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## Deconvolving the detector from an observed signal in Fourier space

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Including a numerical recipe!


## Introducing the main characters

1. A Signal, e.g:


Heavy $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$, lepton + jets
2. A particle detector

3. The convolution theorem.

## The signal

The purpose of the analysis is to measure an angular distribution $d^{n} \Gamma / d \Omega^{n}$.
The reason for studying the angular distribution is: sensitivity to coupling constants in the decay, particularly anomalous couplings, which would be a sign of new physics.
$\mathcal{L}_{W t b}=-\frac{g}{\sqrt{2}} \bar{b} \gamma^{\mu}\left(V_{L} P_{L}+V_{R} P_{R}\right) t W_{\mu}^{-}-\frac{g}{\sqrt{2}} \bar{b} \frac{i \sigma^{\mu \nu} q_{\nu}}{M_{W}}\left(g_{L} P_{L}+g_{R} P_{R}\right) t W_{\mu}^{-}+h . c$.
The Wtb
vertex.
Nucl.Phys.B840:349-378,2010
$\left.\mathcal{L}_{H W W}=m_{W}^{2}\left(\sqrt{2} G_{F}\right)^{1 / 2}\left(1-\frac{g^{2} v}{2 \Lambda^{2}} f_{\Phi, 2}\right)\right) H W_{\mu}^{+} W^{-\mu}+\frac{g^{2} v}{2 \Lambda^{2}} \frac{f_{W}}{2}\left(W_{\mu \nu}^{+} W^{-\mu} \partial^{\nu} H+h . c\right)-\frac{g^{2} v}{2 \Lambda^{2}} f_{W W} W_{\mu \nu}^{+} W^{-\mu \nu}$
The HWW
vertex.
arXiv:1505.05516
In particular we concentrate on signatures with a single neutrino in the final sate:

* Resolution effects are large.
* But the final state can be fully, if not precisely, reconstructed.

Single top t-channel w/ leptonic decay, $\sqrt{s}=14 \mathrm{TeV}$ generated with PROTOS.
https://jaguilar.web.cern.ch/jaguilar/protos/manual.ps
$\mathrm{H}(200 \mathrm{GeV})->\mathrm{W}^{+} \mathrm{W}^{-}$, lepton+jets mode, $\sqrt{\mathrm{s}}=14 \mathrm{TeV}$ generated with PYTHIA8.

## The detector

-muon chamber

## :magnetized iron

hadron calorimeter
: EM calorimeter
:beam pipe center
:magnet coi

We demonstrate a technique with a simple detector simulation:

Very simple smearing of the neutrino energy and direction are applied:
$\sigma\left(\mathrm{E}_{\mathrm{T}}\right)=0.5 \sqrt{ } \mathrm{E}_{\mathrm{T}}$. in both $x, y$ directions.

Neutrino $p_{z}$ obtained from the $W$ mass constraint; quadratic ambiguity solved by optimizing the reconstructed top (Higgs) mass.

Cuts applied on $p_{T}$ of lepton, and jets $E_{T}{ }^{\text {miss }}$, lepton isolation, detector acceptance.

These isolate the lepton + jets signal.

## The convolution theorem

$$
\widetilde{f \star g}=\sqrt{2 \pi} \cdot \tilde{f} \cdot \tilde{g} \quad \begin{aligned}
& \text { The Fourier transform of the convolution of two } \\
& \text { functions is the product of their Fourier transforms. }
\end{aligned}
$$

Used in signal processing. Proof is simple:

$$
\begin{aligned}
(f \star g)(t) & \equiv \int f(x) g(t-x) d x \\
& =\int\left[\frac{1}{\sqrt{2 \pi}} \int \tilde{f}(\omega) e^{-i \omega x} d \omega\right] \cdot\left[\frac{1}{\sqrt{2 \pi}} \int \tilde{g}\left(\omega^{\prime}\right) e^{-i \omega^{\prime}(t-x)} d \omega^{\prime}\right] d x \\
& =\int d \omega \int d \omega^{\prime}\left[\tilde{f}(\omega) \cdot \tilde{g}\left(\omega^{\prime}\right)\right] e^{-i \omega^{\prime}(t)}\left[\frac{1}{2 \pi} \int e^{i\left(\omega^{\prime}-\omega\right) x} d x\right] \\
& =\int d \omega \int d \omega^{\prime}\left[\tilde{f}(\omega) \cdot \tilde{g}\left(\omega^{\prime}\right)\right] e^{-i \omega^{\prime}(t)} \delta\left(\omega^{\prime}-\omega\right) \\
& =\int d \omega[\tilde{f}(\omega) \cdot \tilde{g}(\omega)] e^{-i \omega^{\prime}(t)}
\end{aligned}
$$Define convolution

Express in terms ofFourier transforms
RearrangeDiscern a $\delta$-function$\widetilde{f \star g}=\sqrt{2 \pi} \cdot \tilde{f} \cdot \tilde{g}$Conclude...

Formulated more abstractly, we can imagine that convolution theorem works with any set of basis functions, not just complex exponentials.

$$
\begin{aligned}
(f \star g)(t) & \equiv \int f(x) g(t-x) d x \\
& =\sum_{x}\langle f \mid x\rangle\langle x-t \mid g\rangle \\
& =\sum_{x, k, k^{\prime}}\langle f \mid k\rangle\langle k \mid x\rangle\left\langle x-t \mid k^{\prime}\right\rangle\left\langle k^{\prime} \mid g\right\rangle \\
& =\sum_{x, k, k^{\prime}}\langle f \mid k\rangle\langle k \mid x\rangle\left\langle x \mid k^{\prime}\right\rangle\left\langle k^{\prime} \mid g\right\rangle e^{i k^{\prime} t} \\
& =\sum_{k, k^{\prime}}\langle f \mid k\rangle \delta_{k, k^{\prime}}\left\langle k^{\prime} \mid g\right\rangle e^{i k^{\prime} t} \\
& =\sum_{k}\langle f \mid k\rangle\langle k \mid g\rangle e^{i k t} \\
& =\int \tilde{f} \tilde{g} e^{i k t} d k
\end{aligned}
$$

$$
\widetilde{f \star g}=\sqrt{2 \pi} \cdot \tilde{f} \cdot \tilde{g}
$$

## Convolution on a sphere

Mathematische Annalen
December 1917, Volume 78, Issue 1, pp 398-404

Über orthogonal-invariante Integralgleichungen. Von
E. Hecke in Basel.

Origin of the Funk-Hecke theorem.

First practical application?

Ronen Basri, Member, IEEE, and David W. Jacobs, Member, IEEE

BASRI AND JACOBS: LAMBERTIAN REFLECTANCE AND LINEAR SUBSPACES
The above paper addresses the issue of facial recognition under different lighting conditions.

Sound familiar?


Fig. 1. The same face, under two different lighting conditions.

## Angular analog: the Funk-Hecke theorem

Describes the effect of isotropic angular smearing on an angular distribution $\mathrm{d} \Gamma / \mathrm{d} \Omega$.

$$
\begin{aligned}
& \text { signal } \quad \rho(\theta, \phi)=\sum_{l=0}^{\infty} \sum_{m=-l}^{l} c_{l}^{m} Y_{l}^{m}(\theta, \phi) \\
& \begin{array}{l}
\text { detector } \\
\text { effects }
\end{array} \\
& \mathcal{R}(\Theta)=\sum_{l=0}^{M} r_{l} P_{l}(\cos \Theta) \\
& (\rho \star \mathcal{R})(\theta, \phi)=\sum_{l=0}^{M} \sum_{m=-l}^{l} d_{l}^{m} Y_{l}^{m}(\theta, \phi) \\
& \text { where } \quad d_{l} \equiv \frac{2}{2 l+1} r_{l} c_{l}^{m} \quad \text { (no summation) }
\end{aligned}
$$

The proof of this theorem is not hard either.
But the theorem is not sufficient for our purposes and we will have to "roll our own"

## We use an orthogonal function called an $M$-Function, a function of three angles built from spherical harmonics:

$$
\begin{aligned}
M_{k, l}^{m}\left(\theta_{1}, \theta_{2}, \phi\right) & =\sqrt{2 \pi} Y_{k}^{m}\left(\theta_{1}, 0\right) Y_{l}^{m}\left(\theta_{2}, \phi\right) \\
& =\sqrt{2 \pi} Y_{k}^{m}\left(\theta_{1}, \phi\right) Y_{l}^{m}\left(\theta_{2}, 0\right)
\end{aligned}
$$

These functions:

- are orthogonal
- are complete
- obey Gaunt's theorem.


## Here is a visual picture of $M$-function projections:


$\mathrm{a}_{000}(\mathrm{~s}) \mathrm{a}_{100}(\mathrm{a})$

$\mathrm{a}_{1,1,-1}(\mathrm{a})$

Difficult to display three variables in a graph. We show $\theta_{2}$ vs $\phi$ in these plots.

$\mathrm{a}_{010}(\mathrm{~s}) \mathrm{a}_{110}(\mathrm{a})$

$\mathrm{a}_{0,2,0}(\mathrm{~s})$


$\mathrm{a}_{111}$ (a)

$\mathrm{a}_{1,2,1}(\mathrm{a})$
The qualifiers (a) and(s) mean that the distribution is asymmetric or symmetric in $\theta_{1}$

## Properties of M-functions

Orthogonality: $\quad \int M_{k, l}^{m}\left(\theta_{1}, \theta_{2}, \phi\right) M_{k^{\prime}, l^{\prime}}^{m^{\prime} *}\left(\theta_{1}, \theta_{2}, \phi\right) d \Omega^{M}=\delta_{k, k^{\prime}} \delta_{l, l^{\prime}} \delta_{m, m^{\prime}}$ where $\quad d \Omega^{M}=\sin \theta_{1} \sin \theta_{2} d \theta_{1} d \theta_{2} d \phi$

Complex conjugation $\quad M_{k^{\prime}, l^{\prime}}^{m^{\prime} *}\left(\theta_{1}, \theta_{2}, \phi\right)=M_{k, l}^{-m}\left(\theta_{1}, \theta_{2}, \phi\right)$

Gaunt's theorem: $\quad M_{k, l}^{m}\left(\theta_{1}, \theta_{2}, \phi\right) M_{k^{\prime}, l^{\prime}}^{m^{\prime}}\left(\theta_{1}, \theta_{2}, \phi\right)=W_{k, l, k^{\prime}, l^{\prime}, L, K}^{m, m^{\prime}, M} M_{K, L}^{M}\left(\theta_{1}, \theta_{2}, \phi\right)$
I.E, if I have to multiply two M-functions, I can write the product as a sum of M-functions.

The known coefficients $W_{k, l, k^{\prime}, l^{\prime}, L, K^{m}, m^{\prime} M}$ can be expressed in terms of Gaunt coefficients and the Gaunt coefficients in Clebsch-Gordan coefficients: gory details in the hidden slide.

## Gory details, Gaunt expansion

$W_{k, l, k^{\prime}, l^{\prime}, L, K}^{m, m^{\prime}, M}=\sqrt{2 \pi} G_{k, k^{\prime}, K}^{m, m^{\prime}, M} G_{l, l^{\prime}, L}^{m, m^{\prime}, M}$
$G_{l, l^{\prime}, L}^{m, m^{\prime}, M}=\sqrt{\frac{(2 l+1)\left(2 l^{\prime}+1\right)}{4 \pi(2 L+1)}} C_{l, l^{\prime}, L}^{m, m^{\prime}, M} C_{l, l^{\prime}, L}^{0,0,0}$
where :
$G_{l, l^{\prime}, L}^{m, m^{\prime}, M} \quad$ are Gaunt Coefficients
$C_{l, l^{\prime}, L}^{m, m^{\prime}, M} \quad$ are Clebsch - Gordan Coefficients

Nature arranges for some important processes to have a simple form.

$$
\begin{aligned}
\rho\left(\theta_{1}, \theta_{2}, \phi\right) & \equiv \frac{1}{\Gamma} \frac{d \Gamma\left(\theta_{1}, \theta_{2}, \phi\right)}{d \Omega^{M}} \\
& =a_{k, l}^{m} M_{k, l}^{m}\left(\theta_{1}, \theta_{2}, \phi\right)
\end{aligned}
$$

Summation implied, finite series.

## Single top t-channel production \& decay



Single top t-channel production \& decay

The triple differential decay rate:

$$
\begin{aligned}
\rho\left(\theta_{1}, \theta_{2}, \phi\right) & \equiv \frac{1}{\Gamma} \frac{d \Gamma\left(\theta_{1}, \theta_{2}, \phi\right)}{d \Omega^{M}} \\
& =a_{k, l}^{m} M_{k, l}^{m}\left(\theta_{1}, \theta_{2}, \phi\right)
\end{aligned}
$$

Nucl.Phys.B840:349-378,2010

$$
\begin{aligned}
& a_{0,1}^{0}=+\frac{\sqrt{3}}{2}\left(\left|A_{1, \frac{1}{2}}\right|^{2}-\left|A_{-1,-\frac{1}{2}}\right|^{2}\right) \\
& a_{0,2}^{0}=+\frac{1}{2 \sqrt{5}}\left(\left|A_{1, \frac{1}{2}}\right|^{2}-2\left|A_{0, \frac{1}{2}}\right|^{2}-2\left|A_{0,-\frac{1}{2}}\right|^{2}+\left|A_{-1,-\frac{1}{2}}\right|^{2}\right) \\
& a_{1,0}^{0}=+P \frac{1}{\sqrt{3}}\left(\left|A_{1, \frac{1}{2}}\right|^{2}-\left|A_{0, \frac{1}{2}}\right|^{2}+\left|A_{0,-\frac{1}{2}}\right|^{2}-\left|A_{-1,-\frac{1}{2}}\right|^{2}\right) \\
& a_{1,1}^{0}=+P \frac{1}{2}\left(\left|A_{1, \frac{1}{2}}\right|^{2}+\left|A_{-1,-\frac{1}{2}}\right|^{2}\right) \\
& a_{1,2}^{0}=+P \frac{1}{2 \sqrt{15}}\left(\left|A_{1, \frac{1}{2}}\right|^{2}+2\left|A_{0, \frac{1}{2}}\right|^{2}-2\left|A_{0,-\frac{1}{2}}\right|^{2}-\left|A_{-1,-\frac{1}{2}}\right|^{2}\right) \\
& a_{1,1}^{1}=-P \frac{1}{\sqrt{2}}\left(A_{1, \frac{1}{2}} A_{0, \frac{1}{2}}^{*}+A_{-1,-\frac{1}{2}}^{*} A_{0,-\frac{1}{2}}\right) \\
& a_{1,1}^{-1}=-P \frac{1}{\sqrt{2}}\left(A_{1, \frac{1}{2}}^{*} A_{0, \frac{1}{2}}+A_{-1,-\frac{1}{2}} A_{0,-\frac{1}{2}}^{*}\right) \\
& a_{1,2}^{1}=-P \frac{1}{\sqrt{10}}\left(A_{1, \frac{1}{2}} A_{0, \frac{1}{2}}^{*}-A_{-1,-\frac{1}{2}}^{*} A_{0,-\frac{1}{2}}\right) \\
& a_{1,2}^{-1}=-P \frac{1}{\sqrt{10}}\left(A_{1, \frac{1}{2}}^{*} A_{0, \frac{1}{2}}-A_{-1,-\frac{1}{2}} A_{0,-\frac{1}{2}}^{*}\right)
\end{aligned}
$$

## More gory details

$$
\tan \phi=\frac{\hat{p}_{l} \times\left(\hat{q} \times\left(\hat{q} \times \hat{s}_{t}\right)\right)}{\hat{q} \cdot\left(\hat{p}_{l} \times \hat{s}_{t}\right)}
$$

## Heavy Higgs decay to two vector bosons:



## And for B physics aficionados, $\mathrm{B}_{\mathrm{s}}^{0} \rightarrow \mathrm{~J} / \psi \phi$



## Sotrining the cociticienti.

Suppose:

$$
\rho\left(\theta_{1}, \theta_{2}, \phi\right)=a_{k, l}^{m} M_{k l}^{m}\left(\theta, \theta^{*}, \phi^{*}\right)
$$

$$
a_{k, l}^{m}=\int \rho\left(\theta_{1}, \theta_{2}, \phi\right) M_{k l}^{m *}\left(\theta_{1}, \theta_{2}, \phi\right) d \Omega^{M}
$$

Consider how to evaluate this integral using Monte Carlo integration:

* generate data according $\varrho\left(\theta_{1}, \theta_{2}, \phi\right)$.
* take the average value of $M_{k l^{l^{*}}}$ for the so-generated dataset. $\quad a_{k l}^{m}=\left\langle M_{k, l}^{m *}\left(\theta_{1}, \theta_{2}, \phi\right)\right\rangle$


## Notice:

* You do not need to know Q .
* All you need for this is the dataset. Good: that's all you have anyway.

And:

* You can also obtain errors, correlations, a full covariance matrix!

Here is a demonstration using harmonic basis functions in a rectangular space:


## Single top t-channel


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## Finite number of coefficients describe the shape in the absence of detector effects

Single top $t$-channel (PROTOS), no detector effects


## $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## Finite number of coefficients describe the shape in the absence of detector effects



## $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$(pythia truth level)


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$(reconstruction level)


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## Single top t-channel (protos truth level)


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## Single top t-channel (reconstruction level):


$\theta_{1}$ vs. $\phi$

$\theta_{2}$ vs. $\phi$




## But detector effects have a very big impact!

Single top t-channel, reconstruction level coefficients.


Here in miniature is the original.

Our mission: recover the original coefficients from the reconstructed coefficients.


## Detector effects

A particle produced at $\theta_{1 T}, \theta_{2 T}, \phi_{T}$,
is either rejected by selection cuts, or it is reconstructed at $\theta_{1 R}, \theta_{2 R}, \phi_{R}$

The joint probability function is defined as
$\mathcal{R}\left(\theta_{1 T}, \theta_{2 T}, \phi_{T}, \theta_{1 R}, \theta_{2 R}, \phi_{R}\right)$

Manufacture a basis for this 6-D space out of M-functions:
$r_{k, l, m, k^{\prime}, l^{\prime}, m^{\prime}} M_{k, l}^{m}\left(\theta_{1 T}, \theta_{2 T}, \phi_{T}\right) M_{k^{\prime}, l^{\prime}}^{m^{\prime}}\left(\theta_{1 R}, \theta_{2 R}, \phi_{R}\right)$
==> obtain the coefficients from Monte Carlo

## Convert first:

You have found the coefficients of the joint pdf. $\mathcal{R}\left(\theta_{1 R}, \theta_{2 R}, \phi_{R}, \theta_{1 T}, \theta_{2 T}, \phi_{T},\right)$ You need the coefficients of the conditional pdf $\mathcal{R}\left(\theta_{1 R}, \theta_{2 R}, \phi_{R} \mid \theta_{1 T}, \theta_{2 T}, \phi_{T},\right)$

Convert by solving this matrix equation, which is obtained using Gaunt's theorem:

in training sample

You can get what you need by inverting this system of equations

$$
g_{\kappa^{\prime}, \lambda^{\prime}, \mu^{\prime}, K^{\prime}, L^{\prime}, M^{\prime}}
$$

## Construct a convolution theorem

Multiply the physics distribution with the conditional probability and integrate over the truth angles. .
Theorem accommodates non isotropic smearing, which need not be independent of the decay angles:

$$
g_{K, L,-M, k, l, m} \cdot a_{K, L, M}=\mathcal{A}_{k, l, m}
$$

Which can be written in a matrix form:


Physics coefficients. Ypu want.

## Deconvolve. Conceptually:

$$
\mathbf{G} \cdot \vec{a}=\overrightarrow{\mathcal{A}}
$$



Physics coefficients. You want. $\quad \vec{a}=\mathbf{G}^{-1} \cdot \overrightarrow{\mathcal{A}}$

But given that you $G$ is a rectangular matrix in general, you will have to minimize a $\chi^{2}$ :

$$
\chi^{2}(\vec{a})=(\overrightarrow{\mathcal{A}}-\mathbf{G} \cdot \vec{a})^{T} \cdot \mathbf{C}^{-1} \cdot(\overrightarrow{\mathcal{A}}-\mathbf{G} \cdot \vec{a})
$$

With analytic solution and error matrix:

$$
\vec{a}=\left(\mathbf{G}^{T} \mathbf{C}^{-1} \mathbf{G}\right)^{-1} \mathbf{G}^{T} \mathbf{C}^{-1} \overrightarrow{\mathcal{A}} \quad \mathbf{V} \equiv \operatorname{Cov}(\vec{a})=\left(\mathbf{G}^{T} \mathbf{C}^{-1} \mathbf{G}\right)^{-1}
$$

## Single top t-channel



## $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$(reconstruction level)






## $\mathrm{H} \rightarrow \mathrm{W}^{+} \mathrm{W}^{-}$(after deconvolution)



## Deconvolving the detector from an observed signal in Fourier space: the recipe

1. Do an orthogonal series analysis of the Monte Carlo in the space of true and reconstructed angles.
2. Coefficient Conversion: Joint PDF-> Conditional PDF \& determination of G. Procedure is sketched in the previous slides, will be fully described in proceedings.
3. Do an orthogonal series analysis of data sample to determine coefficients $\mathfrak{A}$ of reconstructed angular distributions and their covariance matrix $\mathbf{C}$.
4. Apply this equation:

$$
\vec{a}=\left(\mathbf{G}^{T} \mathbf{C}^{-1} \mathbf{G}\right)^{-1} \mathbf{G}^{T} \mathbf{C}^{-1} \overrightarrow{\mathcal{A}} \quad \mathbf{V} \equiv \operatorname{Cov}(\vec{a})=\left(\mathbf{G}^{T} \mathbf{C}^{-1} \mathbf{G}\right)^{-1}
$$

to obtain the physics coefficients \& the full covariance thereof.
Then propagate the measurement to fundamental parameters: coupling constants in the interaction Lagrangian

## Conclusions

* We showed a set of techniques for describing data using orthogonal functions.
* Introduced a set of functions useful for a certain types of processes with two polar and one azimuthal angle.
* The techniques benefit from an impressive mathematical toolkit, but one which is largely unfamiliar to physicists.
* This includes Gaunt's theorem and a variant of the convolution theorem.
* The latter is extremely useful for handling ferocious detector effects and the benefit is simultaneous determination of shape variables and / or physics parameters.
* The purpose of this talk and the accompanying proceedings is to make these techniques more familiar to the physics community.
* Thank you!

