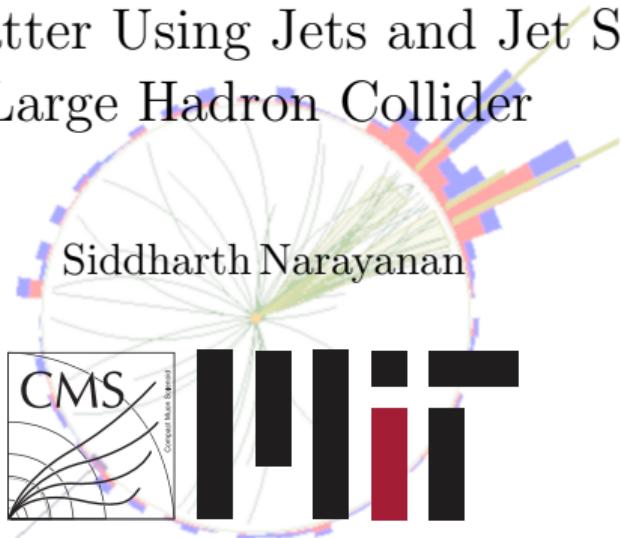


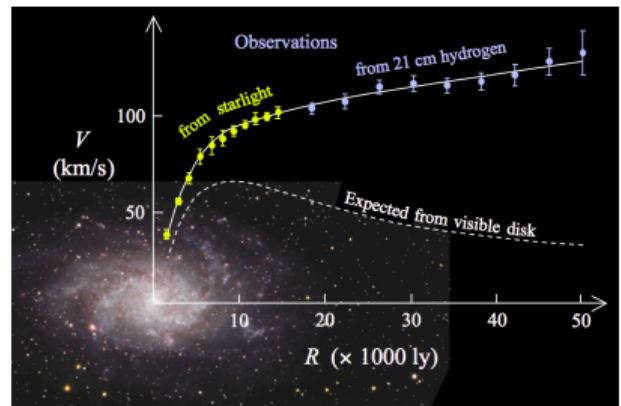
# Searching for Dark Matter Using Jets and Jet Substructure at the Large Hadron Collider



Ph.D. Thesis Defense - 2019/01/23

# Dark matter - in space

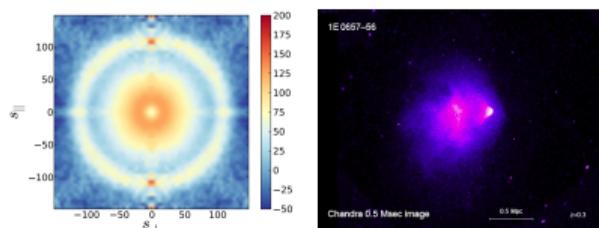
Strong astrophysical evidence for DM:



[1,2]



[3]

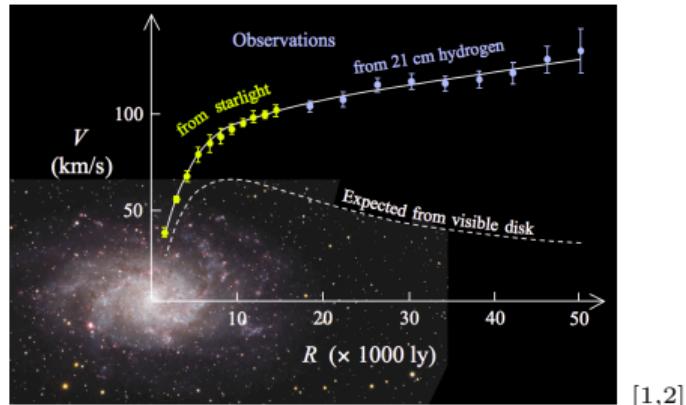


[4]

[5]

# Dark matter - in space

Strong astrophysical evidence for DM:



Weakly Interacting Massive Particles

- ▶ Weakly: DM-SM coupling  $g_\chi \sim g$
- ▶ Massive: mass  $m_\chi \sim 100$  GeV
- ▶ Close to measured relic density:

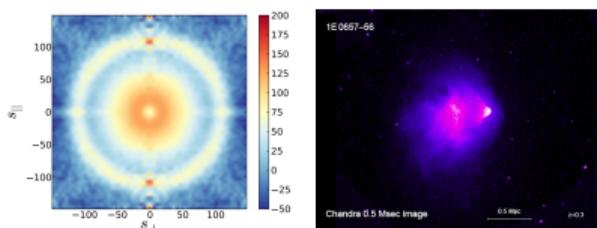
$$\Omega \propto \frac{\rho}{\rho_c} \propto \frac{1}{\langle \sigma v \rangle}$$

$$\Omega_{\text{meas.}} = 0.12, \quad \Omega_\chi \sim 0.1$$

- ▶ Particle colliders can probe WIMPs



[3]



[4]

[5]

# Dark matter - in a laboratory

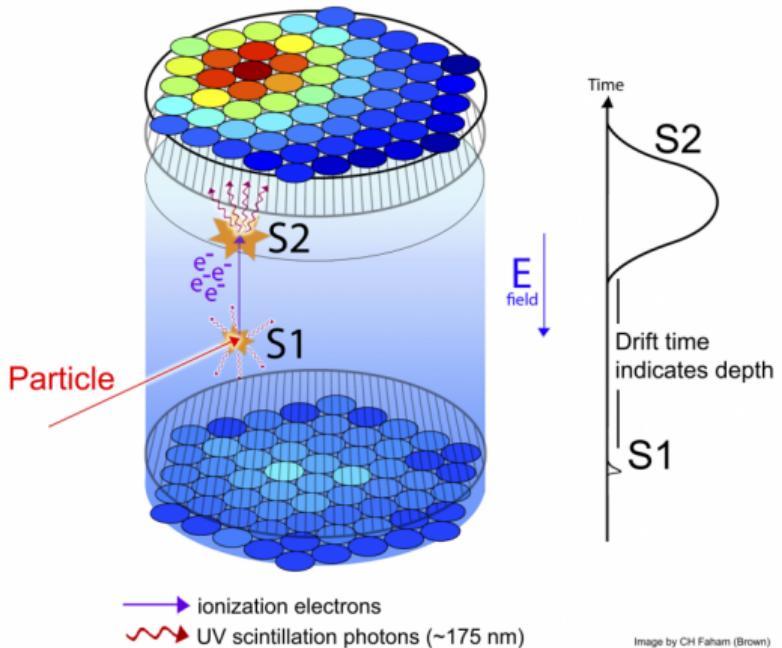
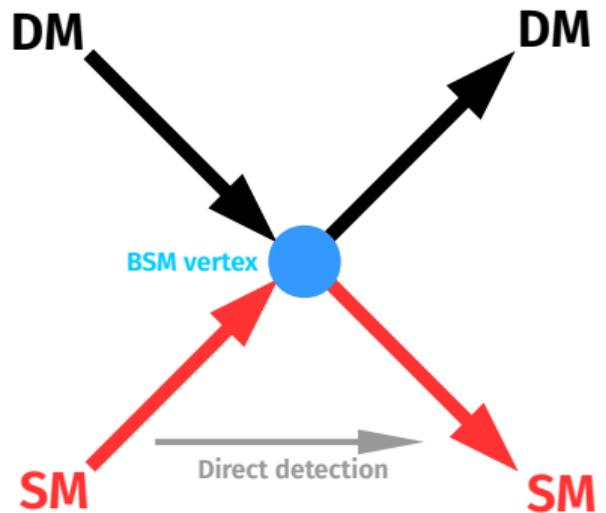
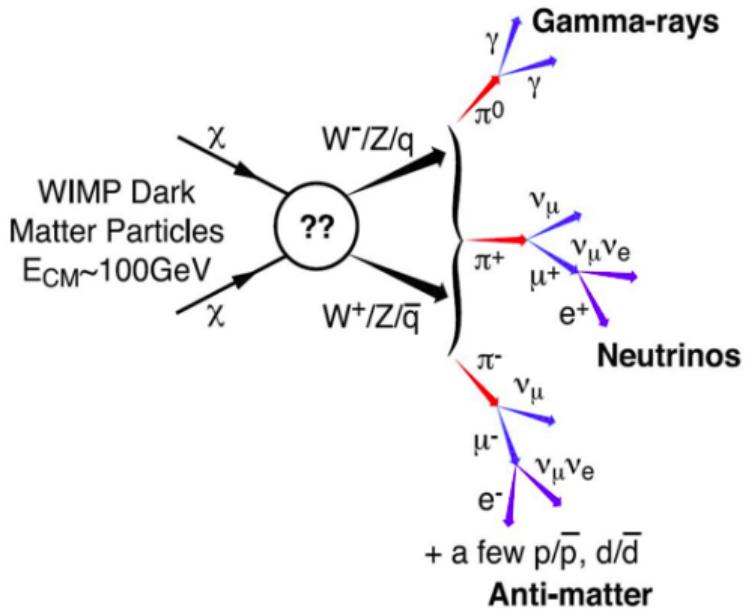
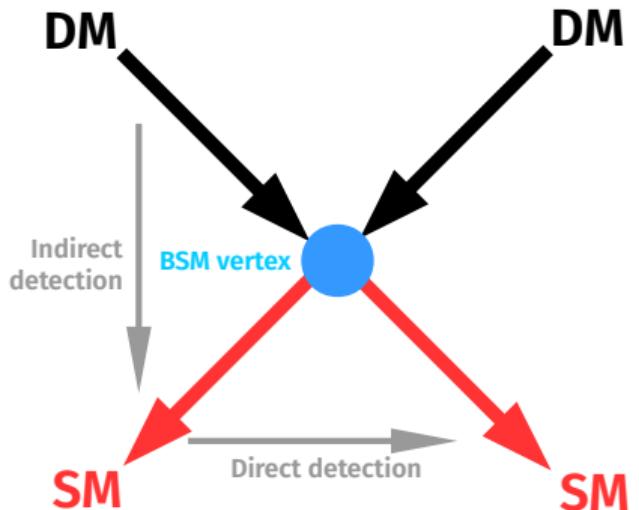


Image by CH Faham (Brown)

[6]

Search for DM-SM interactions as Earth moves through DM halo

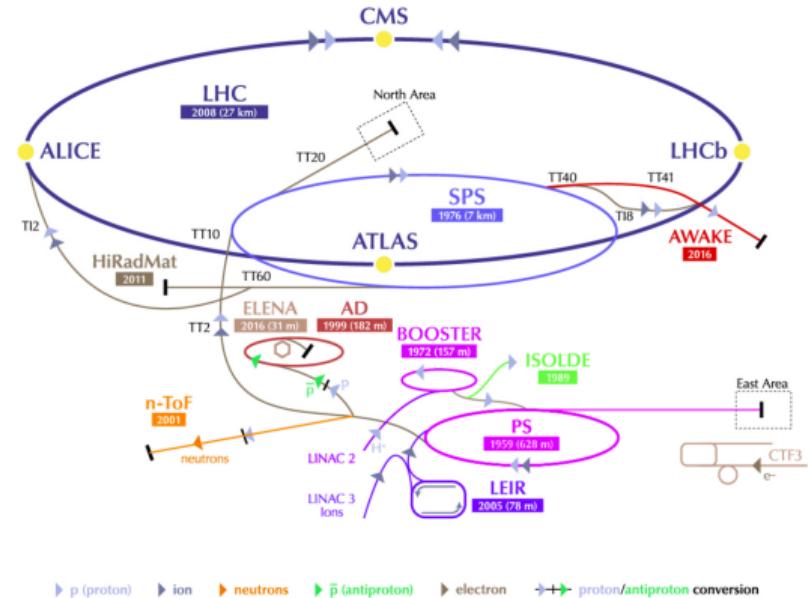
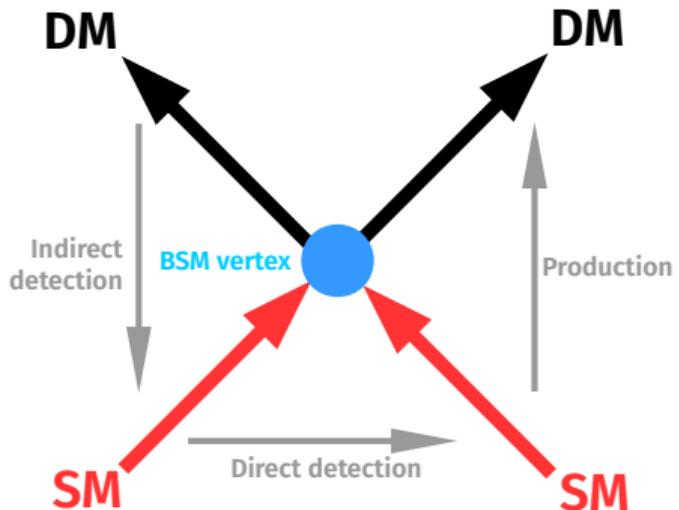
# Dark matter - in a laboratory



[7]

Look for SM remnants of DM-DM  
annihilation in space

# Dark matter - in a laboratory

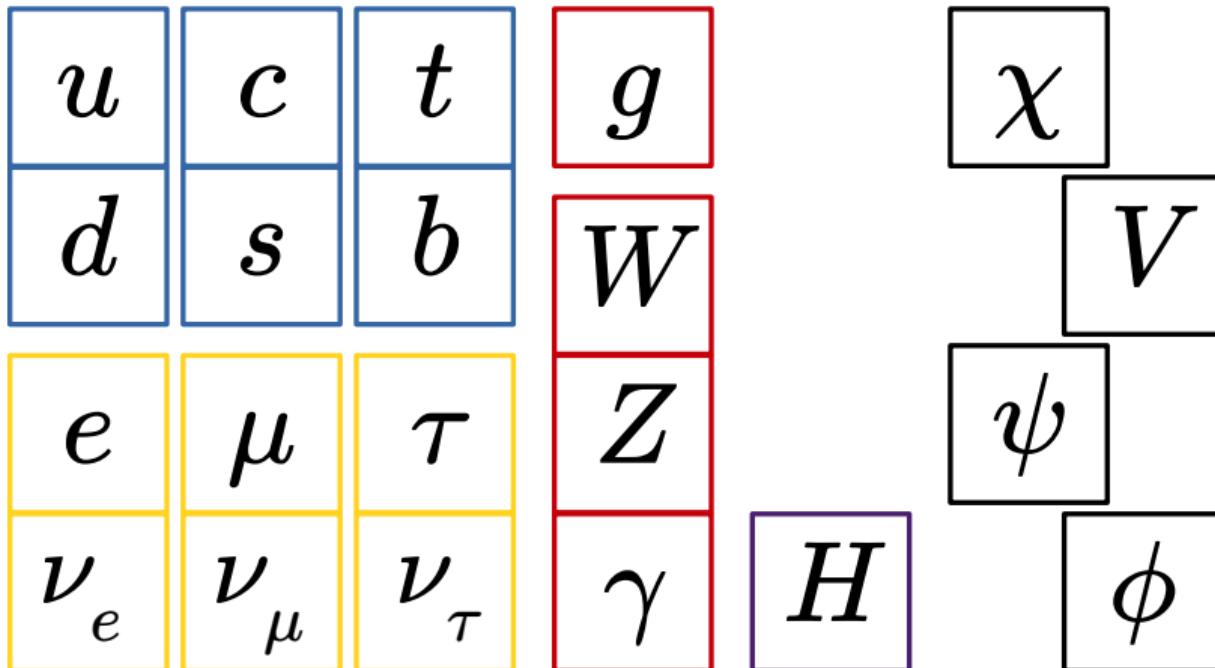


Exploit DM-SM interaction to produce DM  
in a laboratory

# Production of WIMPs at a hadron collider

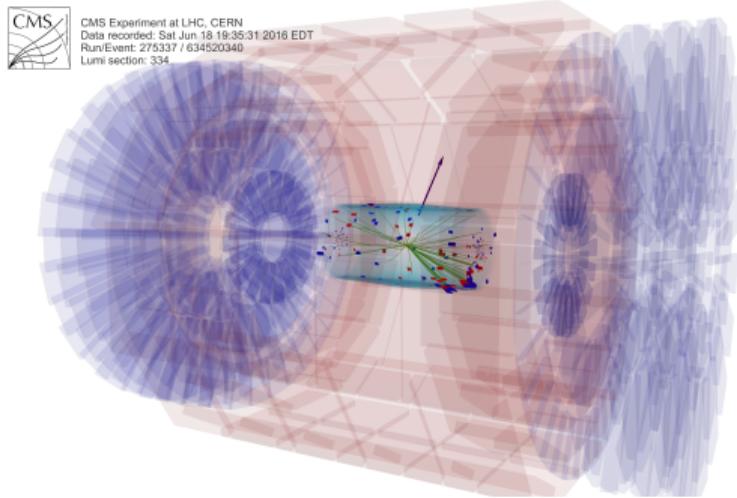
Effective coupling to quarks/gluons  $\gtrsim 10^{-4}$

Masses  $\lesssim \sqrt{s}$



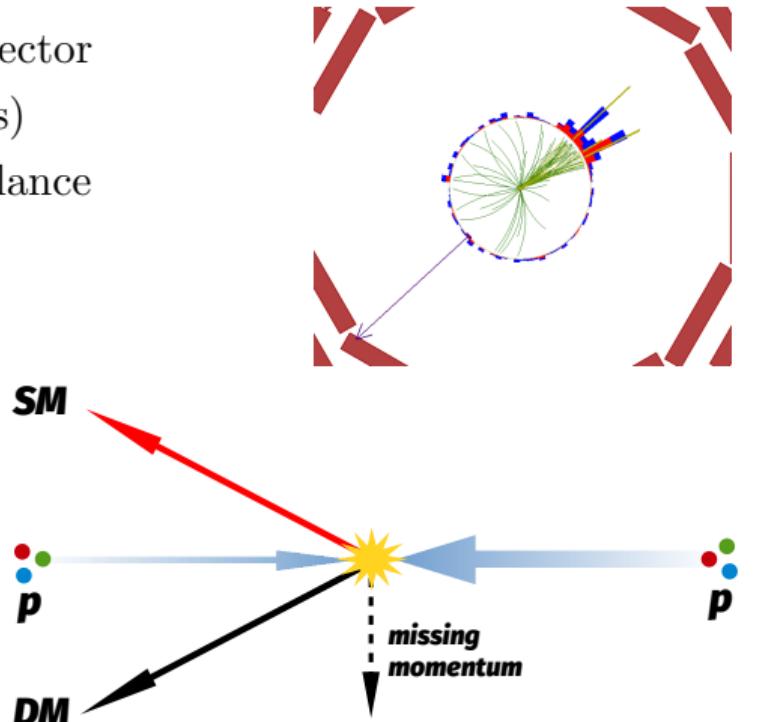
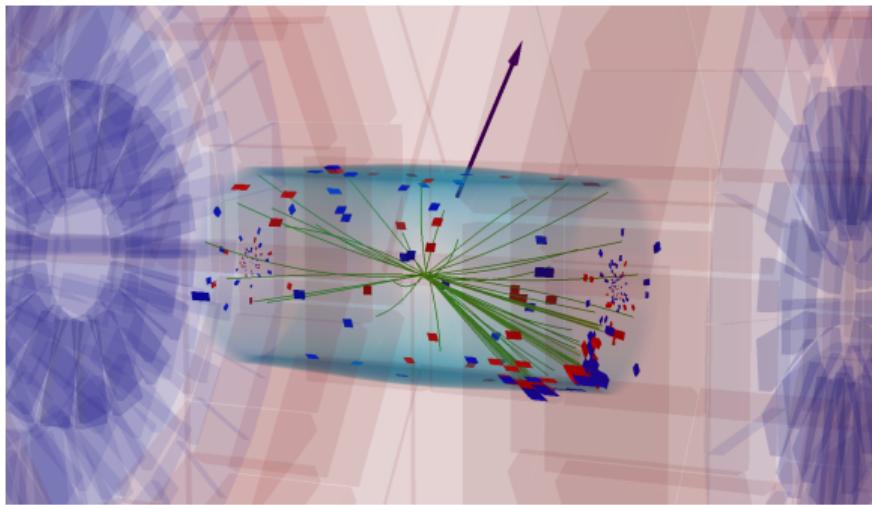
# Seeing the invisible at a hadron collider

- By definition, DM will not interact with a detector



# Seeing the invisible at a hadron collider

- ▶ By definition, DM will not interact with a detector
- ▶ Look for production of DM with SM particle(s)
- ▶ Key observable is transverse momentum imbalance



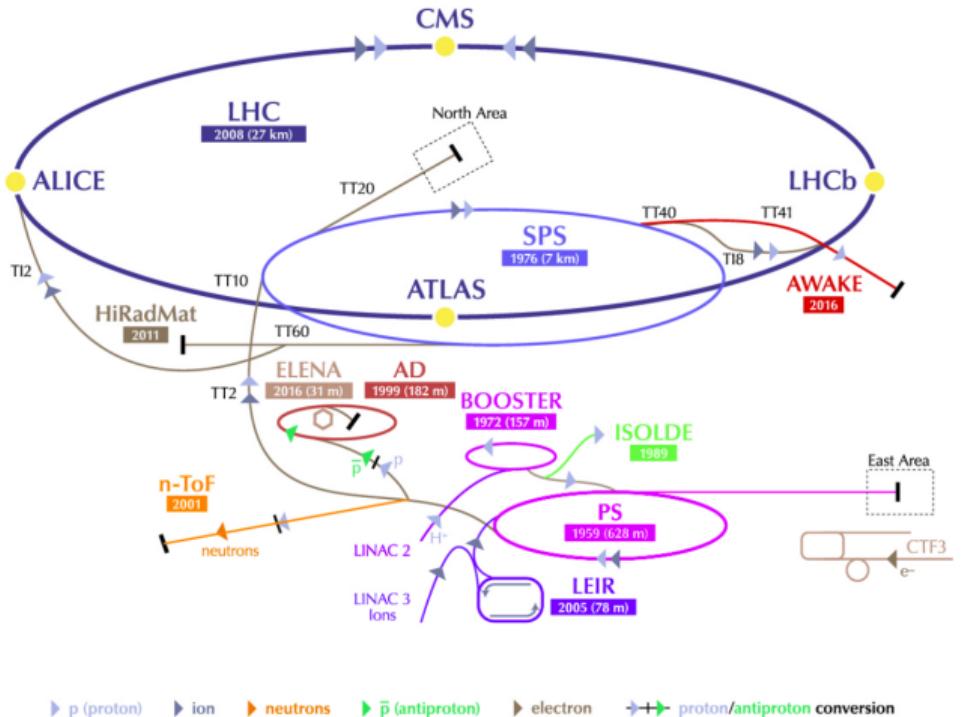
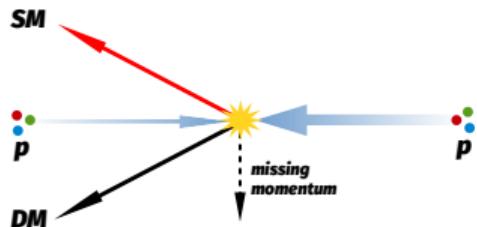
# Which SM particle(s)?

Many to choose from. SM particle choice  $\Leftrightarrow$  type of DM you can look for

|              | SM particle                  | Minimal extension | Higgs-like | Extra dimensions | Extended Higgs sector | Flavor violation |
|--------------|------------------------------|-------------------|------------|------------------|-----------------------|------------------|
| Quarks       | $q(g)$                       |                   |            |                  |                       |                  |
|              | $t$                          |                   |            |                  |                       |                  |
|              | $qq'$                        |                   |            |                  |                       |                  |
|              | $t\bar{t}$                   |                   |            |                  |                       |                  |
|              | $b/b\bar{b}$                 |                   |            |                  |                       |                  |
| Gauge bosons | $\gamma$                     |                   |            |                  |                       |                  |
|              | $V \rightarrow q\bar{q}'$    |                   |            |                  |                       |                  |
|              | $Z \rightarrow \ell^+\ell^-$ |                   |            |                  |                       |                  |
| Higgs        | $H \rightarrow x\bar{x}$     |                   |            |                  |                       |                  |

# $p_T^{\text{miss}}$ at the LHC

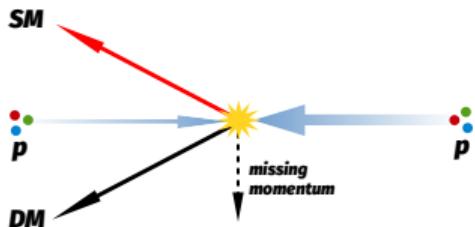
- CMS records collisions from the LHC
  - Today:  $\sqrt{s} = 13 \text{ TeV}$   $pp$  collision data from 2016
- Missing momentum:



►  $p$  (proton)   ► ion   ► neutrons   ►  $\bar{p}$  (antiproton)   ► electron   ►+► proton/antiproton conversion

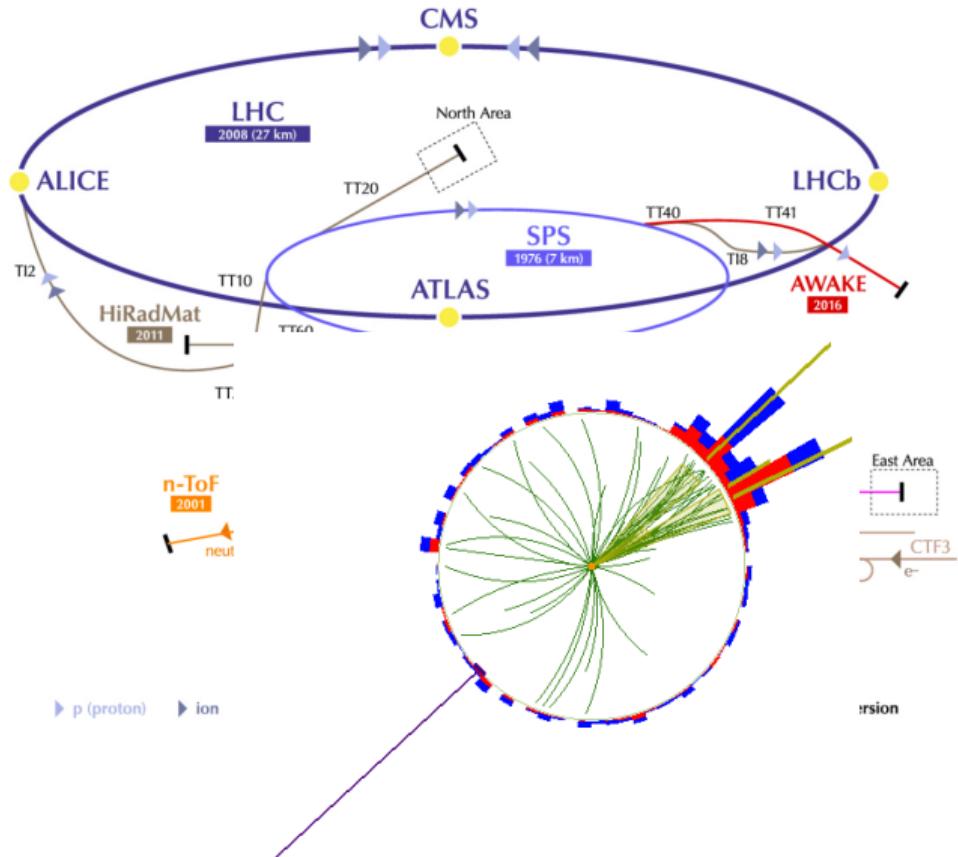
# $p_T^{\text{miss}}$ at the LHC

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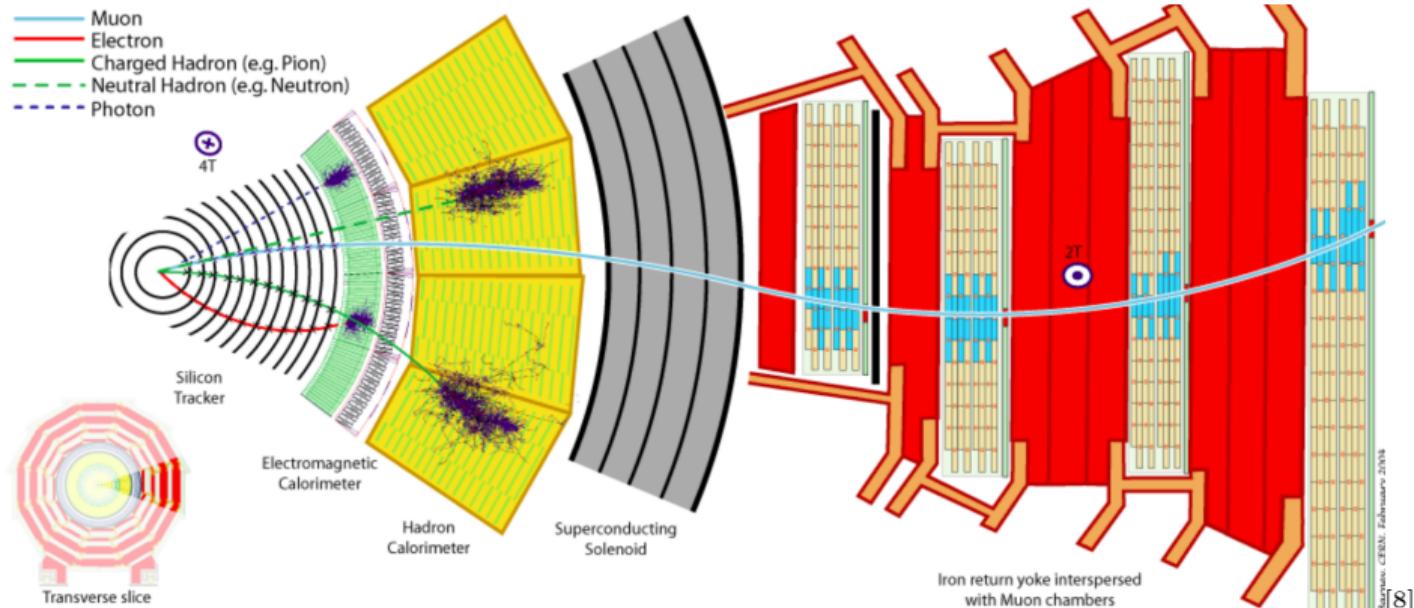


- turns into:

$$\vec{p}_T^{\text{miss}} = - \sum_{i \in \text{particles}} \vec{p}_{T,i}$$



# The Compact Muon Solenoid



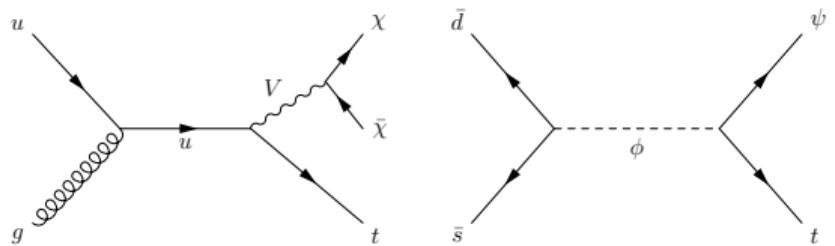
| Tracker   | ECAL  | HCAL  | Muon          |
|---|---|---|---------------|
| $\frac{0.015\% \cdot p_T}{\text{GeV}} \oplus 0.5\%$ | $\frac{3\%}{\sqrt{E/\text{GeV}}} \oplus \frac{12\%}{E/\text{GeV}} \oplus 0.3\%$ | $\frac{85\%}{\sqrt{E/\text{GeV}}} \oplus 7.4\%$ | 3% at 100 GeV |

# Outline of this talk

## DM production mode

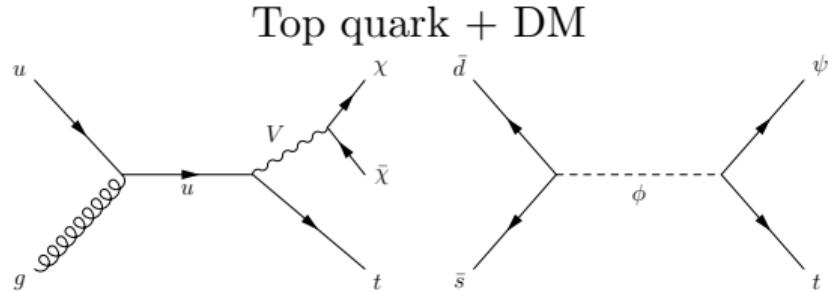
## Highlights

Top quark + DM



# Outline of this talk

## DM production mode



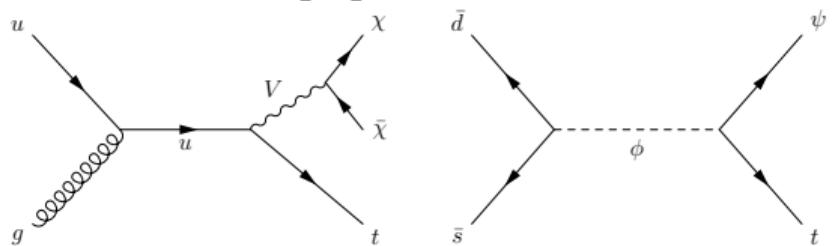
## Highlights

Jet substructure  
Invisible background estimation

# Outline of this talk

## DM production mode

### Top quark + DM

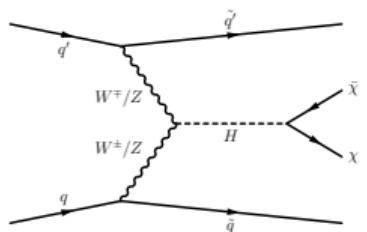


## Highlights

Jet substructure

Invisible background estimation

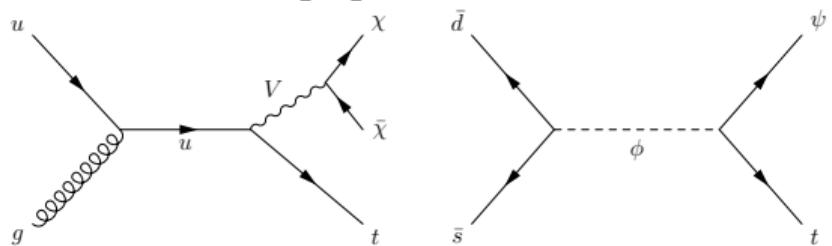
### Higgs $\rightarrow$ DM



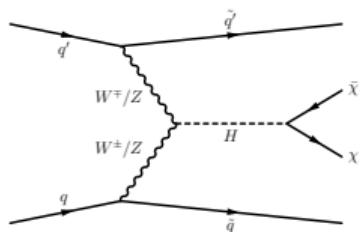
# Outline of this talk

## DM production mode

Top quark + DM



Higgs  $\rightarrow$  DM



## Highlights

Jet substructure

Invisible background estimation

Electroweak SM backgrounds  
Forward jets

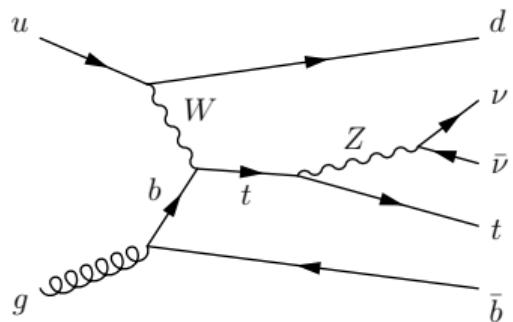
# Mono-Top

# Hallmarks of top quark+ $p_T^{\text{miss}}$

- ▶ Final state violates flavor conservation
  - ▶ SM will have  $b$  quark in the final state
- ▶ Excess mono-top production  $\Rightarrow$  flavor-changing BSM

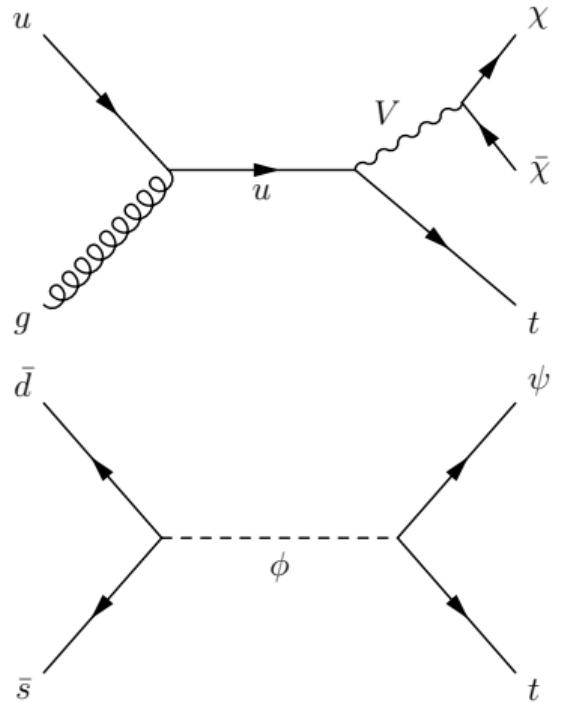
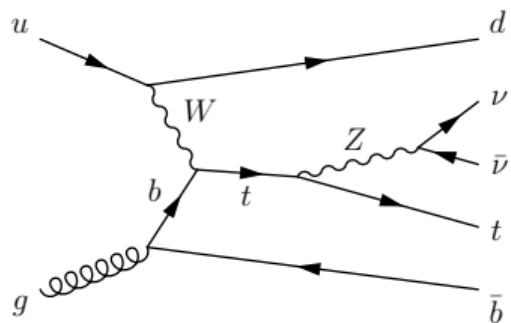
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- ▶ Final state violates flavor conservation
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- ▶ SM process is tiny: 0.14 pb  $\Rightarrow$  5000 events in 36/fb



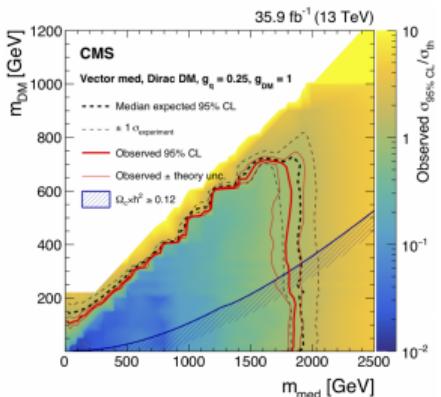
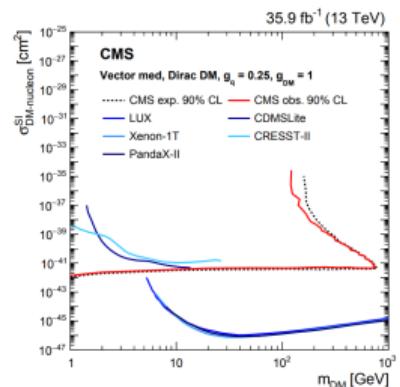
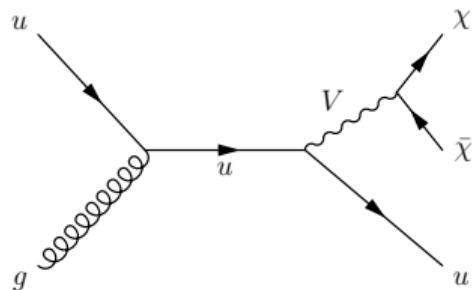
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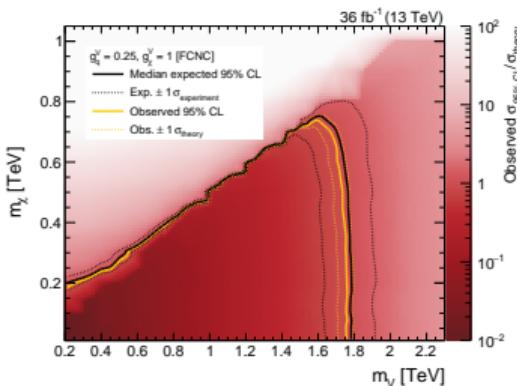
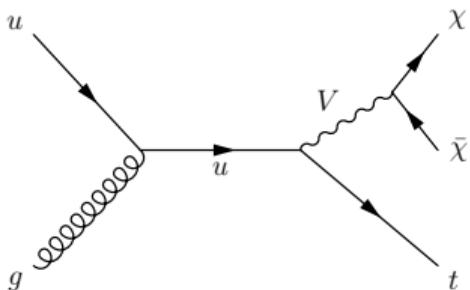


# Connection to canonical DM models

Flavor conserving: diagonal  $g_u^V$

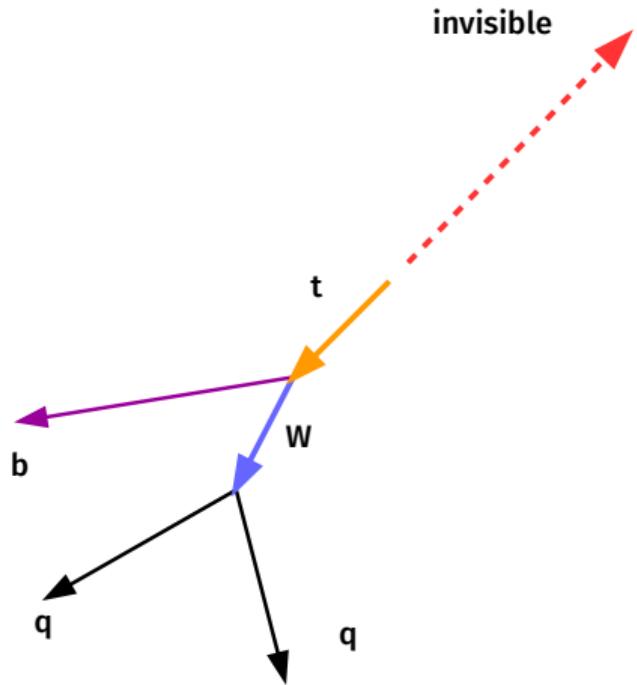


Flavor violating: off-diagonal  $g_u^V$



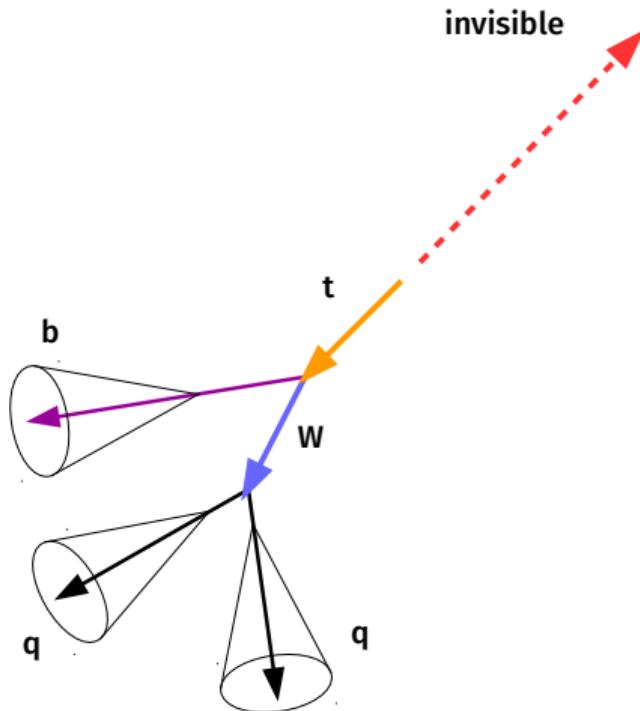
# Anatomy of a mono-top event

Hadronic decay  $\Rightarrow$  larger  $\mathcal{B}$ , no  $p_T^{\text{miss}}$

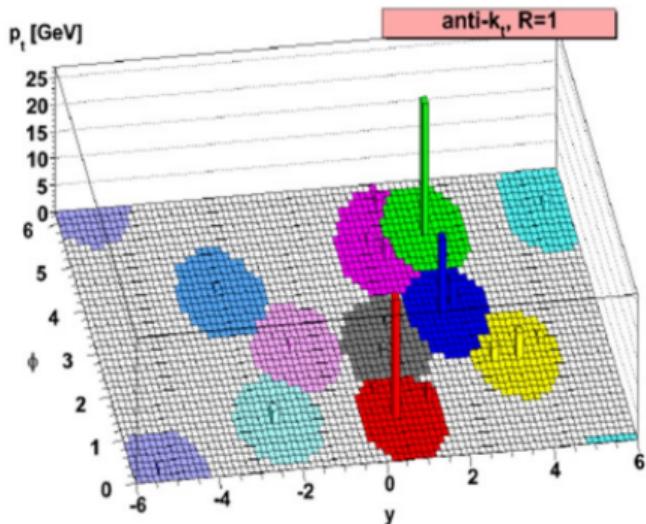


# Anatomy of a mono-top event

Bare quarks shower into jets

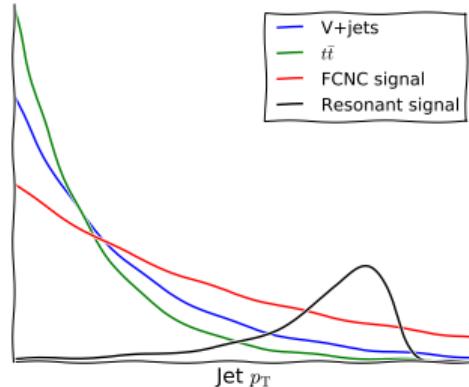
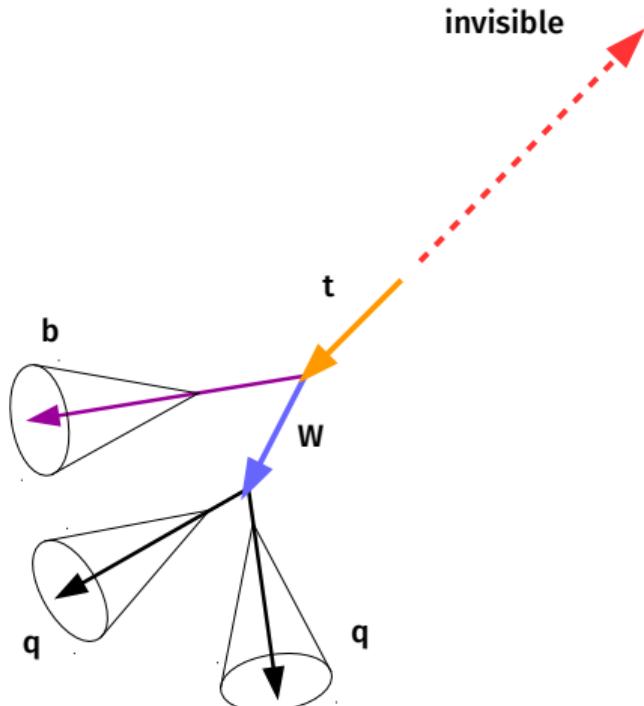


- ▶ Soft and collinear splittings  $\Rightarrow$  parton shower
- ▶ Color confinement  $\Rightarrow$  hadronization
- ▶ “Jets” are reconstructed using iterative clustering algorithms at LHC



# Anatomy of a mono-top event

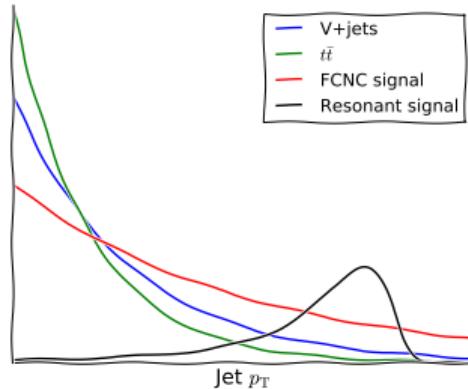
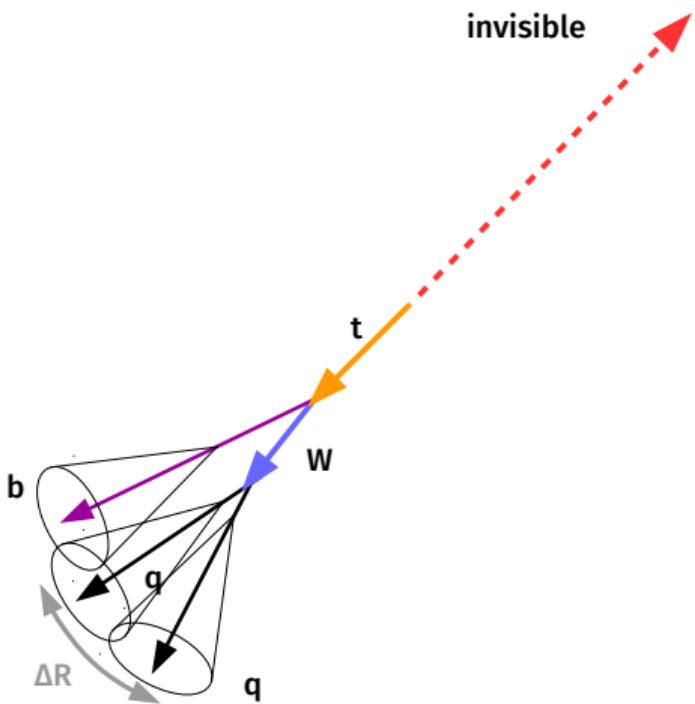
Bare quarks shower into jets



- ▶ Signal more energetic than SM
- ▶ Maximize S/B  $\Rightarrow$  large jet  $p_T$

# Anatomy of a mono-top event

Decay products collimate

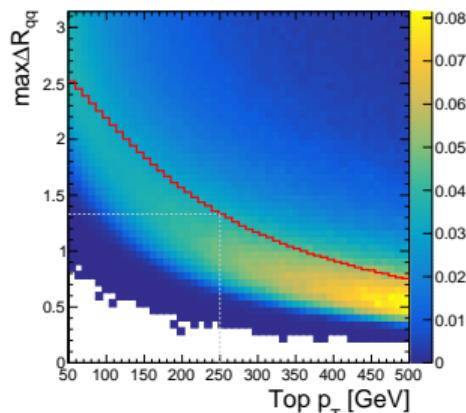


- ▶ Signal more energetic than SM
- ▶ Maximize S/B  $\Rightarrow$  large jet  $p_T$
- ▶ Separation between jets:  $\Delta R \sim 2m_t/p_T$ 
  - ▶  $p_T > 250$  GeV  $\Rightarrow$  jets ( $R = 0.4$ ) overlap

# Reconstruction of top quark jet

## Clustering

- ▶ Three  $R = 0.4$  jets  $\rightarrow$  single  $R = 1.5$  jet

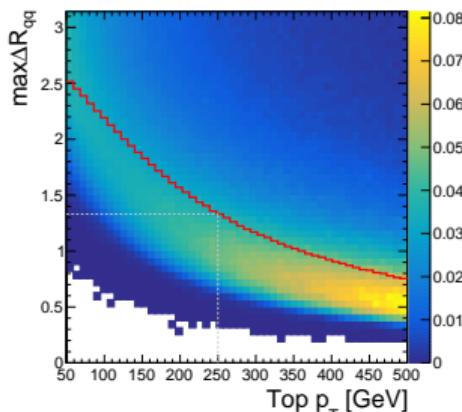


- ▶ These are huge jets: half the detector!
- ▶ Many extra particles

# Reconstruction of top quark jet

## Clustering

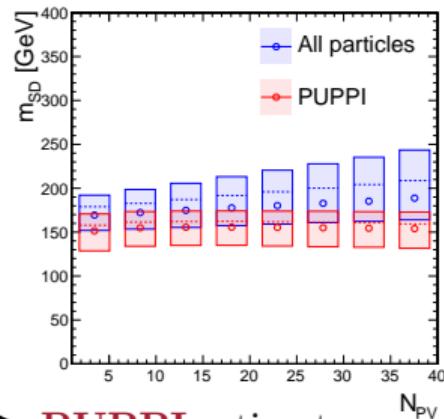
- ▶ Three  $R = 0.4$  jets  $\rightarrow$  single  $R = 1.5$  jet



- ▶ These are huge jets: half the detector!
- ▶ Many extra particles

## Pileup particles

- ▶ 10-25 vertices per collision
- ▶ PU particles are isotropic

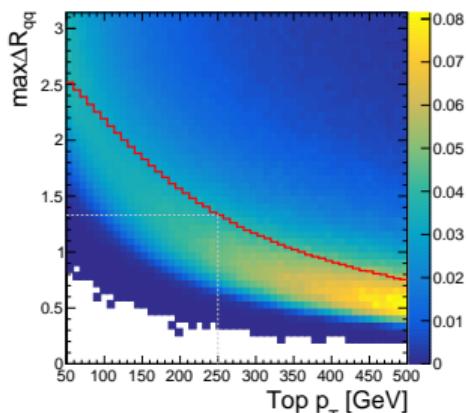


- ▶ **PUPPI** estimates  
 $P(\text{PU}|p_T, \eta, \phi)$  from proximity to PV particles

# Reconstruction of top quark jet

## Clustering

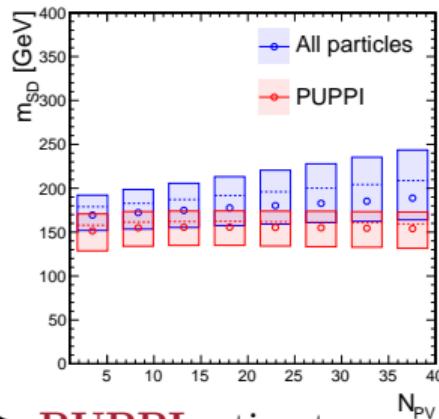
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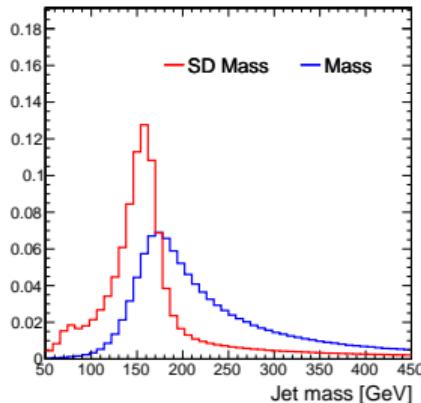
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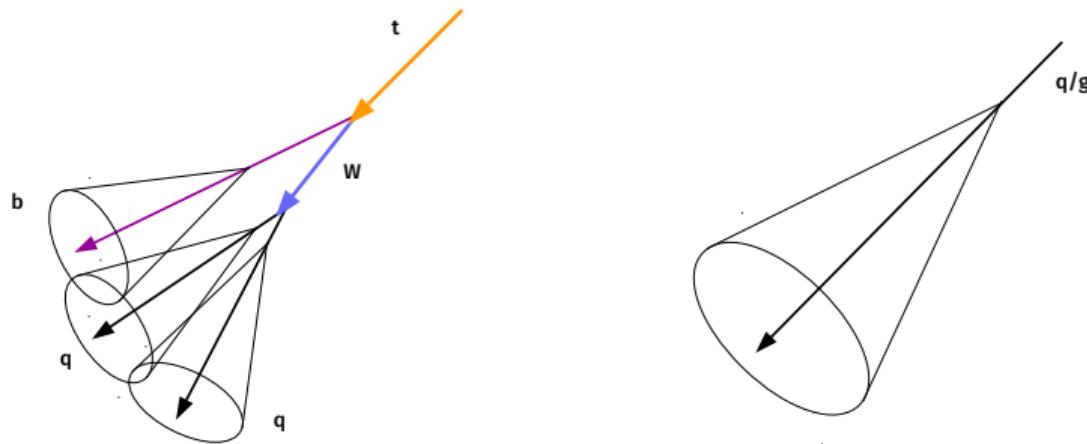
## Non-PS radiation

- ▶ Initial state radiation, underlying event, multi-parton interactions



- ▶ **Soft drop** removes wide-angle and soft radiation from jet

- Top quark  $\rightarrow 3q \Rightarrow$  top jet has 3 “prongs”: regions of correlated radiation



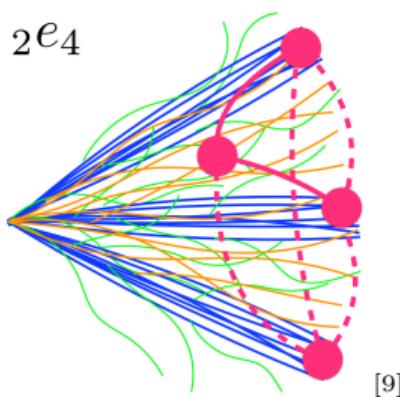
- **Substructure** observables are sensitive to such features
  - $N$ -subjettiness, subjet algorithms, ECFs,...

# Energy correlation functions

ECFs are **N**-point distance-weighted correlation functions among particles of the jet

$$e(a, \mathbf{N}, \alpha) \sim \sum_{\mathbf{N} \text{ particles } \in J}$$

sets of **N** particles

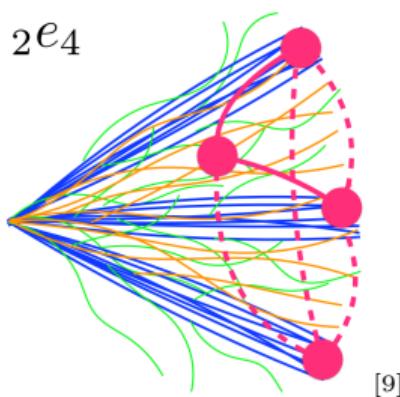


# Energy correlation functions

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$$e(a, \mathbf{N}, \alpha) \sim \sum_{\mathbf{N} \text{ particles } \in J} \left[ \prod_{p \in \text{particles}} \frac{E_p}{E_J} \right]$$

sets of **N** particles    energy fractions

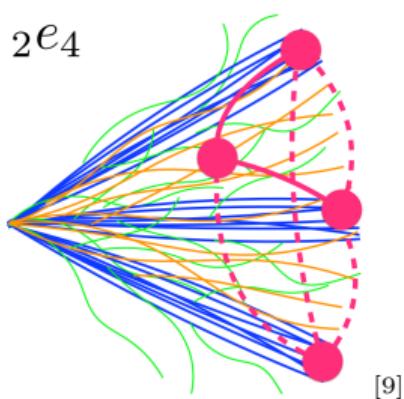


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sets of **N** particles
energy fractions
opening angle

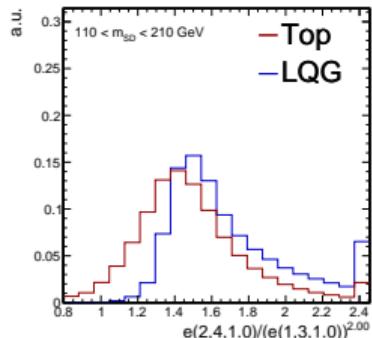
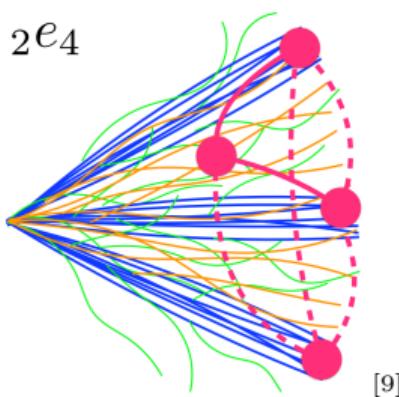


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sets of **N** particles
energy fractions
opening angle



$$e(4)/e(3)$$

# Energy correlation functions

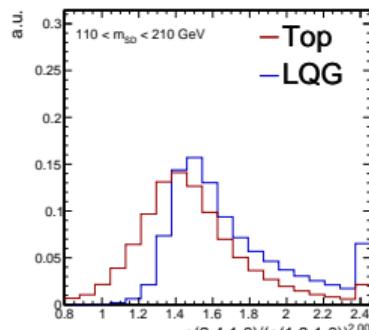
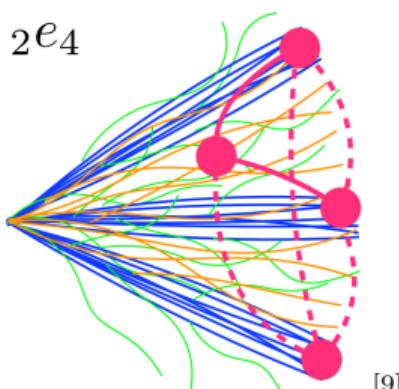
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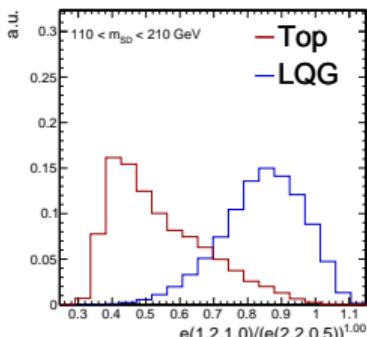
sets of **N** particles

energy fractions

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$e(4)/e(3)$

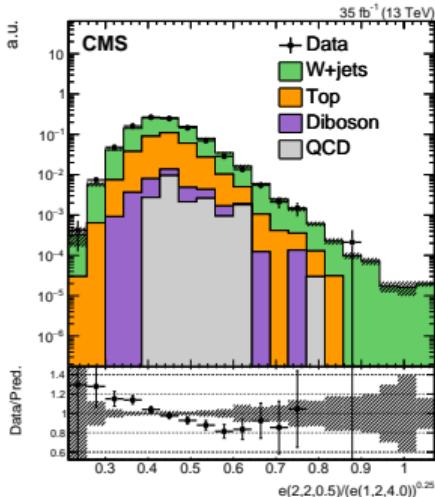


$e(2)/e(2)$

# Building a combined tagger

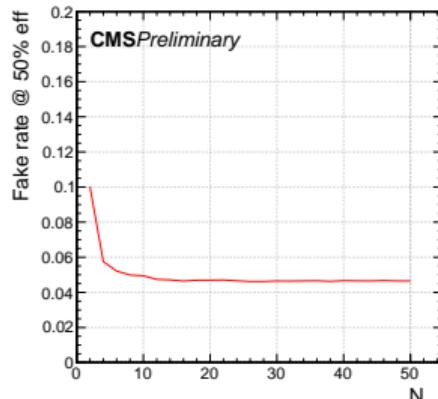
## Modeling issues

- ▶ PS model does not perfectly describe all ECF ratios



## Dimensional reduction

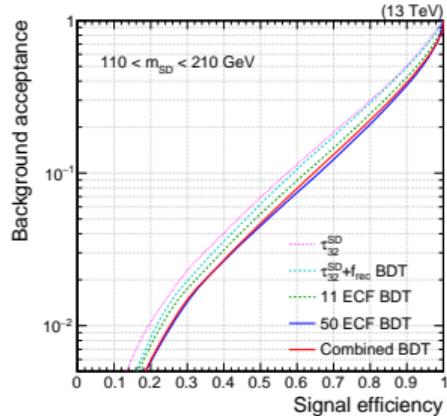
- ▶ Large ECF ratio space
- ▶ Expensive to compute



- ▶ Embed dimensional reduction into boosted decision tree training

## Combined tagger

- ▶ Final discriminator combines ECFs,  $\tau_{32}$ ,  $f_{rec}$

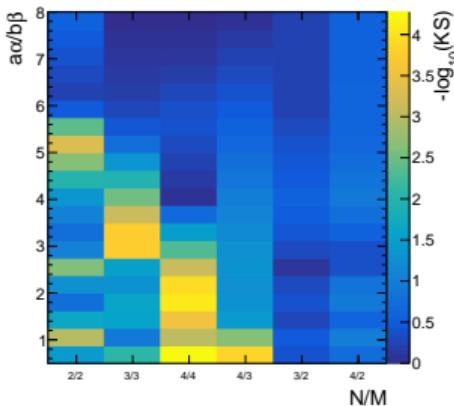


- ▶ 30% better background rejection

# Building a combined tagger

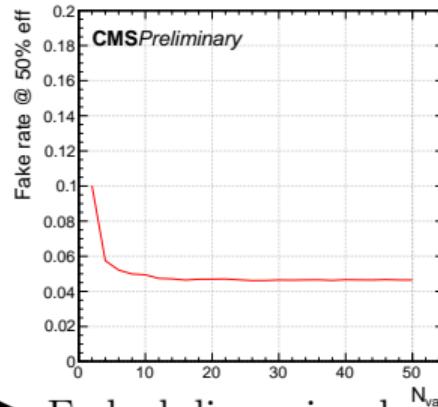
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- ▶ PS model does not perfectly describe all ECF ratios



## Dimensional reduction

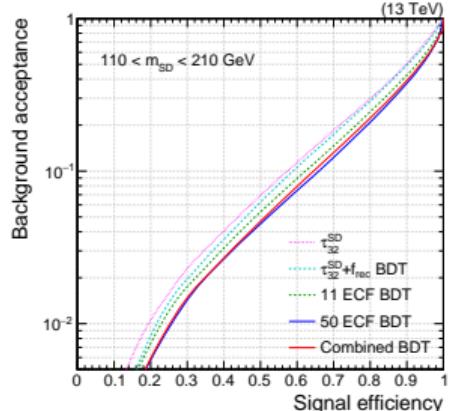
- ▶ Large ECF ratio space
- ▶ Expensive to compute



- ▶ Embed dimensional reduction into boosted decision tree training

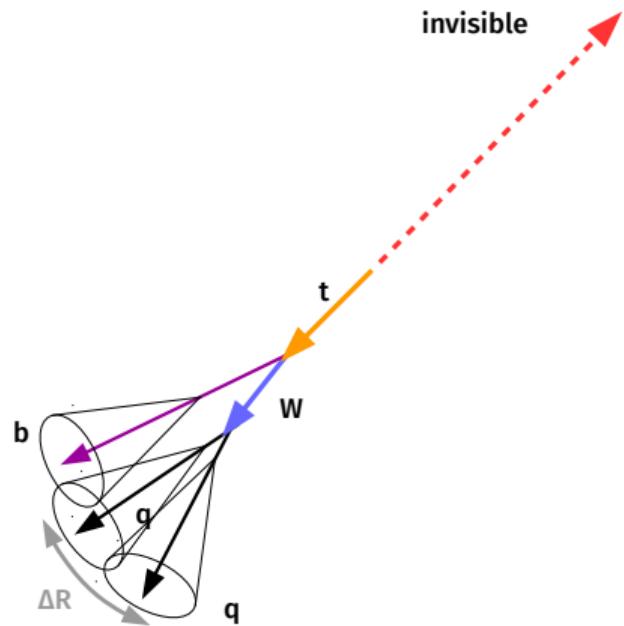
## Combined tagger

- ▶ Final discriminator combines ECFs,  $\tau_{32}$ ,  $f_{rec}$



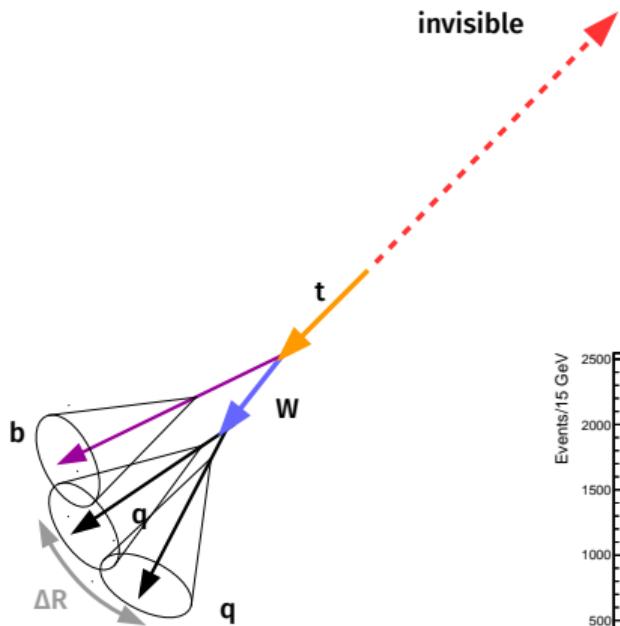
- ▶ 30% better background rejection

# Selecting mono-top events

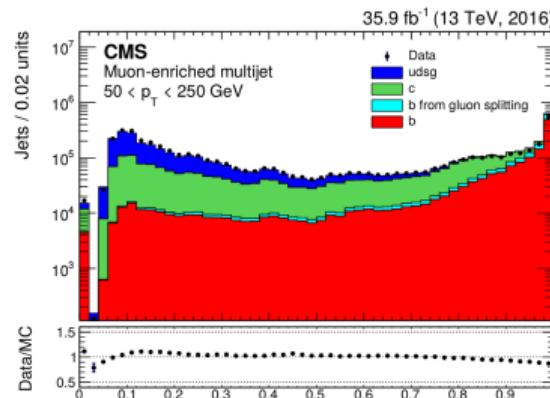
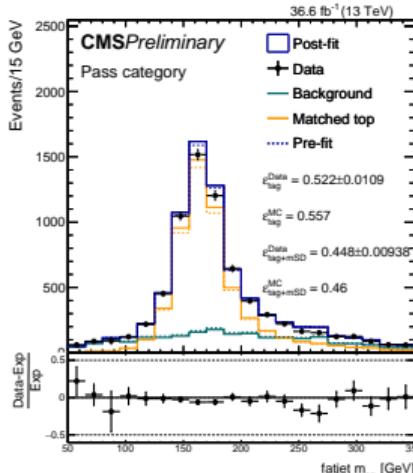


- ▶  $p_T^{\text{miss}} > 250 \text{ GeV}$  (trigger)
- ▶ CA15 jet,  $p_T > 250 \text{ GeV}$
- ▶ Selected by BDT

# Selecting mono-top events

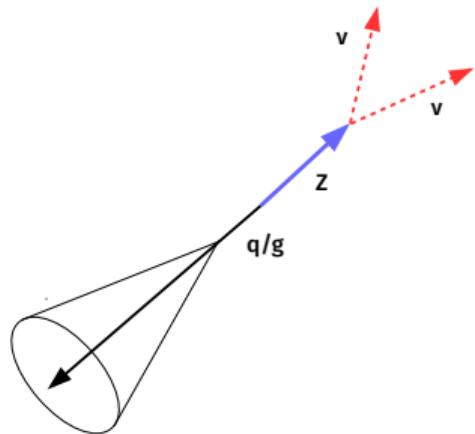


- $p_T^{\text{miss}} > 250 \text{ GeV}$  (trigger)
- CA15 jet,  $p_T > 250 \text{ GeV}$
- Selected by BDT
- Mass consistent with  $m_t$
- Signature of  $B$  meson decay inside jet
- Lab frame  $c\tau \sim \mathcal{O}(\text{mm})$



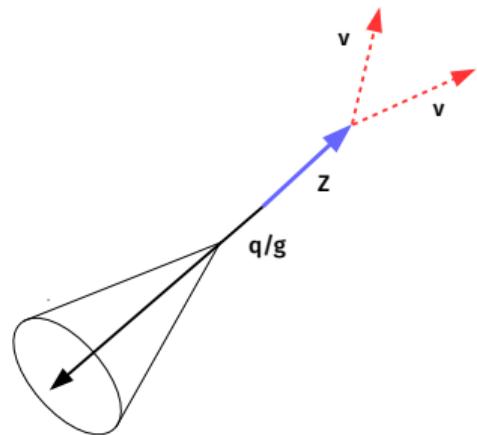
# SM backgrounds

$Z \rightarrow \nu\nu$  (30%)

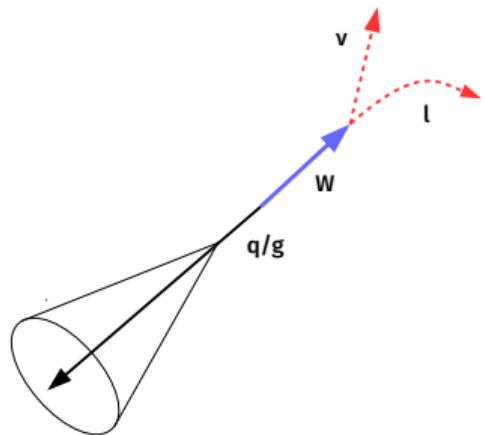


# SM backgrounds

$Z \rightarrow \nu\nu$  (30%)

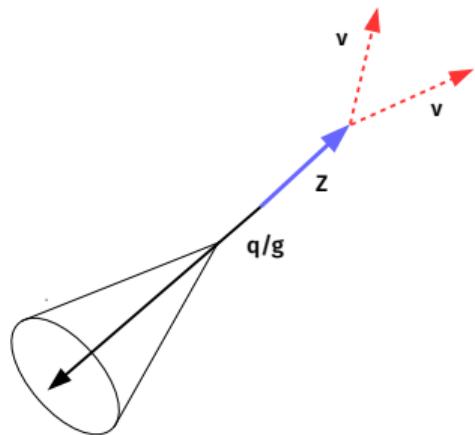


$W \rightarrow (\ell)\nu$  (15%)

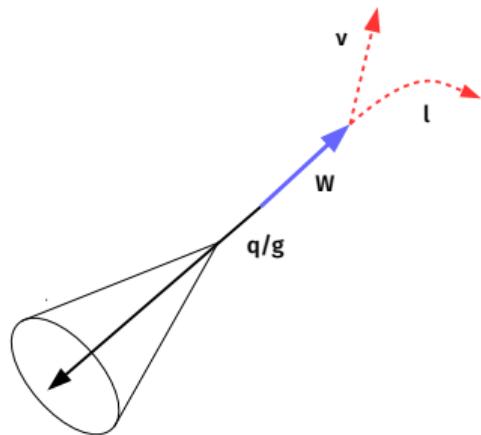


# SM backgrounds

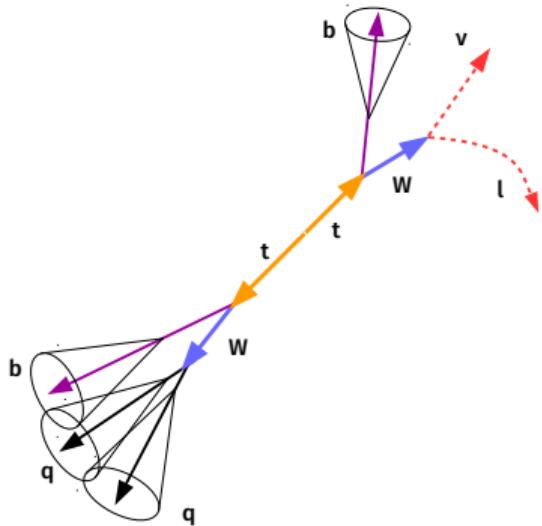
$Z \rightarrow \nu\nu$  (30%)



$W \rightarrow (\ell)\nu$  (15%)

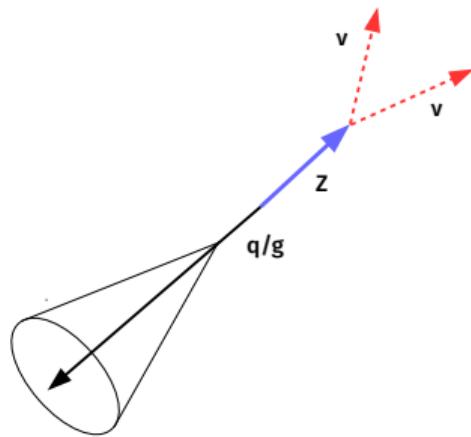


$t$  quark pair (50%)

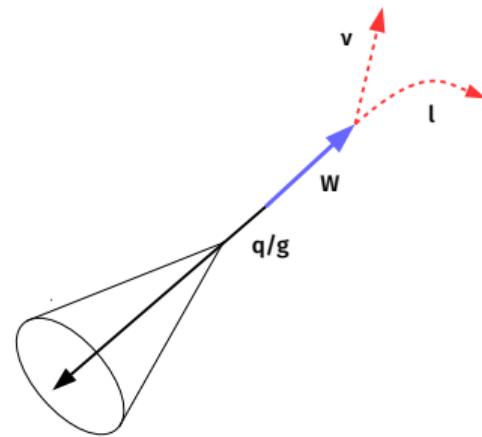


# SM backgrounds

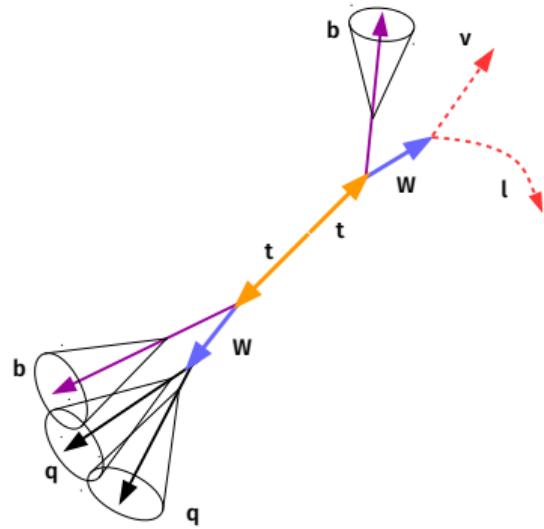
$Z \rightarrow \nu\nu$  (30%)



$W \rightarrow (\ell)\nu$  (15%)



$t$  quark pair (50%)



Note that  $p_T^{\text{miss}}$  is the transverse momentum of the **vector boson**

# References

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- [2] arXiv:astro-ph/9909252
- [3] [hubblesite.org/image/1276/news\\_release/2003-01](http://hubblesite.org/image/1276/news_release/2003-01)
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let-there-be-light-upon-dark-digging-deeper-dark-matter-lux](https://kipac.stanford.edu/highlights/let-there-be-light-upon-dark-digging-deeper-dark-matter-lux)
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- [8] <https://cms-docdb.cern.ch/cgi-bin/PublicDocDB>ShowDocument?docid=4172>
- [9] arXiv:1609.07473
- [6] [physik.uzh.ch/en/researcharea/lhcb/outreach/StandardModel.html](https://physik.uzh.ch/en/researcharea/lhcb/outreach/StandardModel.html)
- [7] arXiv:hep-ph/0802.1189
- [8] arXiv:hep-ph/1609.07473

# BACKUP

# Compact Muon Solenoid

All particles in sum  $\Rightarrow$   
all subdetectors help measure  $p_T^{\text{miss}}$ !

- ▶ Solenoidal magnet
  - ▶ 3.8 T B field
- ▶ Silicon tracker
  - ▶ Charged particles'  $\vec{p}$
  - ▶ Track vertices
- ▶ Calorimeters
  - ▶ EM and hadronic
  - ▶ Good energy resolution
  - ▶ Large coverage
- ▶ Muon chambers
  - ▶ ID muons
  - ▶ Help measure  $\vec{p}$

