

A particle detector event visualization showing a central vertex with numerous tracks radiating outwards, colored in shades of blue, purple, and green, set against a dark orange background.

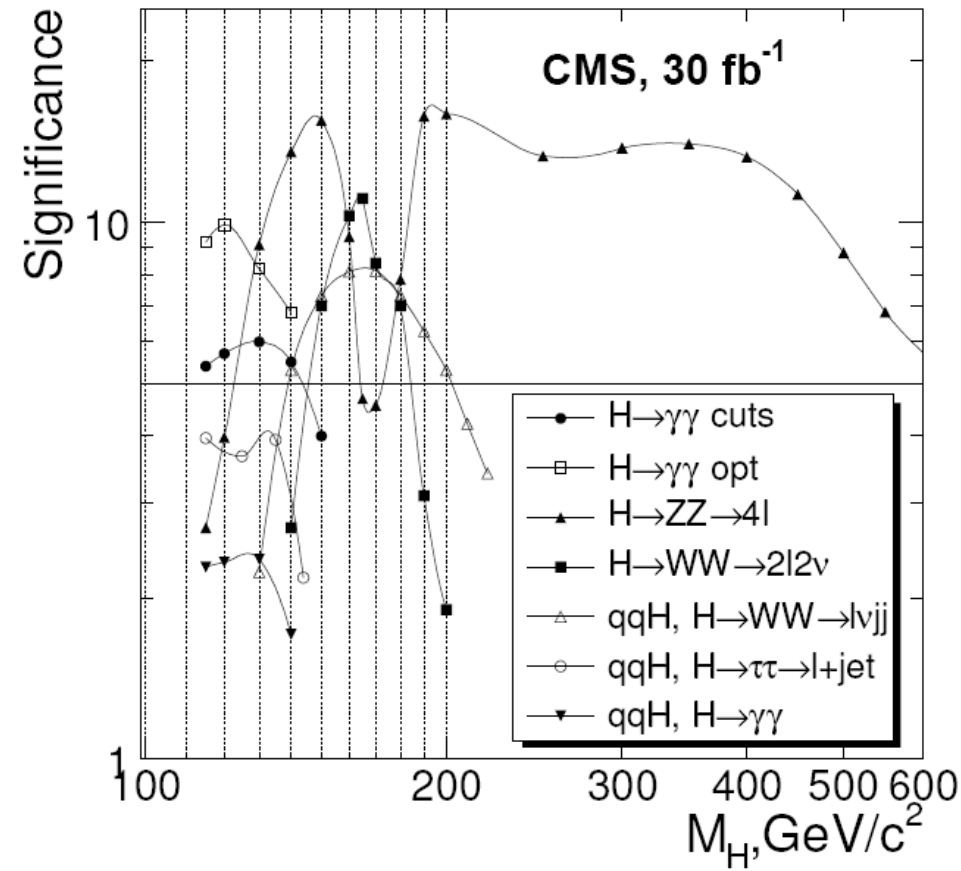
# Higgs Mass Reconstruction in $H \rightarrow WW^* \rightarrow \ell\nu\ell\nu$

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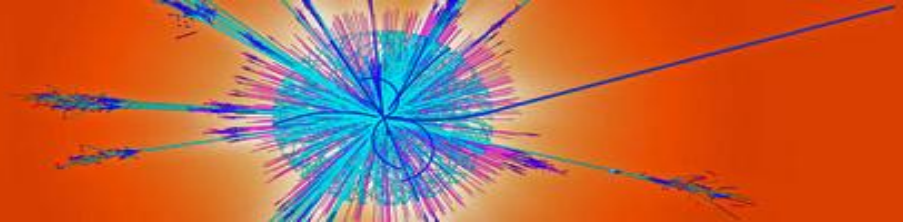
# Introduction



- In SM Higgs Search,  $H \rightarrow WW^* \rightarrow l\nu l\nu$  is important
- Due to 2 neutrinos, we cannot reconstruct Higgs mass directly
  - Dilepton opening angle usually used
- Is Higgs mass reconstruction possible in  $H \rightarrow WW^* \rightarrow l\nu l\nu$  ?



$$H \rightarrow WW^* \rightarrow l\nu l\nu$$



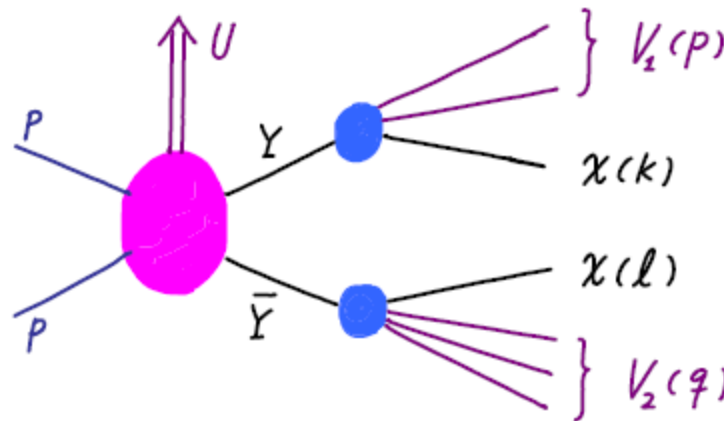
- Observables
  - Momentum of lepton 1
  - Momentum of lepton 2
  - Transverse momentum of sum of two neutrino momenta – MET
  - To reconstruct Higgs, we need two neutrino momenta
- Unknowns
  - Two neutrino momenta –  $2 \times 3$
- 4 Constraints
  - MET<sub>x</sub>
  - MET<sub>y</sub>
  - $M(\text{lepton1} + \text{neutrino1}) = M_W$
  - $M(\text{lepton2} + \text{neutrino2}) = M_W$
- System is underconstrained

# Using MAOS momenta to $H \rightarrow WW \rightarrow \ell\nu\ell\nu$

- $M_{T2}$  Assisted On-Shell algorithm developed by KAIST group
  - Originally developed to determine neutralino momenta in SUSY events
$$pp \rightarrow Y(1) + \bar{Y}(2) \rightarrow V(p_1)\chi(k_1) + V(p_2)\chi(k_2)$$
  - <http://cms.skku.ac.kr/wiki/images/7/77/Mass-spin-LHC.ppt>
  - <http://cms.skku.ac.kr/wiki/images/5/5c/KChoi.pdf>
  - In our case,  $Y=W, V=\ell, \chi=\nu$
- Advantage of MAOS method
  - for events with large values of  $M_{T2}$ , the approximated momenta approach the true momenta

# From $M_{T2}$ to MAOS

- $M_{T2}$  is unique for an event



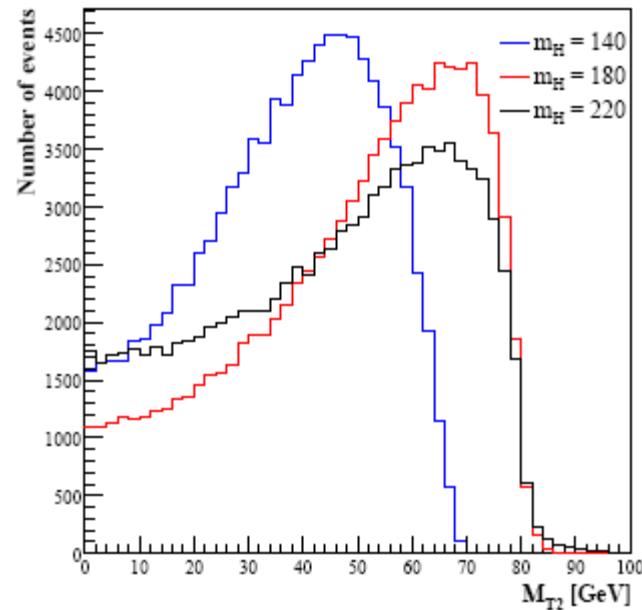
$$M_{T2}(\text{event}; m_\chi) \quad \left( \{\text{event}\} = \{p^2, \mathbf{p}_T, q^2, \mathbf{q}_T, \cancel{p}_T\} \right)$$

$$= \min_{\mathbf{k}_T + \mathbf{l}_T = \cancel{p}_T} \left[ \max \left( M_T(p^2, \mathbf{p}_T, m_\chi, \mathbf{k}_T), M_T(q^2, \mathbf{q}_T, m_\chi, \mathbf{l}_T) \right) \right]$$

- Transverse components of neutrino are determined
- We did not use W-mass constraint

# $M_{T2}$ for $H \rightarrow WW$ events

- Edge is at



$$M_{T2} \leq \min(M_W, \frac{m_H}{2})$$

- How to determine z-components of 2 neutrinos?
  - No unique way of determination

# Determining $P_z$ of Neutrinos

- Conditions
  - Massless:

$$(k_{\text{maos}})^2 = (l_{\text{maos}})^2 = 0$$

- Mass of lepton+neutrino:

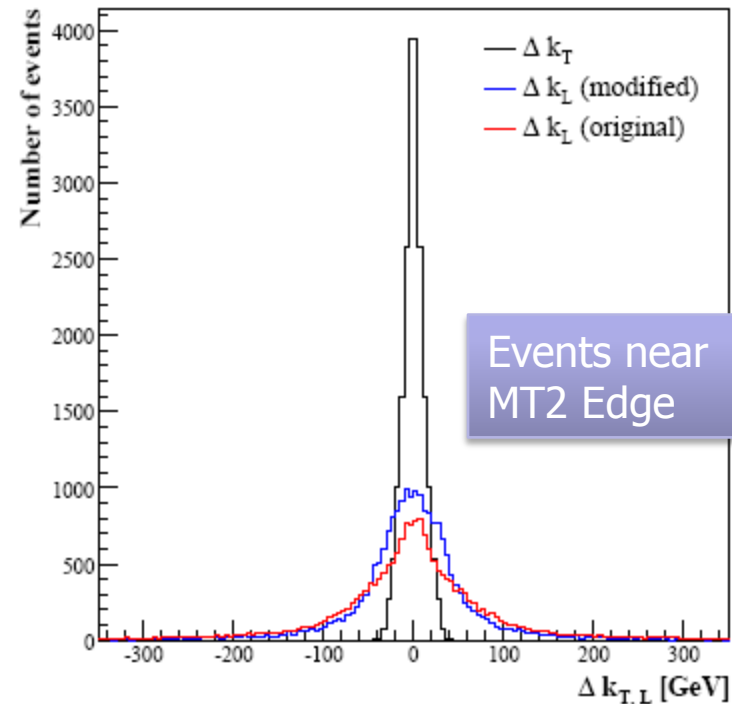
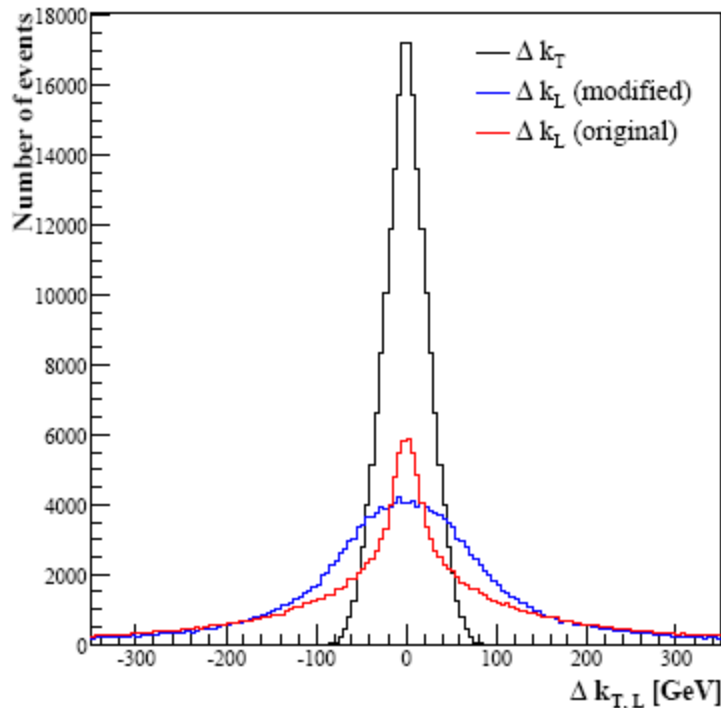
$$(p + k_{\text{maos}})^2 = (q + l_{\text{maos}})^2 = M_{T2}^2$$

- Unique  $P_z$  of Neutrinos in modified MAOS scheme

$$k_L^{\text{maos}} = \frac{|\mathbf{k}_T^{\text{maos}}|}{|\mathbf{p}_T|} p_L, \quad l_L^{\text{maos}} = \frac{|\mathbf{l}_T^{\text{maos}}|}{|\mathbf{q}_T|} q_L.$$

# Accuracy of MAOS method

- For  $M_H=180$  GeV

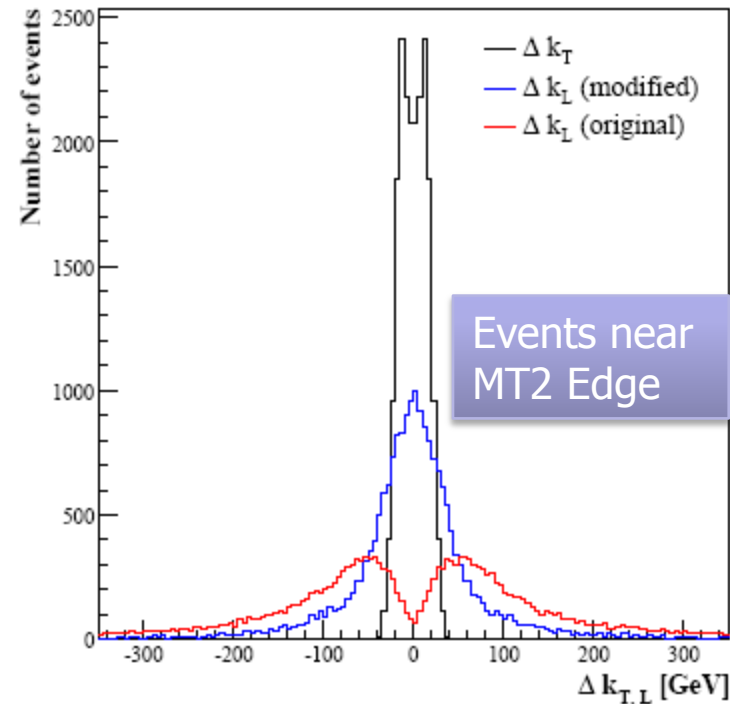
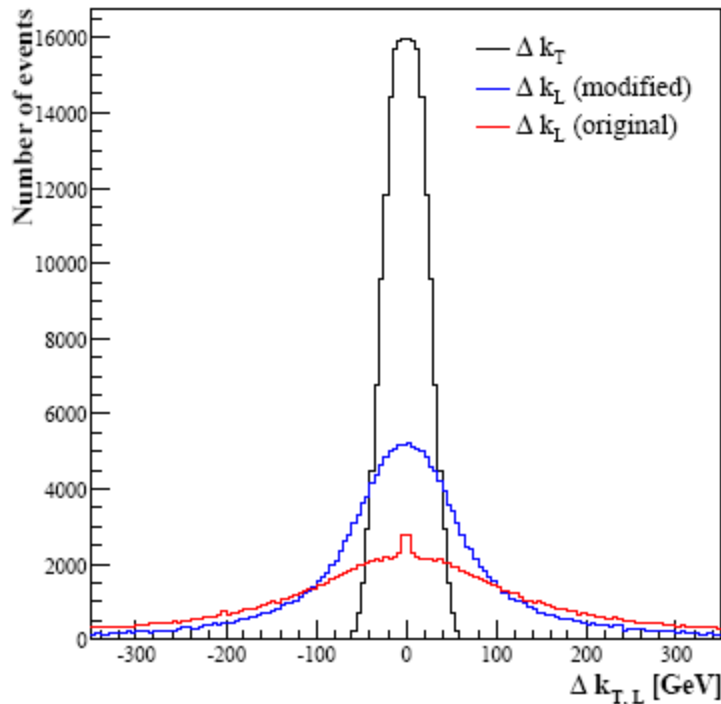


- In the original MAOS, the lepton+neutrino mass constrained to be  $M_W$
- Original MAOS scheme slightly more accurate overall
- For events near edge, both methods are the same



# Accuracy of MAOS method

- For  $M_H = 140$  GeV

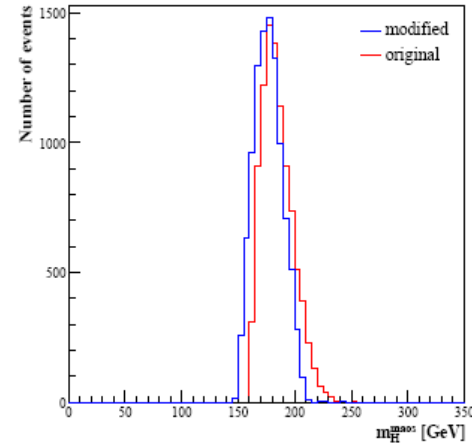
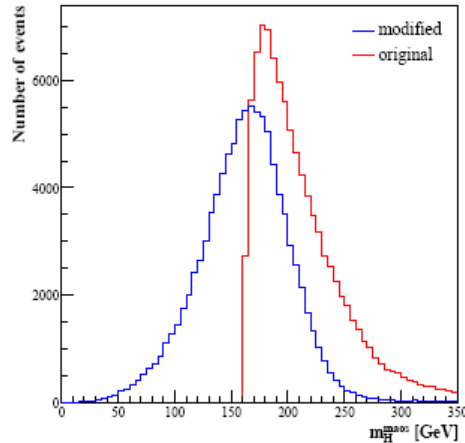


- One of the W bosons is off-shell
- Original MAOS scheme more accurate
- For events near  $M_{T2}$  edge, the method is much more accurate

# Mass Reconstruction

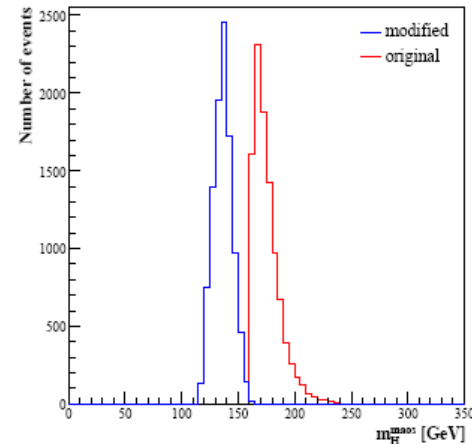
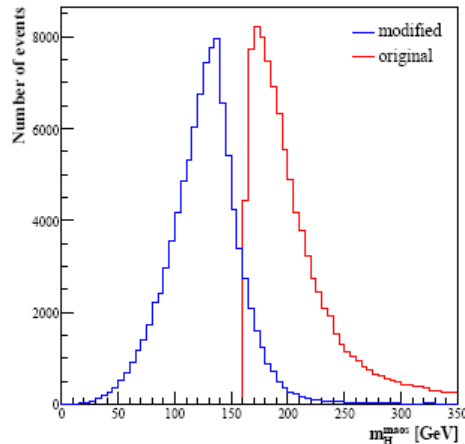
- Peaks at correct masses with modified MAOS scheme

$M_H = 180$  GeV

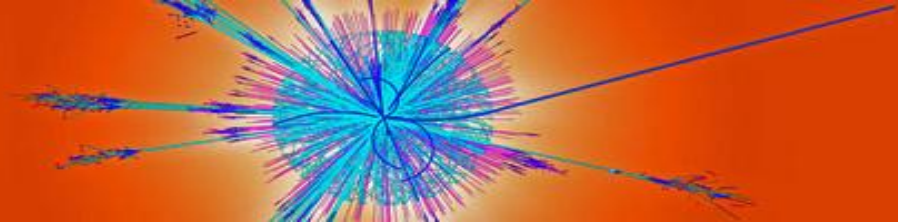


Events near  
MT2 Edge

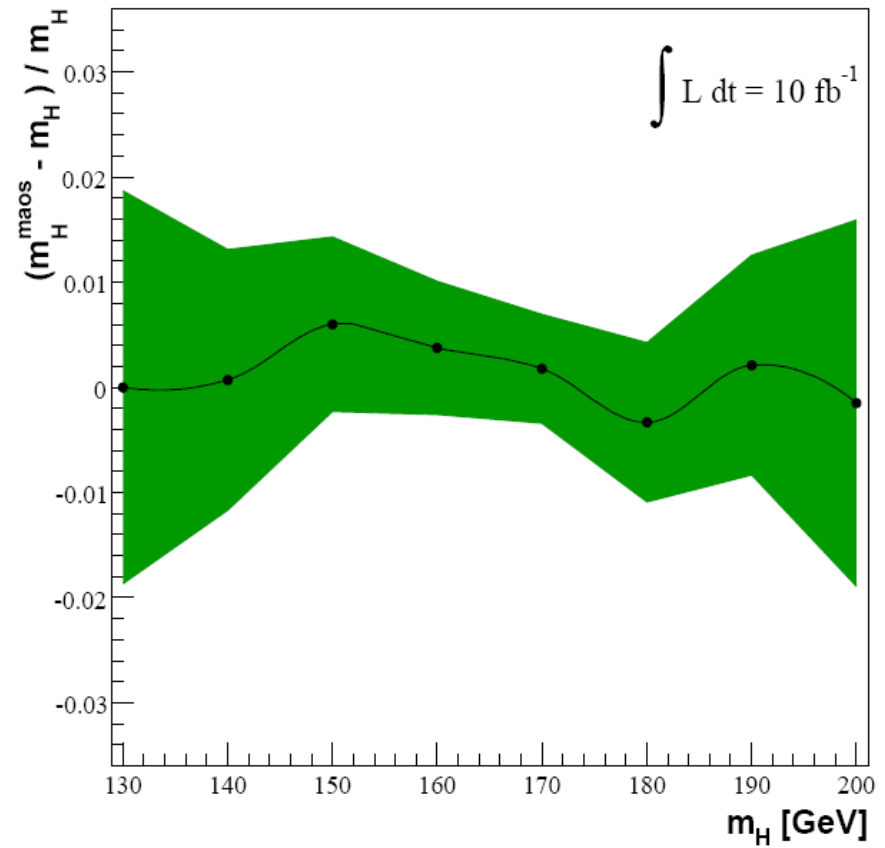
$M_H = 140$  GeV



# Mass Resolution



- <2% mass measurement with  $10 \text{ fb}^{-1}$  of data
  - PGS simulation
  - Statistical errors only
  - WW and tt-bar background considered





- arXiv:0908.0079 – submitted to PRD

August 4, 2009

## Reconstructing the Higgs boson in dileptonic $W$ decays at hadron collider

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### ABSTRACT

We examine the prospect to measure the Higgs boson mass using the recently introduced kinematic variable, the  $M_{T2}$ -Assisted On-Shell (MAOS) momentum, that provides a systematic approximation to the invisible neutrino momenta in dileptonic decays of

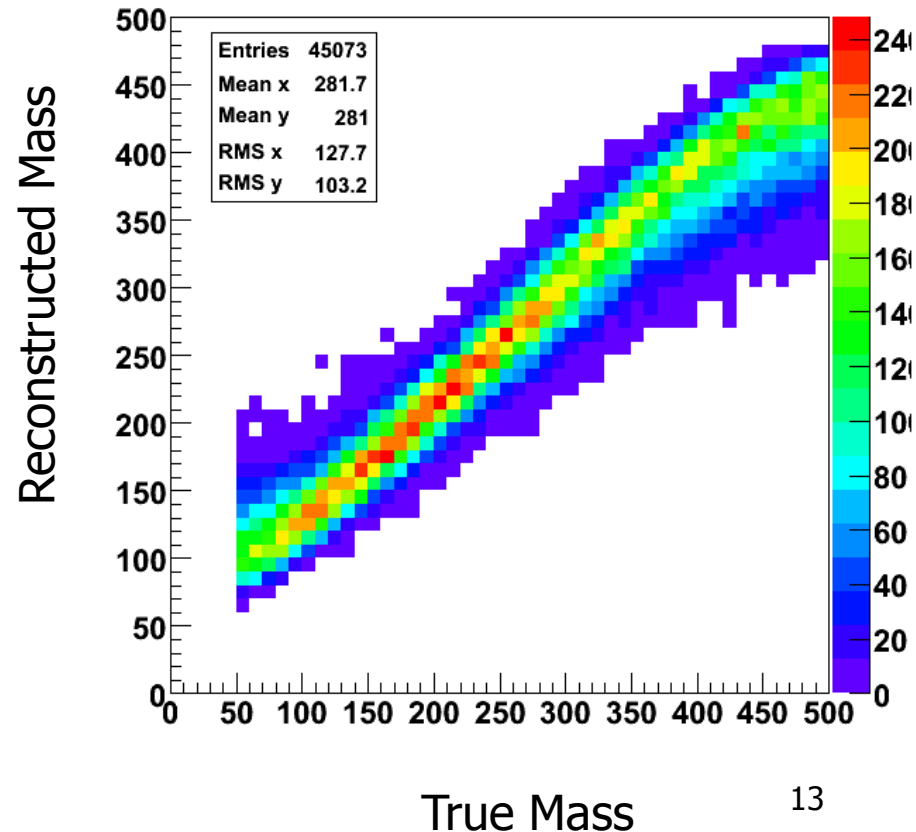
79v1 [hep-ph] 1 Aug 2009

# Multivariate Non-linear Regression

- mass reconstruction as a problem of regression
  - A general function estimator  $\{x_i\} \rightarrow m$
- Numerical regression methods have some deficiency
  - Bayesian

- Momentum vectors from a two body decay

Mass Reconstruction using RF



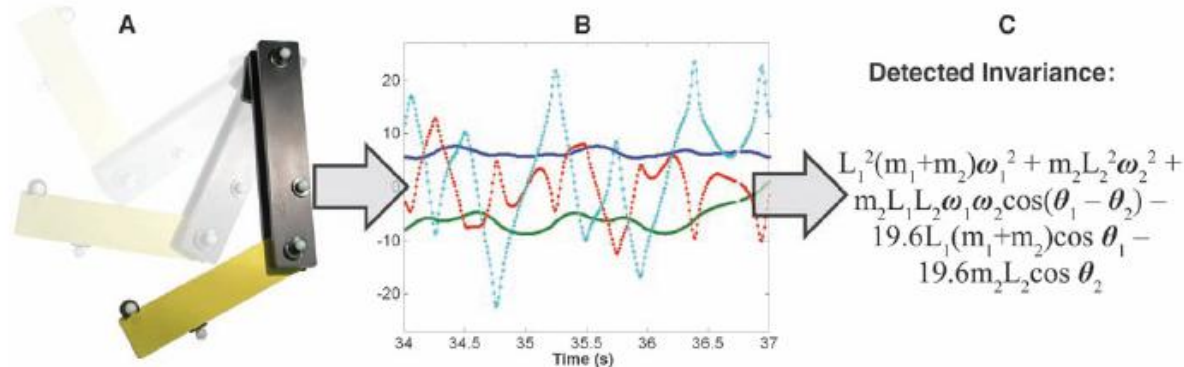
# Symbolic Regression

- Science 324, 81 (2009)
  - Find invariants present in the data
  - **Analytic equation is constructed**
  - Genetic algorithm was used in finding the solution

## Distilling Free-Form Natural Laws from Experimental Data

Michael Schmidt<sup>1</sup> and Hod Lipson<sup>2,3\*</sup>

For centuries, scientists have attempted to identify and document analytical laws that underlie physical phenomena in nature. Despite the prevalence of computing power, the process of finding natural laws and their corresponding equations has resisted automation. A key challenge to finding analytic relations automatically is defining algorithmically what makes a correlation in observed data important and insightful. We propose a principle for the identification of nontriviality. We demonstrated this approach by automatically searching motion-tracking data captured from various physical systems, ranging from simple harmonic oscillators to chaotic double-pendula. Without any prior knowledge about physics, kinematics, or geometry, the algorithm discovered Hamiltonians, Lagrangians, and other laws of geometric and momentum conservation. The discovery rate accelerated as laws found for simpler systems were used to bootstrap explanations for more complex systems, gradually uncovering the “alphabet” used to describe those systems.



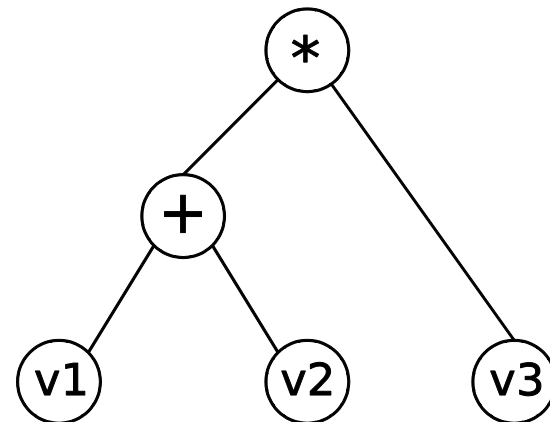
- We can apply similar idea to the problem of finding optimal variables in HEP

# Symbolic Regression

- Goal: construct a variable sensitive to mass
  - kinematic variables
  - operators: +, -, \*, /
  - functions: sin, cos, exp, log
  - Restricted terms to match the dimension of target
  - Fitness – relative Root Mean Square

- Evolution

- 150 Generations
- 1000 individuals (equations)
- cross-over probability 50%
- mutation probability 4%



$$(v1 + v2) * v3$$

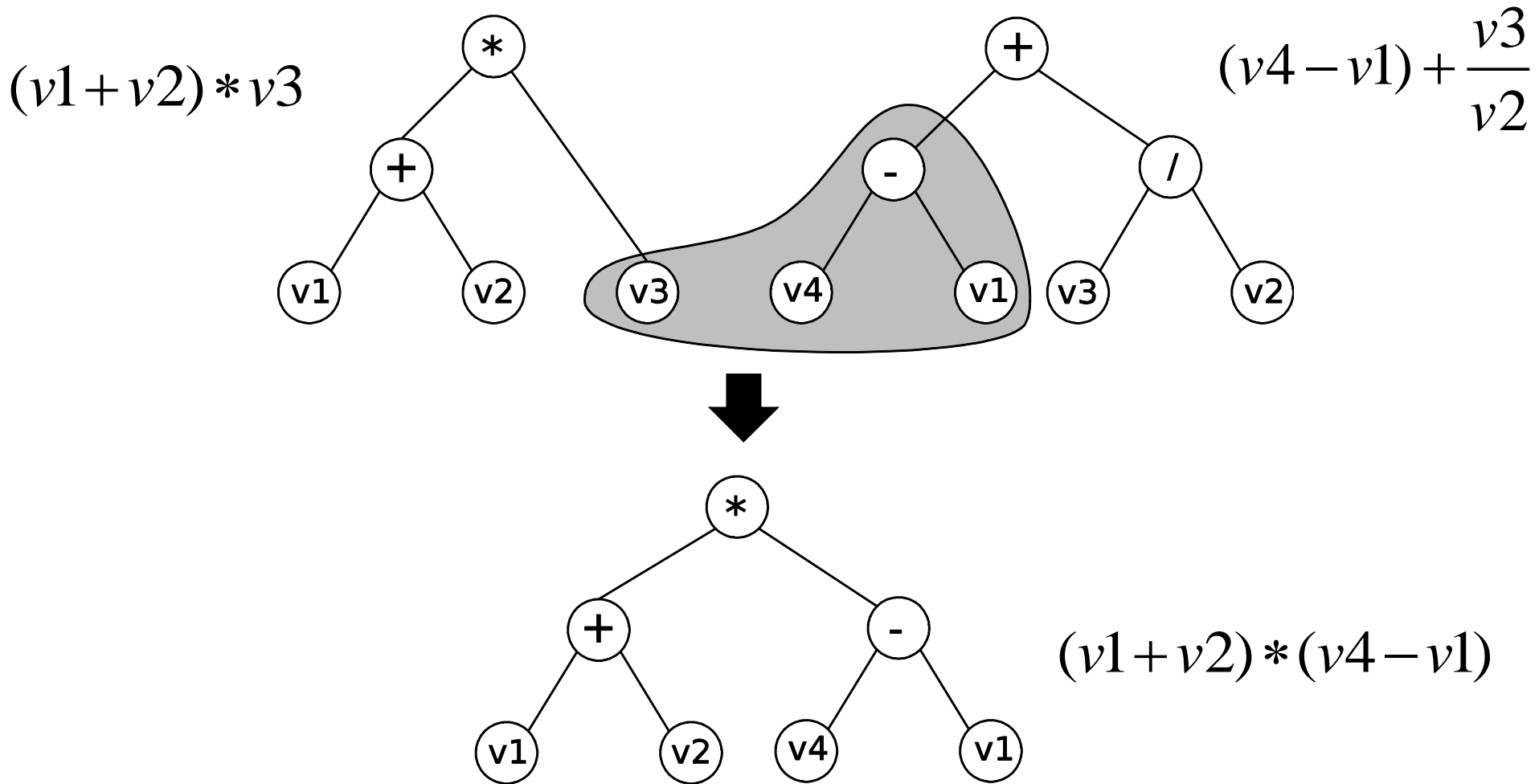
# Symbolic Regression with Genetic Algorithms



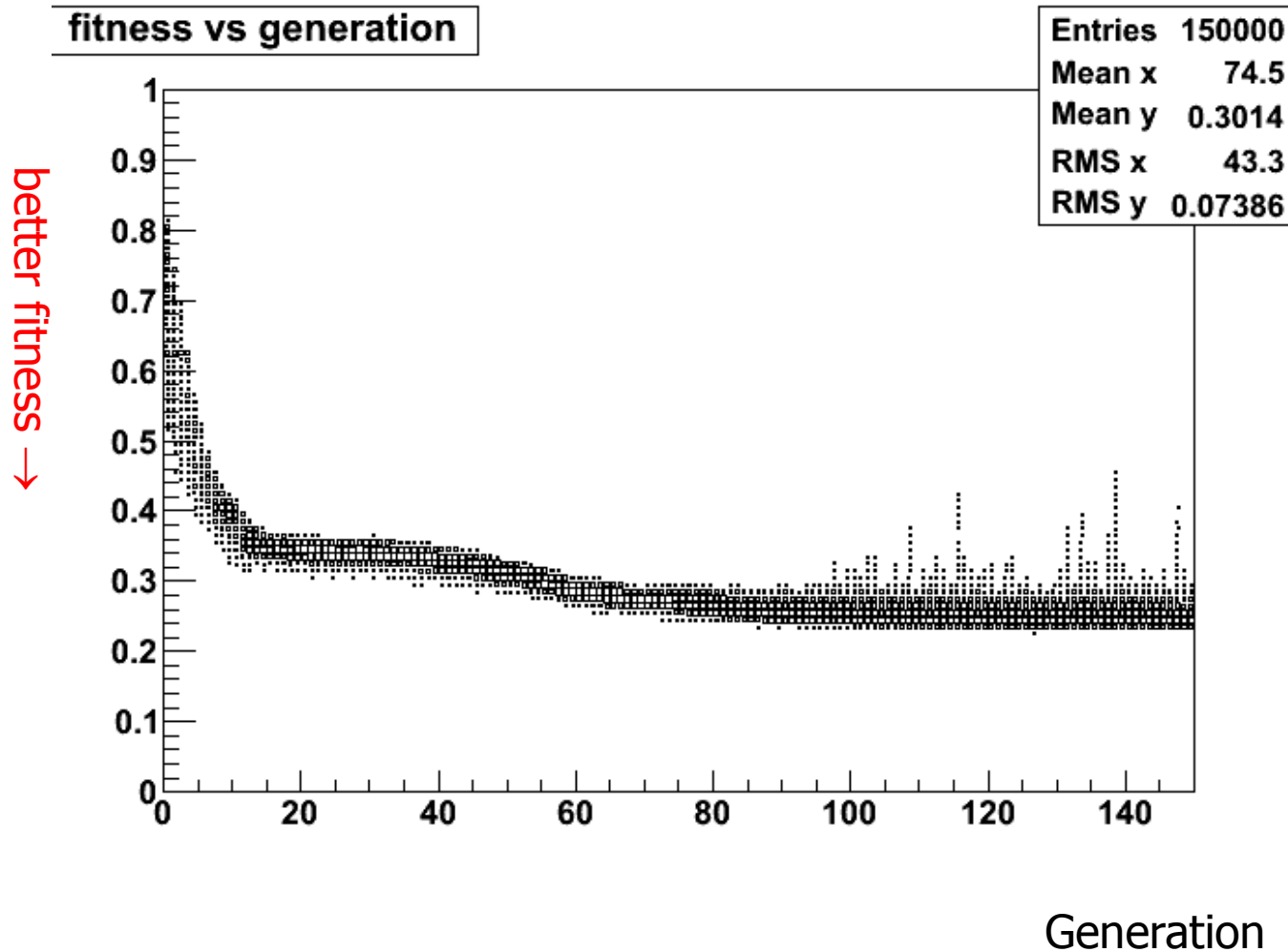
1. Initialization: random equations are created
2. Creation of new individuals
  1. parents are selected by tournament from random subpool
  2. Cross-over of genes occur at random points
  3. random mutation - probability for this is small
3. Population selection
  1. Population sorted according to fitness
  2. Discard individuals with poor fitness
4. Go to step 2

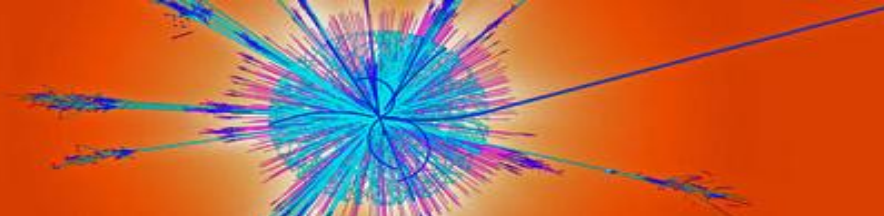


# Example of Cross-over Genetic Operation

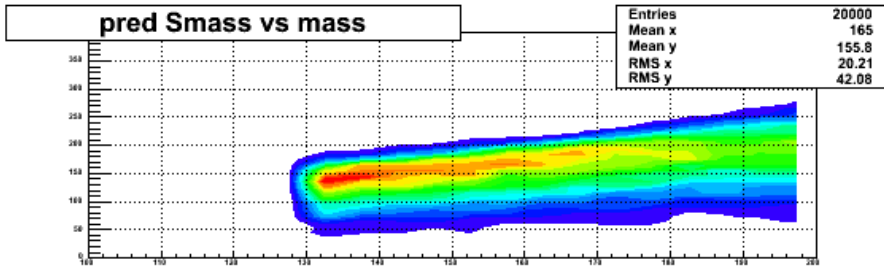


# Evolution of Fitness

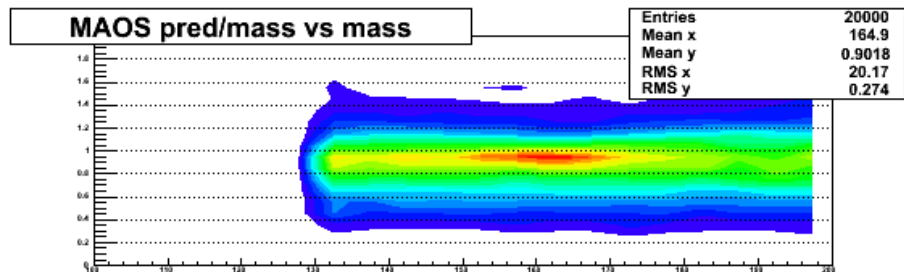
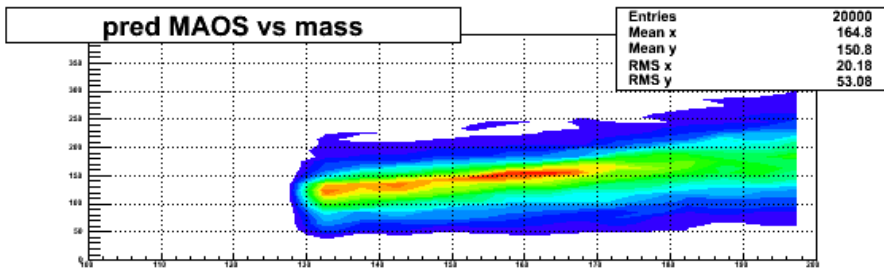
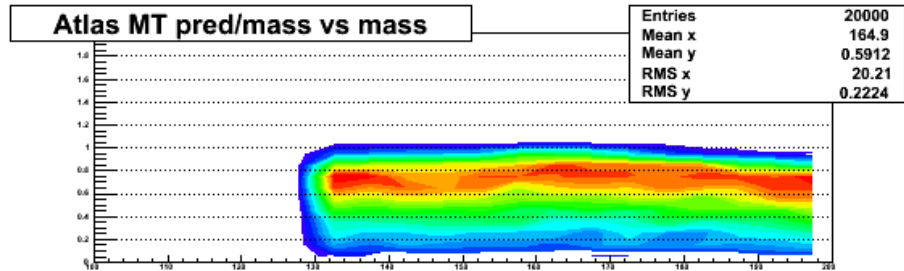
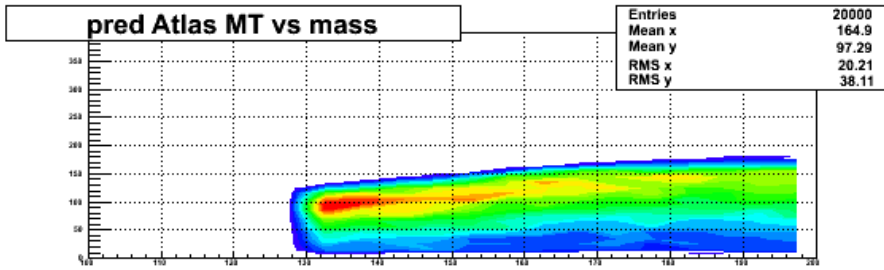
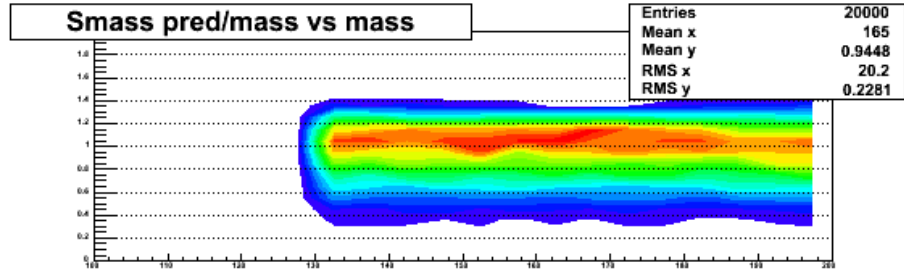




## Predicted Mass vs True Mass

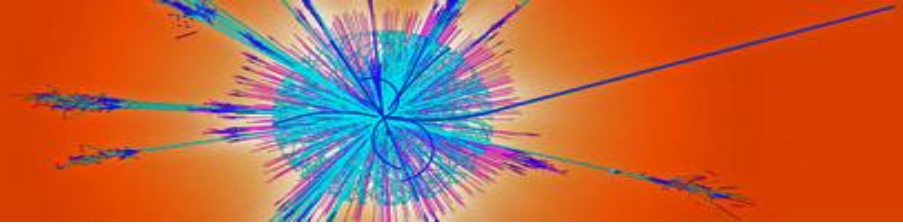


## Mass Ratio vs True Mass



Good linearity and resolution is seen

# Summary



- Applied MAOS method for mass reconstruction in  $H \rightarrow WW^* \rightarrow l\nu l\nu$ 
  - competitive with other recently developed techniques
- Symbolic regression allows one to build sensitive variables with correct dimensionality.
- Symbolic regression method is general can be applied to problems with multiple final state particles.