



# Looking for charm production in NOvA

## Final talk

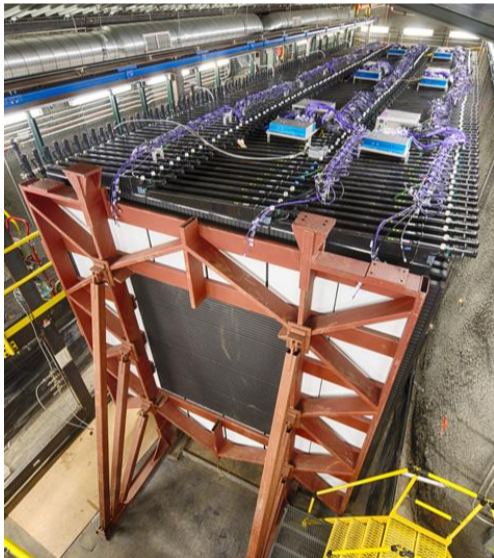
Roman Lavička

Sep 23 2016, Fermilab

Supervisor: Keith Matera

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- 1 The experiment NOvA
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- 3 Charm production
- 4 Workflow
- 5 Results
- 6 Conclusion

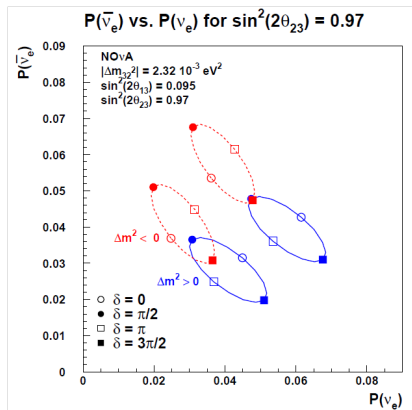


# The NOvA Experiment - oscillation analysis goals

- NOvA = NuMI Off-axis  $\nu_e$  Appearance

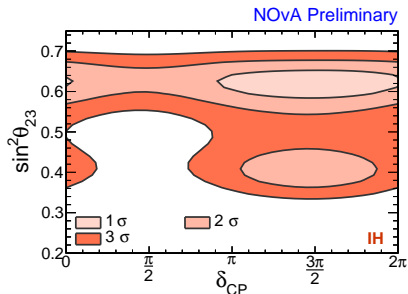
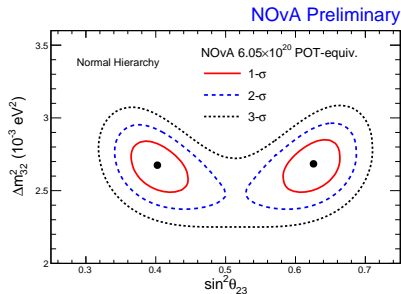
$$\begin{pmatrix} \nu_e \\ \nu_\mu \\ \nu_\tau \end{pmatrix} = \begin{pmatrix} c_{13}c_{12} & & s_{13}e^{-i\delta} \\ -c_{23}s_{12} - s_{13}s_{23}c_{12}e^{i\delta} & c_{23}c_{12} - s_{13}s_{23}s_{12}e^{i\delta} & c_{13}s_{23} \\ s_{23}s_{12} - s_{13}c_{23}c_{12}e^{i\delta} & -s_{23}c_{12} - s_{13}c_{23}s_{12}e^{i\delta} & c_{13}c_{23} \end{pmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \\ \nu_3 \end{pmatrix}$$

- Oscillation of  $\nu_\mu$  to  $\nu_\mu$  (disappearance)
- Oscillation of  $\nu_\mu$  to  $\nu_e$  (appearance)
- Neutrino masses ordering  $\Delta m^2$
- Symmetry between matter and antimatter  $\delta_{CP}$

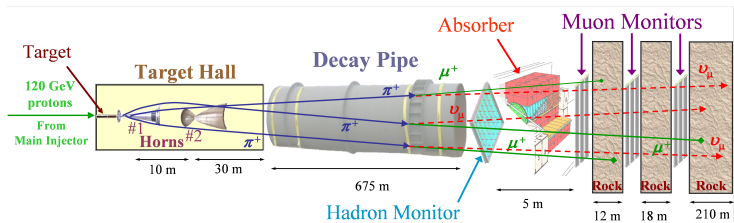


# The NOvA Experiment - the most recent results

- Excludes maximal mixing at  $2.5 \sigma$  from  $\nu_\mu$  disappearance
- So far  $\delta_{CP} \sim \frac{3\pi}{2}$  is slightly preferred from  $\nu_e$  appearance



# The NOvA Experiment - neutrino production

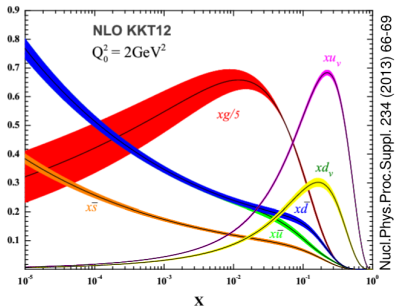
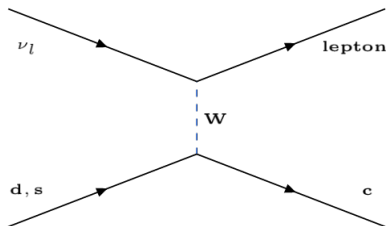


- NuMI beam to the graphite target
- Focused with 2 magnetic horns
- $\pi^{\pm}$  decay in pipe into  $\mu$  and  $\nu$
- $\mu$  stop in absorber
- Near detector at Fermilab, ILLINOIS
- Far detector in Ash River, MINNESOTA
- NOvA 14.6 mRad off-axis
- Spectrum peaks at 2 GeV with long high energy tail → charm production



# Charm production - motivation

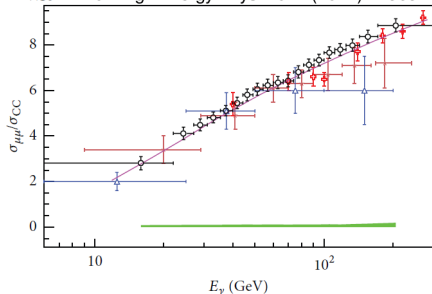
- Charm quark from valence or sea quark
- Forms hadrons  $\rightarrow$  decay to  $\mu + X$



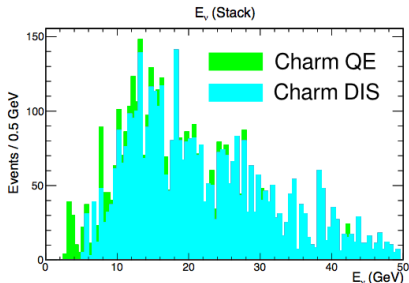
- Measurement of the cross section
- Probability density function of strange quark?

# Charm production - outlooks

$\times 10^{-3}$  Adv.High Energy Phys. 2014 (2014) 129694



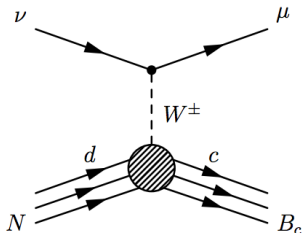
- NOMAD
- △ E53A + E53B
- ★ CHORUS
- ◆ CCFR
- Model



- NOMAD measured neutrino-induced charm production by taking the ratio of rates of dimuon to single muon neutrino interaction events
- The energy spectrum of charm production events at NOvA is shown to the right
- We can compare, and maybe provide complementary measurements in the 0-20 GeV region

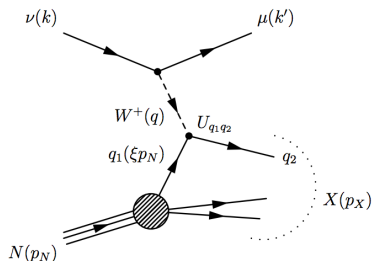
# Charm production - two types

## Quasi-elastic



- Clean
- Charmed baryons
- $\Lambda_c \sim 2.3$  GeV

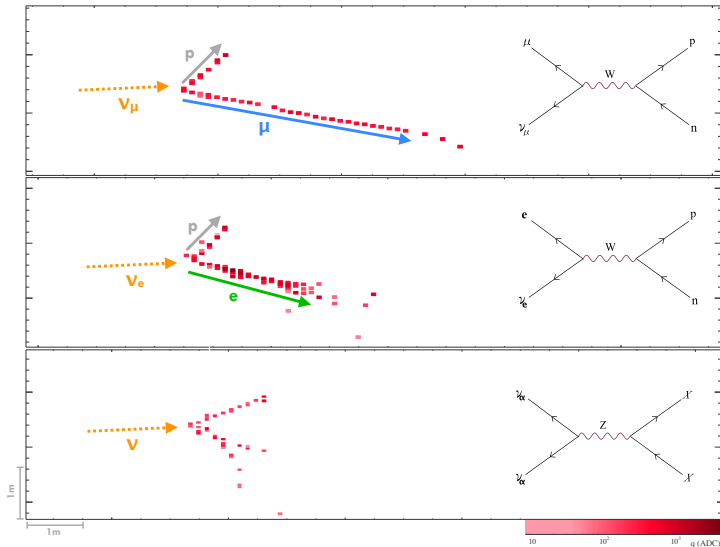
## Deep-inelastic



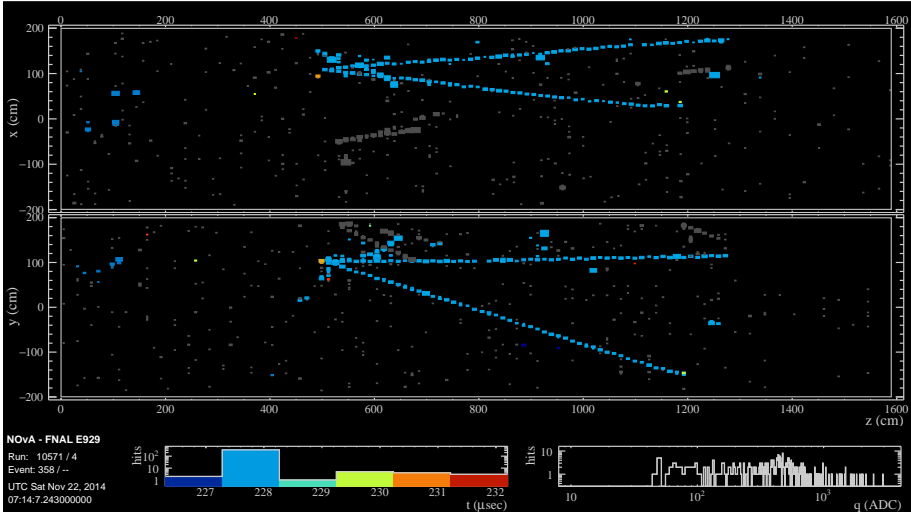
- Mess
- Charmed mesons (+ baryons)
- $D_c + p \sim 2.8$  GeV



# Event display - what non-charm interactions look like



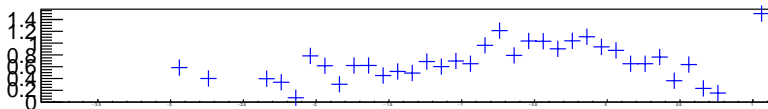
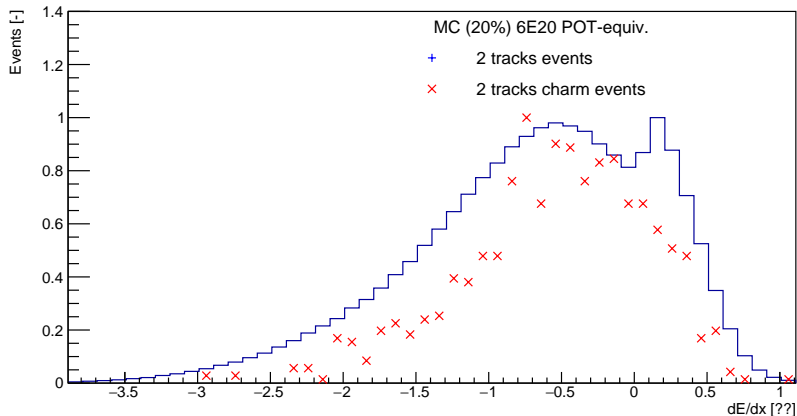
# Event display - what charm interactions look like (in MC)



- Event displays only for cross check
  - Impossible to look at every event
- Analytic tools (CAF, ROOT...)
- Steps of the analysis:
  - Learn how to operate Monte Carlo simulations
  - Use them to study signal/background
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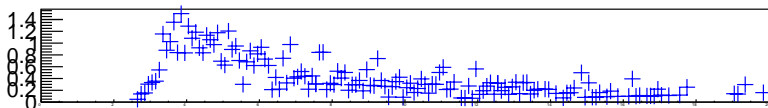
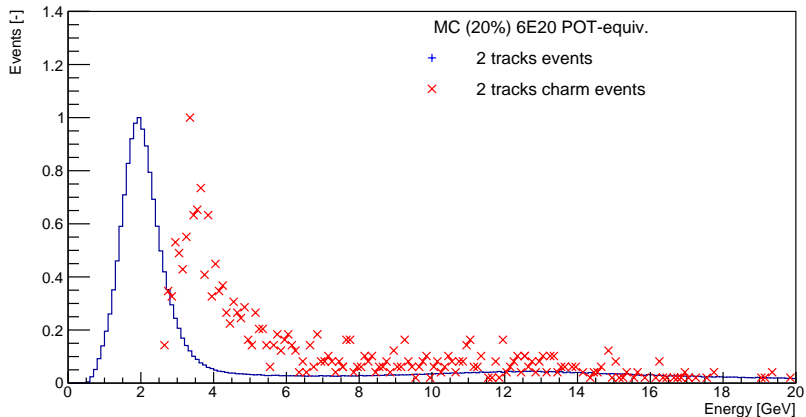
# MC plots - log-likelihood

## Log-likelihood value from dE/dx (bkg)

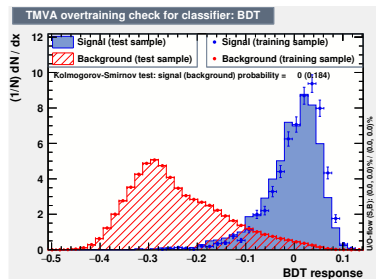


# MC plots - energy

True energy of neutrino (bkg)

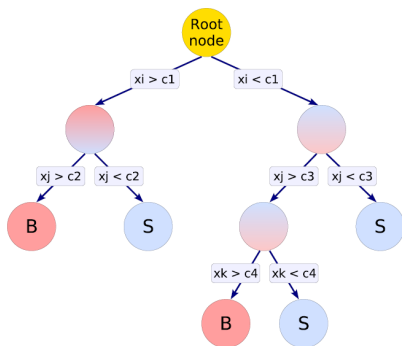


- The **T**oolkit for **M**ultivariate **A**nalysis
- Machine learning environment
- Designed for high-energy physics
- Implemented in ROOT → C++ and ROOT classes
- A pack of multivariate classification/regression methods
- Boosted decision tree



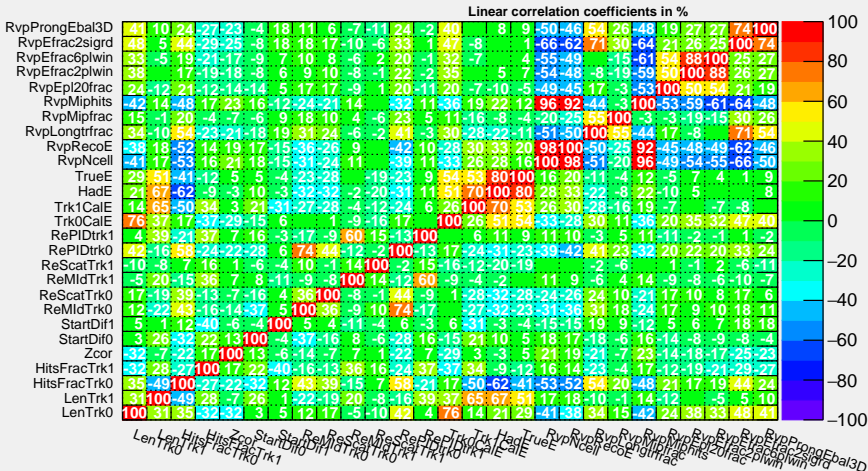
# Boosted decision tree

- Binary tree structured classifier
- Each branch several nodes
- Decision signal/bkg based on a cut on a single variable
- Each node different variable
- Each branch different criteria
- Tree needs to be trained
- Boosted  $\rightarrow$  more trees  $\rightarrow$  forest (lowers fluctuation sensitivity)



# Correlation of variables

## Correlation Matrix (signal)

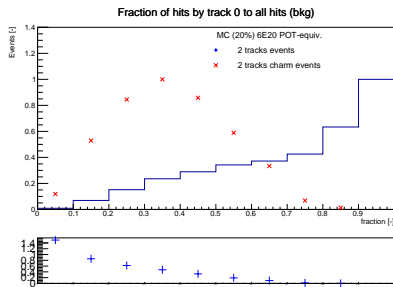
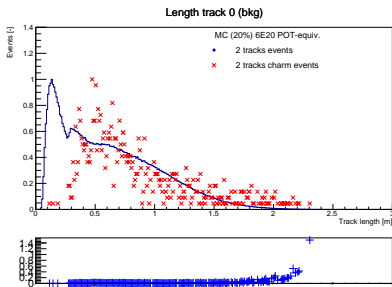


Mostly no significant correlations deteriorating the training

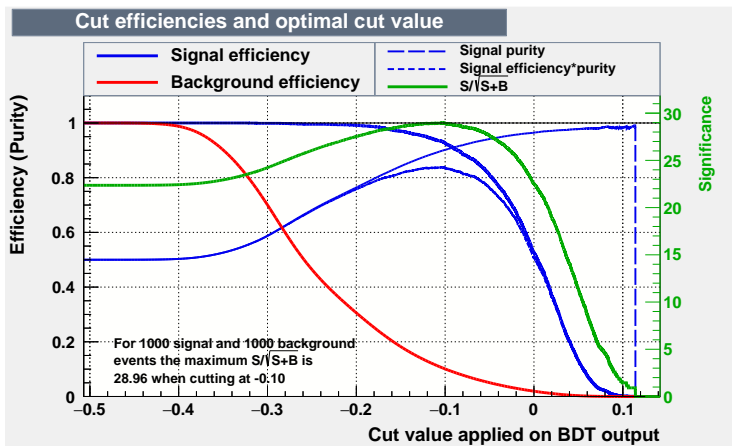


# Pre-selection cuts - BDT's suggestions

- Suggests some pre-selection cuts
  - Length of the longest track  $>152$  cm
  - Length of the 2. longest track  $>16$  cm
  - Ratio of hits of the longest track  $<0.88$
  - Ratio of hits of the 2. longest track  $<0.64$
- Makes sense



# BDT output cut value



## Expected sig/bkg ratio

- BDT trains the tree with Monte Carlo
- Creates a set of weights for each variable
- Applied on data and used to compare with our cut value ← decision!
- We looked on MC to predict ratio of signal to background

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- Sig/bkg = 0.001 ← very bad ☹

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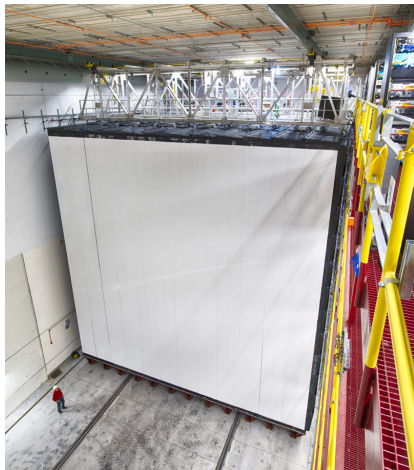
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- Possible ways to improve cuts:
  - Get event displays of signal and background after BDT
  - Investigate more correlations between variables used for BDT
  - Talk to as many expert as possible to collect other opinions

# Conclusion

- Difficult to separate charm dimuon events from background
- Consider different variables?
- Check correlations?
- Use different charm decay modes?





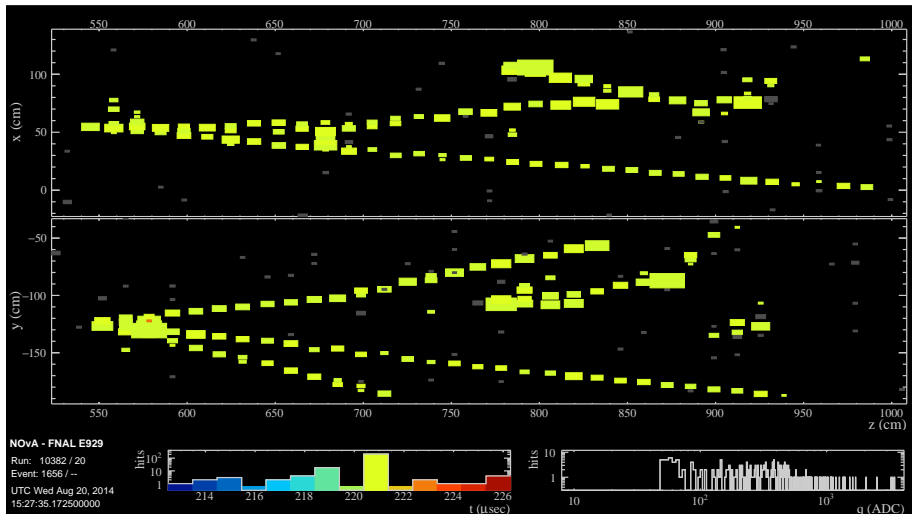
# Thank you for your attention



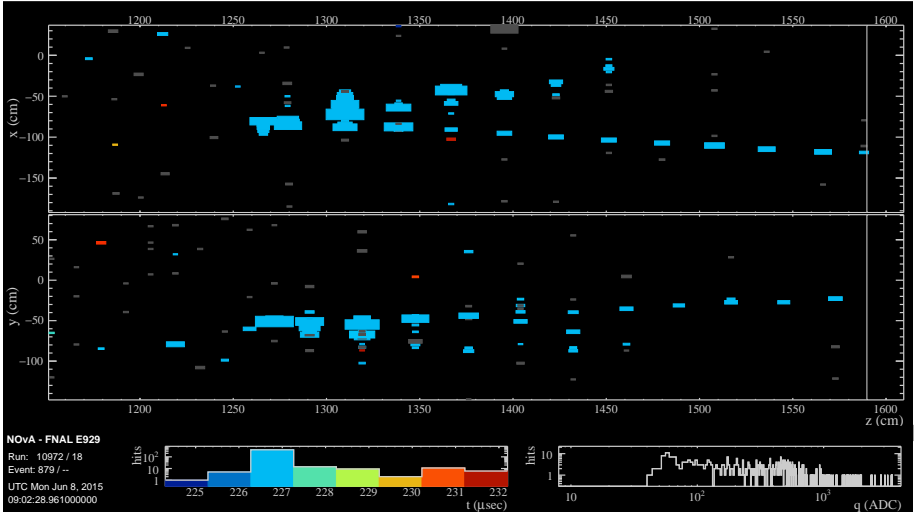
**I hate reading  
other people's code.**

# BACK UP

# Event display - background event after cut on BDT output

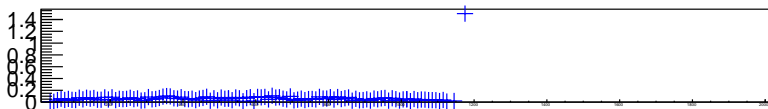
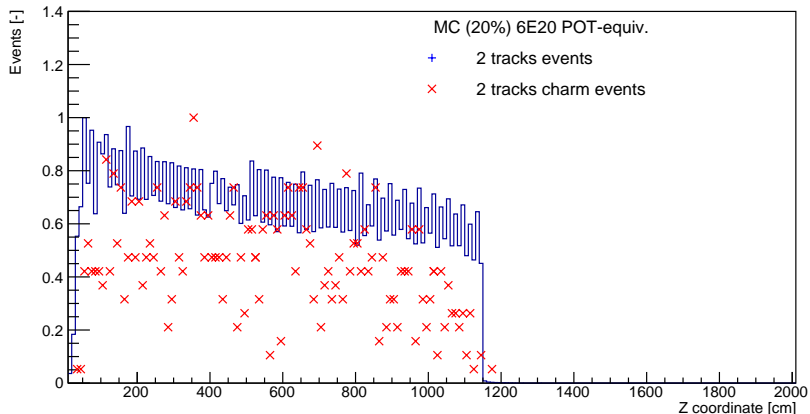


# Event display - signal event after cut on BDT output



# MC plots - Z coordinate of start of the longest track

Z coord. of track start (bkg)



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