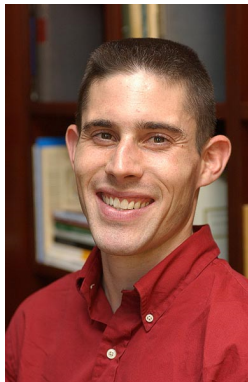


# Sleuth

## Search Algorithm for New Physics at the Tevatron



**Georgios Choudalakis, MIT**



Bruce  
Knuteson



Conor  
Henderson



Markus  
Klute



Ray  
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and  
myself

For the CDF collaboration

# What is a discovery?

An observation:

- that is NOT a shortcoming of the SM simulation,
- that is NOT a detector effect,
- that is NOT a statistical fluctuation,
  - here comes *Sleuth*.
- of which we have a plausible interpretation.
  - Bruce Knuteson's talk.

# quasi model independence

To be model-independent and yet sensitive,  
*Sleuth* examines one simple  
kinematic quantity of each event:

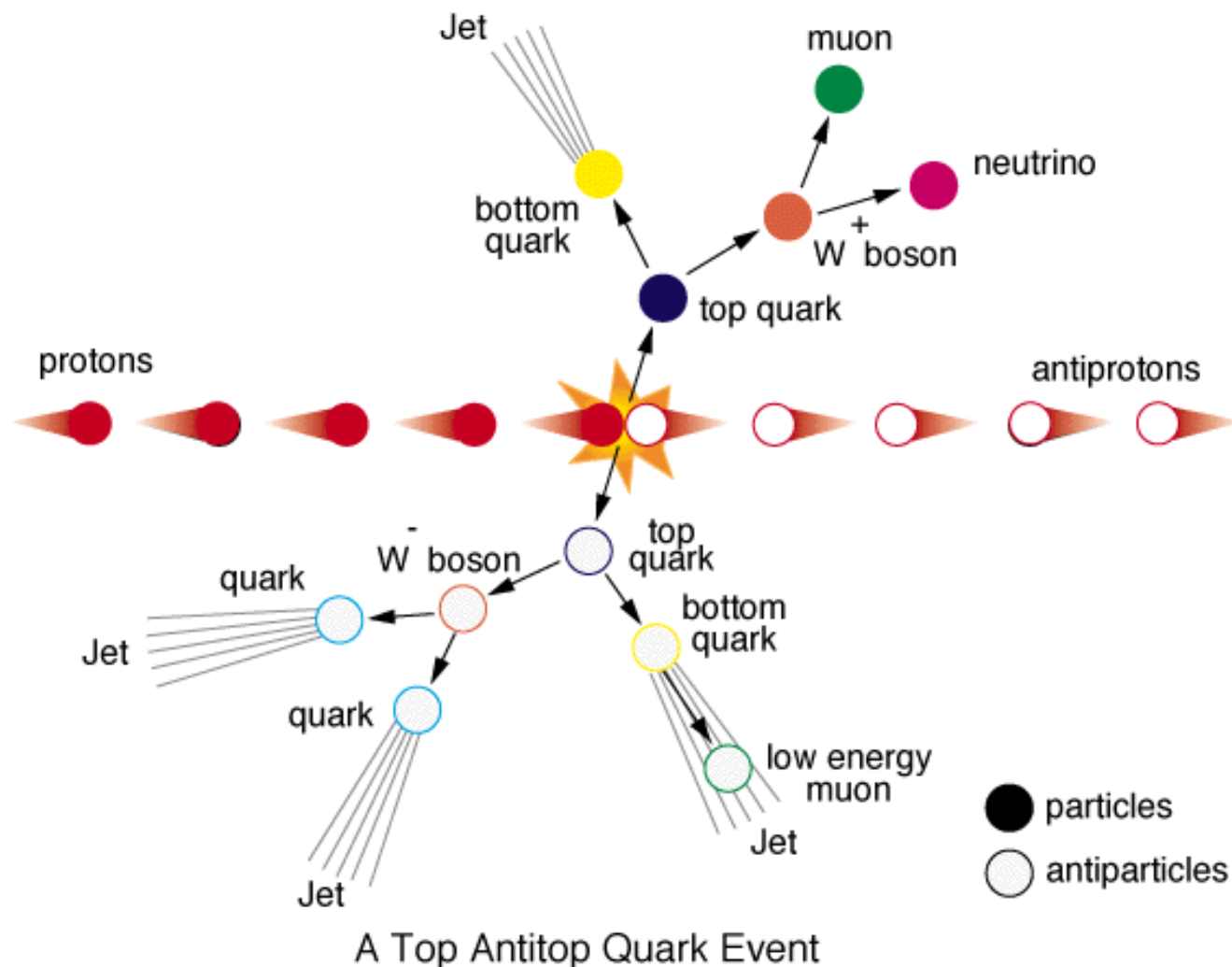
$\Sigma p_T$  = the scalar sum of the transverse momentum

# $\Sigma p_T$ is a well motivated choice

Something common in almost all theories beyond the SM is that:

***New electro-weak scale physics gives new massive resonances, which decay into high- $p_T$  particles.***

## Historical example: the top quark



# goal of Sleuth

- Search for any interesting\* excess of data in the high- $\Sigma p_T$  tails.

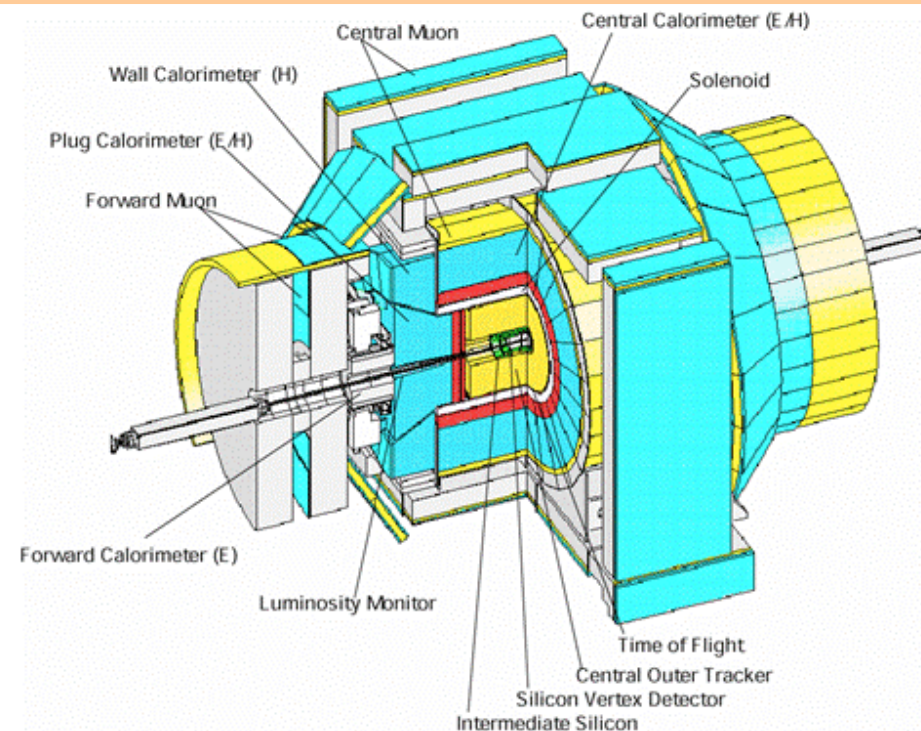
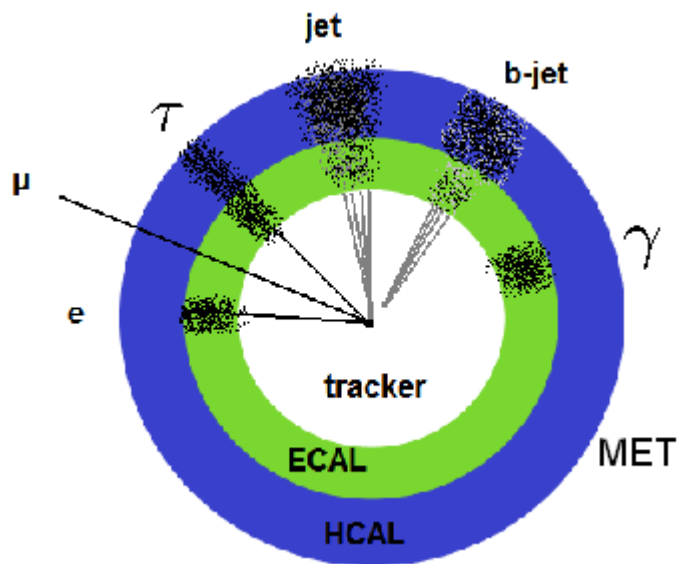
\* “interesting” = “statistically significant”  
= “unlikely to be a fluctuation”.

- Reveal the most interesting  $\Sigma p_T$  tail, and quantify its interestingness.
- Return *one number* that expresses if there is a discovery or not in the data, from the statistical viewpoint.

notice: An excess is not a bump,  
though a bump is an excess.

# preliminaries

- Collect data
- Generate SM MC
- Identify objects in each event



- Off-line selection:  
Keep any event with:
  - $e$  or  $\mu$  with  $p_T > 25$  GeV or
  - $\gamma$  with  $p_T > 60$  GeV or
  - $jet$  with  $p_T > 200$  GeV
- Partition Data and SM MC into final states.

# partitioning into final states

final objects:

$e^+ e^+ pmiss$   
 $\mu^+ \mu^+ pmiss$   
 $e^+ e^+ j pmiss$   
 $\mu^+ \mu^+ j pmiss$   
 $e^- e^- pmiss$   
 $\mu^- \mu^- pmiss$   
 $e^- e^- j pmiss$   
 $\mu^- \mu^- j pmiss$

$b b j j pmiss$   
 $b j j pmiss$   
 $b b j j j pmiss$   
 $b j j j pmiss$

$e^+ j j$   
 $e^- j j$   
 $\mu^+ j j$   
 $\mu^- j j$   
 $e^+ j j j$   
 $e^- j j j$   
 $\mu^+ j j j$   
 $\mu^- j j j$

etc...

final state:

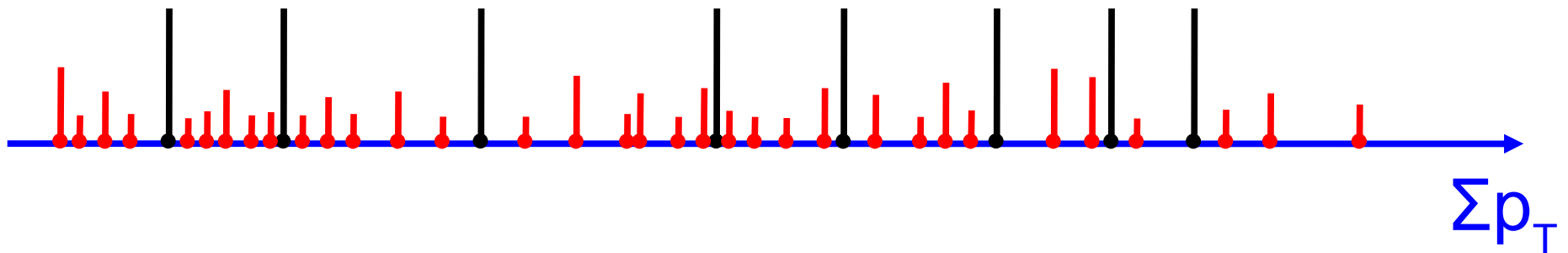
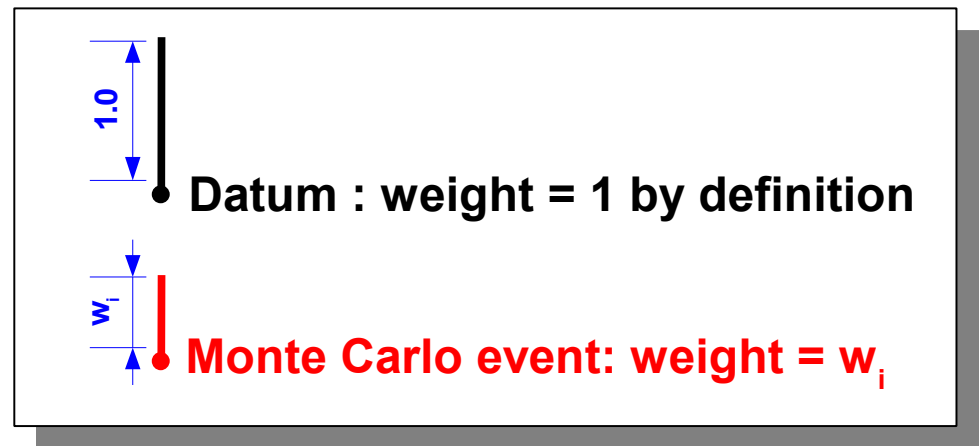
$2e+1pmiss$

$1bb1jj1pmiss$

$1e+1jj$

- Each event falls in exactly one final state
- New physics is expected
  - to treat electrons and muons the same
  - to be symmetric under charge conjugation
  - to produce jets in pairs

# the raw information *Sleuth* uses



- ***Nature*** provides the data.
- ***MadEvent* & *Pythia* & *CDF detector simulation*** give the **SM MC events**
- ***Vista*** adjusts their weights ( $w_i$ )  
(recall talk by Conor Henderson)

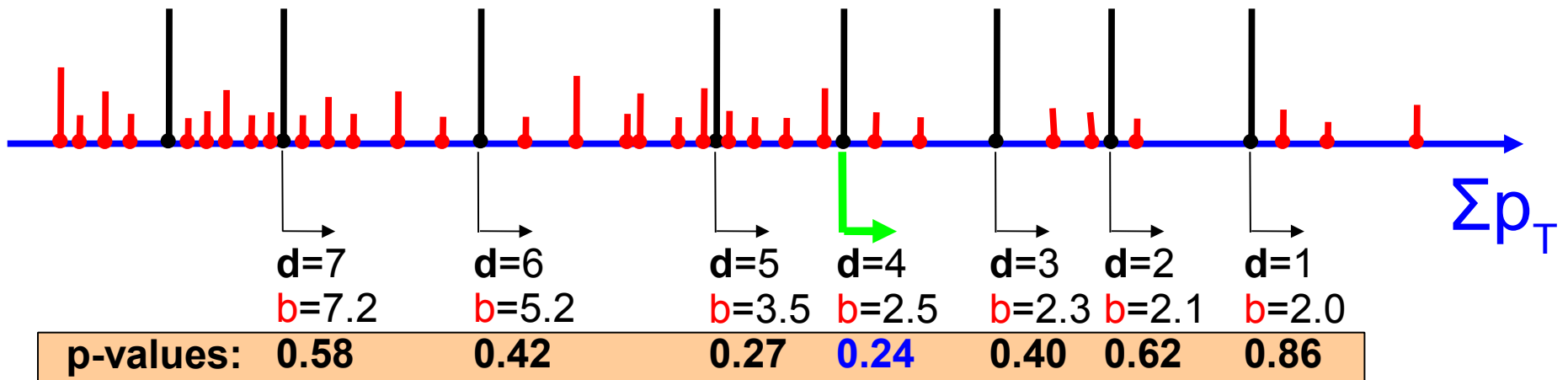


# p-value and Pmin

For each final state:

- For each region:  
**d = observed data**  
**b = expected background**
- With **d** and **b**, calculate:  
**p-value** = The Poisson probability to observe **d** or more data in the tail, given that I expect **b**.

$$= \sum_{i=d}^{\infty} \frac{b^i}{i!} \exp(-b)$$



- Most interesting region in this final state: the smallest **p-value**  $\equiv$  **Pmin**

# from $P_{\min}$ to $\text{scriptP}$

Remember: Now each final state has its own  $P_{\min} = \min\{\text{p-values}\}$ .

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For each final state, generate many sets of pseudo-data in order to estimate the:

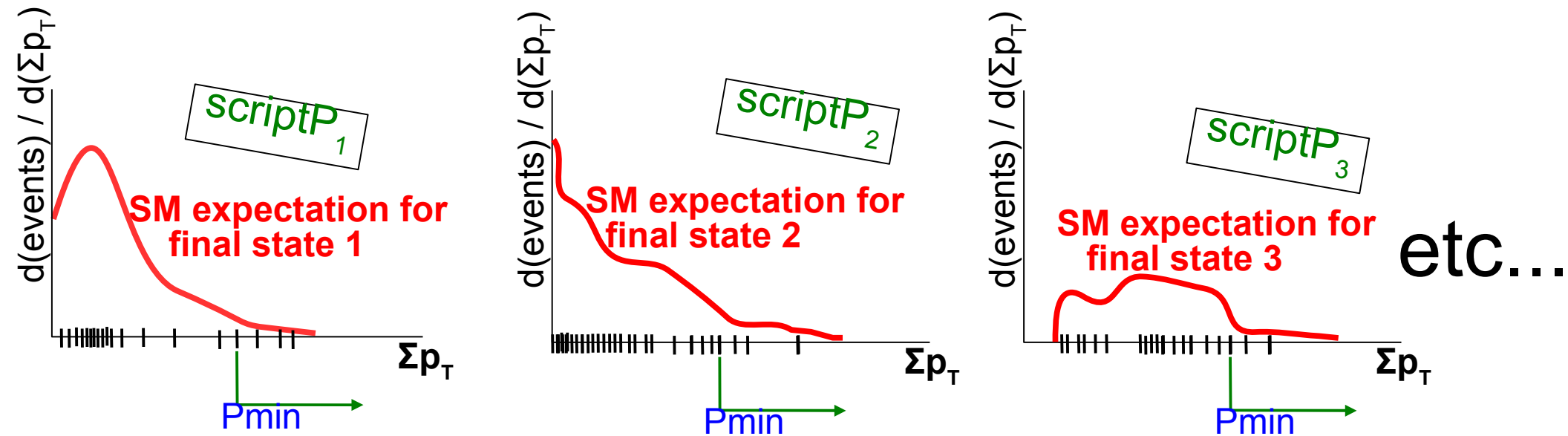
$\text{scriptP}$  = fraction of SM-like pseudo-experiments which would have (in this final state) *any* tail with p-value  $\leq$  the  $P_{\min}$  (of this final state).

*in other words:*

$\text{scriptP} \sim$  the probability that the data of a SM-like pseudo-experiment would fluctuate in this final state to look as or more interesting than in the actual experiment.

The smaller the  $\text{scriptP}$  of a final state, the more interesting the final state and its prominent  $\Sigma p_T$  region.

# first goal achieved



At this point, *Sleuth's* first goal is achieved:

- The most interesting final state is the one with the smallest  $\text{scriptP}$ , let's say final state 45, for which I know what events it contains.
- I know *how* interesting it is. That is  $\text{scriptP}_{45}$ .
- I know which one exactly the most interesting  $\Sigma p_T$  tail is, *for example*, the tail starting at 130 GeV/c in the final state 45.

# trials factor

But how interesting is the whole experiment with  $N \sim 50$  final states?

We didn't see what turned out to be most interesting at first trial, but rather after looking at  $N$  final states.



## Analogy:

Joe tries the slot machine  $N=1$  time and wins!  
==> I suspect he has tampered the machine... his plays follow some non-standard model.

Joe tries  $N=1,000,000$  times and wins at least once!  
==> I wouldn't think he did anything interesting.  
His plays are consistent with the standard model.

This describes the infamous *trials factor* that has to be accounted for.

# from scriptP to tildeScriptP

- To account for the trials factor, we define:

$$\text{tildeScriptP} = 1 - (1 - \min\{\text{scriptP}\})^N$$

= The probability that the data of a SM-like experiment would fluctuate to make *any*  $\Sigma p_T$  tail in *any final state* seem as or more interesting than the most interesting one that we actually observed.

- **scriptP** encapsulates all possible regions of a final state, **tildeScriptP** encapsulates all possible final states.  
==> *Sleuth* rigorously accounts for the trials factor.

# tildeScriptP

- Many of us think something has to be a “ $5\sigma$ ” effect to be a discovery candidate.

$5\sigma$  means probability of  $10^{-7}$ .

But if you estimate the trials factor:

$10^{-7} \times 100 \text{ students} \times 1 \text{ plot/week}$

$\times 50 \text{ weeks/year} \times 2 \text{ years} = 0.001$

==> **tildeScriptP** < 1/1000 is even a conservative threshold for discovery.

- If **tildeScriptP** < 1/1000 then we prefer to question the SM than to attribute this data excess to “luck”.

# What it means to be the 1/1000 guy



# Summary

- *Sleuth* probes the high  $\Sigma p_T$  tails
    - in minutes
    - globally and quasi model independently
    - without risk of human bias or error
  - *Sleuth* rigorously accounts for the trials factor
  - *Sleuth* returns an illustrative, clear answer about the statistical significance of the  $\Sigma p_T$  tail of each final state and of the data as a whole.
- ==> We are currently using *Sleuth* to find new physics at the CDF.