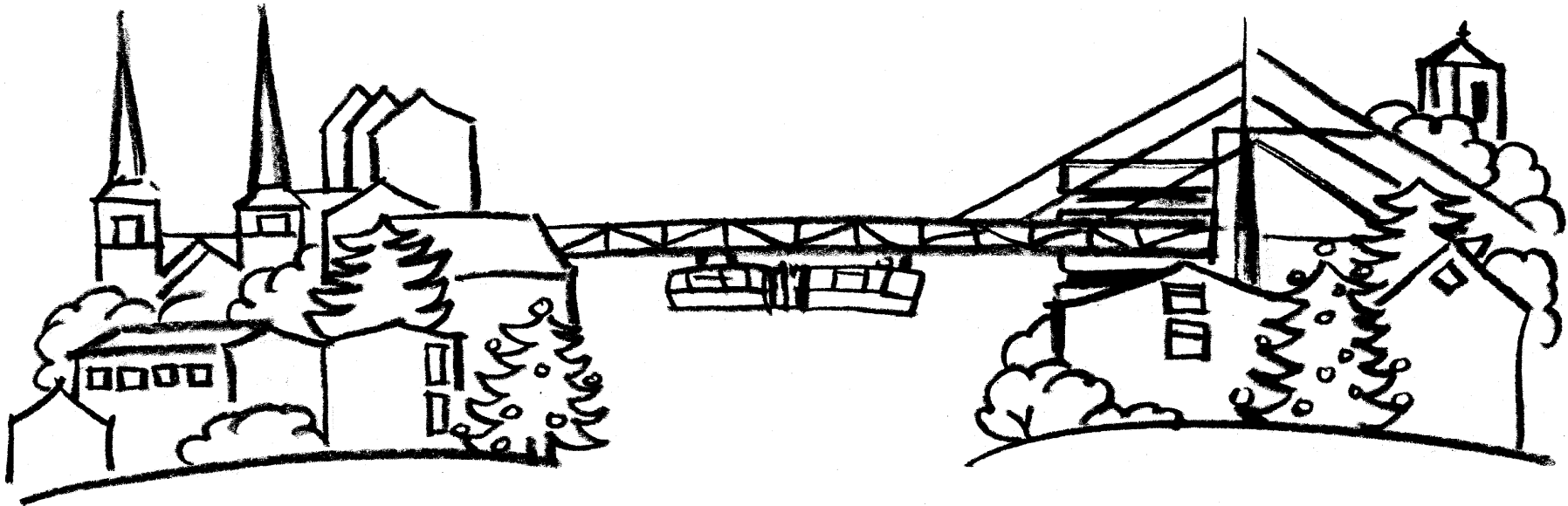




Experience with Bayesian Unfolding (after method proposed by D'Agostini)





Contents

- Motivation
- Strategy of unfolding an experimental distribution
 - $W \leftrightarrow Z$ migrations
 - Model dependency of migration matrix
- Estimation of statistical errors
- Summary





Motivation

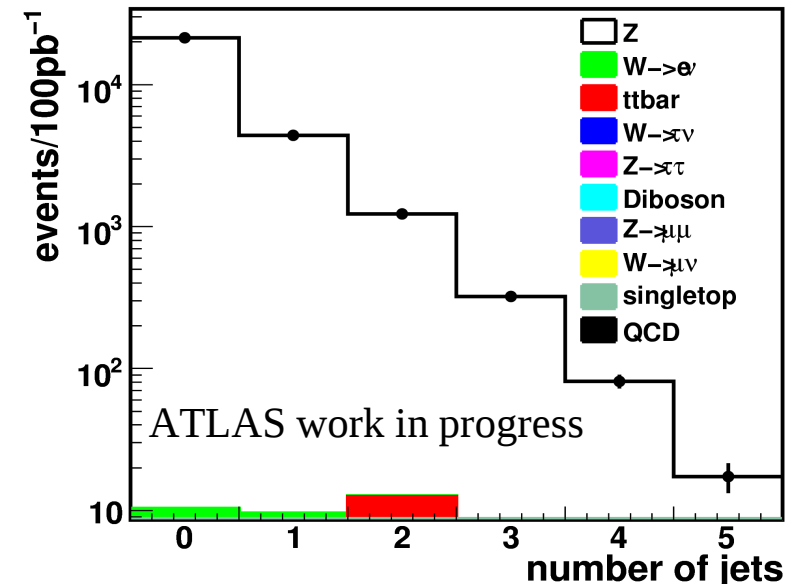
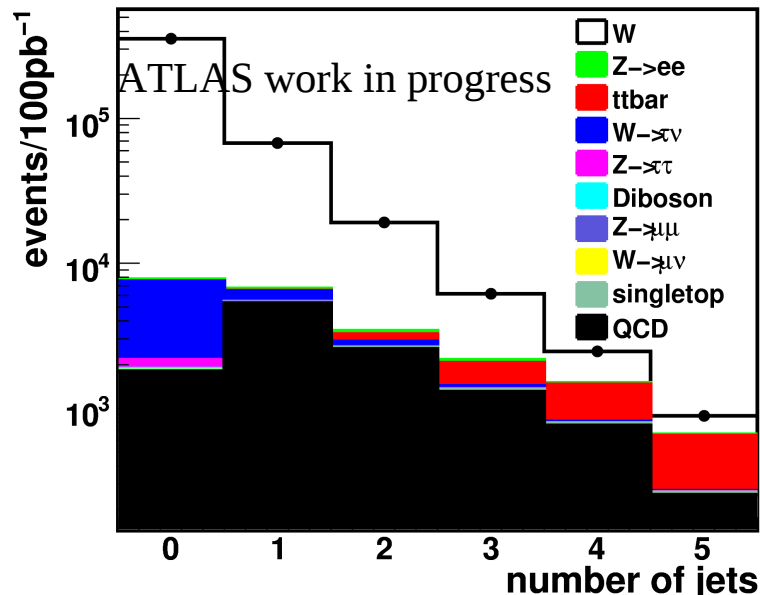
- Production of W and Z bosons + jets
central process at LHC
 - > important background processes
 - > test QCD predictions, test and tune MC generators
- Aim of analysis:
measure **ratio W+njets/Z+njets**
- **Unfold W+jets and Z+jets** then calculate ratio
 - > compare directly to QCD and MC generator predictions, without detector and reconstruction effects





Analysis with unfolding -> as I learned by doing..

- Always first step: Select W and Z candidates



- First subtract background -> then **unfold only signal** (tried to handle bg during unfolding -> large off-diagonal elements, does not converge!)

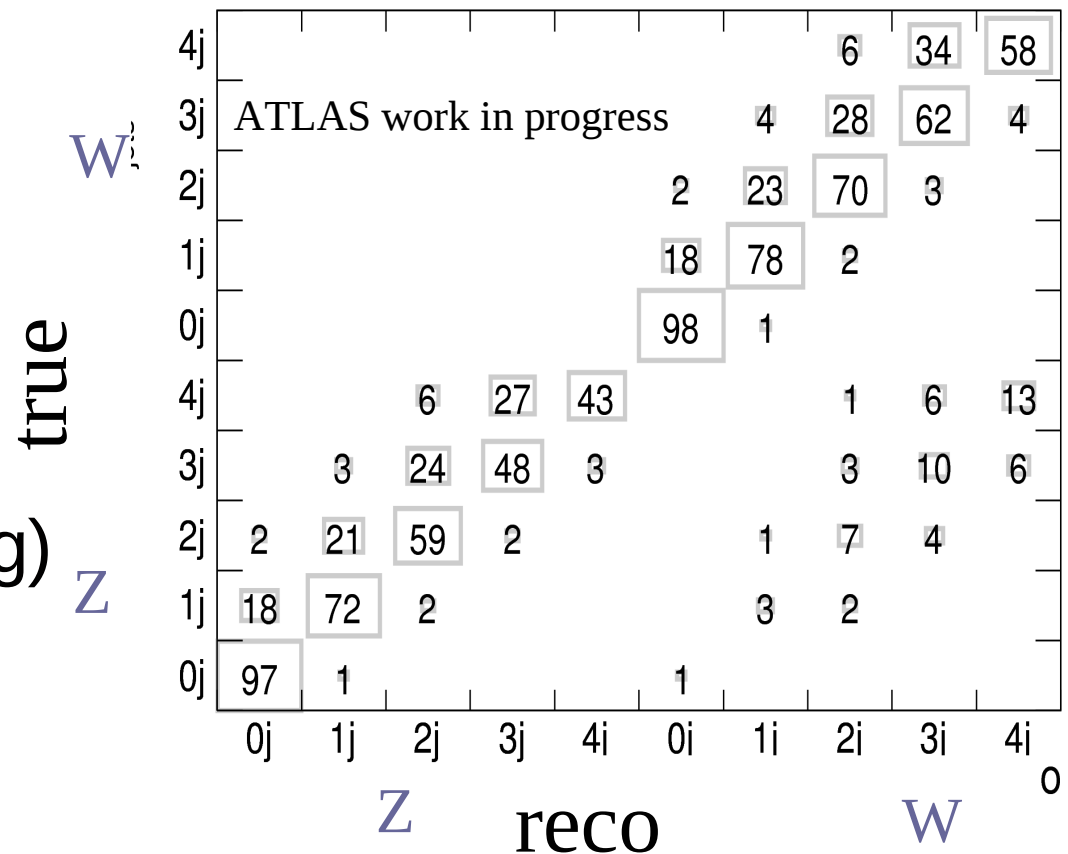




Next “problem”: W \leftrightarrow Z Migrations!

- W \leftrightarrow Z migrations exist
 - Many Z events reconstructed as W
-> how to handle?
- Correct during unfolding?
- Migration matrix with large off-diagonal elements!
(typical problem for unfolding)
- 10 times more W than Z

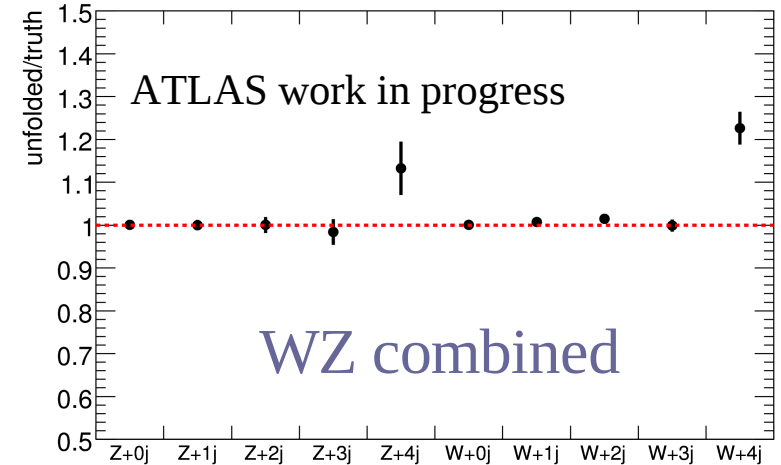
Migration prob. in %





W <-> Z Migrations II

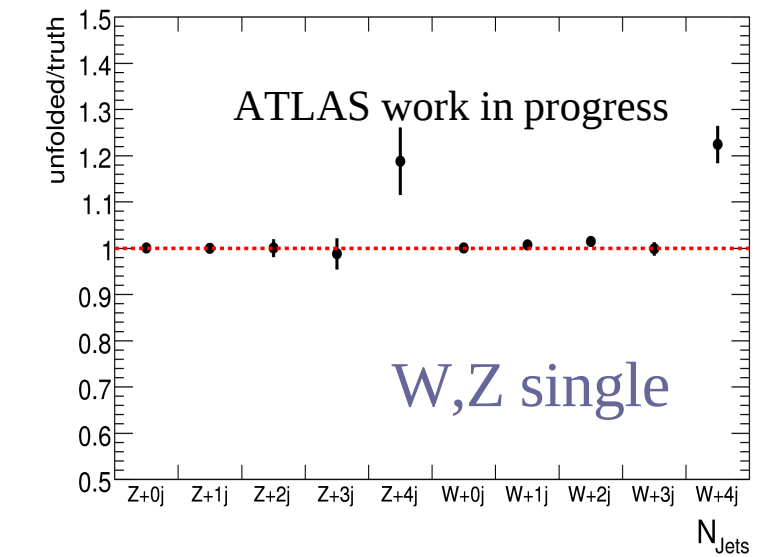
- ... what happens during unfolding?
- > works, but....
(different results!!!)
- > errors do not change??? Strange!
Strong correlations! Also strange...



ATLAS work in progress

N_{jets}	4j	-2	-1		9	10	-13	-4	-3	21	100
	3j	-3	-1	3	3		-24	-6	17	100	21
	2j	-5	-1		-1	-1	-47	5	100	17	-3
	1j	-8	-3	-3	-2	-1	-83	100	5	-6	-4
	0j	-31	-18	-12	-7	-4	100	-83	-47	-24	-13
	4j			8	43	100	-4	-1	-1		10
	3j	-1	3	34	100	43	-7	-2	-1	3	9
	2j	-1	23	100	34	8	-12	-3		3	
	1j	7	100	23	3		-18	-3	-1	-1	-1
	0j	100	7	-1	-1		-31	-8	-5	-3	-2
		0j	1j	2j	3j	4j	0j	1j	2j	3j	4j

N_{jets}





Lessons learned

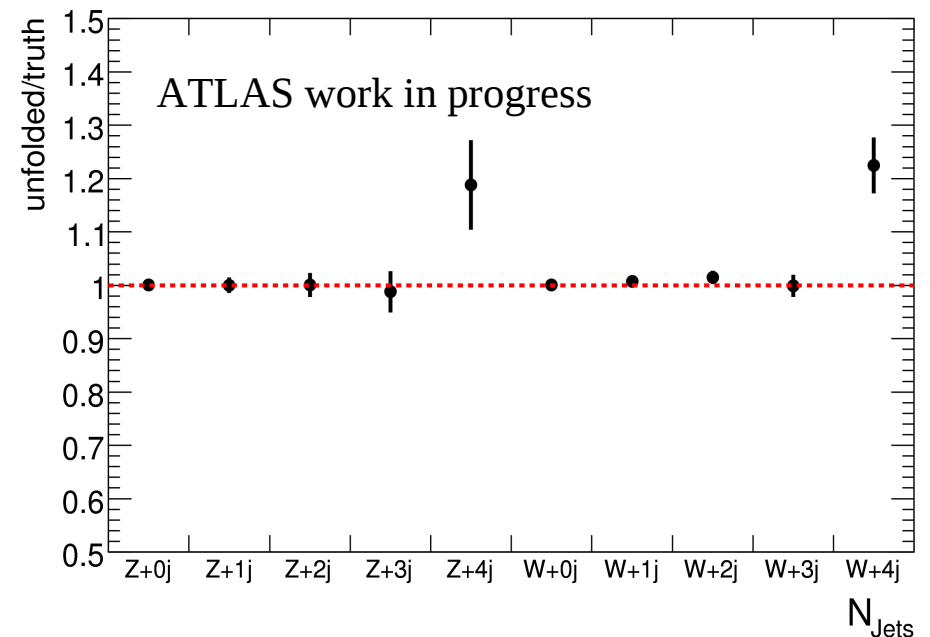
- Factorize:
 - Event selection
 - Background subtraction
 - **Unfolding**
 - Better unfold **W and Z separately!**
 - Unfolding = re-sorting of events!
-> Calculate migration matrix with selected events,
same cuts like for W and Z
- After unfolding:
Signal efficiency: from “all” -> “selected”
no migrations here! Only $1/\epsilon$!





One “problem”: Need a migration matrix!

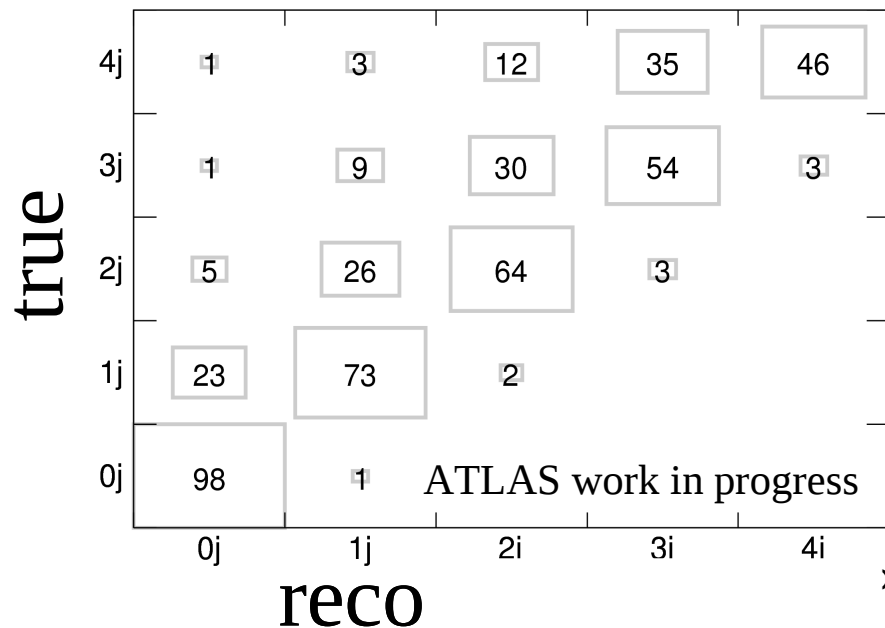
- Migration matrix from simulated events
 - Two “models”:
event generator and **detector simulation**
- Closure test inside one model
-> works fine!
(binary bin effects: no out of acceptance correction)
- But cannot calculate mig matrix with data.. have to **rely on Monte Carlo..**



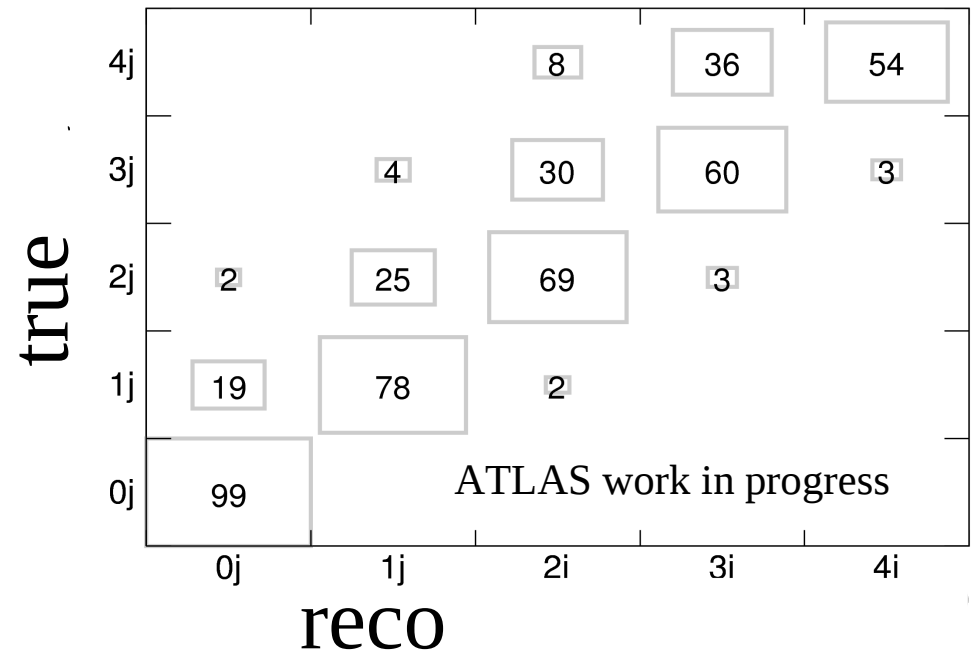


Comparison of Migration Matrices

- Alpgen



Sherpa



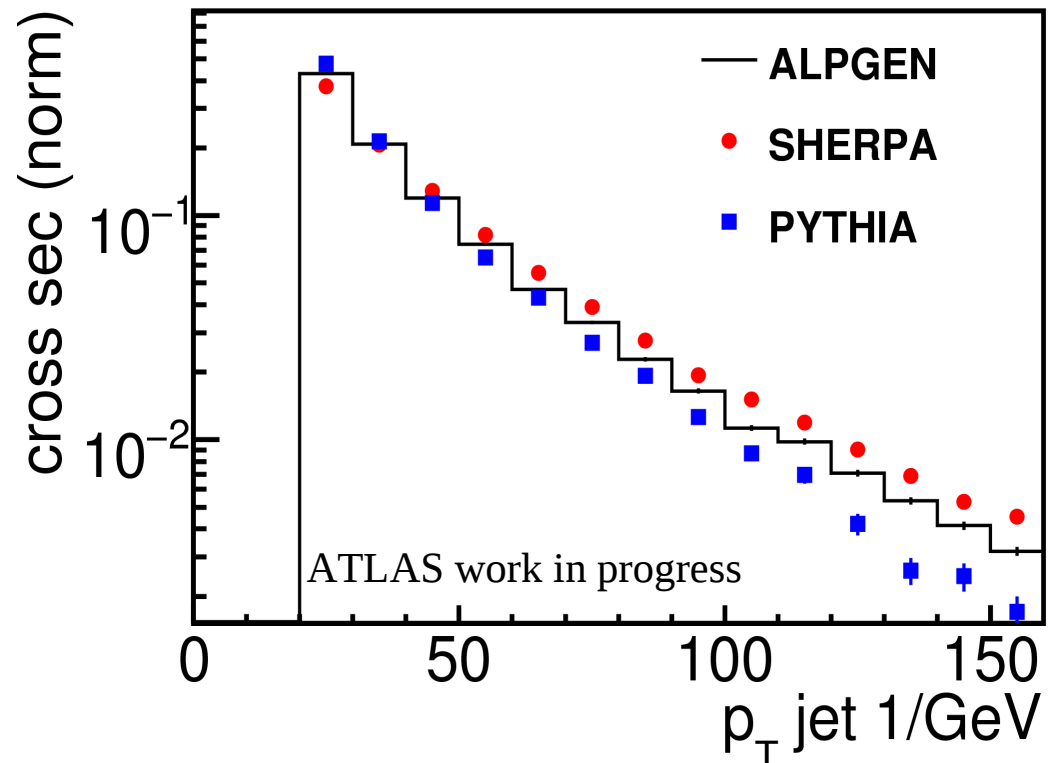
- Less migrations for Sherpa! Why?





Jet p_T : ALPGEN and SHERPA

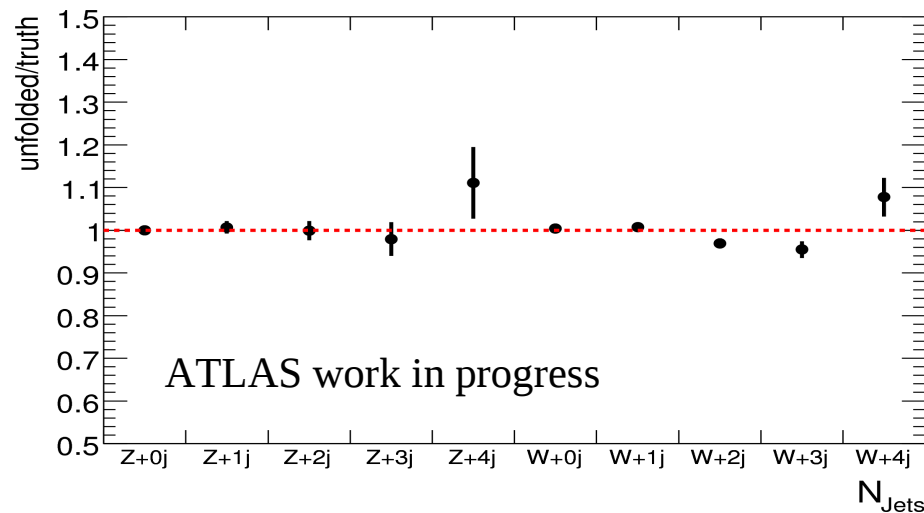
- PT Sherpa larger than pT Alpgen-> differences understood!
- “hidden” physic effects reveal as detector effects -> take care!
- -> important to compare data and MC in jet p_T distributions
- migration matrix has to reflect data



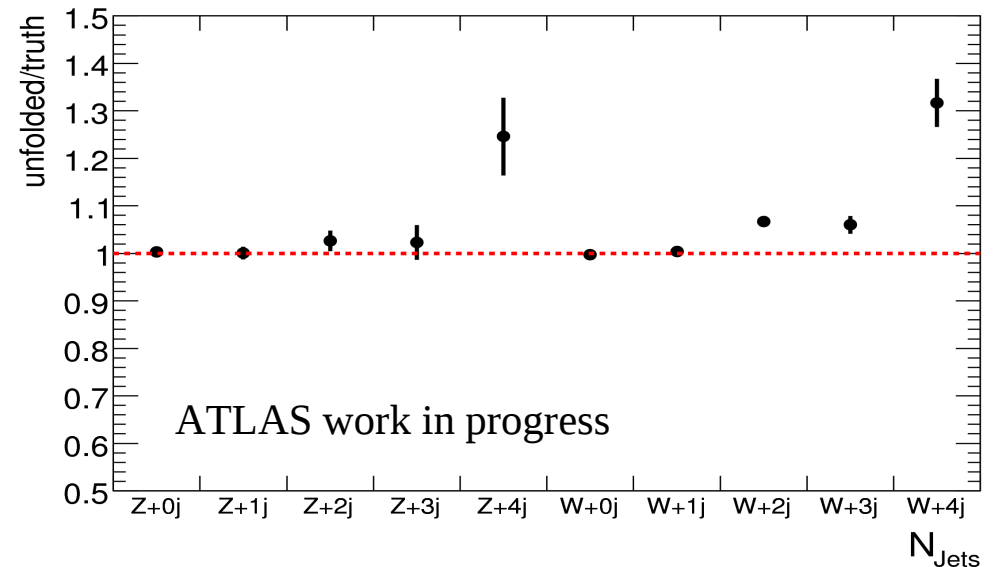


Consequences ALPGEN/SHERPA

- Alpgen with Sherpa



- Sherpa with Alpgen



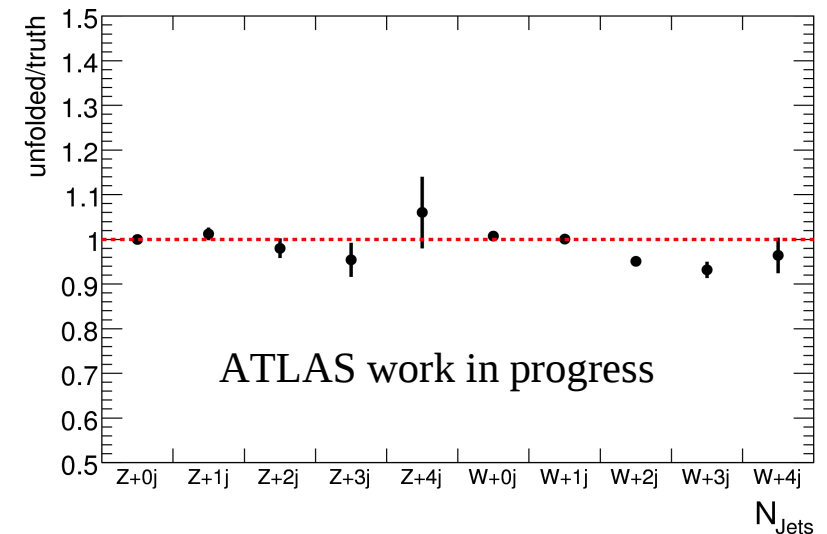
- Sherpa: less migrations -> Alpgen unfolded with Sherpa: too few events back to high jet multiplicities (and vice versa) -> but only **small effects!!!!**





My Analysis

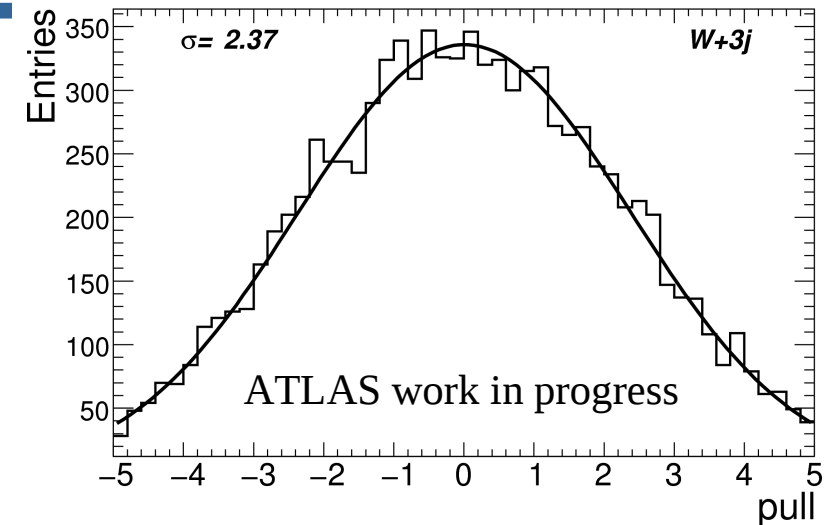
- No data available (at time of analysis ;-))
- Migration matrix as independent as possible:
 - Alpgen for “pseudo data”
(with full detector simulation)
 - Sherpa for migration matrix
(with fast detector simulation)
-> both “models” different
- Very good agreement despite these differences!!!
- (implemented D'Agostini's formulae in C++ routine -> cross checked with original FORTRAN code)



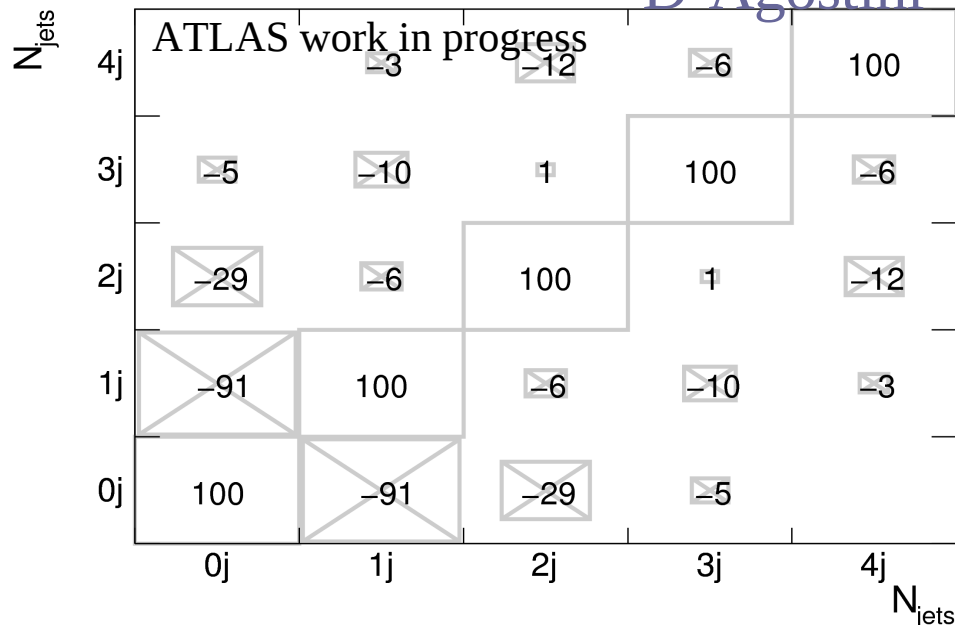


Error estimation -> always difficult ...

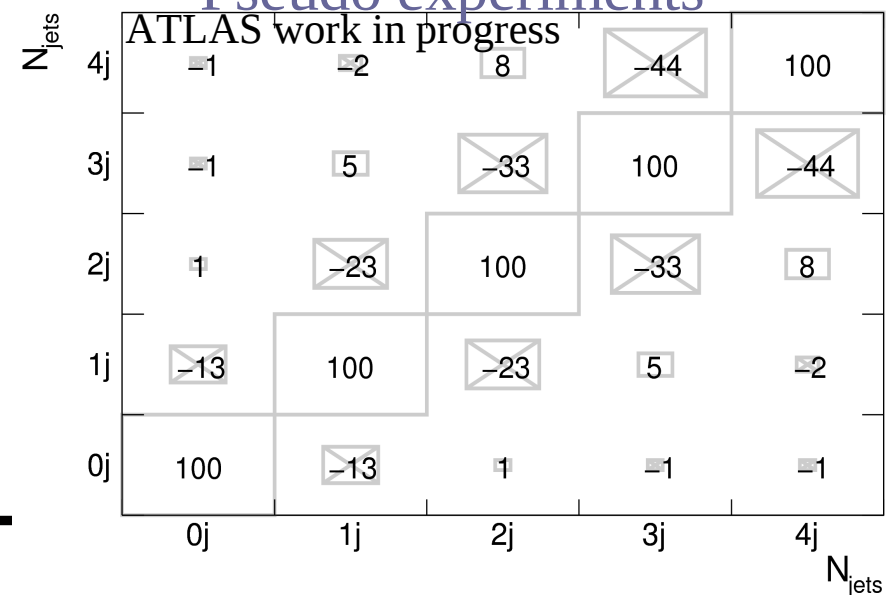
- Correlations, repeated cross talk between bins
- Pseudo experiments to test errors
 - > too small! Problem not gaussian?
 - > took errors from pseudo exp.



D'Agostini



Pseudo experiments





Summary

- Unfolding of W+jets and Z+jets distributions
- Factorize: event selection, background subtraction, unfolding, signal efficiency
- Unfold = only resort events of signal distribution
- Unfold W and Z separately
- Cannot avoid model dependency of migration matrix
 - Control plots MC \leftrightarrow data important
 - “hidden” physics effects are revealed in mig matrix
- Took errors from pseudo experiments

