

# Reinterpretation of current and future measurements

Andy Buckley,  
University of Glasgow

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University  
of Glasgow

# What is reinterpretation?

- ❖ **First interpretation:** physics conclusions drawn from data observables in the experimental-analysis paper
  - Often models the analysis was *designed* to be sensitive to
- ❖ **Reinterpretation:** re-use of analysis data to draw conclusions about physics models it *wasn't* designed for
- ❖ **I.e. doing science!** Unclear why it has a special name...
- ❖ Borderline experiment/theory activity, vibrant collaborations across soft boundaries, e.g. [LHC Reinterpretation Forum](#)
- ❖ **Key to getting most science from our facility investment**
  - **Sustainability:** max physics/tCO<sub>2</sub> ⇒ **analysis life does not end with publication; data re-usability maximises long-term impact**

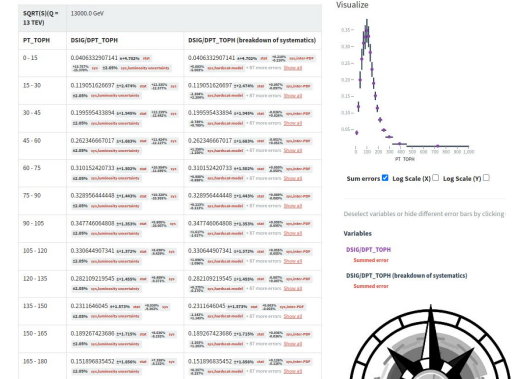


# Reinterpretation tools

- ❖ **Several main tools “on the market”**. Rivet+Contur, MadAnalysis, SModelS, GAMBIT, CheckMATE
- ❖ **All “lightweight” analysis preservation/reuse approaches**
  - **SModelS** reinterprets search data direct from published simplified-model sensitivity maps
  - Others implement event loops, logic and simplified detector-effect modelling
  - **GAMBIT** tries to do everything: EW precision, flavour, astro, cosmo, ... collider as last resort
  - **CheckMATE** has ~focused toward tests of long-lived particle models, via efficiency maps
  - By familiarity, I have to focus on “MC gen” collider-reinterpretation today

# Reinterpretation tools (2)

- ❖ **Main data-source is HEPData.** Standard for LHC, less beyond
  - Stores numerical “primary data”, i.e. histograms, event counts in signal regions, errors & correlations
  - Also “new” push to store experiments’ theory estimates, especially super-expensive precision SM backgrounds
- ❖ **Statistical models: HEPData, pyhf, Spey, HS3, (TACO) + ONNX**
  - HEPData becoming more semantically aware of aux-file meanings: ability to query available resources ([OpenMAPP](#))
- ❖ **Also “full-detail” analysis preservation** and reinterpretation using Docker/etc. containers: RECAST/Reana
  - See following talk by Nicole Skidmore
- ❖ **Focus here on Rivet**, for (my) familiarity but most ideas apply generally; different tools ⇒ different focuses

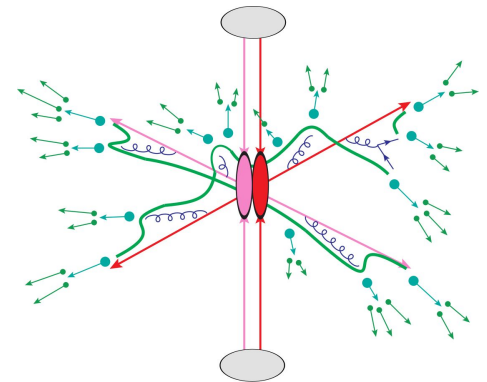
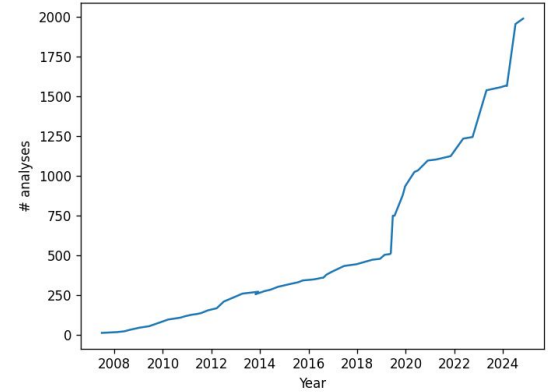


HS<sup>3</sup>

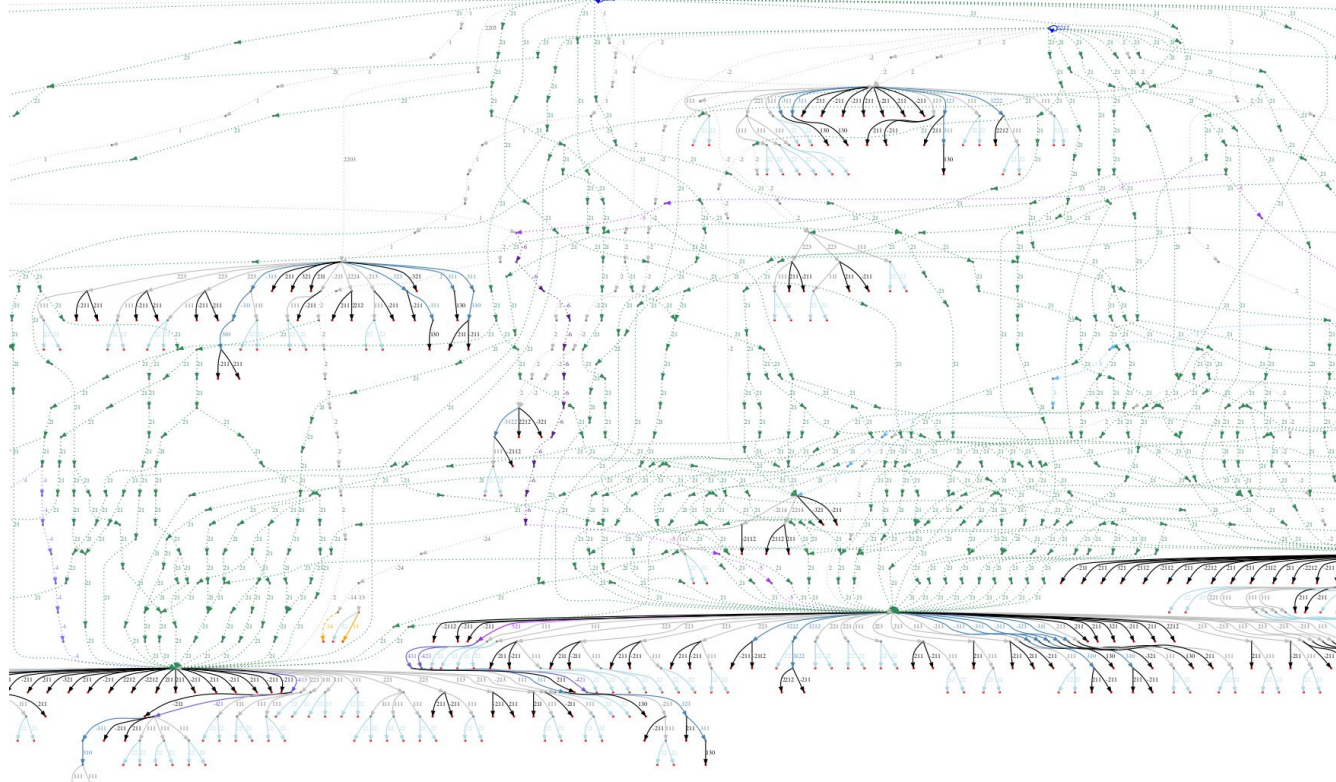


# What is Rivet?

- ❖ The “LHC standard” MC analysis toolkit
- ❖ More broadly a project to preserve the logic of data analyses and encourage expt-pheno collaboration
- ❖ Package structure & key features:
  - C++ core with Python tools
  - Fiducial / **generator-independence**
  - Integration with **HEPData**
  - Automatic **systematic-weights propagation**
  - **~2000+ analyses written in “physicist C++”**
- ❖ Central to a community of analysis reinterpretation tools, linking experiment to theory
- ❖ **But why? Event loops are trivial...**



# Because “MC truth” events are not *true*!



←  $\sim 1/3$  of an LO tt event

MC events are full of unphysical debug info, kinematic inconsistencies, *ad hoc* structures & representations, etc.!

Avoid physicists needing to rediscover graph algorithms, MC conventions, and physical/debug distinctions, ...

# From HZTool to Rivet

- ❖ The idea of preserving experimental analyses for MC validation was born out of HZTOOL
  - HERA (H1 and ZEUS) DIS and photoproduction
  - Probing **low- $x$ , semi-perturbative physics**: DIS with  $Q^2 \sim 4 \text{ GeV}^2$ ; jet  $p_T \sim 5 \text{ GeV}$ ; diffraction
  - Many “state of the art” models only in MCs
  - Much confusion about comparing like-with-like between generators, experiments, and analyses
  - **HZTool** (Fortran) for cross-experiment comparisons of similar measurements modulo cut differences
- ❖ Direct line to Rivet, 10 years later: “HZ mark two”
  - PPARC/STFC initiative, adopted by **MCnet network**

**Future Physics at HERA**  
Workshop, DESY Hamburg, Sept. 95 to Sept. 96

Aim: Study of future physics potentials at HERA in collider and fixed target modes, including high luminosity, polarized beams and nuclei.

**Proceedings of the Workshop**  
[Old home page](#) and [workshop meetings](#)

**Working Groups:**

- Structure Functions
- Electroweak Physics
- Beyond the Standard Model
- Heavy Quark Production and Decay
- Jets and High  $p_T$  Phenomena
- Diffractive Hard Scattering
- Polarized Protons and Electrons
- Lepton and Heavy Nuclei in HERA
- HERA Upgrades and Impacts on Experiments

**Organizing Committee:**  
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Albert De Roeck, DESY  
Robert Klanner, DESY

**Secretary:**  
Ms. H. Haertel  
DESY-FH1K  
Notsekrasse 85  
D-22603 Hamburg  
Phone: +49-40-8998-3105  
Fax: +49-40-8998-3093

**Email:** [heras96@mail.desy.de](mailto:heras96@mail.desy.de)

**Advisory Committee:**  
W.Buchmüller, J.Feltesse, A.Levy,  
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If you are using mosaic, click [here](#).

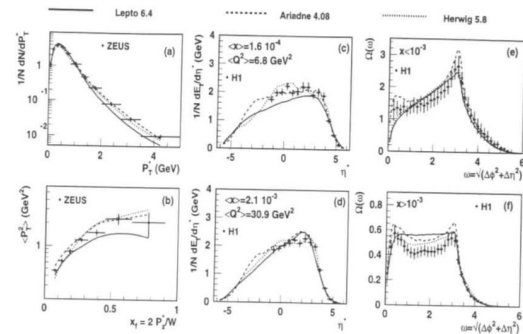
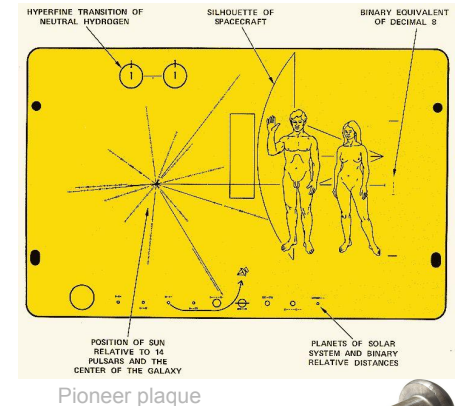


Figure 1: The transverse momenta  $dN/dp_T$  (a) and the 'seagull' plot  $(P_T^2) \times x_F$  (b) of single particles in the positive hemisphere of the hadronic center of mass. The transverse energy flow  $dE_T/d\eta$  in a low (c) and high (d)  $x$  and  $Q^2$  bin. The transverse energy-energy correlations for  $x > 10^{-3}$  (e) and  $x < 10^{-3}$  (f).

# Lessons learned

- ❖ **A simple/obvious idea, with surprising impact:**
  - Reproducing (or not) a key plot is *powerful*
  - A clear basis for concluding whether or not models agree with each other and with data. Numbers > adjectives!
  - **A common language for phenomenology and experiment**
- ❖ **Practicality forces good behaviour (a “Ulysses contract”)**
  - It’s “obvious” to use partons & bosons from the event graph
  - But they are frequently unphysical, approximate in various ways, and may not even exist!
  - Generality / compatibility with many generators means avoiding gen-dependence, and enforcing standards
  - ⇒ **predict “real” observables, from well-defined final states**  
... AKA “fiducial analysis”
  - My bias: this should be our measurement gold-standard, increasingly including BSM-focused analyses in the HL era





# Fiducial analysis

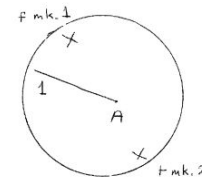
## ❖ Another simple/obvious idea:

- **“Say what you see”**: **don’t report what you couldn’t see!**
- More specifically: *do* correct for detector biases, but **minimise extrapolations beyond experiment acceptance**
- Done by aligning “unfolding target” (usually MC) definition with reco-level acceptances and selection cuts
- Take **“safe” shortcuts**, e.g. use hadron decay histories in place of reco, but **don’t rely on partons from interfering amplitudes**: hadronization is a decoherence barrier
- Result is **“best estimate of what could be seen by a perfect detector”**: don’t fill unseen phase-space with model-dependent assumptions



## ❖ Analysis lifetime is maximised by not being model-specific

- E.g. HH-production signal-strength at HL-LHC has **~40% theory uncertainty from  $m_t$  scheme**. No theory resolution in sight. But **fiducial cross-section is unaffected**



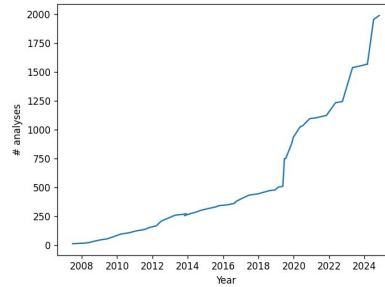
- 19 -

Single incident particle A1 stopping in the chamber at A. Two fiducial marks 1 and 2 on the chamber front glass. Two stereoscopic photos of this event.

# How's it going?

## ❖ Version 4.0.2 (Oct 2024) → 1,987 analyses!

A steady flow of analysis submissions until 2019, then increase + several deluges from MC gen teams



## ❖ Official support from the (LHC) experiments is crucial

- Preservation of analysis logic in executable form has become standard for measurements
- The original teams know logic best by far; papers are never quite complete/unambiguous
- Still imperfect! We [monitor paper coverage](#) ⇒

## Rivet analysis coverage (no searches, no heavy ion)

Rivet analyses exist for 845/4241 papers = 20%. 153 priority analyses required.

Total number of Inspire papers scanned = 7280, at 2020-07-02

Breakdown by identified experiment (in development):

Key	ALICE	ATLAS	CMS	LHCb	Forward	HERA	$e^+e^- (\geq 12 \text{ GeV})$	$e^+e^- (\leq 12 \text{ GeV})$
Rivet wanted (total):	72	111	126	183	43	461	765	647
Rivet REALLY wanted:	17	42	61	9	0	13	1	3
Rivet provided:	14/86 = 16%	135/246 = 55%	77/203 = 38%	13/196 = 7%	8/51 = 16%	9/470 = 2%	166/931 = 18%	344/991 = 35%

Show greylist Show blacklist

ALICE **ATLAS** CMS LHCb Forward HERA  $e^+e^- (\geq 12 \text{ GeV})$   $e^+e^- (\leq 12 \text{ GeV})$  Tevatron RHIC SPS Other

ATLAS: Measurement of the  $t\bar{t}$  production cross-section in the lepton+jets channel at  $\sqrt{s} = 13 \text{ TeV}$  with the ATLAS experiment

Inspire ID: 1802524 arXiv ID: 2006.13076 Report IDs: CERN-EP-2020-096

Links: Inspire arXiv

ATLAS: Measurements of top-quark pair single- and double-differential cross-sections in the all-hadronic channel in  $pp$  collisions at  $\sqrt{s} = 13 \text{ TeV}$  using tt

Inspire ID: 1801434 arXiv ID: 2006.09274 Report IDs: CERN-EP-2020-063

Links: Inspire CDS arXiv

ATLAS: Measurements of the Higgs boson inclusive and differential fiducial cross sections in the  $4\ell$  decay channel at  $\sqrt{s} = 13 \text{ TeV}$

Inspire ID: 1790439 arXiv ID: 2004.03969 Report IDs: CERN-EP-2020-035

Links: Inspire CDS arXiv HepData ATLAS\_2020\_11790439

ATLAS: Measurement of the Lund Jet plane using charged particles in 13 TeV proton-proton collisions with the ATLAS detector

Inspire ID: 1790256 arXiv ID: 2004.03540 Report IDs: CERN-EP-2020-030

Links: Inspire DOI/Journal CDS arXiv HepData ATLAS\_2020\_11790256

ATLAS: Measurements of the production cross-section for a  $Z$  boson in association with  $b$ -jets in proton-proton collisions at  $\sqrt{s} = 13 \text{ TeV}$  with the ATLAS

Inspire ID: 1788444 arXiv ID: 2003.11960 Report IDs: CERN-EP-2020-022

Links: Inspire CDS arXiv

ATLAS: Measurement of isolated-photon plus two-jet production in  $pp$  collisions at  $\sqrt{s} = 13 \text{ TeV}$  with the ATLAS detector

Inspire ID: 1772071 arXiv ID: 1912.09866 Report IDs: CERN-EP-2019-210

Links: Inspire CDS arXiv

ATLAS: A measurement of soft-drop jet observables in  $pp$  collisions with the ATLAS detector at  $\sqrt{s} = 13 \text{ TeV}$

# Applications: from tuning to BSM

❖ Pre-LHC huge QCD uncertainties: **MC tuning** via Rivet analyses

❖ Tunes revealed gaps in data and in modelling

➤ Better tunes  $\Rightarrow$  better analysis, better results  $\Rightarrow$  better MC

➤ **Impact:** LEP and Tevatron analyses published for  $\sim 10$  years suddenly got *used!* And cited...

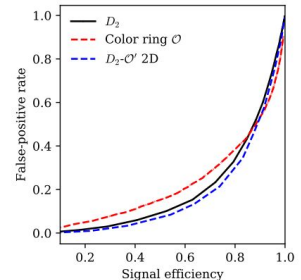
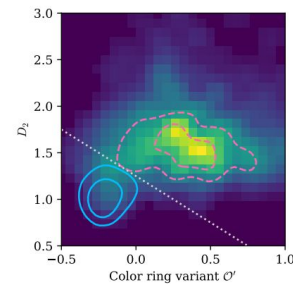
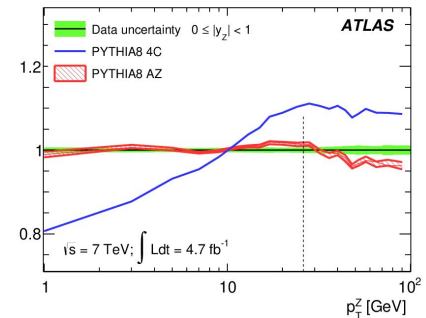
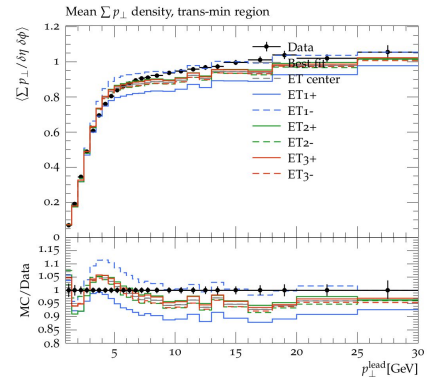
$\Rightarrow$  ATLAS and CMS tunes, tune uncertainties

$\Rightarrow$  Rapid responses to preliminary data

➤ **Model development:** matching & merging, addition of energy evolution & colour-reconnection to Herwig, ...

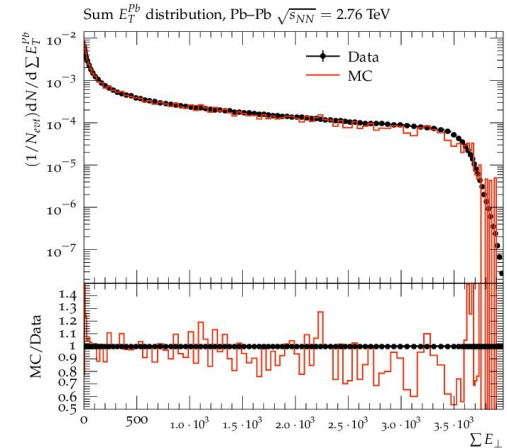
❖ Recently, also use of Rivet's large analysis collection for **BSM & Higgs**

➤ Same features that made analyses quick to use for tuning also useful in analysis prototyping and model scans



# Heavy-ion preservation

- ❖ **Heavy-ion physics is a “frontier”**: high-complexity multi-scale event modelling, no current tools that can do everything → **flexibility needed**
- ❖ Again, a concrete tool through which to test against data sharpens discussions, provides a clear metric
- ❖ Some really nice **community-led initiatives** grew up around tools, spurred standardisations, **collaboration between HEP/nuclear communities**, and drive modelling developments:
- ❖ ⇒ more analyses finding there's *life after publication*



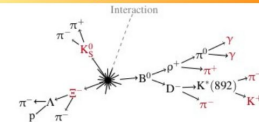
## Summary

1. Data getting into HEPData

2. Build your own undergraduate army



3. Primary particle definition



4. Validation Procedure

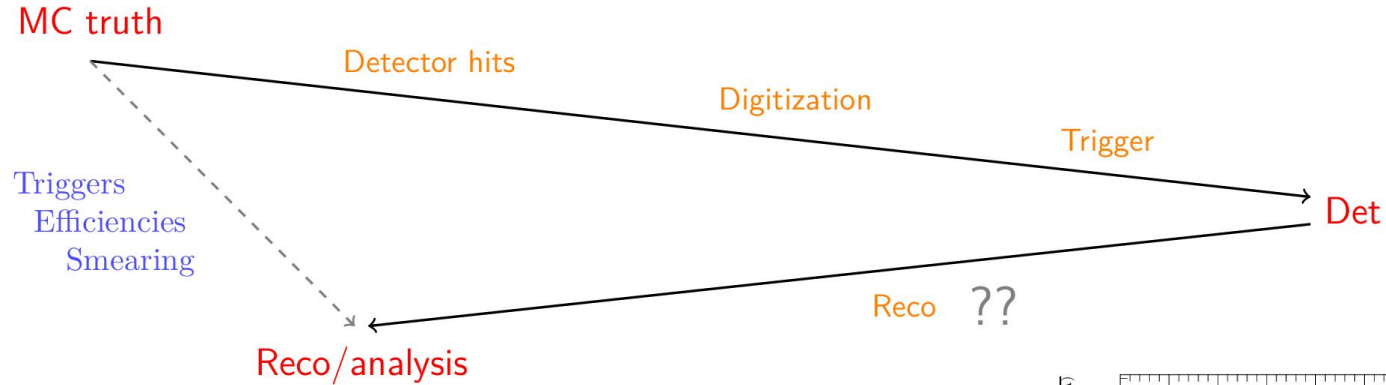
5. HEPMC output may have some issues



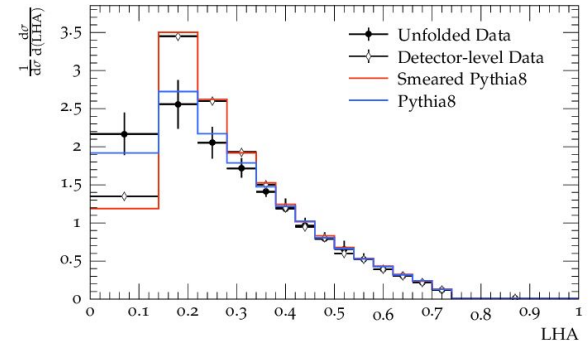
<https://indico.bnl.gov/event/10966/>

# Detector emulation

- ❖ “Detector smearing” is valid for many reco-level analyses (also in GAMBIT, MA5): reco is calibrated back toward MC truth, so go direct and skip the unknowns

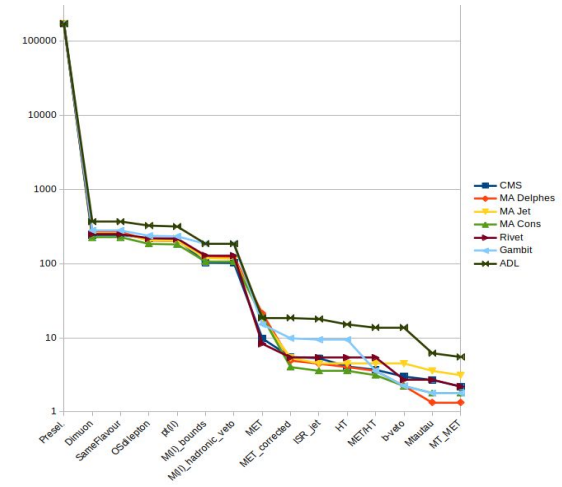


- capture key efficiencies cf. Delphes, but analysis-specific and less “simulation theatre”
- flexibility allows e.g. “tuned” jet-substructure smearing, systematics studies, whatever...

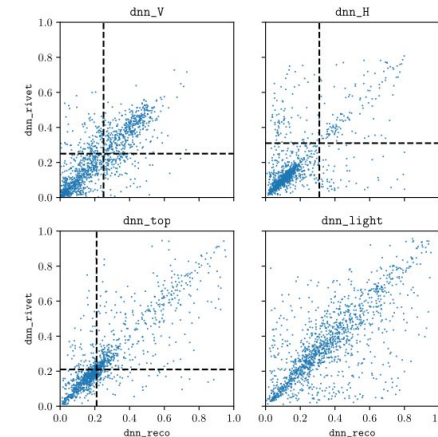


# Reco-level search recasting

- ❖ Lots of activity in reinterpretations of BSM-search analyses with detector emulation
  - efficient scaling-up to hundreds of analyses
  - phase-space-specific detector/efficiency functions (or Delphes cards) found necessary
- ❖ Precision maybe 10%-20%
  - on fast-falling spectra, small effect on CL's
  - sufficient to highlight regions of interest in new models  $\Rightarrow$  point experiments to re-test
- ❖ Machine-learning classifiers *can also be preserved* and work well on smeared events
  - not always necessary: tagging algs can be parametrised, maybe MC-level NN
  - object robustness / truth equivalent matters



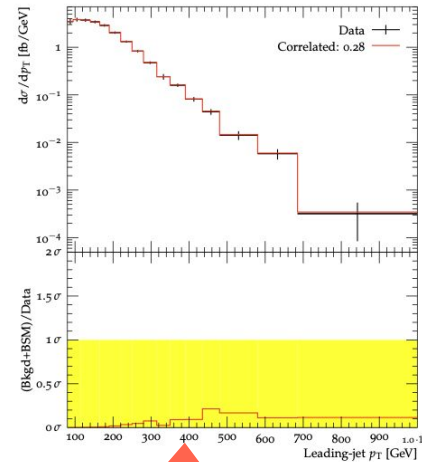
MCBOT comparison: reco vs RIVET for  $Z' \rightarrow t\bar{t}$  (1250 GeV)



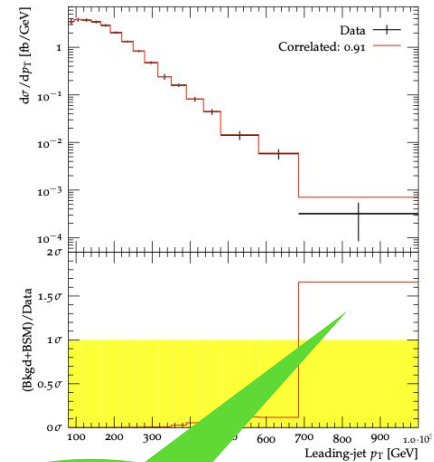
# BSM from “Standard Model”



- ❖ Particle-level measurements *can* achieve high model-independence
  - Careful definition of fiducial cross-section, reduce model sensitivity in unfolding
- ❖ E.g. Contur injects BSM signal into “SM” measurements
  - Many models **already “dead” before a dedicated search**  $\Rightarrow$  *save years of effort* (cf. ATLAS EXO)
  - Particularly strong for measurements with complex signatures: mixtures of leptons, jets, MET, ...
  - But even e.g. model-independent unfolded MET+jet has near-search power
- ❖ All at truth-level  $\Rightarrow$  **SPEED!**



Signal would have small effect wrt uncertainties, can't exclude it (28 % CL)

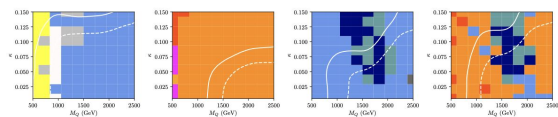


Signal would have large effects wrt uncertainties: can exclude at high CL

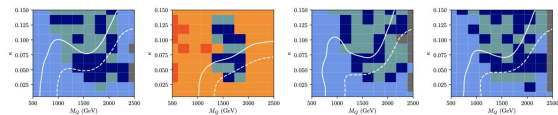
# Try doing this with full-sim in finite time...

❖ Contour vector-like quark study on a scan of realistic VLQ multiplets:

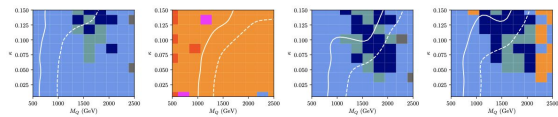
7 multiplets, each with 3 generational couplings, each with 4 W/H/Z-couplings,  
300 points per scan, x 30,000 events  $\Rightarrow$  750M events!



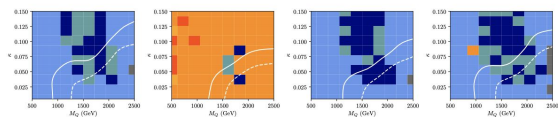
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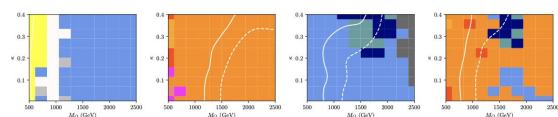
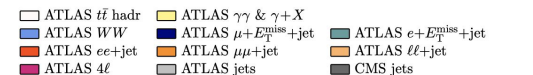
(e) *XT* 0:0:1 (f) *XT* 0:1:0 (g) *XT* 1:0:0 (h) *XT*  $\frac{1}{2}:\frac{1}{2}:\frac{1}{4}$



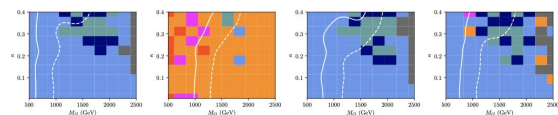
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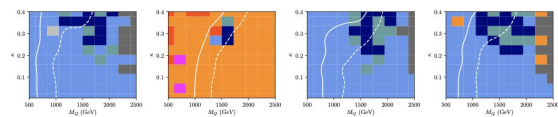
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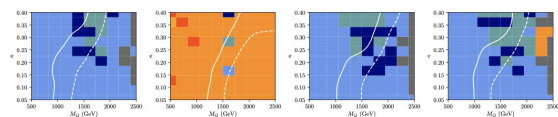
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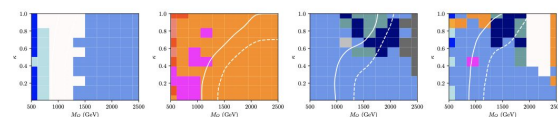
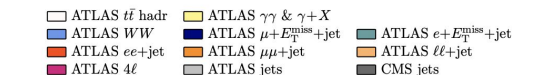
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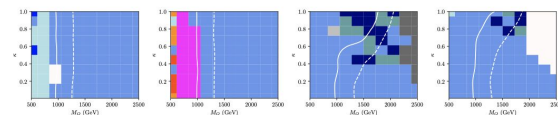
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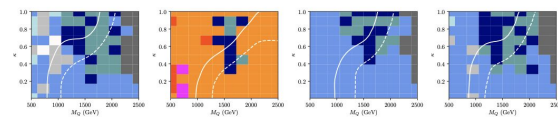
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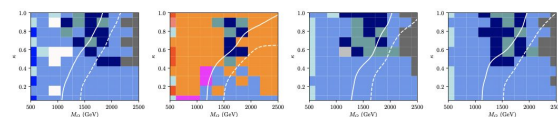
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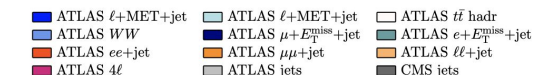
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(i) *BY* 0:0:1 (j) *BY* 0:1:0 (k) *BY* 1:0:0 (l) *BY*  $\frac{1}{2}:\frac{1}{2}:\frac{1}{4}$



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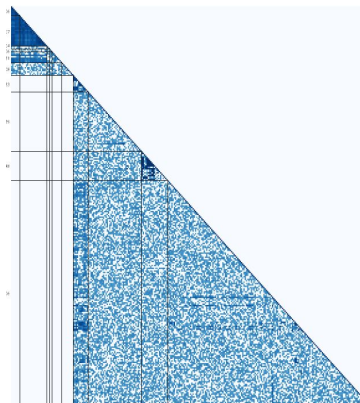




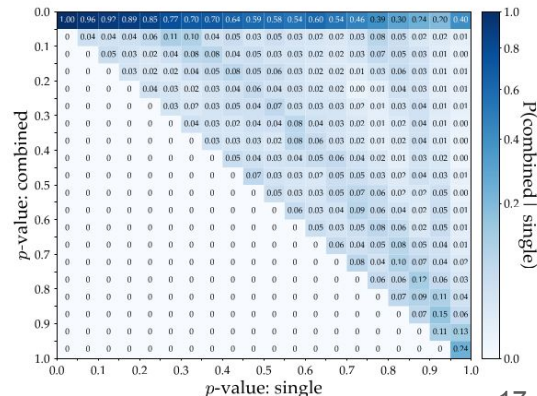
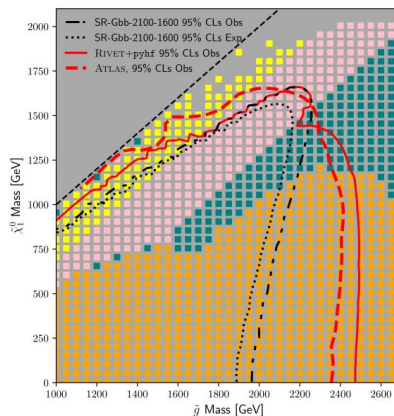
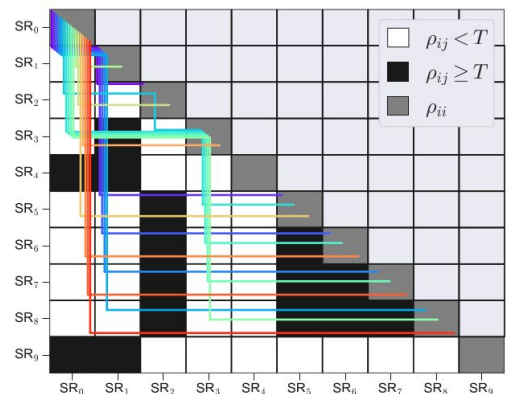
# Analysis combinations



- ❖ One last thing: cannot just naively add all  $\text{InL}'s$  and draw a mega-limit!
- ❖ Over many (many!) analyses, bins and signal regions, there will be acceptance overlaps  $\Rightarrow$  double-count exclusionary features
- ❖ Naive approach is to only use single best-expected bin: what a waste! Lots of exciting work on acceptance correlations, TACO WHDFS alg for best-expected combinations, and anomaly detection in development



from Jamie Yellen & Tomasz Procter theses



# Summary

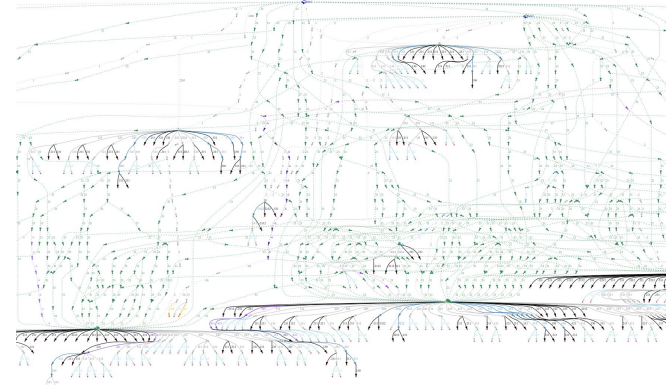
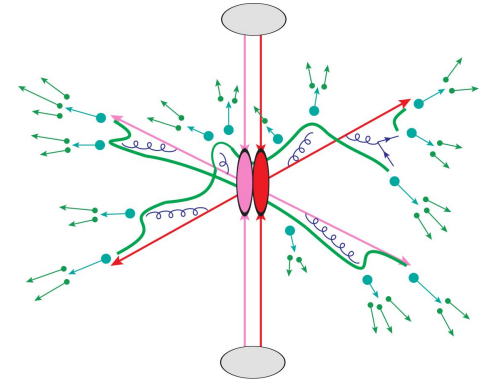
- ❖ **Reinterpretation is about enabling two-way communication between experiments and theory**
  - Testing & improving models, more impact, and avoiding wasted effort. **Actual science aims, not proxies like publication**
- ❖ **Preserving analysis logic, particularly in a publicly accessible and rapidly computable form *matters***
- ❖ **Several toolkits, with different focuses and strengths**
  - So far mainly collider-focused event-loops; the idea is more general. All analysis can & should be reusable and combinable
- ❖ **Incentives are needed**
  - **Short-termism can discourage work for long-term impact**
  - Get junior scientists enthused, build re-use culture & values
  - **Reward good community/science behaviour ⇒ career rewards**



# Backup slides

# MC generation

- ❖ **MC generation is where theory meets experiment**
  - The fundamental  $pp$ ,  $pA$ ,  $AA$  collision, *sans* detector
- ❖ **Components of an “exclusive” event-generator chain:**
  - QFT **matrix element** sampling at fixed-order in QCD
  - *Dressed* with approximate collinear splitting functions, iterated in factorised Markov-chain “**parton showers**”
  - FS parton evolution terminated at  $Q \sim 1$  GeV: phenomenological **hadronisation** modelling
  - Mixed with **multiple partonic interaction** modelling
  - Finally particle **decays**, and other niceties
- ❖ **Modern HEP is hostage to shower MCs!**
  - The main mechanism for translating theory to experimental signatures, from QCD to BSM
  - Generally very complex modelling and output

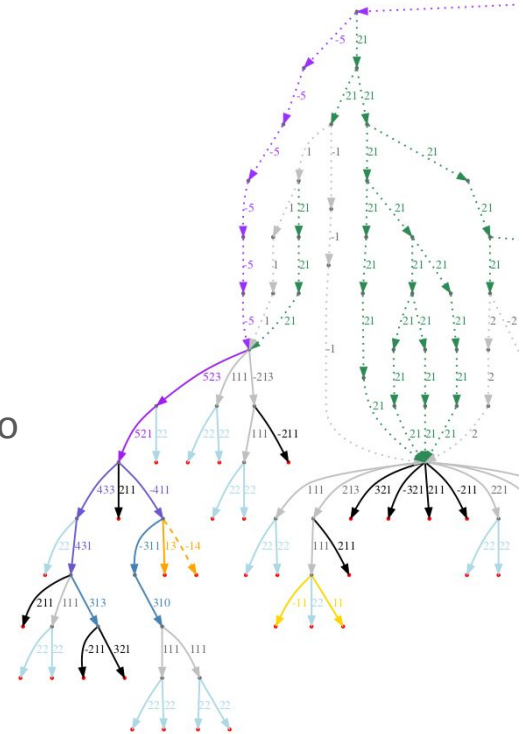


# Physically safe analysis methods



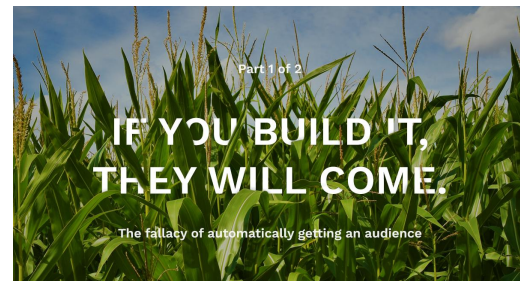
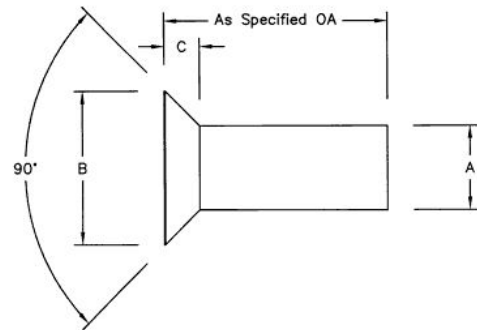
Avoiding unstandardised event-graph features was pragmatic, but led to some genuine physical insights:

- ❖ Refining the “fiducial” idea, defining *unfolding targets*
- ❖ **Hadronisation as a “decoherence barrier”**  
use the natural dividing line between the quantum-interfering hard process & semi-classical decays: ~ no tempting partons!
- ❖ **Bringing truth tagging closer to reco**  
first releases used *b*-ancestry of jet constituents to set HF labels: too inclusive!  $\Rightarrow$  *associate* the hard-fragmenting, weakly-decaying *B*
- ❖ **Promptness/directness tests**  
don't identify a particle “from the hard process”; do it backward. Label as *indirect* via recursive checks for hadron parentage
- ❖ **Dressed leptons**  
we now primarily *dress* truth leptons with their photon halo



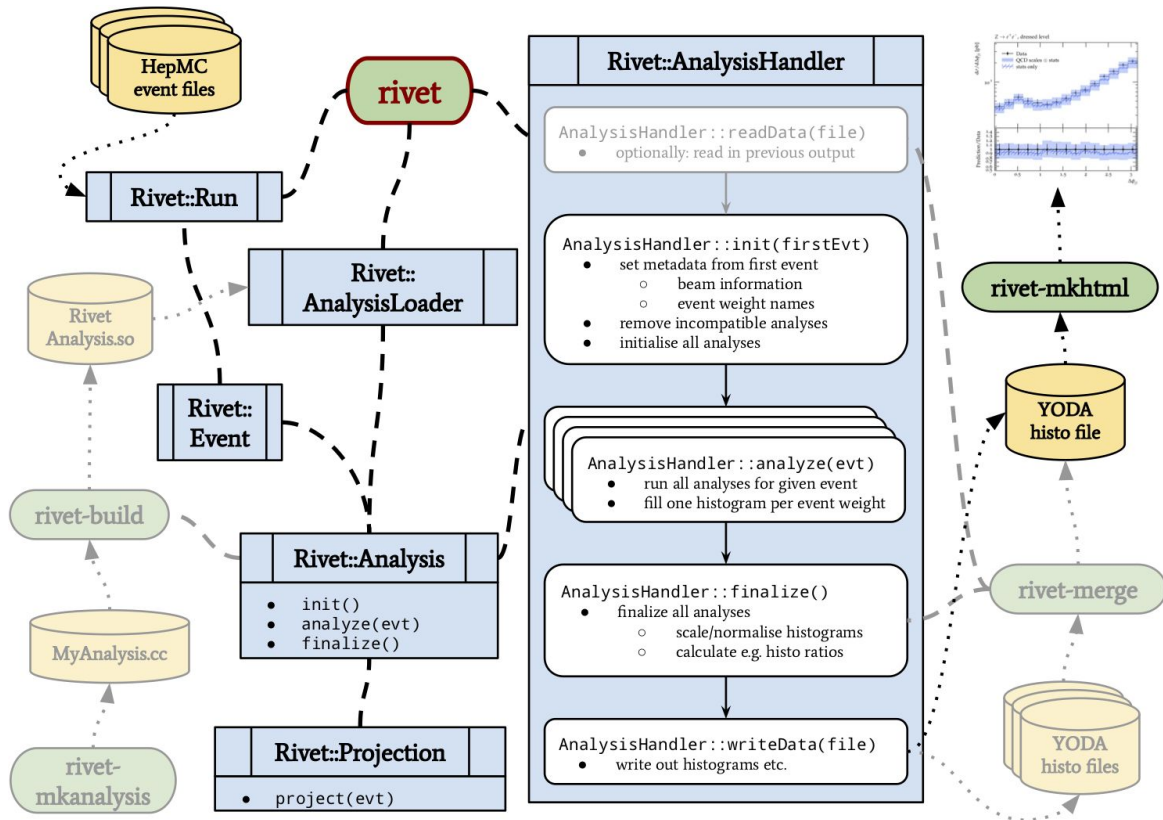
# Designing Rivet

- ❖ **Ease of use**
  - **Big emphasis on “more physics, less noise”!**
  - Minimal boilerplate analysis code, HepData sync
  - Event loop and histogramming basically familiar
  - **Tools to avoid having to touch the raw event graph**
- ❖ **Embeddable**
  - OO C++ library, Python wrapper, sane user scripts
  - Generator independence: communication via HepMC
    - Note HepMC3 HI-support efforts
  - Analysis routines factorised: loaded as “plugins”
- ❖ **Efficient**
  - **Avoid recomputations via “projection” caching system**
- ❖ **Physical**
  - **Measurements primarily from final-state particles only**



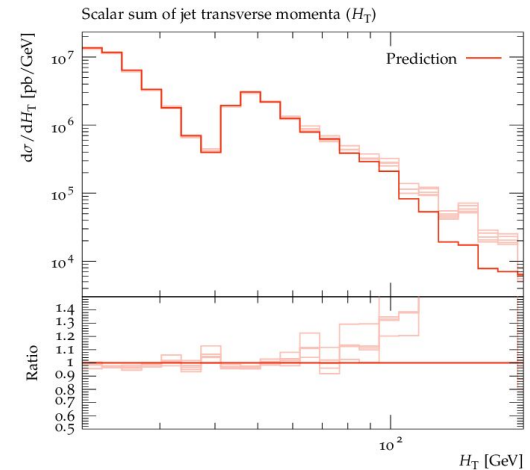
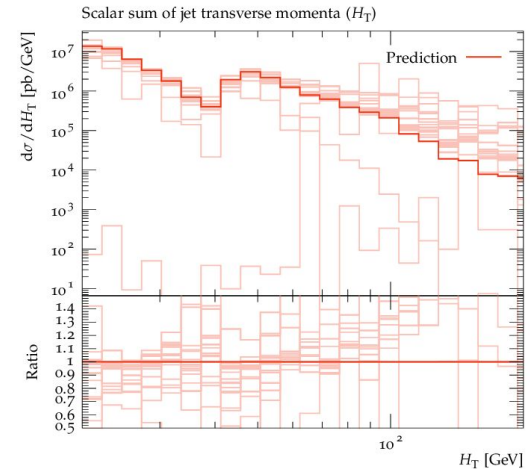
# The result

- ❖ Rivet v3 structure  
[arXiv:1912.05451](https://arxiv.org/abs/1912.05451)
- ❖ Streamlined set of tools from analysis coding to event processing to plotting (and other applications)
- ❖ And a key gateway to connect data analysis to theory (and back again)



# Multiweights and re-entry

- ❖ MC weight vectors allow expression of increasingly complex theory uncertainties. But a burden for analysis chains: have to propagate and correctly combine O(200) weight streams!
- ❖ Rivet 3: complex automatic handling of weights  
~invisible to users: data objects *look* like histograms etc. but are secretly multiplexed
- ❖ Can now re-call finalisation to combine runs:  
RAW histogram stage preserves pre-finalize objects  
⇒ “re-entrant” perfect rivet-merge-ing  
Key for e.g.  $pA/pp$  or  $W/Z$  ratios, + BSM recasting
- ❖ Data types are important: glimpses of a fully coherent separation of semantics from presentation





# The future of Rivet

- ❖ **Vision: Rivet as a standard for “truth-level” observables**
- ❖ Eyes on future colliders, including EIC, cosmic-ray air showers ... and nuclear physics, beyond? Happy to try!
- ❖ Not just standalone, but as a library in pheno & experiment frameworks, too: **leverage analysis collection, standardise MC-observable definitions, seamless systematics handling, etc.**
- ❖ Version 4 features include [high-dimensional \(and consistent\) histogramming](#), HDF5 aux data, and ONNX machine-learning.
- ❖ At its core: a **physics-oriented** system for physicists to **compare MC predictions to one another and to data, on many simultaneous observables, in myriad ways**

*We don't know all the use-cases yet.*

