update of cluster centers
by **mean** of assigned events

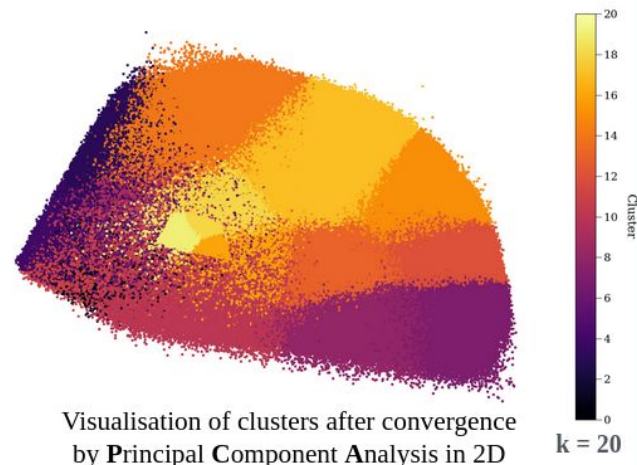


Binning from Clusters

Identify clusters
as bins for
likelihood fit



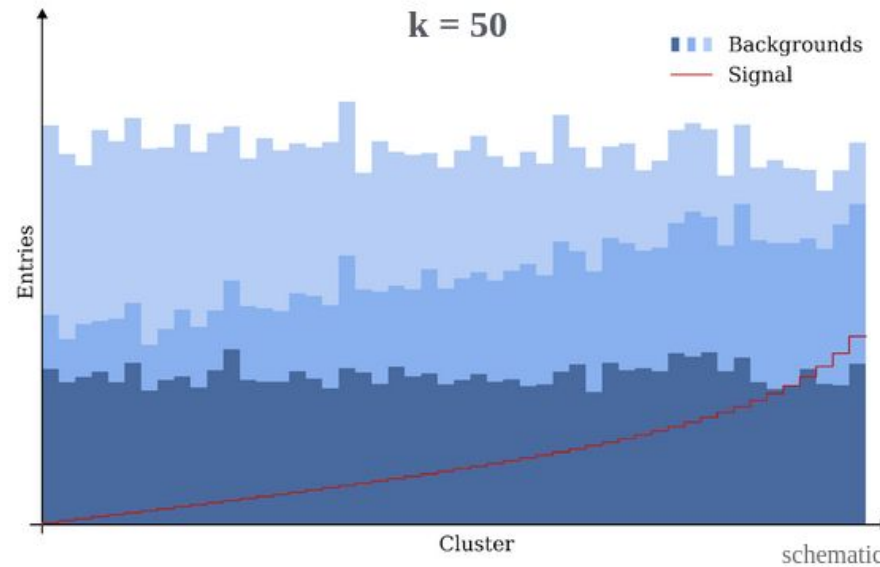
Agnostic binning
algorithm in
high-dimensional
space



Visualisation of clusters after convergence
by Principal Component Analysis in 2D

Resulting Histograms

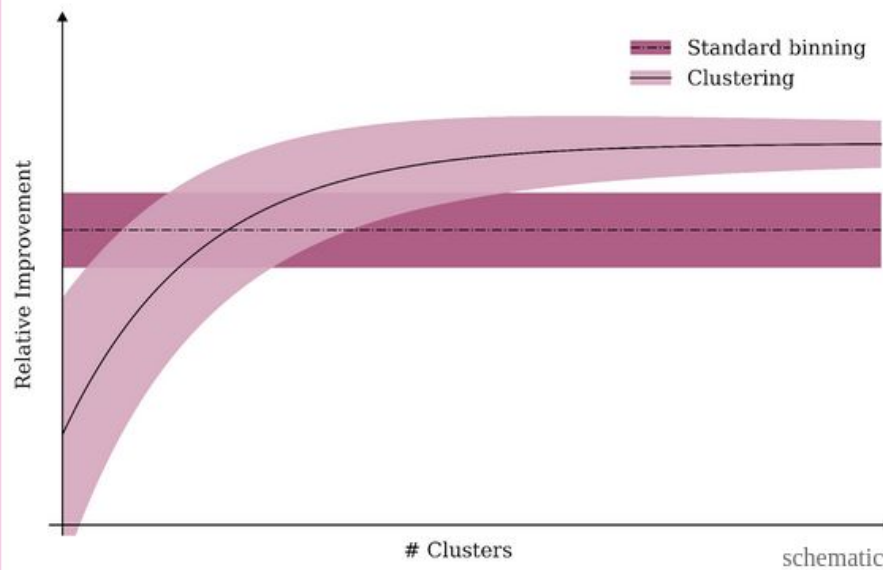
- ◆ clustering creates high signal and high background regions
- ◆ cluster index has no physical meaning
 - ◇ sorted by the total signal contribution (red line)



Sensitivity Enhancement

Sensitivity increase for high numbers of clusters:

- ◇ improvement compared to the standard method including statistical uncertainties



Binning High-Dimensional Classifier Output for HEP Analyses through a Clustering Algorithm

Svenja Diekmann, Niclas Eich & Martin Erdmann - RWTH Aachen University

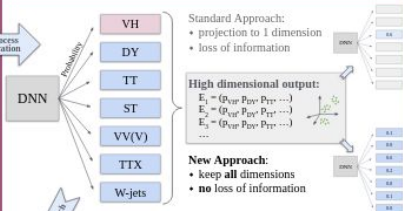


Motivation & Context

- search for VH
- specialised analysis for $gg \rightarrow ZH$ production
- yet unmeasured
- small cross section:
 - need for sensitivity enhancement



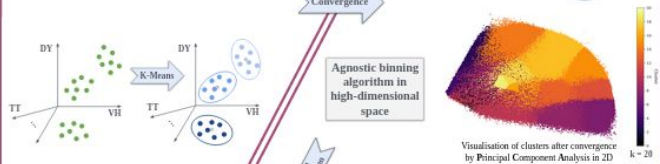
Process Assignment by DNN



High-Dimensional Clustering

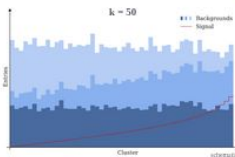
K-Means Clustering Algorithm:

- random initialisation of k cluster centers
- eventwise assignment to closest cluster
- iterative update of cluster centers by **mean** of assigned events



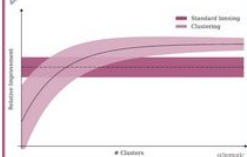
Resulting Histograms

- clustering creates high signal and high background regions
- cluster index has no physical meaning
 - sorted by the total signal contribution (red line)



Sensitivity Enhancement

- Sensitivity increase for high numbers of clusters:
- improvement compared to the standard method including statistical uncertainties



Thank you
for your attention