### Maximizing Experimental precision

Olivier Mattelaer Université Catholique de Louvain CP3-FNRS

Based on:

- P.Artoisenet, V.Lemaître, F. Maltoni, OM: JHEP 1012:068
- J. Alwall, A. Freytas, OM: PRD83:074010
- P.D. Aquino, P.Artoisenet, F. Maltoni, OM : PRL111,091802
- P.Artoisenet, OM: In preparation

# fn's From Theory to Detector





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# fn's From Theory to Detector



















#### Few

assumptions



assumptions

- Missing transverse momentum
- M\_eff, H\_T
- s Hat Min
- M\_T
- M\_TGEN
- M\_T2 / M\_CT
- M\_T2 (with "kinks")
- M\_T2 / M\_CT ( parallel / perp )
- M\_T2 / M\_CT ( "sub-system" )
- "Polynomial" constraints
- Multi-event polynomial constraints
- Whole dataset variables
- Cross section
- Max Likelihood / Matrix Element

#### Robust

- Missing transverse momentum
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#### Slíde from Lester: arXív:1004.2732

Fragile

#### Vague

conclusions



Missing transverse momentum

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Specific conclusions

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#### Outline



- Introduction to Matrix Element re-weighting
- Automation of the method: MadWeight
- Presence of Radiation
- TTH Analysis
- Conclusions



Associate to each experimental event characterised by  $p^{vis}$ , the probability  $\mathcal{P}(p^{vis}|\alpha)$ to be produced and observed following a theoretical assumption  $\alpha$ 



- - $\square \ |M_{lpha}({m p})|^2$  is the squared matrix element



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  - $\square W({m p},{m p}^{vis})$  is the transfer function



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- $\square$   $W({m p},{m p}^{vis})$  is the transfer function
- $\Box \int d\Phi dx_1 dx_2$  is the phase-space integral
- $\Box \ \sigma_{\alpha}^{vis}$  is the cross-section (after cuts)



















Need to sum over the jet/parton assignments.

#### fn's Matrix Element Method



Most common and Important use is to combine those in a Likelihood

$$L(\alpha) = \prod_{i=1}^{N} \mathcal{P}(\boldsymbol{p}_{i}^{vis} | \alpha)$$

### fn's Matrix Element Method



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fn's Matrix Element Method







#### Signal/Background

# Fraction of Signal/Event extracted at the same time:

 $P(p^{vis}|\alpha) = c_S P_S(p^{vis}|\alpha) + c_B P_B(p^{vis})$ 



Single Template Analysis:

$$d(p^{vis}) = rac{P_{Signal}}{(P_{Signal} + P_{Background})}$$





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#### How to evaluate those weights?

 $\mathcal{P}(\boldsymbol{p}^{vis}|\alpha) = \frac{1}{\sigma_{\alpha}} \int d\Phi dx_1 dx_2 |M_{\alpha}(\boldsymbol{p})|^2 W(\boldsymbol{p}, \boldsymbol{p}^{vis})$ 



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Fit from MC tuned to the detector resolution





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- Fit from MC tuned to the detector resolution
- Use of matrix-element generator: MadGraph5

[J.Alwall, M. Herquet, F. Maltoní, OM, T. Stelzer 1106.0522]

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- Use of matrix-element generator: MadGraph5
- Need a specific integrator: Màdweight

[P.Artoisenet, V. Lemaitre, F.Maltoni, OM: 1007.3300]

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$$\mathcal{P}(\boldsymbol{p}^{vis}|\alpha) = \frac{1}{\sigma_{\alpha}} (d\Phi dx_1 dx_2) M_{\alpha}(\boldsymbol{p})|^2 W(\boldsymbol{p}, \boldsymbol{p}^{vis})$$

Difficult point: Numerical Integration

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Dífficult point: Numerical Integration

- Presence of sharp functions
  - Breit-Wigner
  - TF linked to angular observables

# fn's Monte-Carlo Integration



The choice of the parameterisation has a strong impact on the efficiency



The adaptive Monte-Carlo Technique picks point in interesting areas
The technique is efficient

## this Monte-Carlo Integration

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The adaptive Monte-Carlo Techniques picks points everywhere

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The adaptive Monte-Carlo Techniques picks point in interesting areas



#### MADWEIGHT



#### □ First Example: di-leptonic top quark pair



□ degrees of freedom 16

- 0 2: pdf
- □ 3×6: final states
- -4: energy-momentum conservation

D peaks 16

- 4: Breit-Wigner
- □ 3 x 4: visible particles








































Second Example: semí-leptoníc top quark paír PB D degrees of freedom 16  $p_5$  $p_a$  00000  $\overline{d}$  $p_1$ D peaks 19 00000 FB B  $m_{-4}^{*}$ -> 3 peaks unaligned  $p_3$ Multí-channel  $\overline{b}$  $d\phi = \prod_{i=1}^{5} \frac{d^3 p_i}{(2\pi)^3 2E_i} \frac{d^3 p_6}{(2\pi)^3 2E_6} dx_1 dx_2 \delta^4 (p_a + p_b - \sum_j p_j)$ 3 5  $\rightarrow d\phi = \prod_{i=1}^{3} d\theta_{i} d\phi_{i} \prod_{i=1}^{3} d|\mathbf{p}_{i}| \prod_{i=1}^{3} dm_{-k}^{*2} \times J$ Pass to k=1j=1i=1







C

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 MADWEIGHT

P. Artoisenet, V. Lemaître, F. Maltoni, OM: JHEP 1012:068



## MadWeight





fully hadronic / leptonic process

W production

semi-leptonic top quark pair

Fully leptonic top quark pair

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## MadWeight



Higss production decaying in W

W+W-production



## MadWeight





## MadWeight History



- 2009: MadGraph4 Implementation
- 2011: Private Implementation in MadGraph5
  - Initial State Radiation Support
  - SubProcess grouping (speed)
  - NWA (speed)
- 2013: MadWeight5 beta
  - □ Improve cluster support (speed)
  - MC over jet/parton assignment (speed)
  - pre-training (speed)
  - better multi-channel (speed)
- 2014: Madweight5 in MG5\_aMC
  - Support for multi-transfert function estimated on the same phasespace point (speed)
  - Module of preselection of the jet/parton assignment (speed)

### cpu-time



Number of integration to evaluate:
 Number of events: ~1000
 Number of theoretical hypothesis: ~10
 Systematics (JES): ~5
 Jet-Parton assignment: ~12

□ Total: ~600k

Each of them needs to be Fast



### **Speed Benchmark**



process	perm	MW4	MW5
tt semí lept	24	1h16	41S
tt fully lept	2	46s	10s
tth semí lept	720	> 2 days	10mín
tth semí lept	48	> зh	Gmín
tth fully lept	24	>1h	Imín
h > w + w - > 1lept	2	59s	<5s
h > w + w - > 2 lept	1	8s	<5s
zbb	24	39т	185
zh	24	43M	<5s

running on Icore of a Intel core i7 2.3Ghz

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### cpu-time



Number of integration to evaluate:

- Number of events:
- Number of theoretical hypothesis:
- Systematics (JES):
- Jet-Parton assignment:







 $\sim 10k$ 

#### Each of them needs to be Fast

# **fnscritics of the Method**



- The Likelihood methods builds the BEST discriminating variable
- Fully Model dependent
- Transfer Function approximation
  - □ Factorize for each parton
  - Not valid for hard radiation
- D Pure LO approximation
- Strong sensitivity in analysis cut
- $\Box$  Computing time ( $N_{event} * N_{th}$  integrals)

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## MEM with radiation / NLO



### Radiations





#### 0 ISR

- Main Effect is to induce a transverse boost.
- D Different PDF

#### FSR

- Need to be parameteríze ín the TF
- Having a one parton
   evolving in two jets TF



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Work in progress



### MEM with radiation



- Those radiations are important
  - □ ttj is 50% at LHC
- 🛛 з Maín ídea
  - Transfer boost
  - Use ME + Njets
  - O NLO



## My point of view



Use ME + Njets

- Having one more jets at the matrix element level is roughly 10 times slower.
  - number of permutations (assignment jet-parton)
  - complexity of the integrand
  - dímension of the phase-space
- The radiation problem still occurs (at least for the inclusive sample)

O NLO

Basically equivalent to ME + N jets



## NLO



[J. Campbel, W. Giele, C. Williams, 1204.4424]

- Splitting higher order in two pieces depending if you resolve the jet or not
   If you resolve the jet: Use LOME + 1 jet
  - If you don't:





### MEM with radiation



- Those radiations are important
  - □ ttj is 50% at LHC

🛛 з Maín ídea

Transfer boost
Use ME + Njets
NLO



#### **Choices of variables**



Higgs production



Híggs Mass
 s-channel
 NOFSR





Study the ISR on Higgs production at LHC (14 TeV) at parton level (no hadronization)











#### Olívier Mattelaer

Glasgow Apríl 10 2014
# **Initial State Radiation**





# **Initial State Radiation**





Study the ISR on Higgs production at LHC (14 TeV) at detector level (simulation includes pile-up)



# Initial State Radiation







## TTH: LHC SENSITIVITY



## **TTH Observation**







Small production rate
 0.137 pb (8 TeV)
 0.632 pb (14TeV)

Challenging background
 tt + (b)jets
 Combinatorial



## **TTH Observation**







Small production rate
 O.137 pb (8 TeV)
 O.632 pb (14TeV)
 Can the MEM improve the sensitivity?



## **Final State**





Semí-leptonic Decay
Interpetation - Fully-leptonic Decay



## **Final State**





Semi-leptonic Decay
Interpetation of the second second

Which Channel is the most sensitive?



## **Event Generation**

- C
- □ Generation: MG5+Pythia6+Delphes2 (14TeV)
- Event selection (CMS type of selection)

**D** Lepton:  $P_T > 20, |\eta| < 2.4$ 

D Jets: (antí-KT,  $\Delta R = 0.5$ )  $P_T > 30$ ,  $|\eta| < 2.5$ 

at least four tagged b-jets

process	incl. $\sigma$	efficiency	$\sigma^{ m rec}$
$t\bar{t}h$ , single-lepton	111 fb	0.0485	$5.37~{ m fb}$
$t\bar{t}h,{ m di-lepton}$	17.7 fb	0.0359	$0.634~{ m fb}$
$t\bar{t}$ +jets, single-lepton	256 pb	$0.463  imes 10^{-3}$	119 fb
$t\bar{t}$ +jets, di-lepton	40.9 pb	$0.168  imes 10^{-3}$	6.89 fb



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$$\mathcal{P}(\boldsymbol{p}^{vis}|\alpha) = \frac{1}{\sigma_{\alpha}} \int d\Phi dx_1 dx_2 |M_{\alpha}(\boldsymbol{p})|^2 W(\boldsymbol{p}, \boldsymbol{p}^{vis})$$

#### Transfer function:

- perfect resolution on charged leptons
- perfect resolution for jets angle
- double gaussian with energy dependencies for jets energy
- Matrix-element
  - With ISR boost correction
  - tth for signal
  - ttbb for background







$$D_i = \frac{P(\boldsymbol{x}_i|S)}{P(\boldsymbol{x}_i|S) + P(\boldsymbol{x}_i|B)}$$











$$D_i = rac{P(\boldsymbol{x}_i|S)}{P(\boldsymbol{x}_i|S) + P(\boldsymbol{x}_i|B)}$$

- Higher discriminative power for di-leptonic channel
  - less background combinatorics
- Higher probability to select the "wrong" jets for semi-leptonic channel.













Test: confidence level in rejecting S+B if B-only is realized

correspond to the green integral





 $\square$  rescale the cross section by a factor  $\mu$  such that S+B is excluded at 95% C.L











## Matrix Element Re-Weighting: path to precise measurement





- Matrix Element Re-Weighting: path to precise measurement
  - LO order method





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- Madweight allows efficient evaluations for ANY BSM model and ANY topologies
  - Allows precise Mass/Spin measurements
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- Radiation is a bottleneck
  - Need new way to deal with them (FSR)





- Matrix Element Re-Weighting: path to precise measurement
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  - Allows precise Mass/Spin measurements
    - Use the full theoretical information
    - A lot of experimental information
- Radiation is a bottleneck
  - Need new way to deal with them (FSR)
- MEM is able to handle successfully complicated process like tth

#### Backup slide





























Second Example: semí-leptoníc top quark paír PB D degrees of freedom 16  $p_5$  $p_a$  00000  $\overline{d}$  $p_1$ D peaks 19 00000 FBB p<sub>6</sub>  $m_{-4}^{*}$ -> 3 peaks unaligned  $p_3$ Multí-channel  $\overline{b}$  $d\phi = \prod_{i=1}^{5} \frac{d^3 p_i}{(2\pi)^3 2E_i} \frac{d^3 p_6}{(2\pi)^3 2E_6} dx_1 dx_2 \delta^4 (p_a + p_b - \sum_j p_j)$ 3 5  $\rightarrow d\phi = \prod_{i=1}^{3} d\theta_{i} d\phi_{i} \prod_{i=1}^{3} d|\mathbf{p}_{i}| \prod_{i=1}^{3} dm_{-k}^{*2} \times J$ Pass to k=1j=1i=1















# MadWeight



- the phase-space is split into blocks, each of them is associated to a specific local change of variables
- 12 blocks, í.e. 12 analytic changes of variables have been defined in our code.
- Madweight finds automatically
  - the optimal partition of the PS into blocks
  - computes the weights using the corresponding PS parametrisation


























#### (Crazy?) scenario: We observe only Two muon + MET







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#### Examples of studies / investigations

- mass determination : smuon pair production
- Spín Analysis
- $\Box$  ISR effects: pp > H > W + W -
- **D**MEM:  $m_{t\bar{t}}$  in fully leptonic channel

## **fnsDifferential Cross Section**





Need the parton configuration uses a series of constraints (kinematical fit) use  $\frac{1}{\mathcal{P}} \frac{\partial \mathcal{P}}{\partial Z}$  as discriminator

## **fnsDifferential Cross Section**





We use the full inference





## **DMEM Validation**





reconstructed level





## DMEM



What if the sample is not a SM one? For example if a heavy Z exists (600 GeV).



#### Examples of studies / investigations

- mass determination : smuon pair production
- Discriminating Hypothesis
- □ ISR effects: pp > H > W+W-
- DMEM:  $m_{t\bar{t}}$  in fully leptonic channel



Discriminatett~ Higgs from background



diagram 3 QC

QCD=2, QED=1











define discriminant:





define discriminant:



















