# Quantum information at the LHC

Harvard LPPC Seminar, 29/11/2023
Baptiste Ravina







#### Outline of the seminar

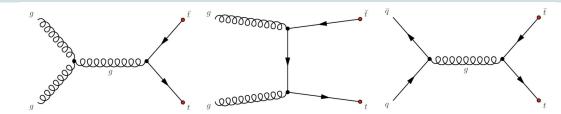
I want to show you the recent ATLAS **observation of quantum entanglement** in **top quark pair production**:

- introduce the top quark
- what has been done historically (spin correlations)
- moving to quantum entanglement
- discussing the experimental results

Then I will give an overview of **what else is possible** in terms of **quantum information at the LHC**:

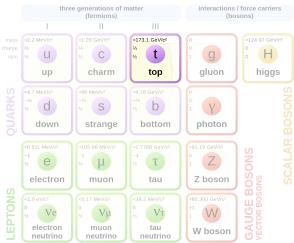
- prospects for Higgs physics
- beyond entanglement: Bell's inequalities

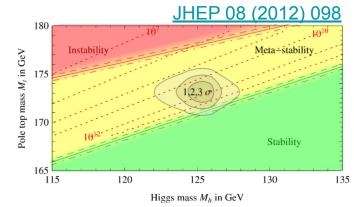
# Starting with top quark physics...



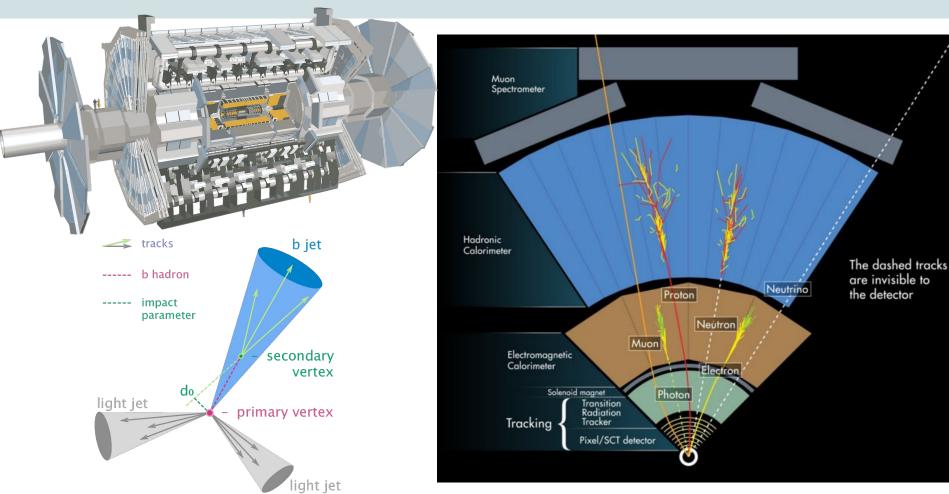
- Most massive fundamental particle in the SM
- → its Mass / Yukawa is a free parameter: need to measure it
  - Mean lifetime  $\sim 5 \times 10^{-25} \text{s} << 1/\Lambda_{QCD} \sim 10^{-23} \text{s}$
- → the only "bare quark"
  - BR(t→Wb) ~ 100%
- → unique experimental signature
  - Abundant production at the LHC, O(100M) pairs
- → "standard candle", very useful for calibrations

#### **Standard Model of Elementary Particles**

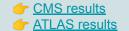




#### Particle identification at ATLAS in one slide

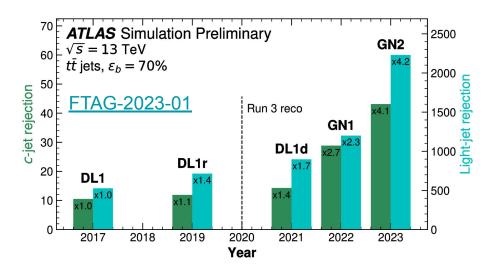


#### A long way to the top...



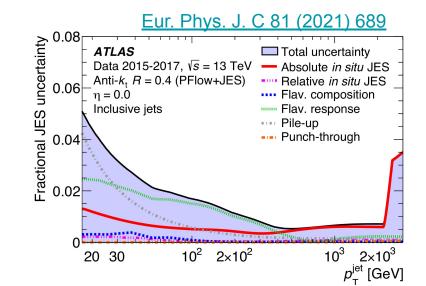
#### 28 years of top quark physics!

Ever more precise measurements enabled by excellent collider and detector performance

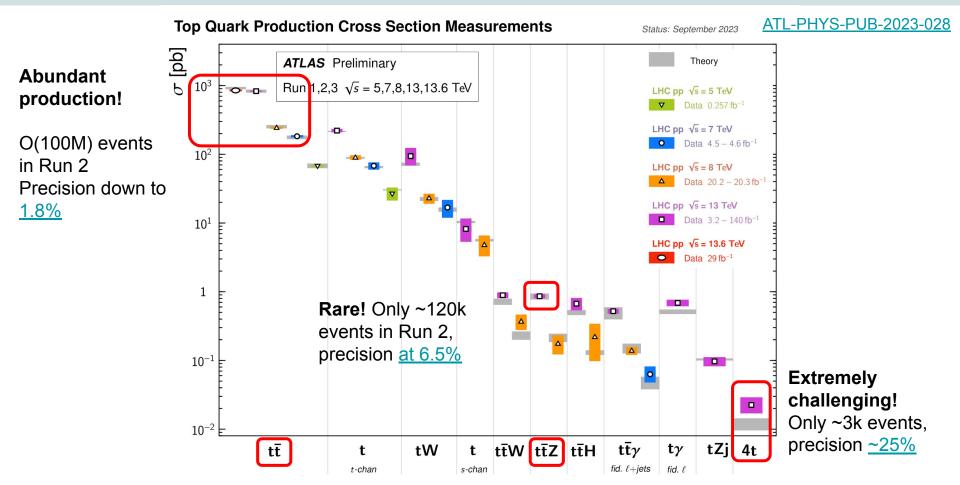


#### Benefit from all areas of Combined Performance:

- jets & missing energy
- flavour tagging
- lepton ID & isolation
- <u>luminosity</u>
- ..



#### The range of top quark physics



#### Prelude: top quark spin correlations

The top quark has a mean lifetime  $\sim 5 \times 10^{-25} \text{s} << 1/\Lambda_{\text{OCD}} \sim 10^{-23} \text{s}$ 

→ **spin information is correlated and transferred** to decay products

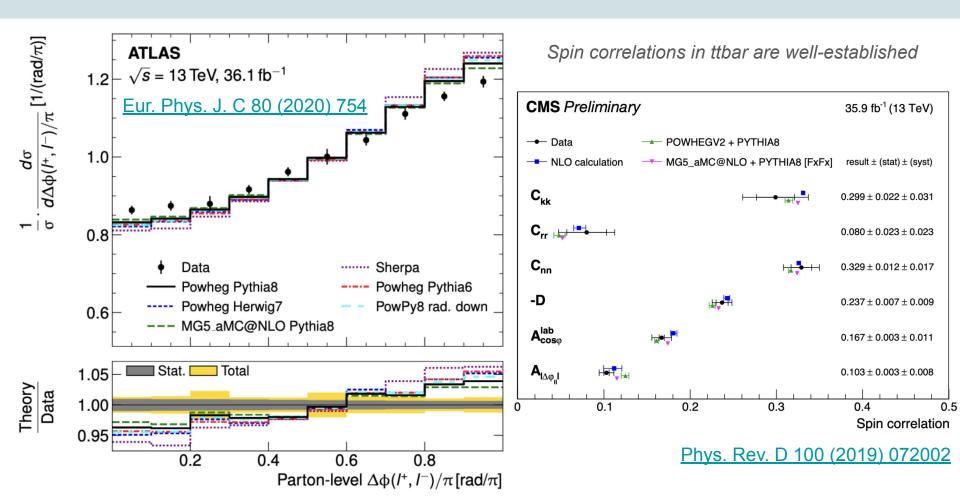
BR(t→Wb)~100% + weak interaction is maximally parity-violating

→ correlations are observable!

$$\frac{1}{\sigma}\frac{\mathrm{d}\sigma}{\mathrm{d}\Omega_{1}\Omega_{2}} = \frac{1}{4\pi^{2}}\left(1 + \alpha_{1}\ \mathbf{B}_{1}\cdot\hat{\ell}_{1} + \alpha_{2}\ \mathbf{B}_{2}\cdot\hat{\ell}_{2} + \alpha_{1}\alpha_{2}\ \hat{\ell}_{1}\cdot\mathbb{C}\cdot\hat{\ell}_{2}\right)$$
 top polarisations spin correlations

= full spin density matrix

#### State-of-the-art in 2020...



#### As you may have heard...



Outreach

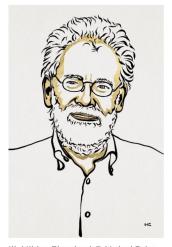
Alain Aspect
Prize share: 1/3



III. Niklas Elmehed © Nobel Prize Outreach

John F. Clauser

Prize share: 1/3

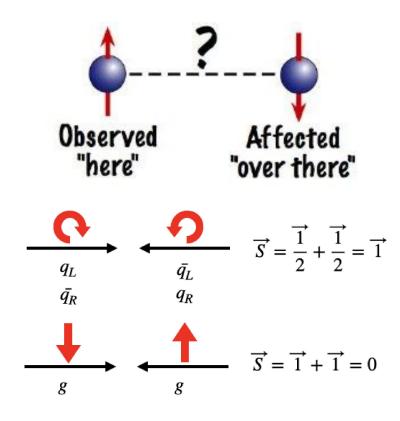


III. Niklas Elmehed © Nobel Prize Outreach

Anton Zeilinger

Prize share: 1/3

The Nobel Prize in Physics 2022 was awarded jointly to Alain Aspect, John F. Clauser and Anton Zeilinger "for experiments with entangled photons, establishing the violation of Bell inequalities and pioneering quantum information science"



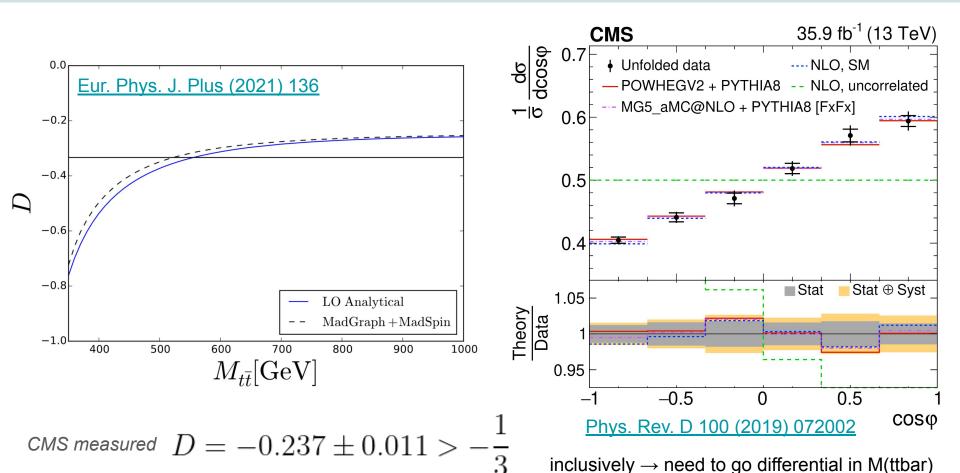
gg→ttbar: spin-singlet state at threshold

# Quantum tops beyond (classical) spin correlations

<u>Eur. Phys. J. Plus (2021) 136</u> (March 2020) → first analysis of top quark pair production *from the quantum information point of view*: "bipartite qubit system"

$$\frac{1}{\sigma}\frac{\mathrm{d}\sigma}{\mathrm{d}\Omega_{1}\Omega_{2}} = \frac{1}{4\pi^{2}}\left(1+\alpha_{1}\mathbf{P}_{1}\cdot\hat{\ell}_{1}+\alpha_{2}\mathbf{P}_{2}\cdot\hat{\ell}_{2}+\alpha_{1}\alpha_{2}\;\hat{\ell}_{1}\;\mathbb{C}\;\hat{\ell}_{2}\right)$$

### So... did CMS observe quantum entanglement?



# The brand-new ATLAS result

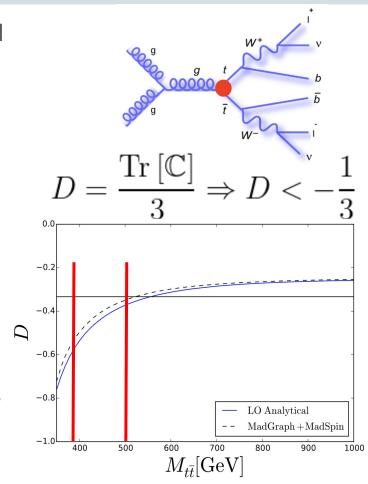
# Quantum entanglement in dilepton ttbar

Dilepton eµ final state is very clean (90% purity) and at the end of Run 2 we have about a million events after preselection.

Then partition events into three selections:

- 340<M<sub>ff</sub><380: entanglement signal region
- 380<M<sub>tt</sub><500: validation region</li>
   (dilution from mis-reconstruction)
- 500<M..: no-entanglement validation region

The mass cuts are crucial!

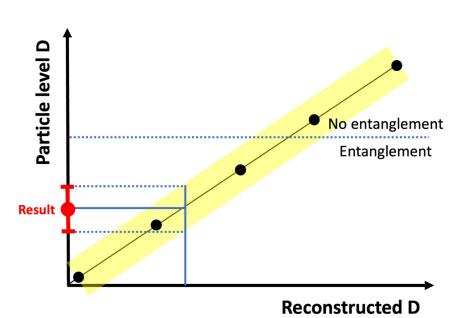


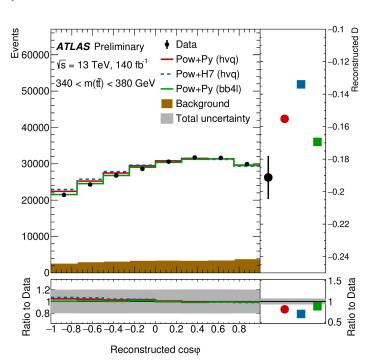
#### Analysis procedure

"Calibration curve" method: use the nominal MC to map the detector-level D value (average of distribution) to the fiducial particle-level D.

Systematics are propagated with their own curves, quadratic envelope.

→ Build the curve by sampling different D values.





#### A closer look at uncertainties

"Backgrounds": mostly  $Z \rightarrow \tau \tau$ , which leads to a flat  $\cos(\phi)$  distribution (spin information from taus is lost)

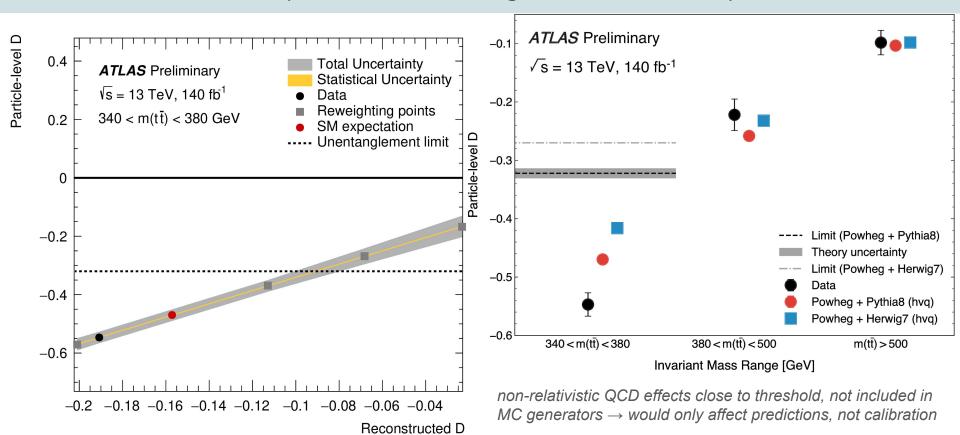
Calibrating to fiducial particle-level reduces the parton shower uncertainty (Pythia vs Herwig): full details in the CONF.

**Signal modelling**: by far the largest contribution

Systematic source	$\Delta D_{\text{particle}}(D = -0.470)$	ΔD (%)
Signal Modelling	0.017	3.2
Electron	0.002	0.4
Muon	0.001	0.1
Jets	0.004	0.7
b-tagging	0.002	0.4
Pileup	< 0.001	< 0.1
$E_{ m T}^{ m miss}$	0.002	0.3
Backgrounds	0.010	1.8
Stat.	0.002	0.3
Syst.	0.021	3.8
Total	0.021	3.8

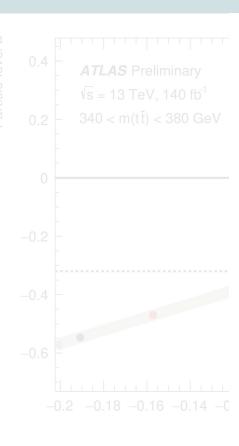
Leading Systematics	Relatvie Size [D = SM $(-0.47)$ ]	
Top-quark decay	1.6 %	
$Z \rightarrow \tau \tau$ Cross-section	1.5 %	
Recoil To Top	1.1 %	
Final State Radiation	1.1 %	
Scale Uncertainties	1.1 %	
NNLO Reweighting	1.1 %	
Parton Distribution Function (5)	0.8 %	
pThard1 Setting	0.8 %	
Top-quark Mass	0.7 %	
Single Top Quark Wt Cross-section	0.4 %	

#### Observation of quantum entanglement in dilepton ttbar



 $D = -0.547 \pm 0.002$  (stat.)  $\pm 0.020$  (syst.)

#### Observation of quantum entanglement in dilepton ttbar



D = -0.547 + 0.00



#### **ATLAS CONF Note**

ATLAS-CONF-2023-069

28th September 2023



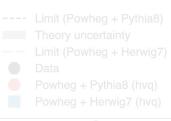




#### **Observation of quantum entanglement in top-quark** pair production using p p collisions of $\sqrt{s} = 13$ TeV with the ATLAS detector

The ATLAS Collaboration

We report the highest-energy observation of entanglement so far in top-antitop quark events produced at the Large Hadron Collider, using a proton-proton collision data set with a centreof-mass energy of  $\sqrt{s} = 13$  TeV and an integrated luminosity of 140 fb<sup>-1</sup>. Spin entanglement is detected from the measurement of a single observable D, inferred by the angle between the charged leptons in their parent top- and antitop-quark rest frames. The observable is measured on a narrow interval around the top-quark-antitop-quark production threshold, where the entanglement detection is expected to be significant. The entanglement observable is measured in a fiducial phase-space with stable particles. The entanglement witness is measured to be  $D = -0.547 \pm 0.002$  (stat.)  $\pm 0.021$  (syst.) for 340 <  $m_{t\bar{t}}$  < 380 GeV. The large spread in predictions from several mainstream event generators indicates that modelling this property is challenging. The predictions depend in particular on the parton-shower algorithm used. The observed result is more than five standard deviations from a scenario without entanglement and hence constitutes the first observation of entanglement in a pair of quarks, and the observation of entanglement at the highest energy to date.



effects close to threshold, not erators

 $[stat.] \pm 0.017 [syst.]$ 



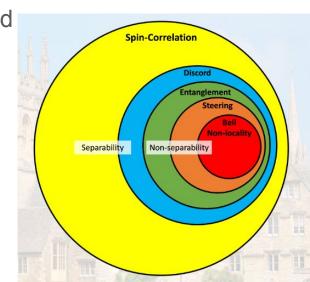
# The landscape of quantum information at the LHC

# Quantum tops beyond entanglement

Follow-up papers by the same authors formulate additional <u>quantum information</u> theory concepts in term of <u>ttbar production at the LHC</u>:

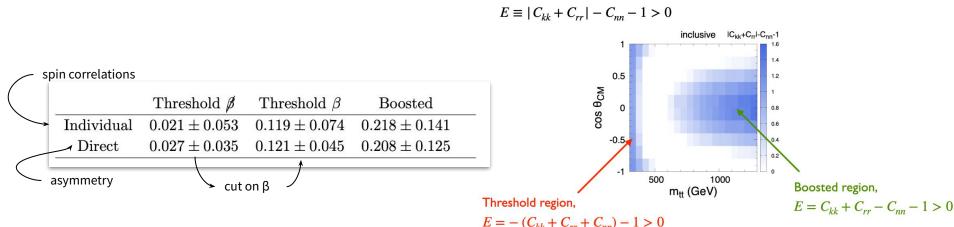
- Quantum Discord measures the departure of the information entropy from classical theory
- Quantum Steering measures the non-local effect of one measurement on the outcome of the other
- both are usually very hard to measure, given the need to repeat experiments over large samples of spin directions → the LHC gives us millions of randomly sampled directions "for free"!
- both are asymmetric quantities → new tests of CP violation in the strong sector!

In general, want to perform quantum tomography = reconstruct the full spin density matrix



#### Improved tests of entanglement with tops

- A new general marker of quantum entanglement <u>has been proposed</u>
  - in the threshold region, exactly what is being done now (D=Tr[C]/3)
  - o in the **boosted** region, would need slightly different angular distribution
  - at threshold, additional cut on the ttbar velocity β can reduce the qq contamination
  - both approaches can increase the statistical sensitivity by ~20%
- Similarly, we can simplify tests of Bell's inequality violation
  - o sufficient to know the 3 spin correlation coefficients, but better done in the beam basis
  - alternatively, could measure a simple asymmetry

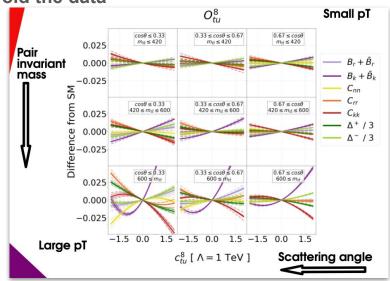


#### Quantum entanglement in the **SMEFT**

- The 15 components of the ttbar spin density matrix can <u>constrain SMEFT</u> operators affecting top production
  - entanglement and Bell observables are also sensitive
  - o in the dilepton channel, all  $O(1/\Lambda^2)$  effects in the top decay cancel out (to less than permille level)
  - best predictions are currently at NLO QCD with approximate-NLO spin effects: this is not something we can match with our MC, better to unfold the data
- 4-quark operators need NLO calculations
  - projections of CMS-like analysis to full Run 2+3 give competitive constraints wrt. to current full global fits to top LHC data

negligible EFT in top decays!

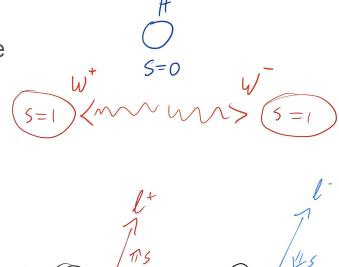
$$\alpha_{\ell} = 1 - \frac{c_{uW,33}^2 v^4}{\Lambda^4} \frac{4(2m_t^6 + 3m_t^4 m_W^2 - 6m_t^2 m_W^4 + m_W^6 + 12m_t^4 m_W^2 \log m_W / m_t)}{(m_W^2 - m_t^2)^2 (m_t^2 + 2m_W^2)}$$



### Quantum state tomography with weak decays

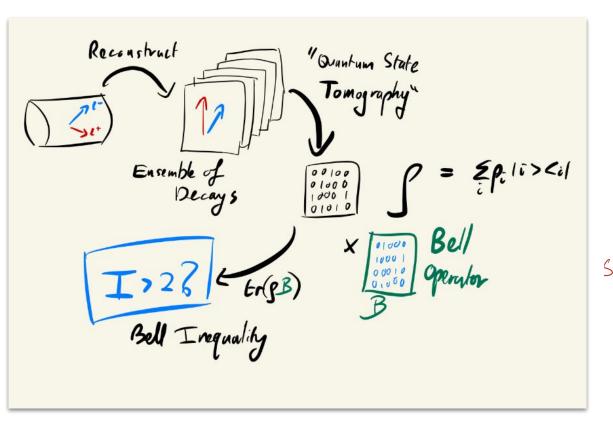
#### "Decaying W bosons are their own polarimeters"

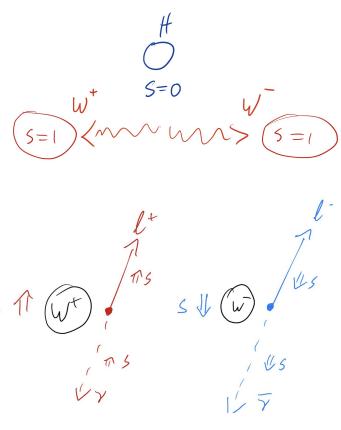
- <u>HWW\*</u> provides a <u>near-maximally entangled</u> state
  - spin density matrix has 80 real parameters
  - can be uniquely determined from angular distributions
  - violation of Bell's inequality for a pair of qutrits can be probed from "only" 10 such distributions
- Sensitivity estimate in the lvlv final state range from 1σ to 5σ
  - but neglects backgrounds and assumes 10 GeV resolution on neutrino reconstruction... unrealistic?



# Quantum state tomography with weak decays

"Decaying W bosons are their own polarimeters"





### Quantum tomography of diboson systems

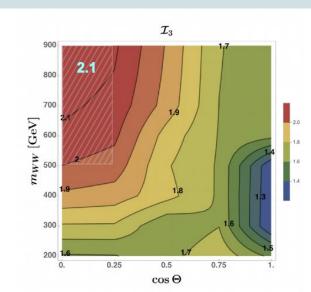
Formalism can be <u>extended</u> to all massive diboson final states: HWW\*, HZZ\*, WW, WZ, ZZ

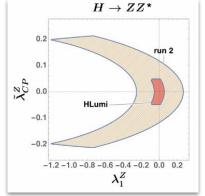
pp→VV infeasible at the HL-LHC: have to "wait" for FCC/muon colliders

Expect HWW\* to be systematically dominated, but HZZ\* gets better with stats

- Bell's inequality violation at most 1sigma for HWW\*
- 1.3σ for HZZ\* in Run 2, 5.6σ at HL-LHC
- but once again the "experimental scenarios" are likely too idealised

HZZ\* could further be used to **drive constraints** on anomalous couplings → stronger than cross section alone!





#### Entanglement and Bell's inequalities in HZZ\*

We can exploit further the <u>symmetries of the ZZ final state</u>, to **avoid** having to study the <u>full 80-parameter</u> spin density matrix

→ entanglement marker narrowed down to 2 doubly-differential observables

Observing entanglement becomes equivalent to observing an asymmetry in either!

Highlights the relevance of mass cuts

We are looking to show C≠0 and I<sub>3</sub>>2

Experimental projections compatible with other theory predictions, slightly more realistic scenario due to 4 lepton final state...

#### • LHC Run 2+3

	$min\ m_{Z_2}$					
-	0	10 GeV	20 GeV	30 GeV		
$\overline{}$	450	418	312	129		
$C_{2,1,2,-1}$	$-0.98 \pm 0.31$	$-0.97\pm0.33$	$-1.05\pm0.38$	$-1.06\pm0.61$		
$C_{2,2,2,-2}$	$0.60 \pm 0.37$	$0.64 \pm 0.38$	$0.74 \pm 0.43$	$0.82 \pm 0.63$		
$I_3$	$2.66 \pm 0.46$	$2.67 \pm 0.49$	$2.82 \pm 0.57$	$2.88 \pm 0.89$		

Table 1: Values  $C_{2,1,2,-1}$ ,  $C_{2,2,2,-2}$  and  $I_3$  obtained from 1000 pseudo experiments with  $L=300~{\rm fb}^{-1}$ .

#### HL-LHC

	$min\ m_{Z_2}$					
	0	10 GeV	20 GeV	30 GeV		
N	4500	4180	3120	1290		
$C_{2,1,2,-1}$	$-0.95\pm0.10$	$-1.00\pm0.10$	$-1.04\pm0.12$	$-1.04\pm0.19$		
$C_{2,2,2,-2}$	$0.60 \pm 0.12$	$0.64 \pm 0.12$	$0.74 \pm 0.14$	$0.83 \pm 0.20$		
$I_3$	$2.63 \pm 0.15$	$2.71 \pm 0.16$	$2.81 \pm 0.18$	$2.84 \pm 0.28$		

Table 2: Same as Table 1, for L=3 ab<sup>-1</sup>.

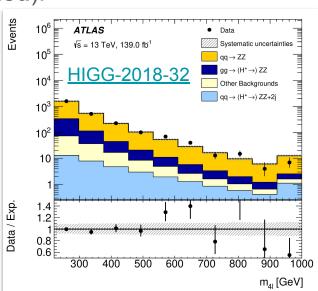
#### A twist on polarisations: $H^*ZZ$ (not a typo!)

ATLAS recently proposed a new analysis strategy to search for <u>high-mass</u> <u>off-shell</u> <u>Higgs</u> bosons in the 4 lepton final state  $\rightarrow$  2 on-shell Z bosons!

Allows to use another **entanglement** "**trick**": entanglement marker can be recast as binary test between observing only longitudinal polarisations of the Z bosons (**separable**) or both transverse and longitudinal (**entangled**).

Can be done with lab-frame observables (very clean) and existing Monte Carlo techniques (well defined polarisations)

In practice: completely stat dominated all the way up to HL-LHC

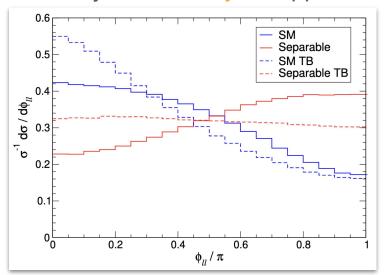


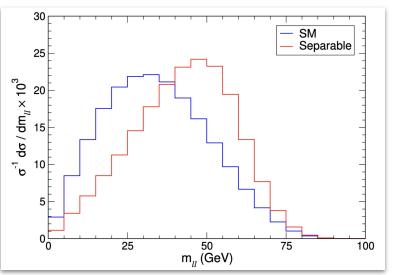
#### Resampling polarisations in HWW\*

The "<u>trick</u>" is saved in the H-onshell/W-offshell regime by the assumption that the W decays to massless particles: OK for  $e/\mu$ , not for taus (but we don't want to look at taus anyway)

Rely on the <u>"CAR" method</u> (custom angle replacement) to resample existing HWW\* MC samples according to new PDFs where we change the W polarisations

→ currently under study for application within ATLAS





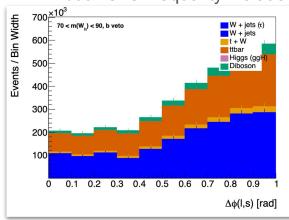
#### Accessing entanglement in semi-leptonic HWW\*

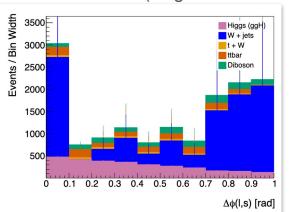
**Dileptonic WW:** clean observables at detector-level, but very hard to reconstruct the full Higgs system to measure the spin density matrix.

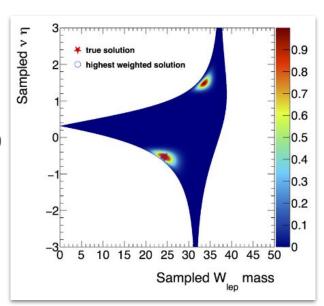
**Semileptonic WW** was so far too messy (large SM backgrounds)

→ <u>new technique</u> inspired from top reconstruction helps!

- exploit charm tagging to reconstruct on-shell W→cs
- off-shell W\*→Iv reconstructed with Neutrino Weighting
- both reconstructions can be used to suppress backgrounds:
   opens up a practical new final state for Higgs physics!
- but Bell's inequality violation will still take time (2sigma at HL-LHC)







#### Wrapping it up

#### **Multiple final states** to look at:

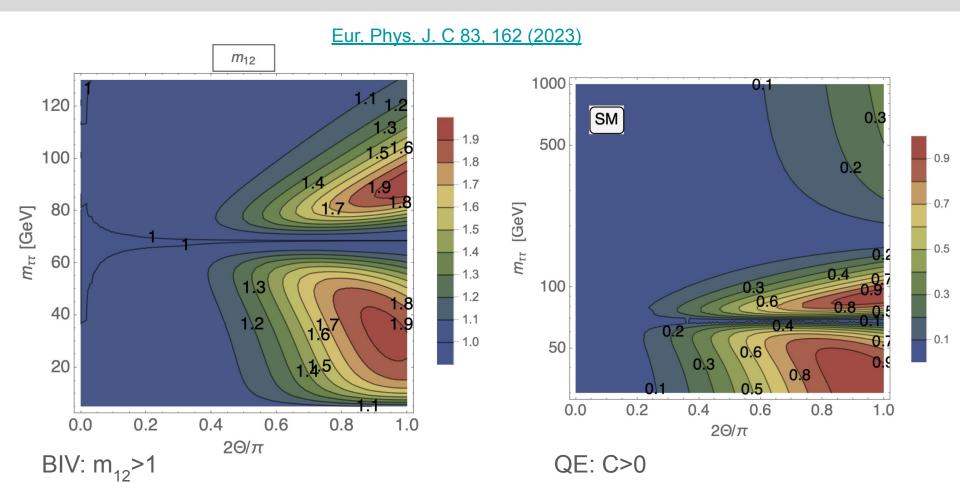
- ttbar, HWW\*, HZZ\* (<u>ττ</u> and <u>VV</u> also received attention, but not nearly as promising)
- multi-lepton final states are "easier", but we benefit from tackling complicated reconstruction problems (semileptonic HWW, dileptonic ttbar/HWW, off-shell resonances...)
- qubits vs qutrits, two- and three-particle entanglement, decays...

The ultimate goal is to measure the full spin density matrices (in several bases and differentially in the invariant mass of the system)

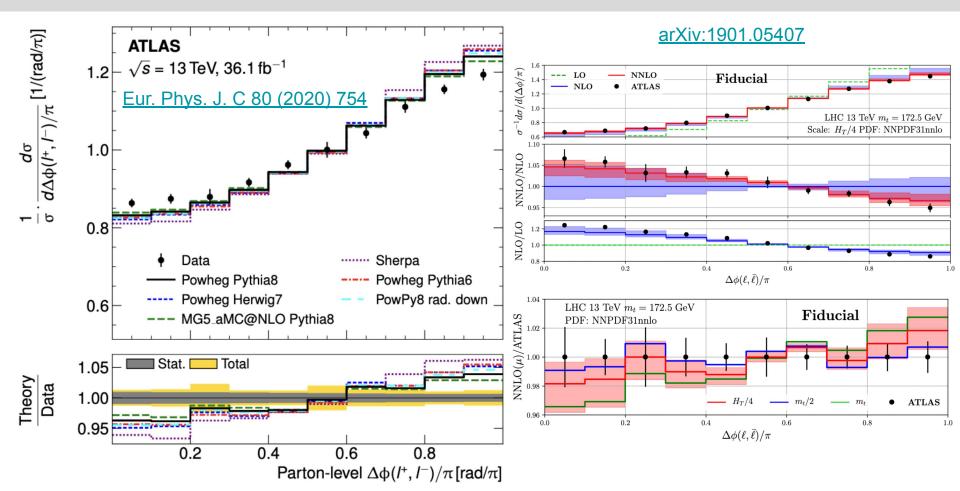
- can also target observation of entanglement by using dedicated observables (few caveats of SM-like assumptions)
- Bell's inequality violation very challenging
- quantum discord could be measured "properly" for the first time...

# Backup

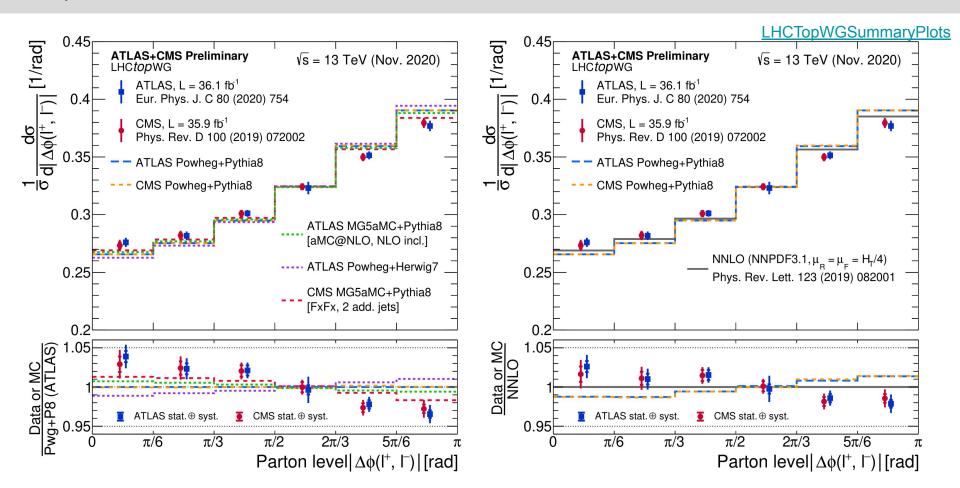
# Quantum entanglement in di-tau systems



#### Spin correlations at NNLO



#### Spin correlations: ATLAS and CMS



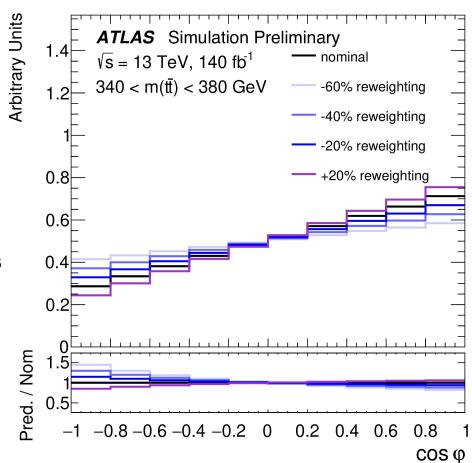
#### The reweighting method

- We have no handle on the "amount of entanglement" in the generators, but we know exact functional forms at parton-level → can reweight D
- Fit a 3<sup>rd</sup> order polynomial to extract the dependence on M(ttbar)

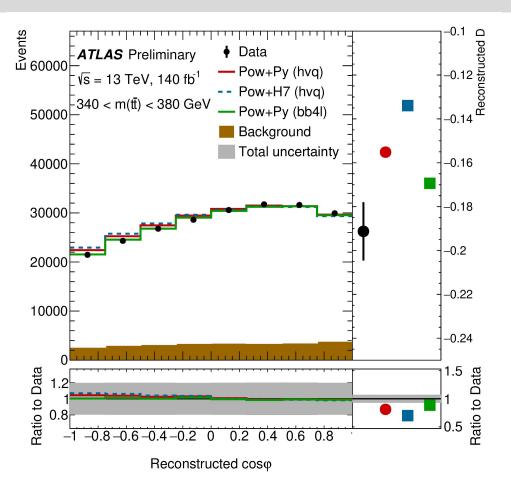
$$D_{\Omega}(m_{t\bar{t}}) = x_0 + x_1 \cdot m_{t\bar{t}}^{-1} + x_2 \cdot m_{t\bar{t}}^{-2} + x_3 \cdot m_{t\bar{t}}^{-3}$$

Then reweight each event as

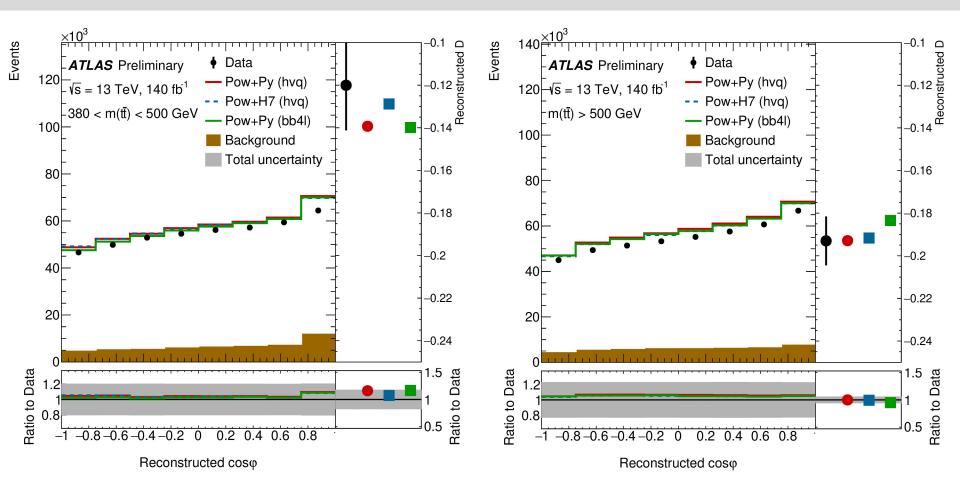
$$w = \frac{1 - D_{\Omega}(m_{t\bar{t}}) \cdot \mathcal{X} \cdot \cos \varphi}{1 - D_{\Omega}(m_{t\bar{t}}) \cdot \cos \varphi}$$



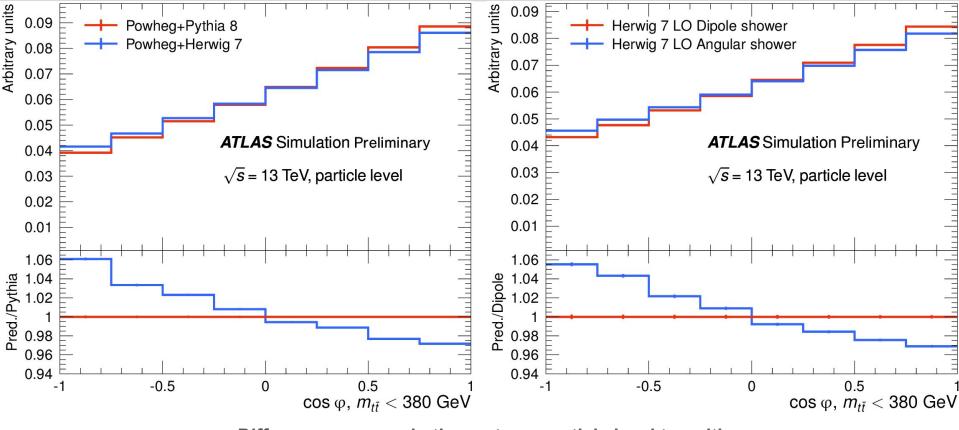
# Data / MC in the signal region



# Data / MC outside the signal region



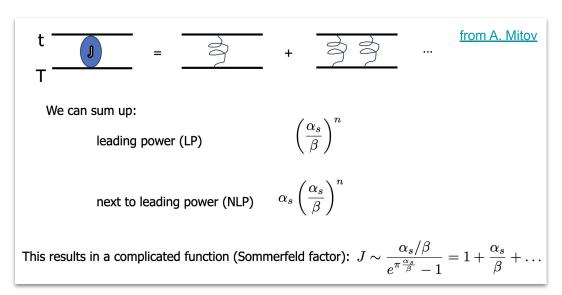
# Investigations of parton shower effects

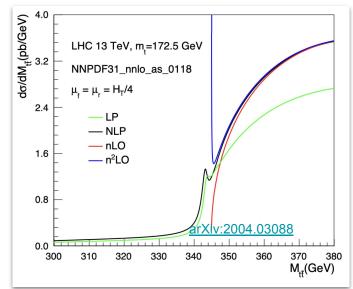


Differences appear in the parton—particle level transition, and seem to largely match the Dipole vs Angular ordering schemes

#### At threshold: need input from the theorists

- Our MC generators don't include the necessary non-perturbative effects how do we get around that?
  - <u>Fuks et al.</u> implemented a BSM Lagrangian in MadGraph → toponium
  - A number of calculations available, most recently <u>Ju et al.</u>
    - pure parton-level calculation (stable tops), resums leading-power and next-to-leading-power calculations and matches to NNLO differential ttbar





#### Separable and entangled states

Example: top pair production

J.A. Aguilar Saavedra

 $q_L q_L[-bar] \rightarrow t \ t$ -bar gives a spin configuration  $|\leftarrow\rangle \otimes |\leftarrow\rangle$  [in the  $q_L$  direction]

This is obviously not entangled.

$$q_R q_R[-bar] \rightarrow t t$$
-bar gives a spin configuration  $| \rightarrow \rangle \otimes | \rightarrow \rangle$ 

Not entangled either.

$$g g \rightarrow t t$$
-bar at threshold gives  $\frac{1}{\sqrt{2}} (|\uparrow\rangle \otimes |\downarrow\rangle - |\downarrow\rangle \otimes |\uparrow\rangle)$ 

This one is entangled.

Mixed states in top pair production

 $qq \rightarrow t$  t-bar is 50% of the time  $q_L q_L$  and 50% of the time  $q_R q_R$ 

Then, we have 50% of the time  $|\leftarrow\rangle\otimes|\leftarrow\rangle$  and 50%  $|\rightarrow\rangle\otimes|\rightarrow\rangle$ 

Obviously, in  $qq \rightarrow t$  t-bar we do have t t-bar spin correlations. But not entanglement!

 $C_{11}-C_{22}-i(C_{12}+C_{21})$ 

 $1 - B_3^+ - B_3^- + C_{33}$ 

 $C_{11} + C_{22} + i(C_{12} - C_{21})$ 

 $B_1^+ - C_{13} - i(B_2^+ - C_{23})$ 

 $B_1^- - C_{31} + i(B_2^- - C_{32})$ 

 $1 - B_3^+ - B_3^- + C_{33}$ 

 $B_1^+ - C_{13} - i(B_2^+ - C_{23})$ 

 $1 - B_3^+ + B_3^- - C_{33}$   $B_1^- - C_{31} - i(B_2^- - C_{32})$ 

$$\rho = \frac{1}{4} \left( \mathbb{1} \otimes \mathbb{1} + \sum_i (B_i^+ \sigma_i \otimes \mathbb{1} + B_i^- \mathbb{1} \otimes \sigma_i) + \sum_{ij} C_{ij} \sigma_i \otimes \sigma_j \right)$$

 $1 + B_3^+ + B_3^- + C_{33}$   $B_1^- + C_{31} - i(B_2^- + C_{32})$ 

 $1 + B_3^+ - B_3^- - C_{33}$ 

 $C_{11} + C_{22} - i(C_{12} - C_{21})$ 

 $B_1^+ - C_{13} + i(B_2^+ - C_{23})$ 

 $1 + B_3^+ + B_3^- + C_{33}$   $B_1^- + C_{31} + i(B_2^- + C_{32})$   $B_1^+ + C_{13} - i(B_2^+ + C_{23})$ 

 $B_1^+ - C_{13} + i(B_2^+ - C_{23})$ 

 $\rho = \frac{1}{4} \begin{vmatrix} B_1^- + C_{31} + i(B_2^- + C_{32}) \\ B_1^+ + C_{13} + i(B_2^+ + C_{23}) \end{vmatrix}$ 

 $\rho^{T_2} = \frac{1}{4} \begin{vmatrix} B_1^- + C_{31} - i(B_2^- + C_{32}) \\ B_1^+ + C_{13} + i(B_2^+ + C_{23}) \end{vmatrix}$ 

 $C_{11} - C_{22} + i(C_{12} + C_{21})$ 

 $C_{11} + C_{22} - i(C_{12} - C_{21})$ 

 $B_1^+ + C_{13} - i(B_2^+ + C_{23})$ 

 $C_{11} + C_{22} + i(C_{12} - C_{21})$ 

 $B_1^- - C_{31} + i(B_2^- - C_{32})$ 

 $B_1^- - C_{31} - i(B_2^- - C_{32})$ 

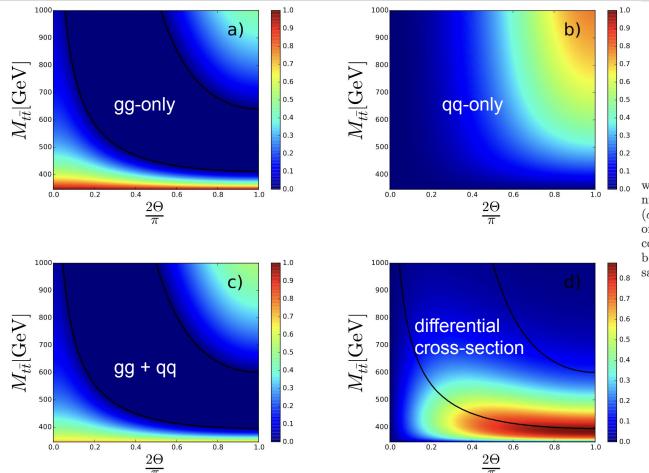
 $1 + B_3^+ - B_3^- - C_{33}$   $C_{11} - C_{22} - i(C_{12} + C_{21})$ 

Peres-Horodecki: if  $\rho^{12}$  has at least one negative eigenvalue, the state is entangled

 $\frac{1}{\sigma} \frac{d\sigma}{d\Omega_1 \Omega_2} = \frac{1}{4\pi^2} \left( 1 + \alpha_1 \mathbf{B}_1 \cdot \hat{\ell}_1 + \alpha_2 \mathbf{B}_2 \cdot \hat{\ell}_2 + \alpha_1 \alpha_2 \hat{\ell}_1 \cdot \mathbb{C} \cdot \hat{\ell}_2 \right)$ 

 $C_{11} - C_{22} + i(C_{12} + C_{21})$   $1 - B_3^+ + B_3^- - C_{33}$ 

# Production phase-space



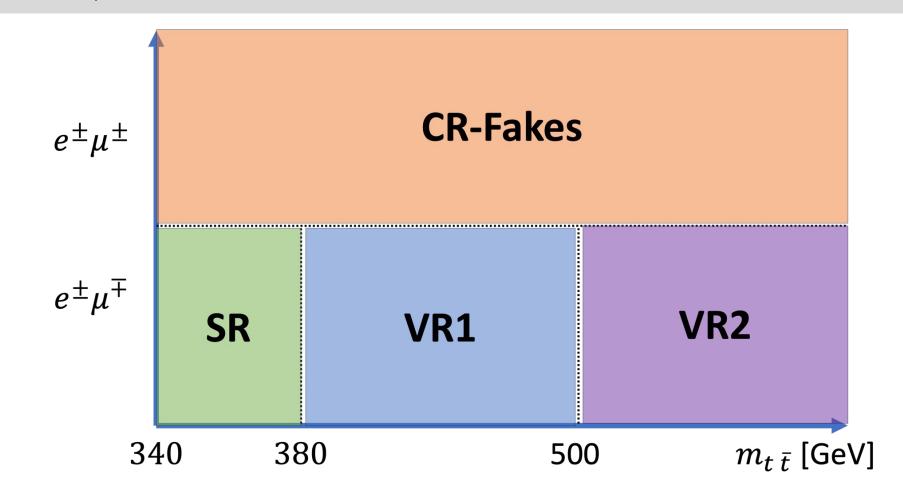
Eur. Phys. J. Plus (2021) 136

$$C[\rho] \equiv \max(0, \lambda_1 - \lambda_2 - \lambda_3 - \lambda_4) \tag{4}$$

where  $\lambda_i$  are the eigenvalues, ordered in decreasing magnitude, of the matrix  $\mathcal{C}(\rho) = \sqrt{\sqrt{\rho}\tilde{\rho}\sqrt{\rho}}$ , with  $\tilde{\rho} = (\sigma_2 \otimes \sigma_2) \ \rho^* \ (\sigma_2 \otimes \sigma_2)$  and  $\rho^*$  the complex conjugate of the density matrix in the usual spin basis of  $\sigma_3$ . The concurrence satisfies  $0 \leq C[\rho] \leq 1$ , with a quantum state being entangled if and only if  $C[\rho] > 0$ . Therefore, states satisfying  $C[\rho] = 1$  are maximally entangled. We refer

z-axis: concurrence C[p]

 $C[\rho] > 0 \Leftrightarrow entanglement$ 



#### Post-decay three-particle entanglement

Movel entanglement tests that were not possible before.

J.A. Aguilar Saavedra

What is genuinely new in particle physics with respect to experiments with electrons and photons? Particle decay.\*

Post-decay entanglement:

JAAS 2307.06991

A and B entangled  $A \rightarrow A_1 A_2$ 



 $A_1$ ,  $A_2$  and B entangled  $A_1$  and B entangled

Entanglement and post-selection:

JAAS 2308.07412

A and B entangled  $A \rightarrow A_1 A_2$ Measurement on B

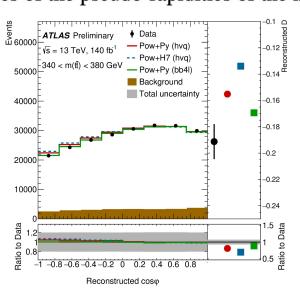


≈ spin selection on A,
 which already has decayed

<sup>\*</sup> J. Bernabéu, talk at 7th Red LHC workshop, Madrid, May 10-12 2023

#### Reconstruction for the dilepton entanglement result

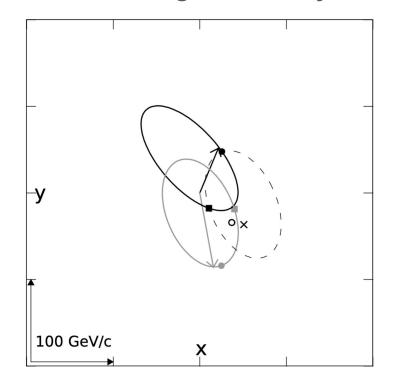
the detector. Several methods are available to reconstruct the top quarks from the detector level charged leptons, jets and  $E_{\rm T}^{\rm miss}$ . The main method used in this work is the Ellipse method [70], which is a geometric approach to analytically calculate the neutrino momenta. Approximately 85% of events are successfully reconstructed by this method. If this method fails, the Neutrino Weighting method [71], which assigns a weight to each possible solution by the compatibility between the neutrino momenta and the  $E_{\rm T}^{\rm miss}$  in the event, after scanning possible values of the pseudo-rapidities of the neutrinos, is used. If both methods fail,

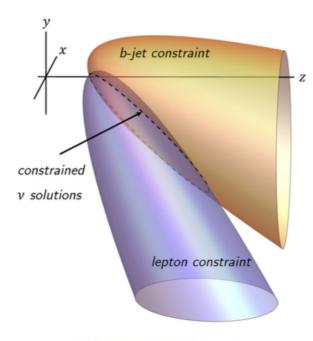


ATLAS-CONF-2023-069

#### **Assume:** everything is on-shell AND neutrinos are the source of the missing $\mathsf{E}_\mathsf{T}$

→ neutrino momenta are **geometrically** constrained to an ellipse





TOP PAG 07/22/20 Evan Ranken



#### The Neutrino Weighting method

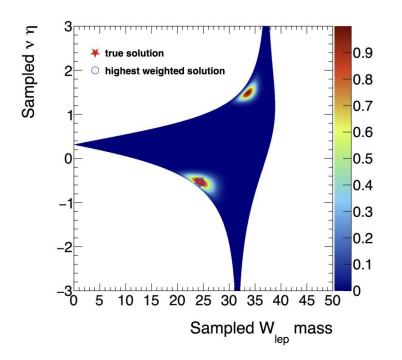
- Dates back to  $\underline{D0}$  (1997), they measured  $m_{top} = 172.0 \pm 7.5 \text{ GeV}$
- LHC Run 1 combination (2023) measured  $m_{top} = 172.52 \pm 0.33$  GeV
- **Don't assume** that the missing  $E_{\tau}$  comes from the neutrinos
  - instead scan  $(\eta_1, \eta_2)$  and for each pair extract  $(p_{x1}, p_{v1})$  and  $(p_{x2}, p_{v2})$  from the mass constraints
  - then compare to missing E<sub>⊤</sub> and extract a weight

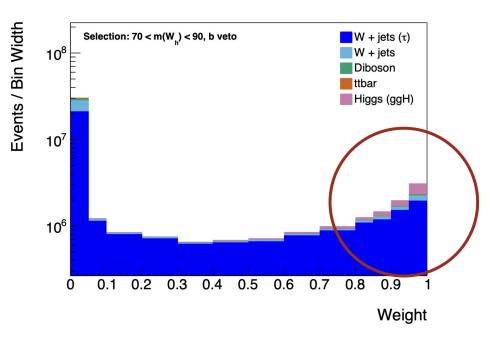
$$w = \exp\left(\frac{-\Delta E_x^2}{2\sigma_x^2}\right) \cdot \exp\left(\frac{-\Delta E_y^2}{2\sigma_y^2}\right)$$

Still have to check the b-jet assignments, possible dependence on m<sub>top</sub>, smearing in case there are no solutions, ...

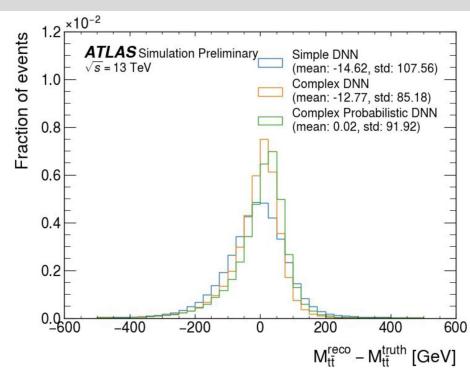
→ very CPU-expensive!

• We reconstruct many Higgs each event under different assumptions of  $m_{W^*}$  and  $\eta_v$ .





# "Can we throw machine learning at it?"



**Simple** → **Complex**: add more inputs and more layers, get *improvement in resolution*.

**DNN** → **Probabilistic DNN**: get an estimate of the aleatoric uncertainty, *remove the bias*.

Reconstructing the two neutrinos' 4-vectors is the hard part...

But maybe this is not always the goal? For instance, we could regress m(ttbar) directly:

- Z'→ttbar resonance searches?
- dependence of m(ttbar) on top Yukawa?
- reducing the amount of dilution in QE/BIV measurements?

# All-hadronic ttbar: should be easy, right?

All decay products are visible jets  $\rightarrow$  **completely avoid the problems** associated with neutrinos!

But now have to deal with combinatorics...

$$\chi^{2} = \frac{(m_{b_{1}q_{1}q_{2}} - m_{t})^{2}}{\sigma_{t}^{2}} + \frac{(m_{b_{2}q_{3}q_{4}} - m_{t})^{2}}{\sigma_{t}^{2}} + \frac{(m_{q_{1}q_{2}} - m_{W})^{2}}{\sigma_{W}^{2}} + \frac{(m_{q_{3}q_{4}} - m_{W})^{2}}{\sigma_{W}^{2}},$$

$$\mathcal{L} = \mathcal{B}(m_{q_{1}q_{2}q_{3}}|m_{t}, \Gamma_{t}) \cdot \mathcal{B}(m_{q_{1}q_{2}}|m_{W}, \Gamma_{W}) \cdot \mathcal{B}(m_{q_{4}q_{5}}|m_{W}, \Gamma_{W})$$

Suffer from CPU cost of permutations

 $\prod^{6} W_{\rm jet} \left( E_{{\rm jet},i}^{\rm meas} | E_{{\rm jet},i} \right)$ 

Nucl. Instrum. Meth. A 748 (2014) 18

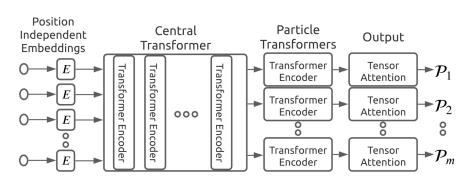
#### Machine learning instead of combinatorics: SPA-Net

#### SciPost Phys. 12 (2022) 178

Symmetry-Preserving Attention Network

**Transformer-Encoder:** state-of-the-art from Natural Language Processing

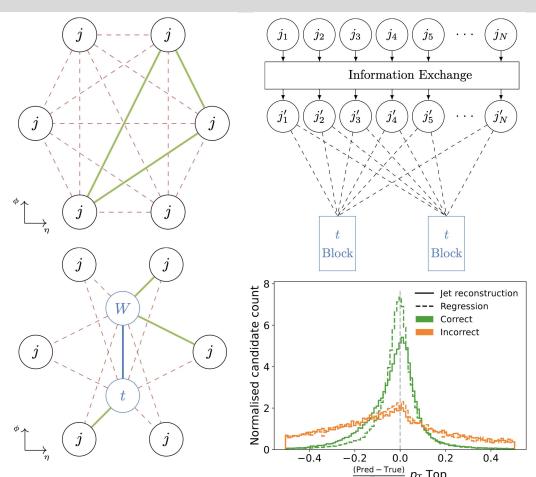
→ relate the input jets to each other in the latent space



**Tensor attention:** impose symmetries of the topology W ~ qq / top ~ bqq

		Event	SPA-NET Efficiency		$\chi^2$ Efficiency	
	$N_{ m jets}$	Fraction	Event	Top Quark	Event	Top Quark
All Events	== 6	0.245	0.643	0.696	0.424	0.484
	== 7	0.282	0.601	0.667	0.389	0.460
	≥8	0.320	0.528	0.613	0.309	0.384
	Inclusive	0.848	0.586	0.653	0.392	0.457
Complete Events	== 6	0.074	0.803	0.837	0.593	0.643
	== 7	0.105	0.667	0.754	0.413	0.530
	≥8	0.145	0.521	0.662	0.253	0.410
	Inclusive	0.325	0.633	0.732	0.456	0.552

# Injecting yet more physics into the machine: Topographs



Phys. Rev. D 107 (2023) 11

# Physically motivated representation of the inputs: graph

→ inject intermediate resonances and specify the allowed connections

- Edge regression: find best assignments
- Node regression: predict the kinematics of the resonances
- Performs as well as SPA-Net

	6j 2b	6j >=2b	7j 2b	7j >=2b	>=6j 2b	>=6j >=2b
Best Spanet [%]	81.58	79.60	65.09	63.09	68.95	66.20
Best Topograph [%]	81.44	79.53	64.91	62.81	68.86	66.24

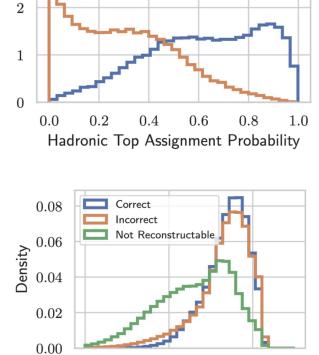
#### From reconstruction to classification

Correct

Incorrect

2.0

1.5



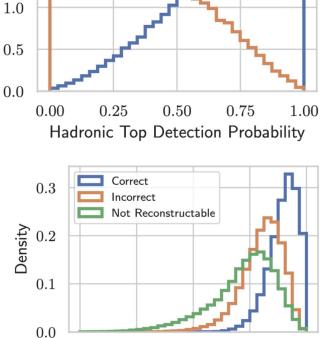
-80

KLFitter Event Log-Likelihood

-100

-60

3



-20

-15

SPANet Event Log-Likelihood

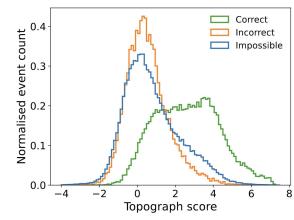
0

Reconstructable

Not Reconstructable

Could select only those events that are well-reconstructed:

- signal vs background?
- unfolding?
- modelling uncertainties?



### A middle ground? ttbar → lepton+jets

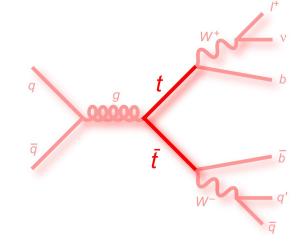
Final state with a single neutrino: can be **fully determined from one mass constraint** (on-shell W) → analytical solution(s)

Is this useful for spin correlation and quantum information studies?

 $\rightarrow$  Yes! the d-quark from the W decay has  $a_{spin}$ ~1

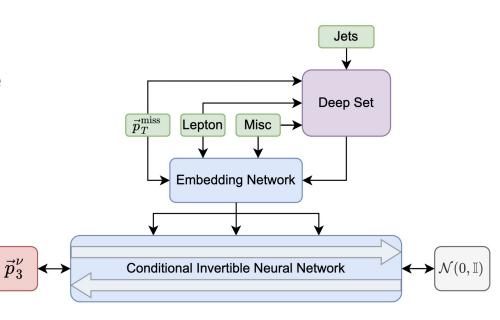
$$p_z^{\nu} = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a},$$

$$\begin{split} a &= (p_z^{\ell})^2 - (E^{\ell})^2, \\ b &= \alpha p_z^{\ell}, \\ c &= \frac{\alpha^2}{4} - (E^{\ell})^2 (p_T^{\nu})^2, \\ \alpha &= m_W^2 - m_{\ell}^2 + 2(p_x^{\ell} p_x^{\nu} + p_y^{\ell} p_y^{\nu}). \end{split}$$

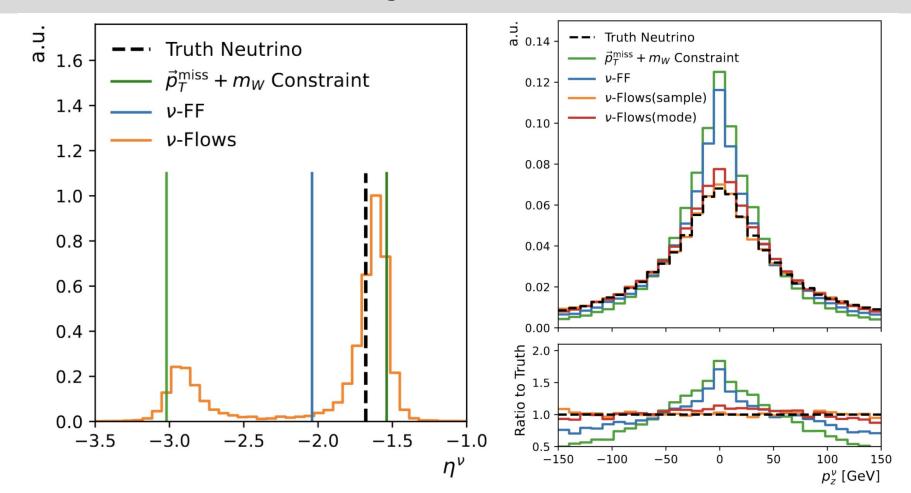


#### Conditional neutrino regression: *v*-flows

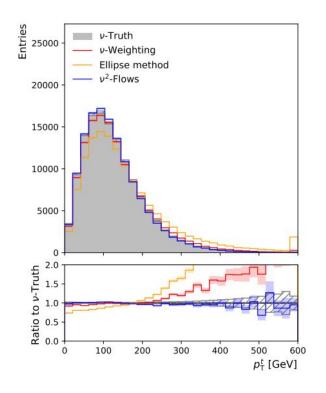
- Embed your input particles in some way
- 2. Train a mapping of the Normal distribution to the kinematics of the neutrinos
- Learn what the likelihood of the neutrino kinematics based on the rest of the event
  - → no assumption of on-shell W's, perfect reconstruction etc.

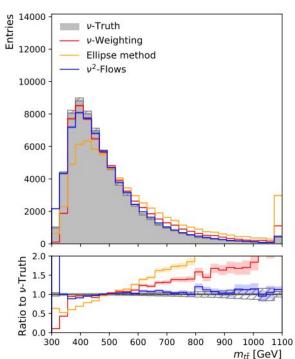


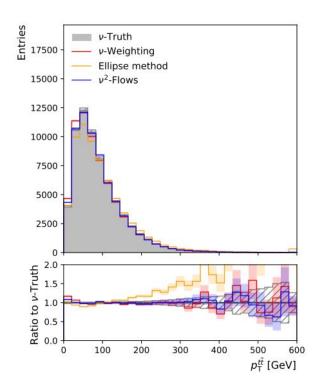
# Conditional neutrino regression: *v*-flows



# More neutrinos! $v^2$ -flows







arXiv:2307.02405

# More neutrinos! $v^2$ -flows

