

# Studying Higgs Boson Self-Interactions at the ATLAS Experiment

Fermilab – Physics Forum

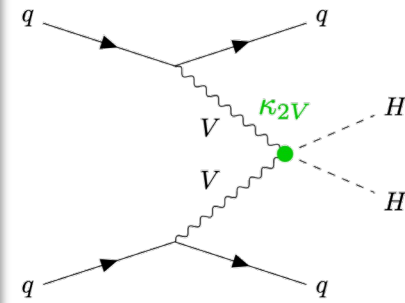
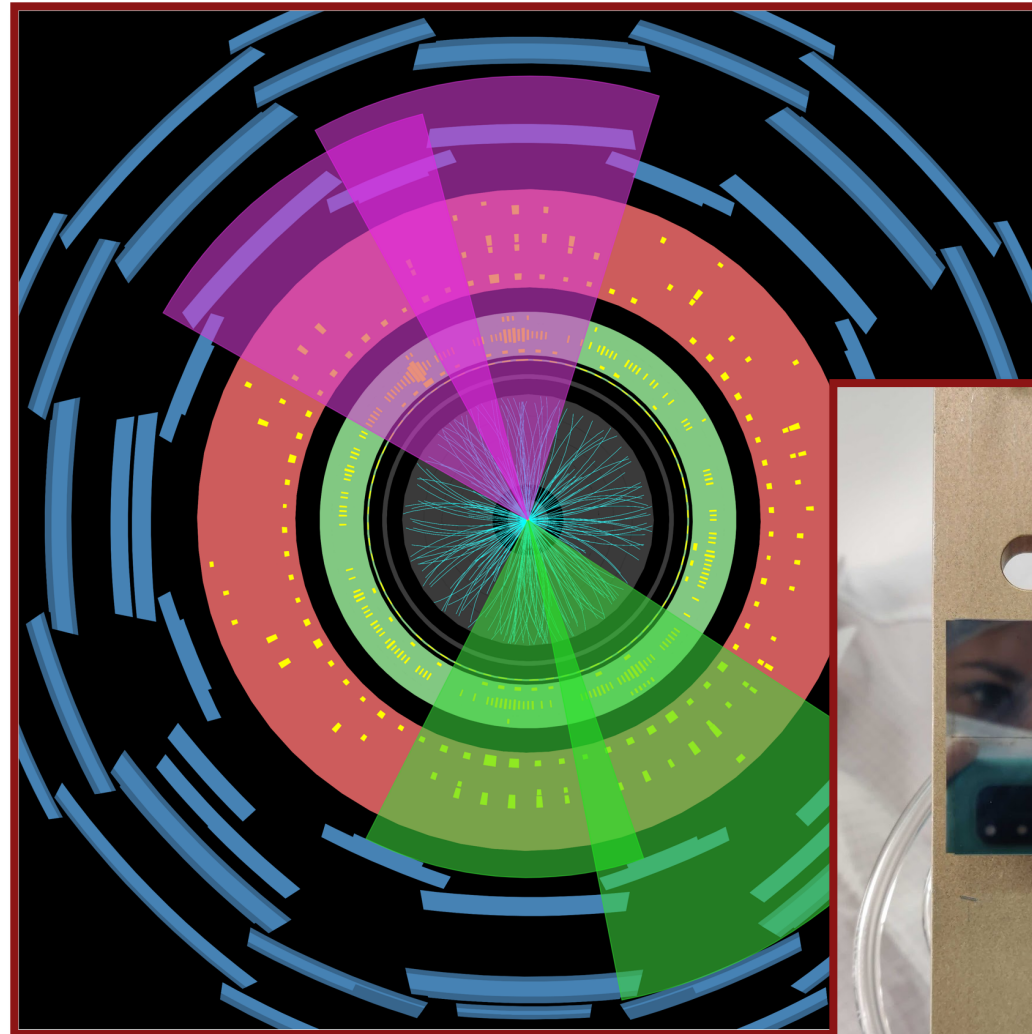
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Rachel Hyneman, Fundamental Physics Directorate - ATLAS

07 September 2023

# Outline

- Why do we care about Higgs Boson self-interactions?
- How do we measure Higgs Boson self-interactions?
- A measurement probing Higgs Boson self-interactions
- How does this result fit into the broader ATLAS Higgs Boson Self-Interactions Program?



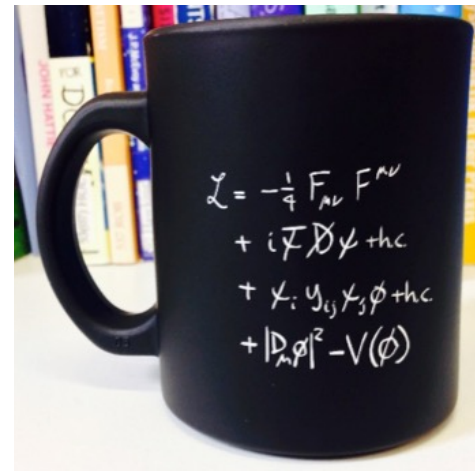
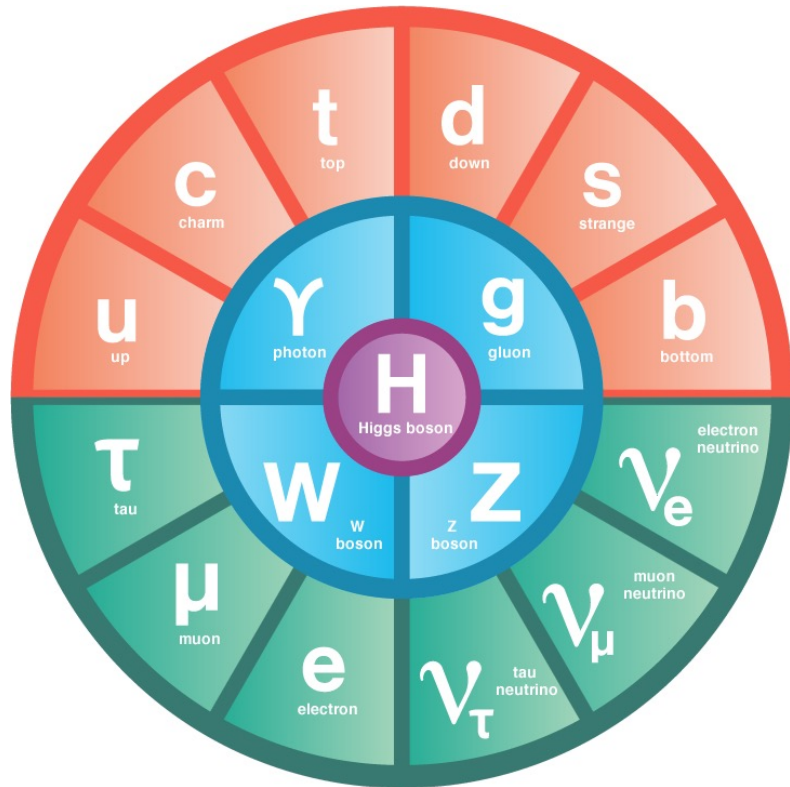
# Why do we care about Higgs Boson self-interactions?

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## Introduction

# The Standard Model of Particle Physics

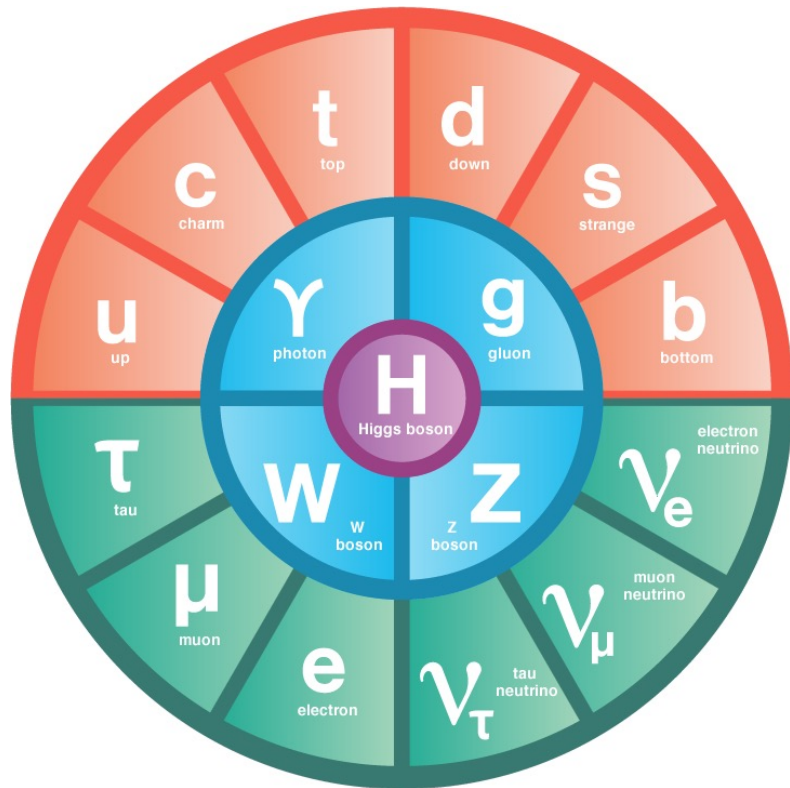
A theory of fundamental particles and how they interact



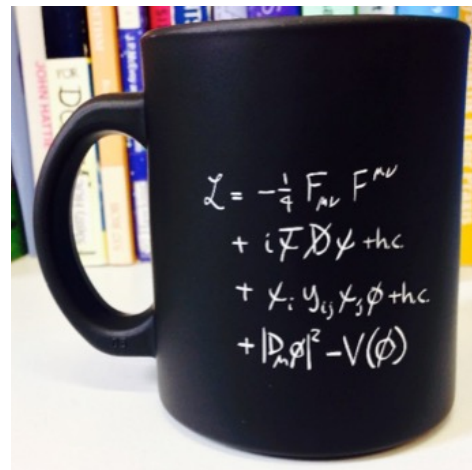
Symmetry Magazine

# The Standard Model of Particle Physics

A theory of fundamental particles and how they interact

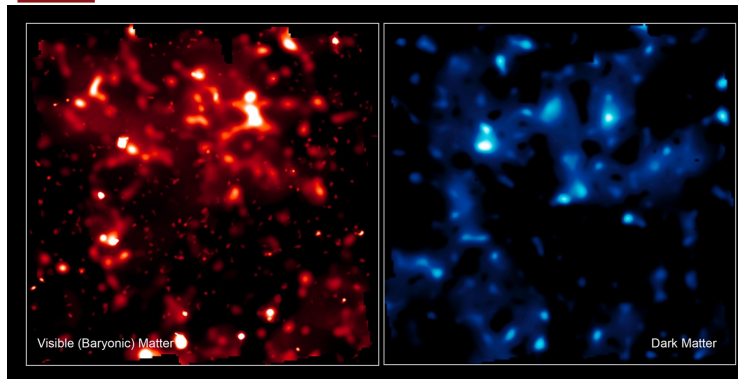


Symmetry Magazine

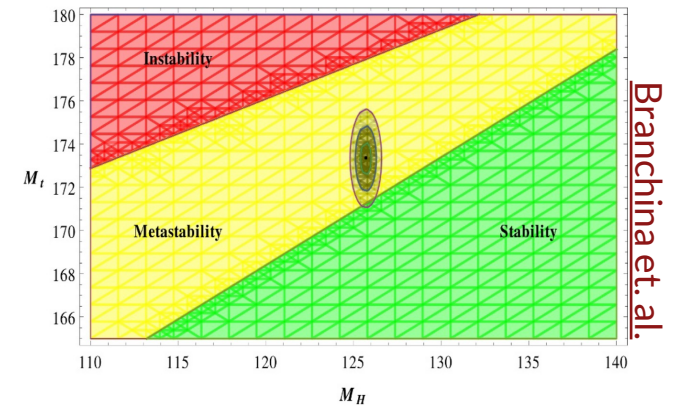


**Why is there more Matter than Anti-Matter?**

## ESA What is Dark Matter?



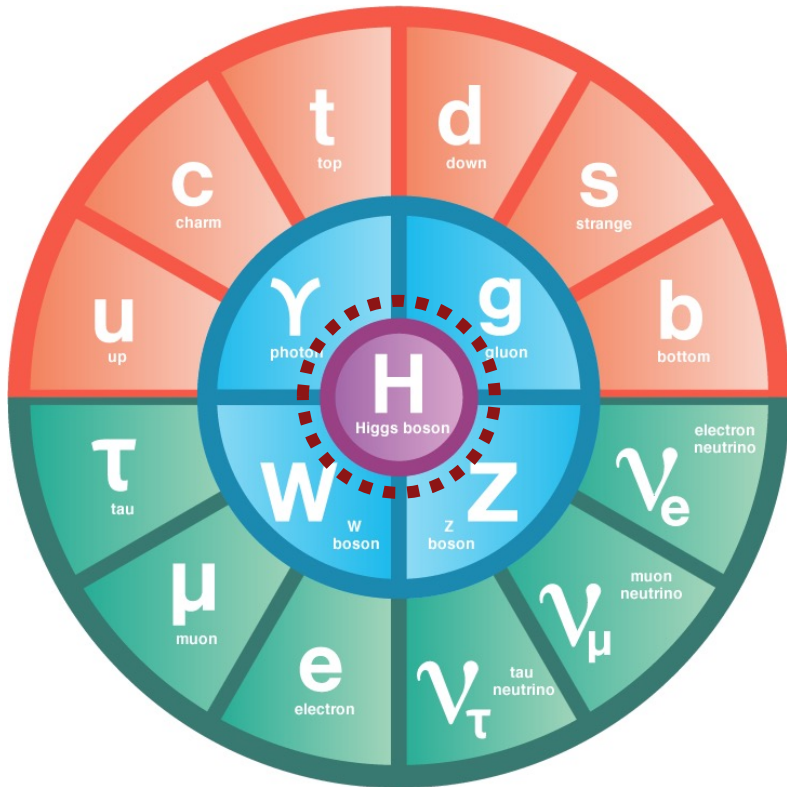
**Is our universe stable?**



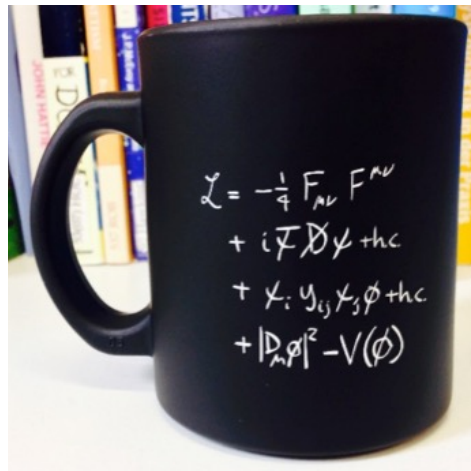
Branchina et. al.

# The Standard Model of Particle Physics

A theory of fundamental particles and how they interact

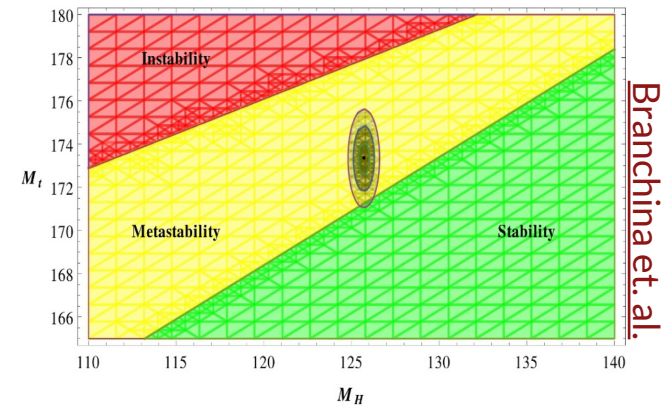


Symmetry Magazine



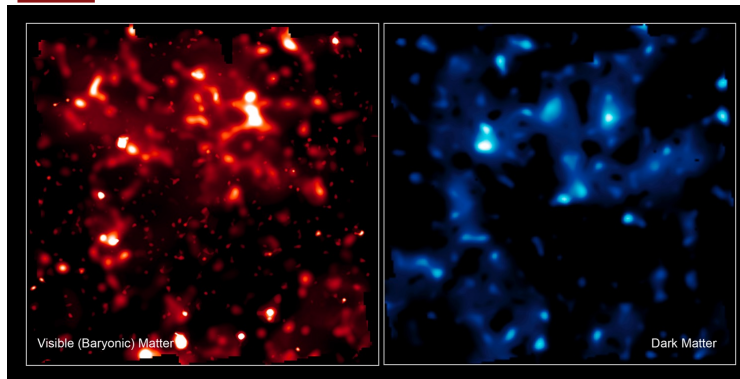
## Why is there more Matter than Anti-Matter?

## Is our universe stable?

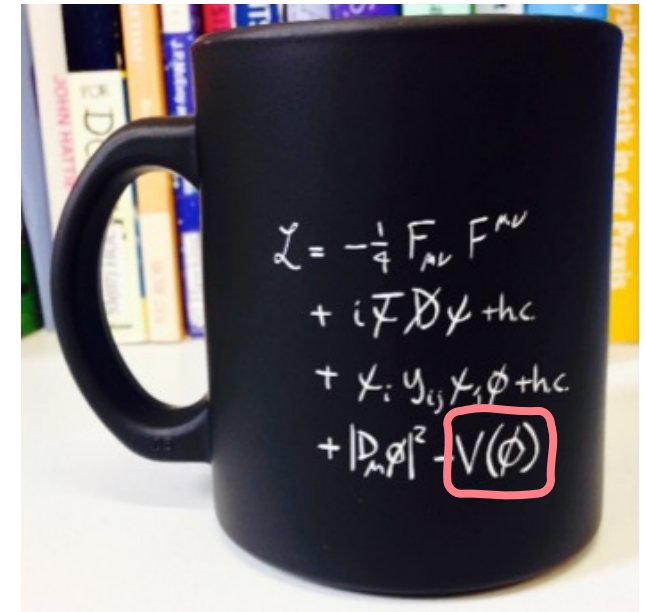
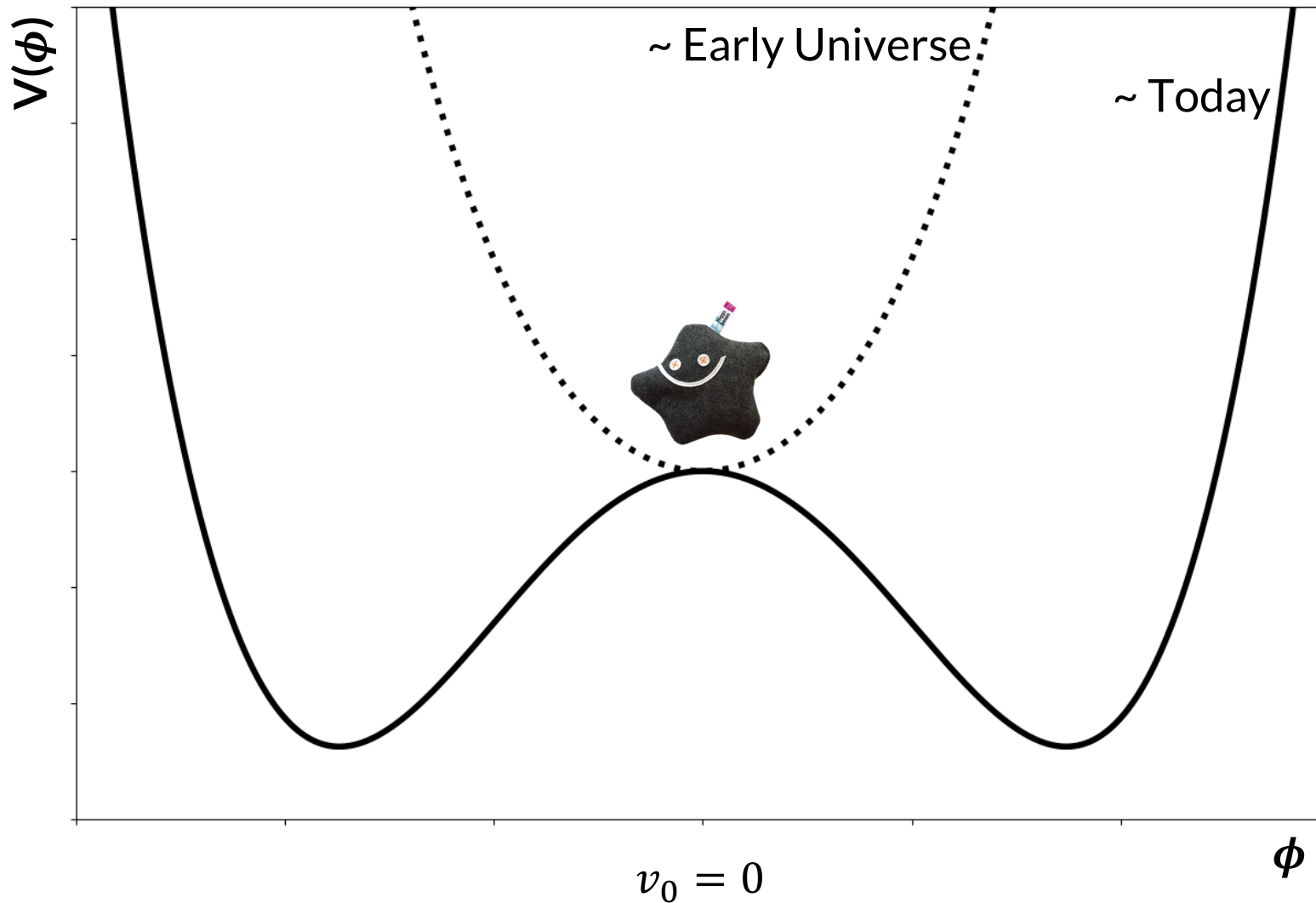


Branchina et. al.

## ESA What is Dark Matter?

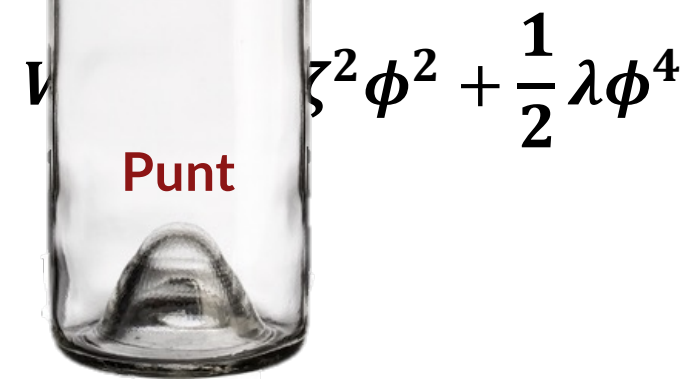
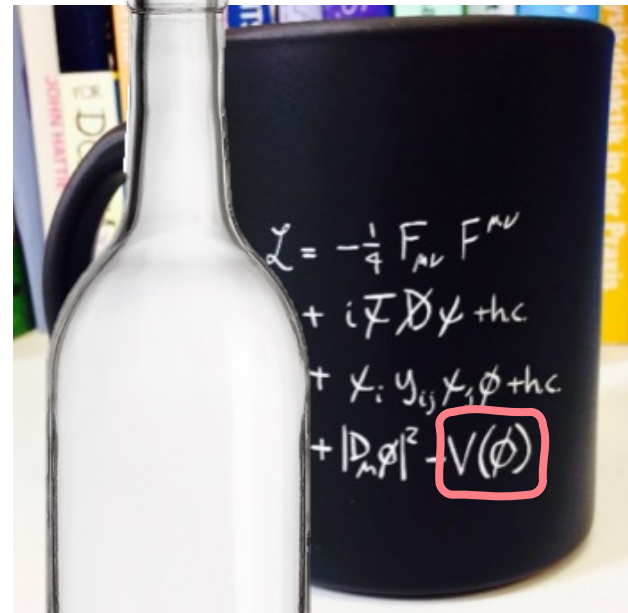
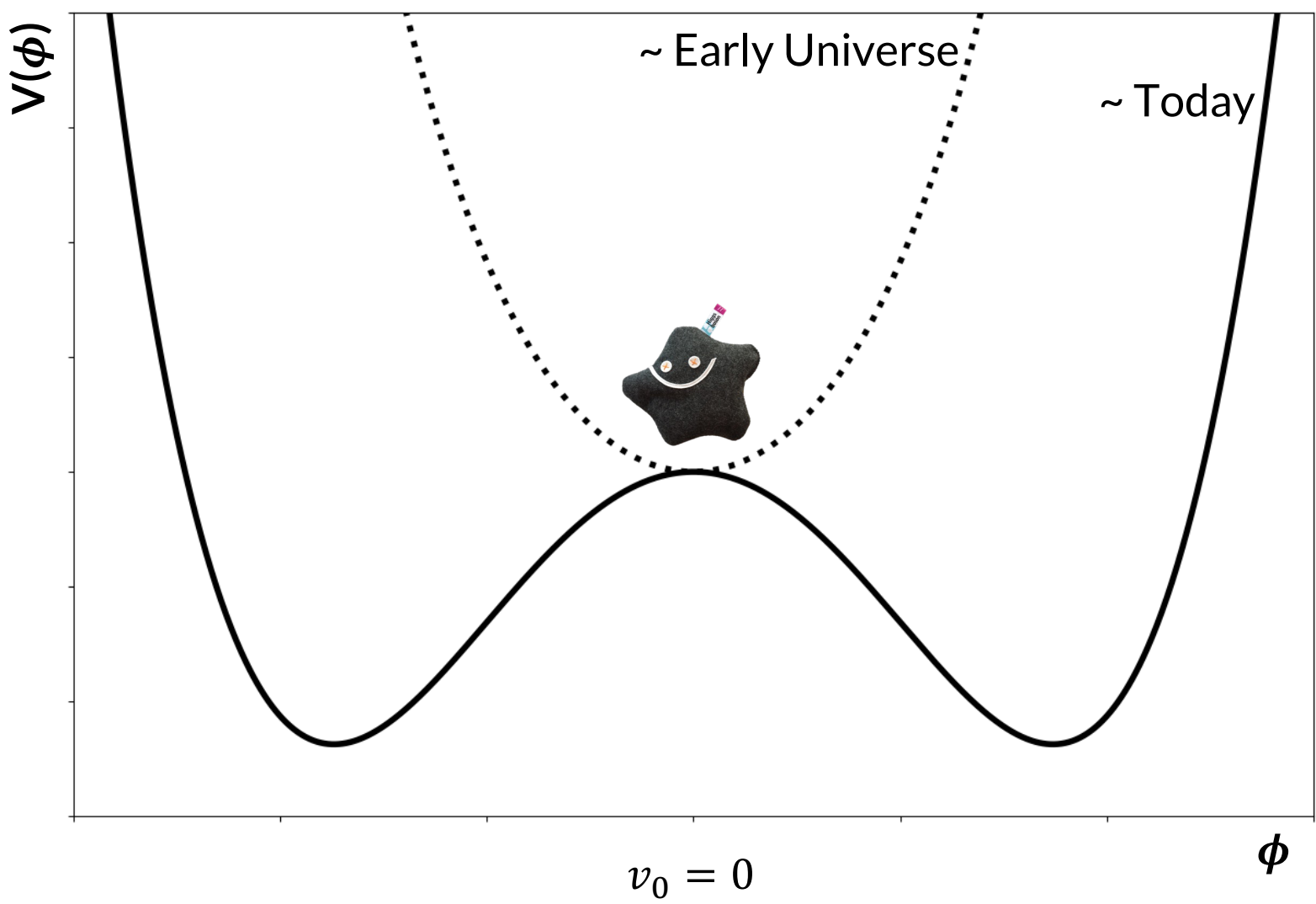


# The Higgs Boson and its Potential



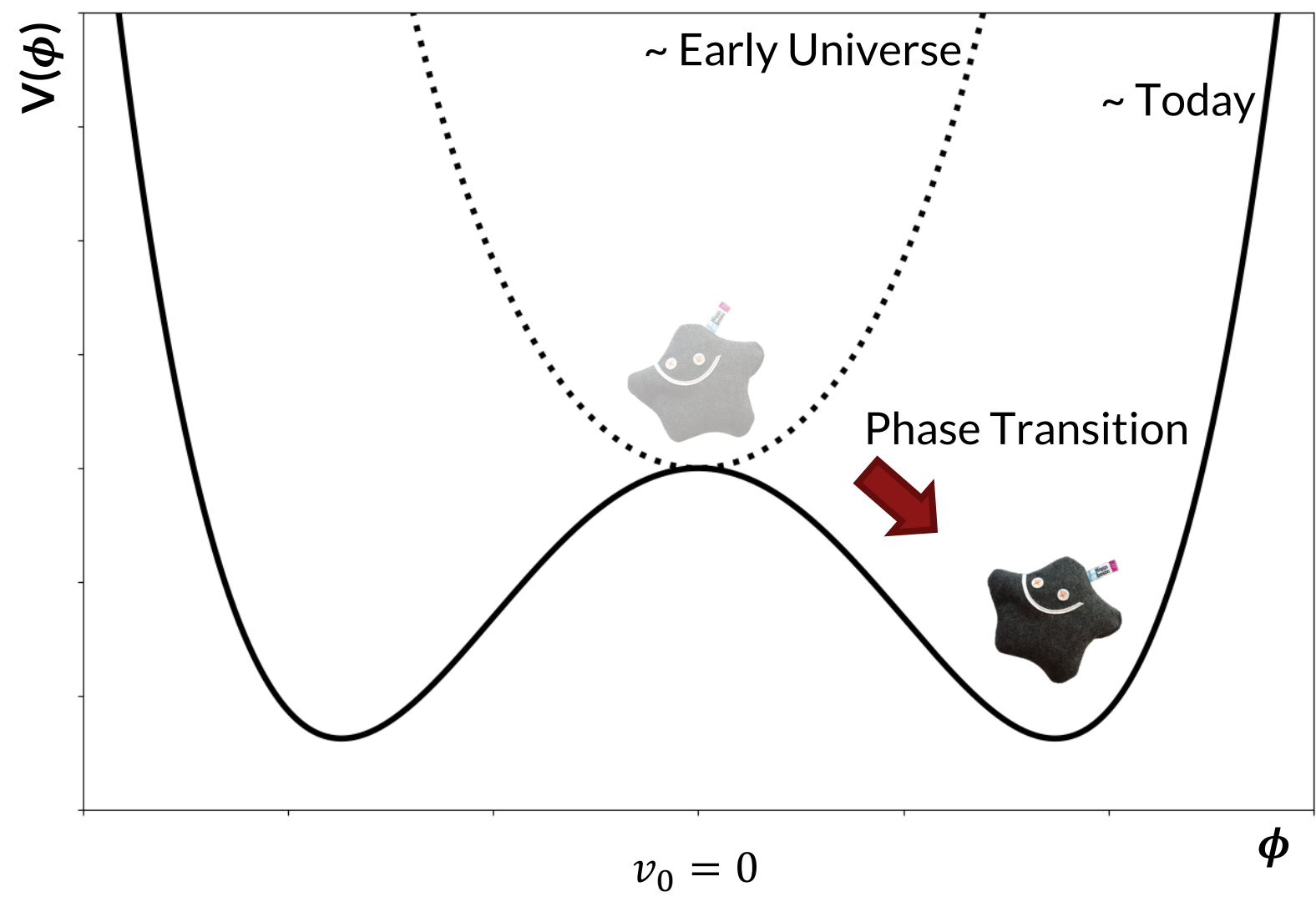
$$V(\phi) = \frac{1}{2} \zeta^2 \phi^2 + \frac{1}{2} \lambda \phi^4$$

# The Higgs Boson and its Potential





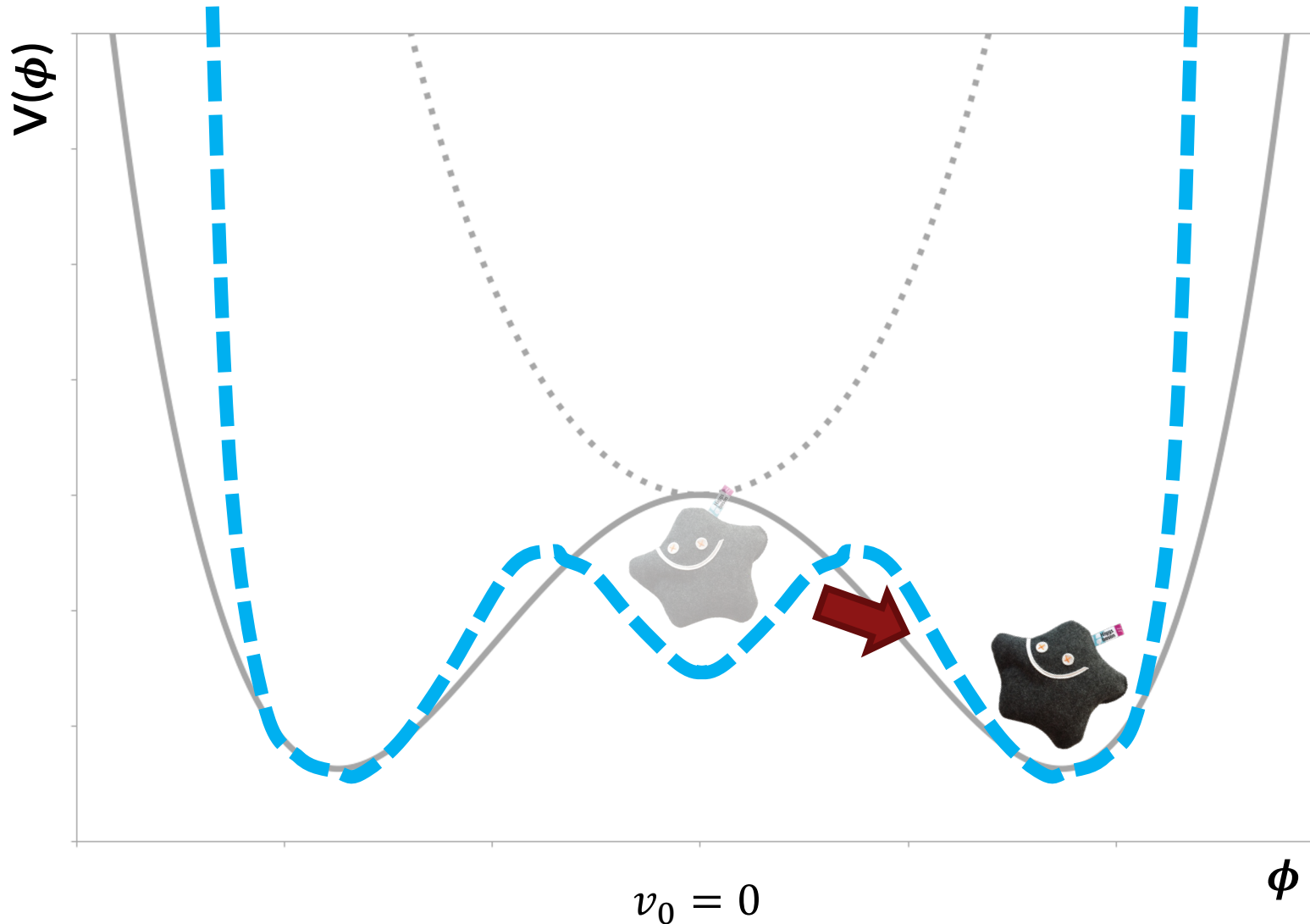
# The Higgs Boson and its Potential



$$V(h) \sim \lambda v h^3 + \frac{1}{4} \lambda h^4$$

What if the potential looks a little different?

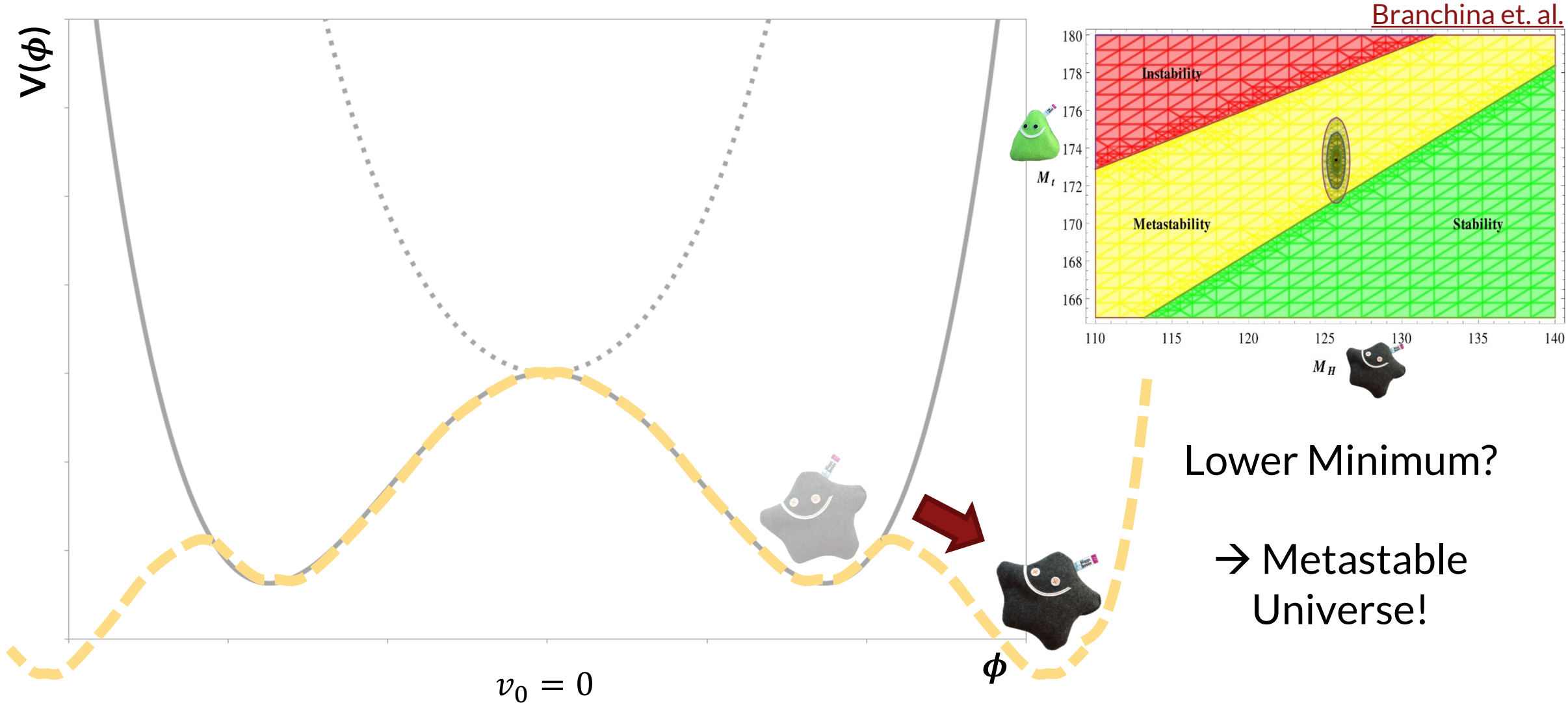
# New Physics and the Higgs Potential



“Second Order” phase transition in early universe

→ required for “Electroweak Baryogenesis”  
(= Electroweak Phase Transition as the source of Matter-Antimatter Asymmetry)

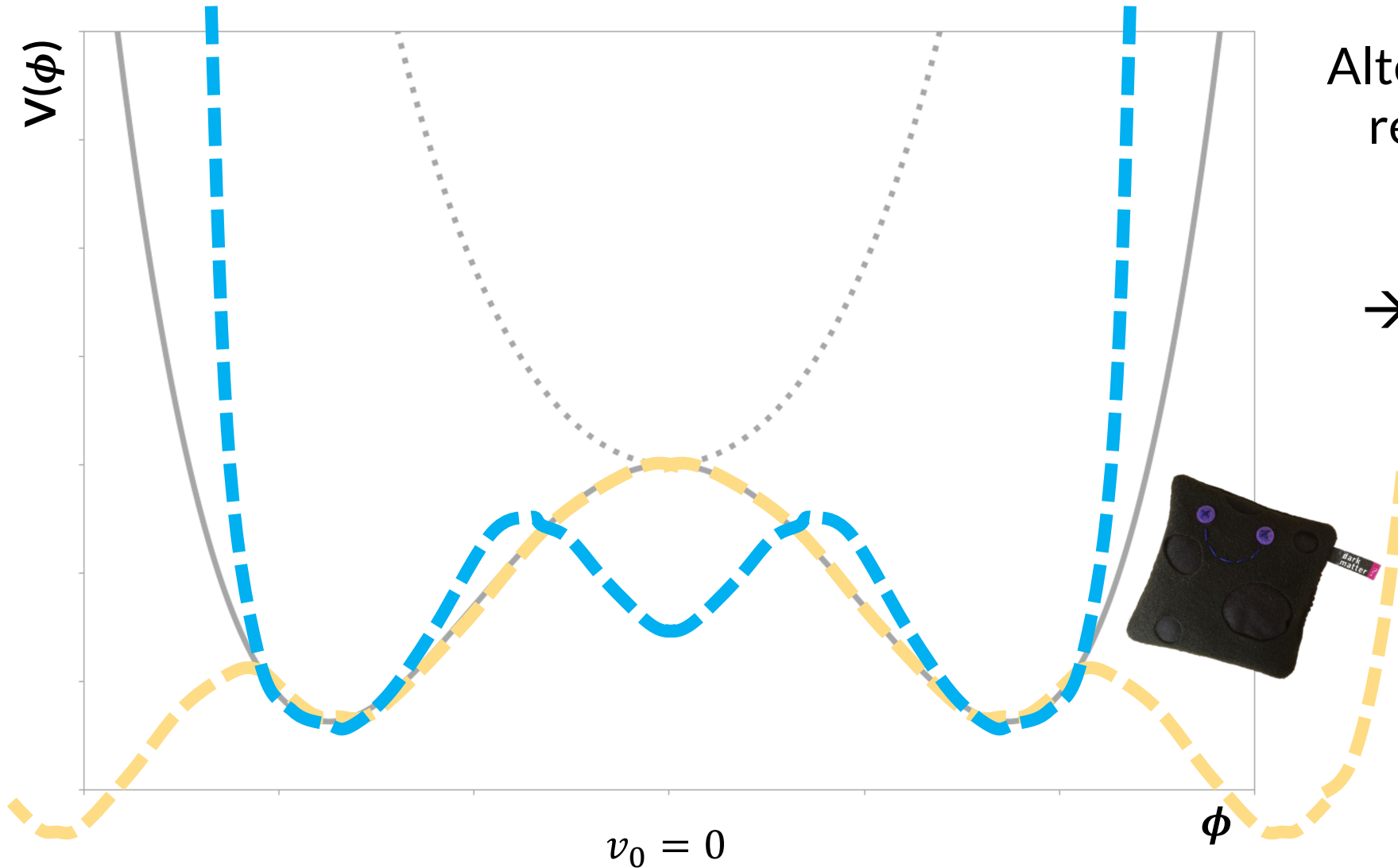
# New Physics and the Higgs Potential



Lower Minimum?

→ Metastable Universe!

# New Physics and the Higgs Potential

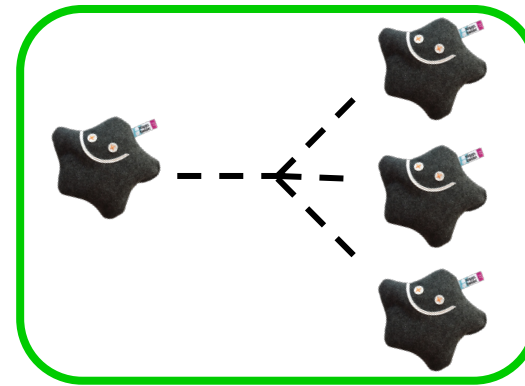
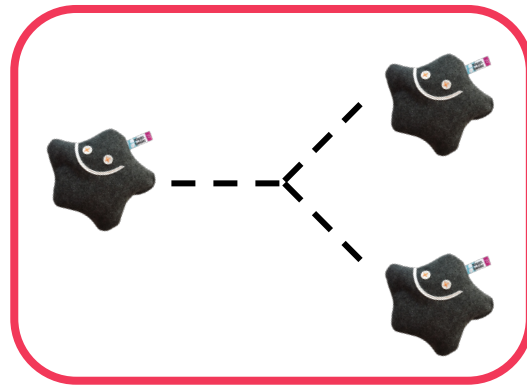


Alternative potentials require new Higgs interactions

→ from a new dark sector particle?

# How Do We Measure the Higgs Potential?

$$V(h) \sim \lambda v h^3 + \frac{1}{4} \lambda h^4$$

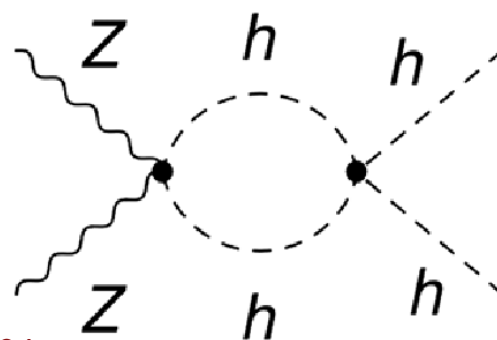
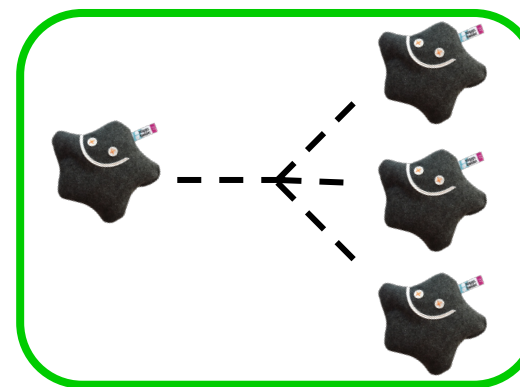
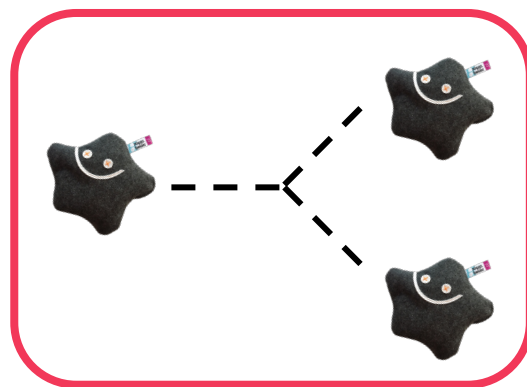


# How Do We Measure the Higgs Potential?

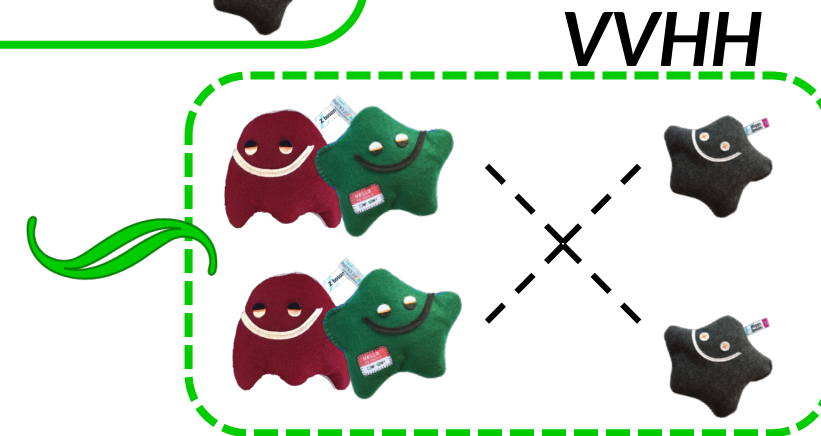
$$V(h) \sim \lambda v h^3 + \frac{1}{4} \lambda h^4$$

Can constrain coupling to within an order of magnitude... at 100 TeV Hadron Collider!

[PhysRevD.93.013007](https://arxiv.org/abs/1307.7688)



[PhysRevD.98.093004](https://arxiv.org/abs/1307.7688)

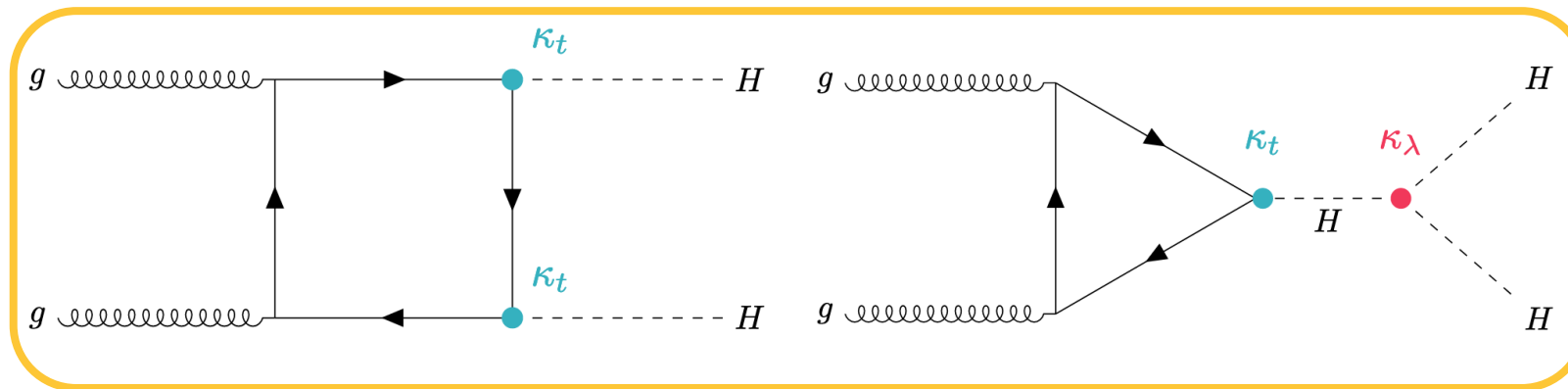


# How Can We Study the Higgs Potential at Colliders?

## Higgs boson pair production (HH)

### gluon-gluon-Fusion

$$\sigma_{ggF} \sim 31 \text{ fb}^{[1]}$$

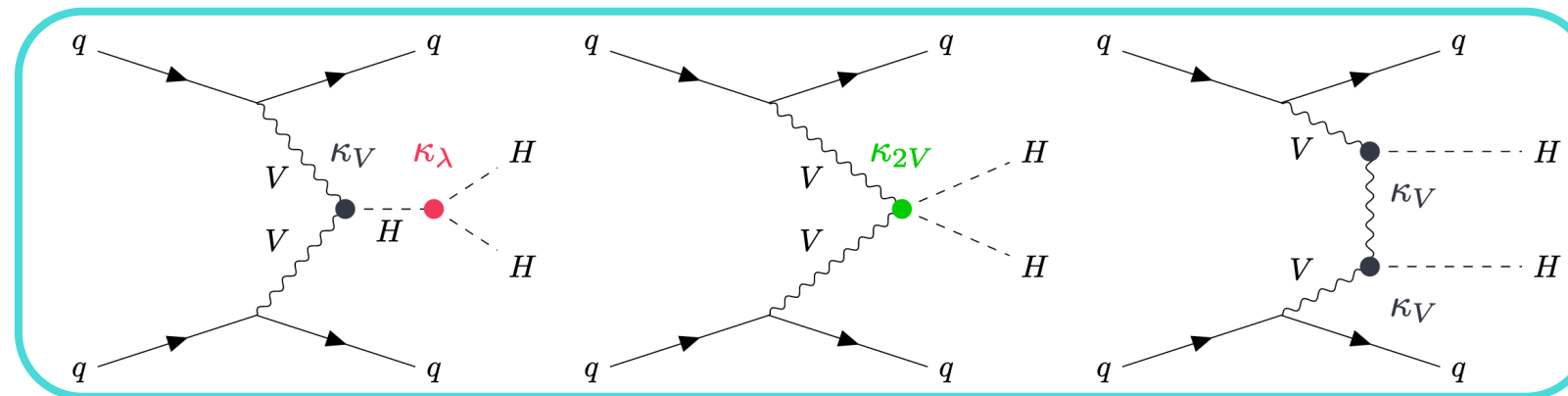


“Kappa framework”

$$\kappa_c = \frac{c}{c_{SM}}$$

### Vector Boson Fusion

$$\sigma_{VBF} \sim 1.7 \text{ fb}^{[2]}$$



[1] [arxiv:1803.02463](https://arxiv.org/abs/1803.02463)

[2] [arxiv:1811.07906](https://arxiv.org/abs/1811.07906)

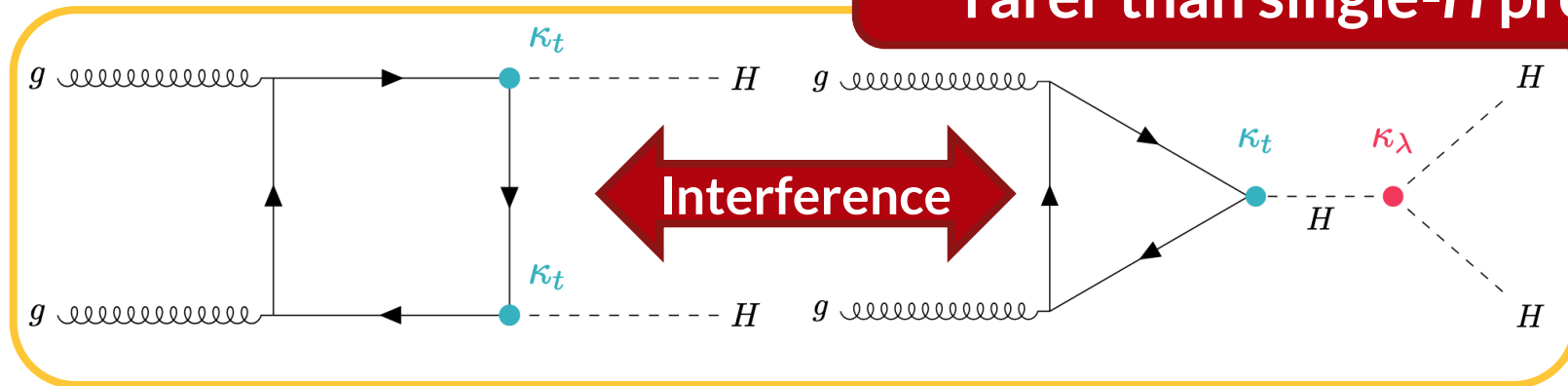
# How Can We Study the Higgs Potential at Colliders?

Higgs boson pair production ( $HH$ )

**$HH$  production is a factor of  $\sim 1000\times$  rarer than single- $H$  production!**

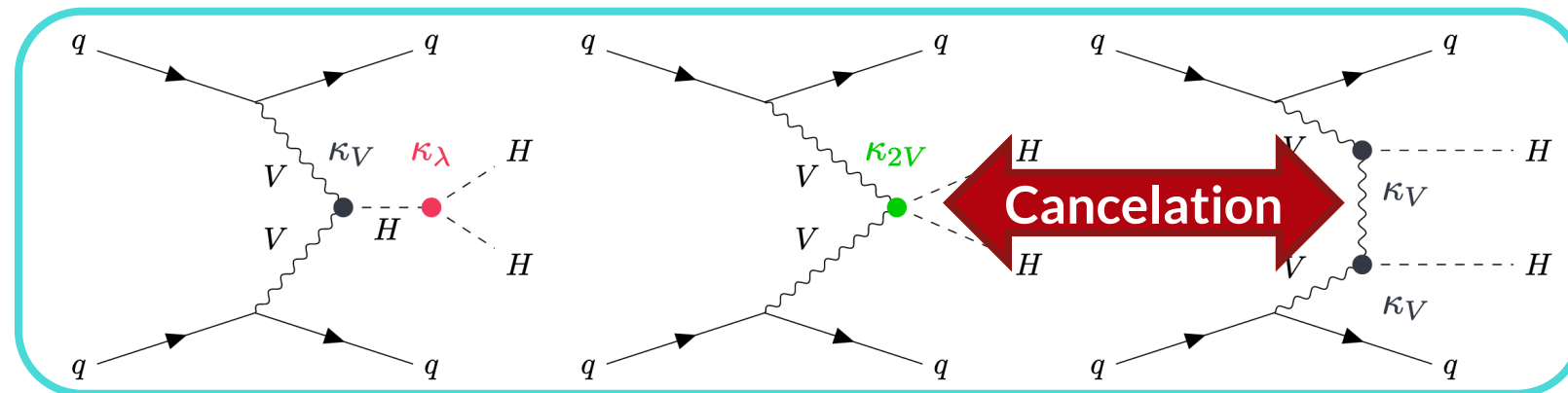
## gluon-gluon-Fusion

$\sigma_{ggF} \sim 31 \text{ fb}^{[1]}$



## Vector Boson Fusion

$\sigma_{VBF} \sim 1.7 \text{ fb}^{[2]}$



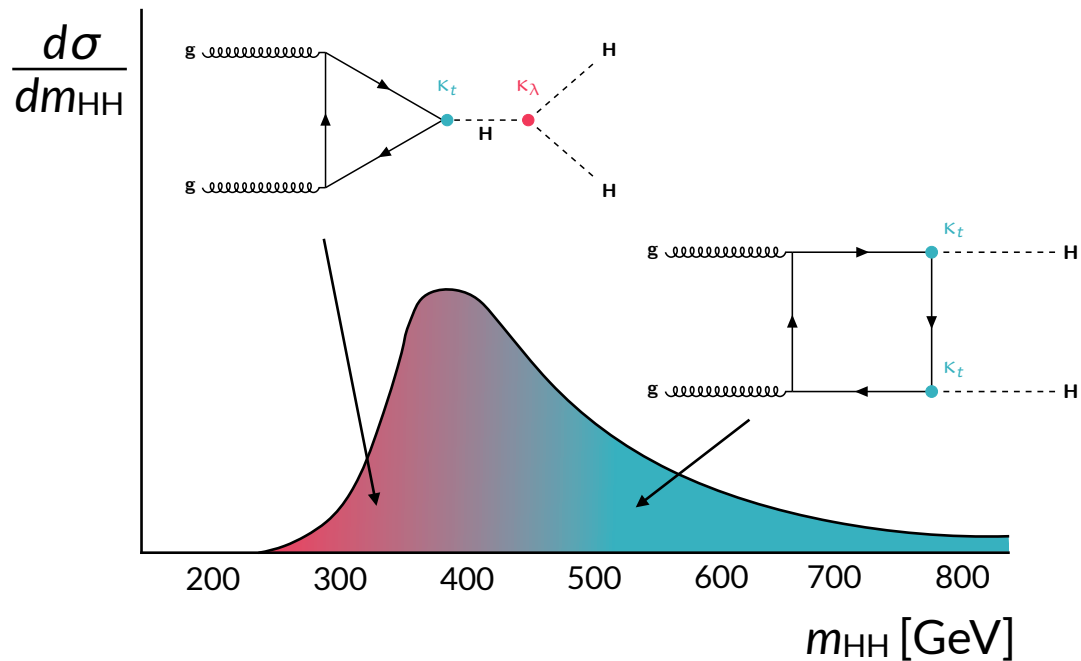
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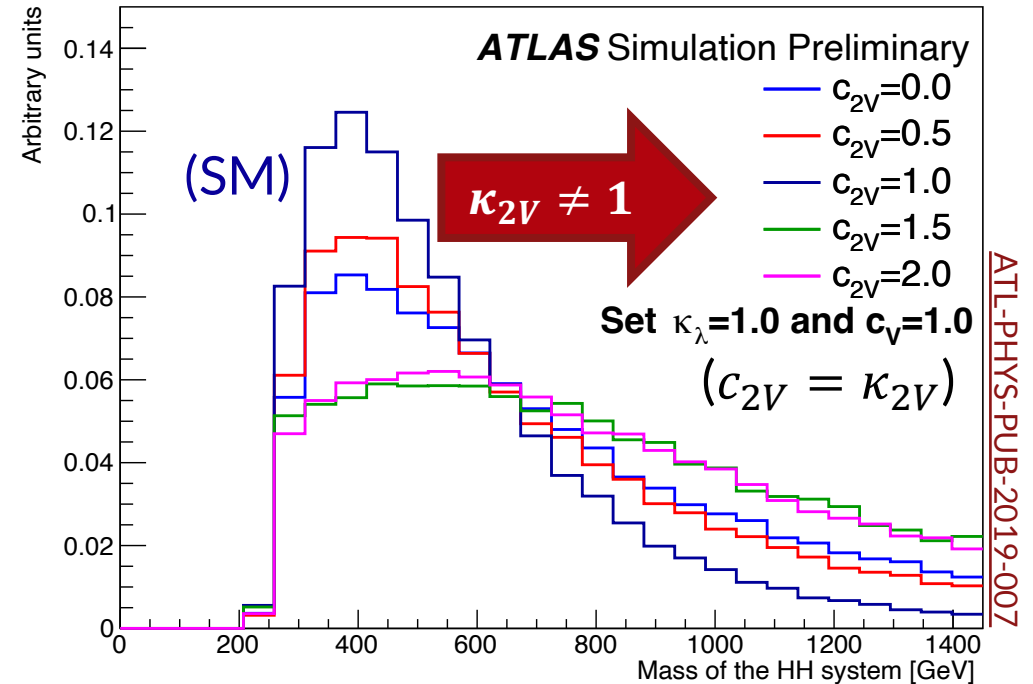


# Sensitivity to New Physics in the Self-Couplings

Contribution of ggF diagrams to di-Higgs invariant mass spectrum ( $\sim$ energy)



VBF Di-Higgs invariant mass spectrum ( $\sim$ energy) for various  $\kappa_{2V}$



ggF: disrupt interference  
 $\rightarrow$  more signal, *softer* events

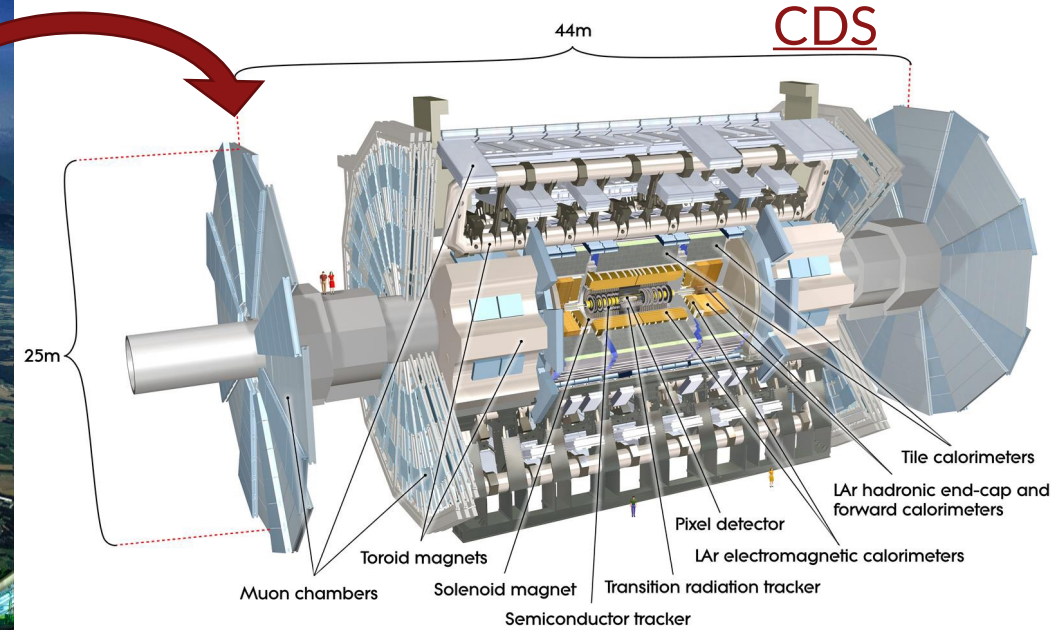
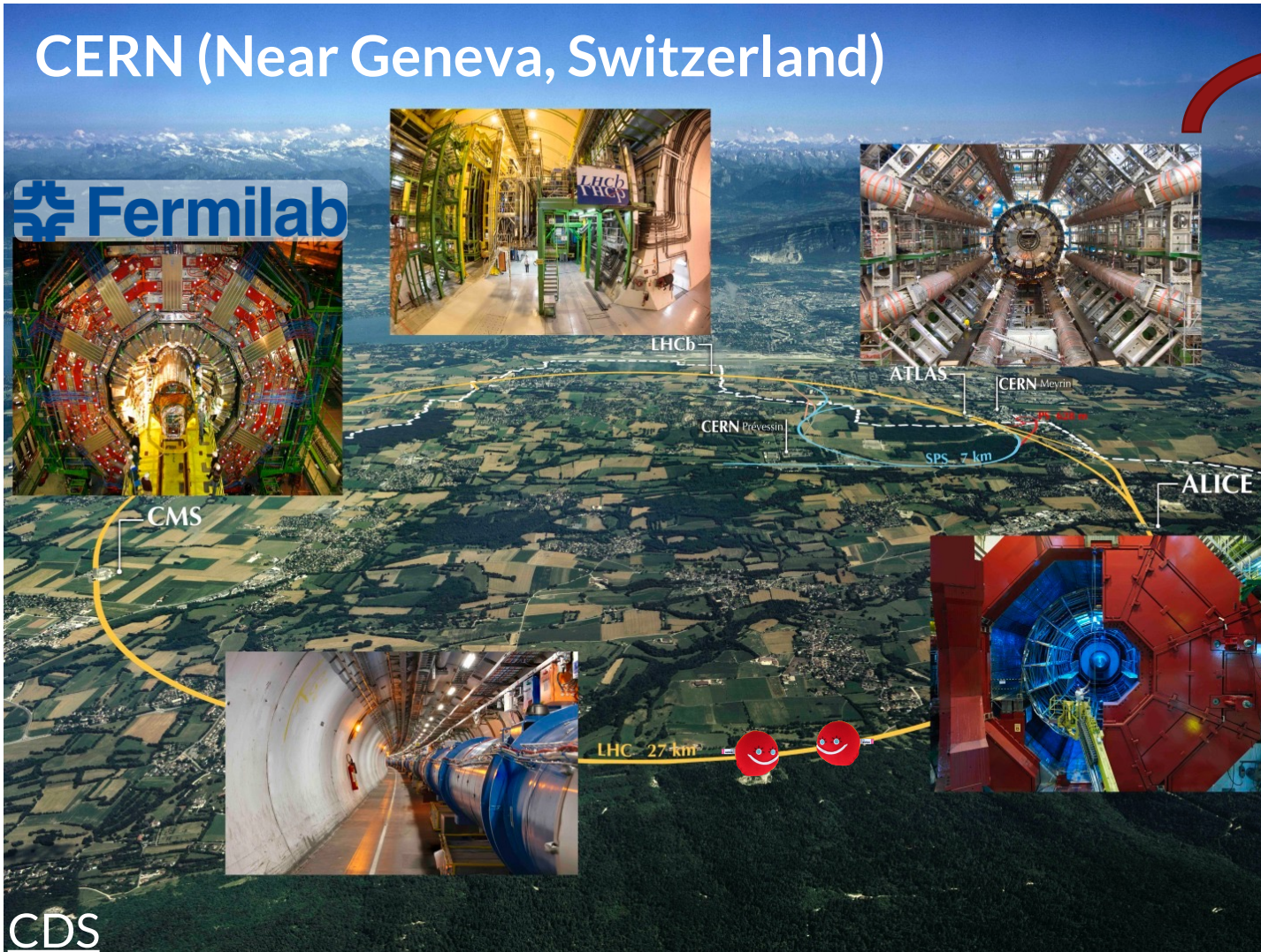
VBF: break cancellation  
 $\rightarrow$  more signal, *harder* events

# How do we measure Higgs Boson self-interactions?

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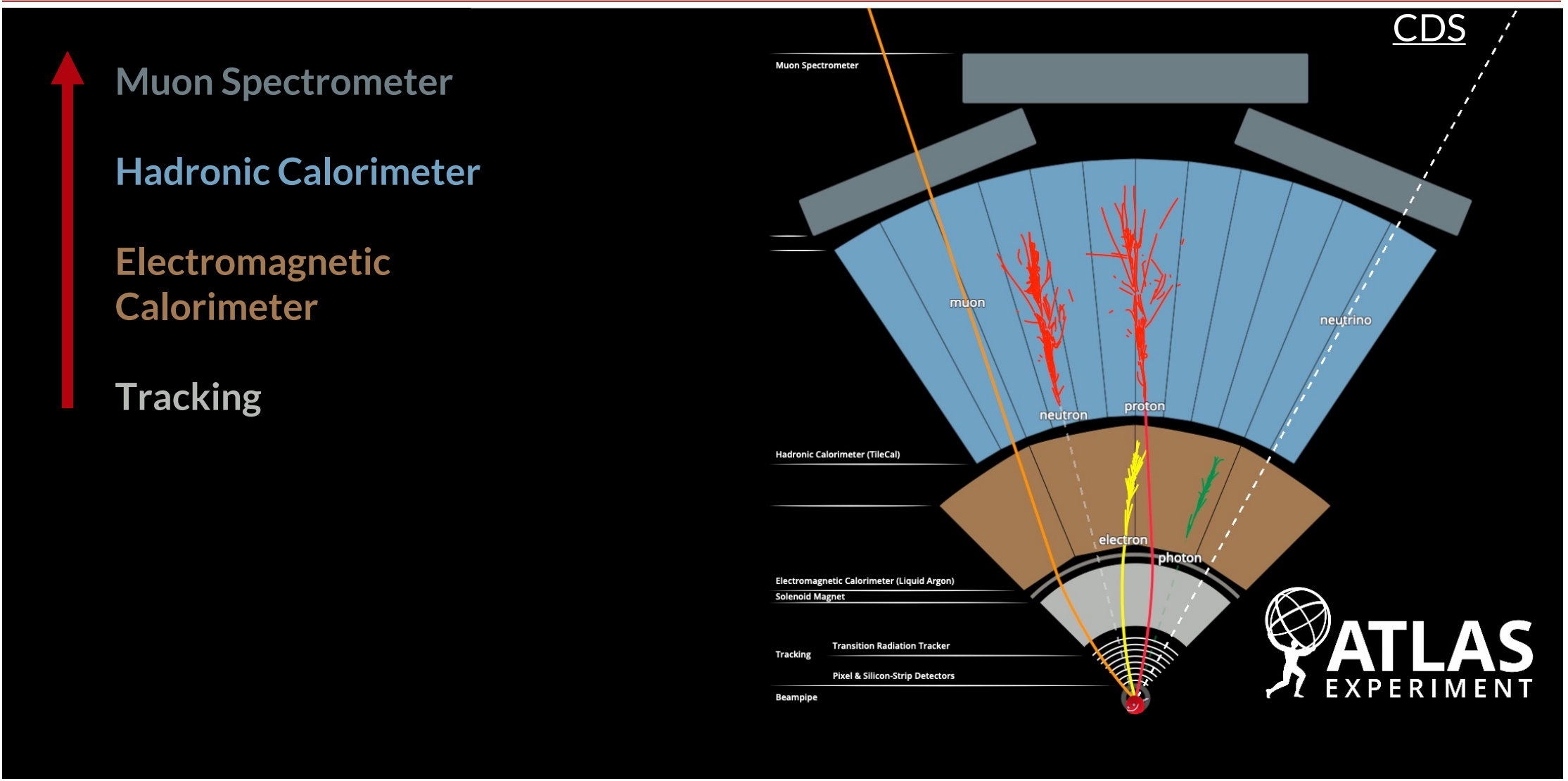
## The ATLAS Detector

# ATLAS and the Large Hadron Collider

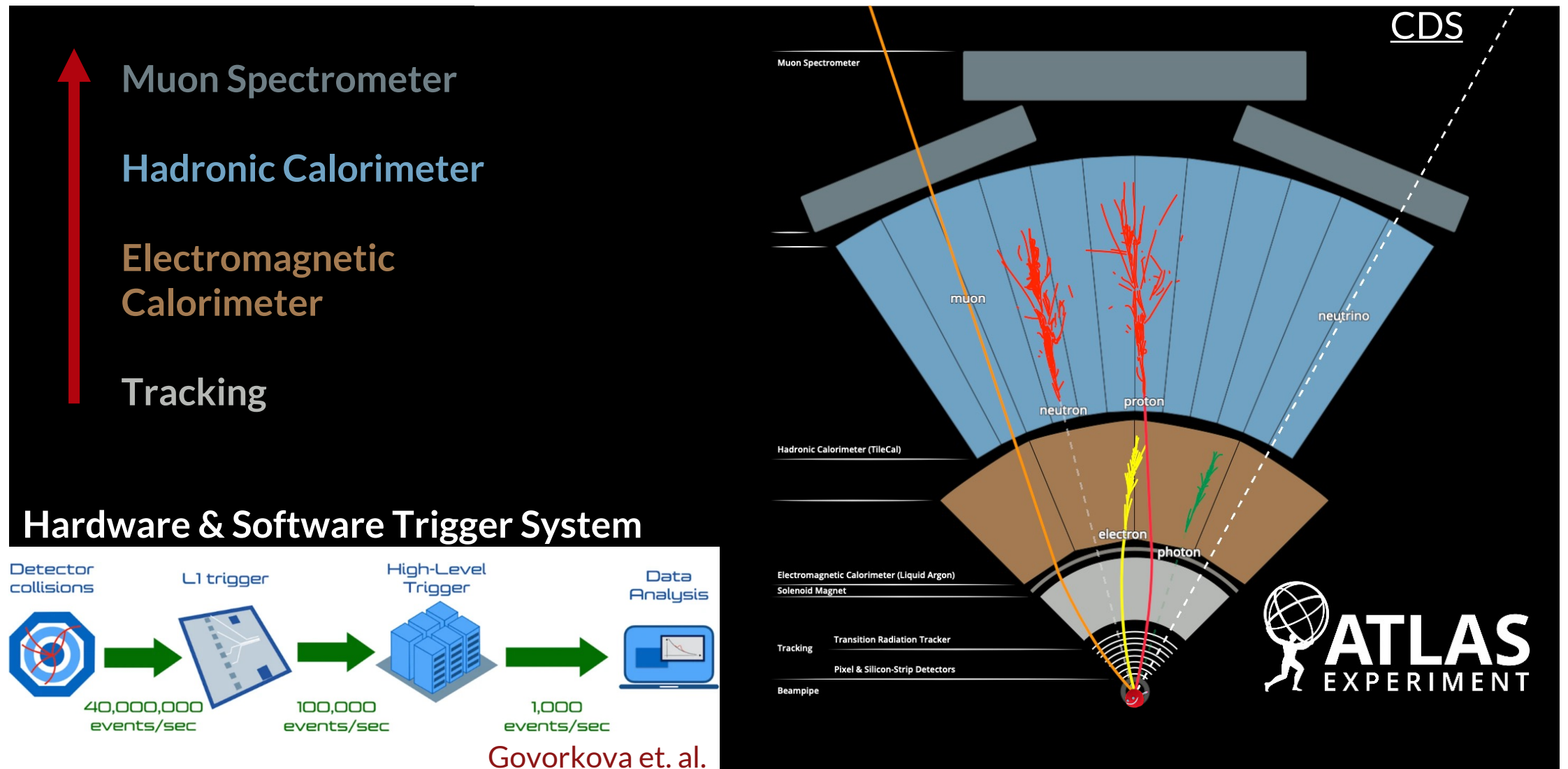


ATLAS  
 → General purpose detector  
 Today: Run 2 (2015-2018)

# The ATLAS Detector

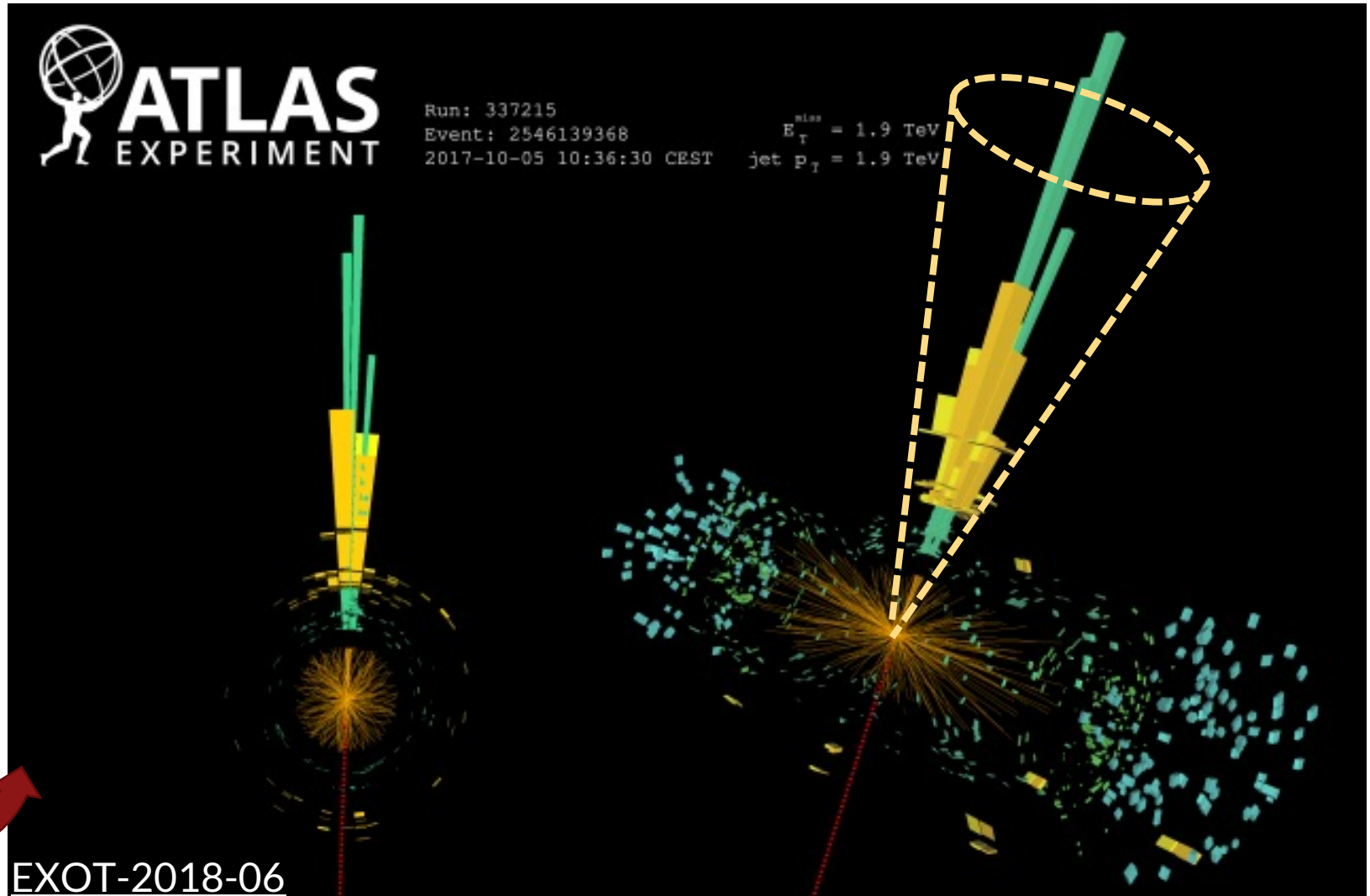
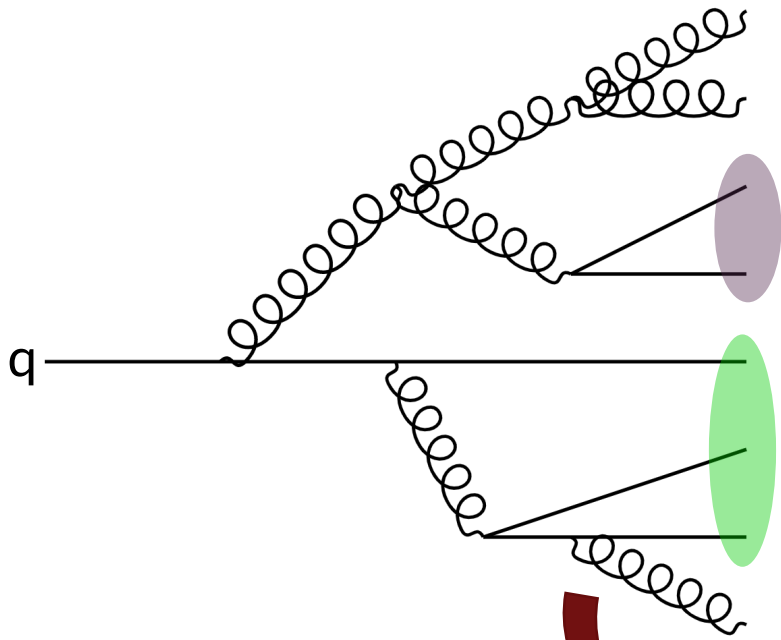


# The ATLAS Detector



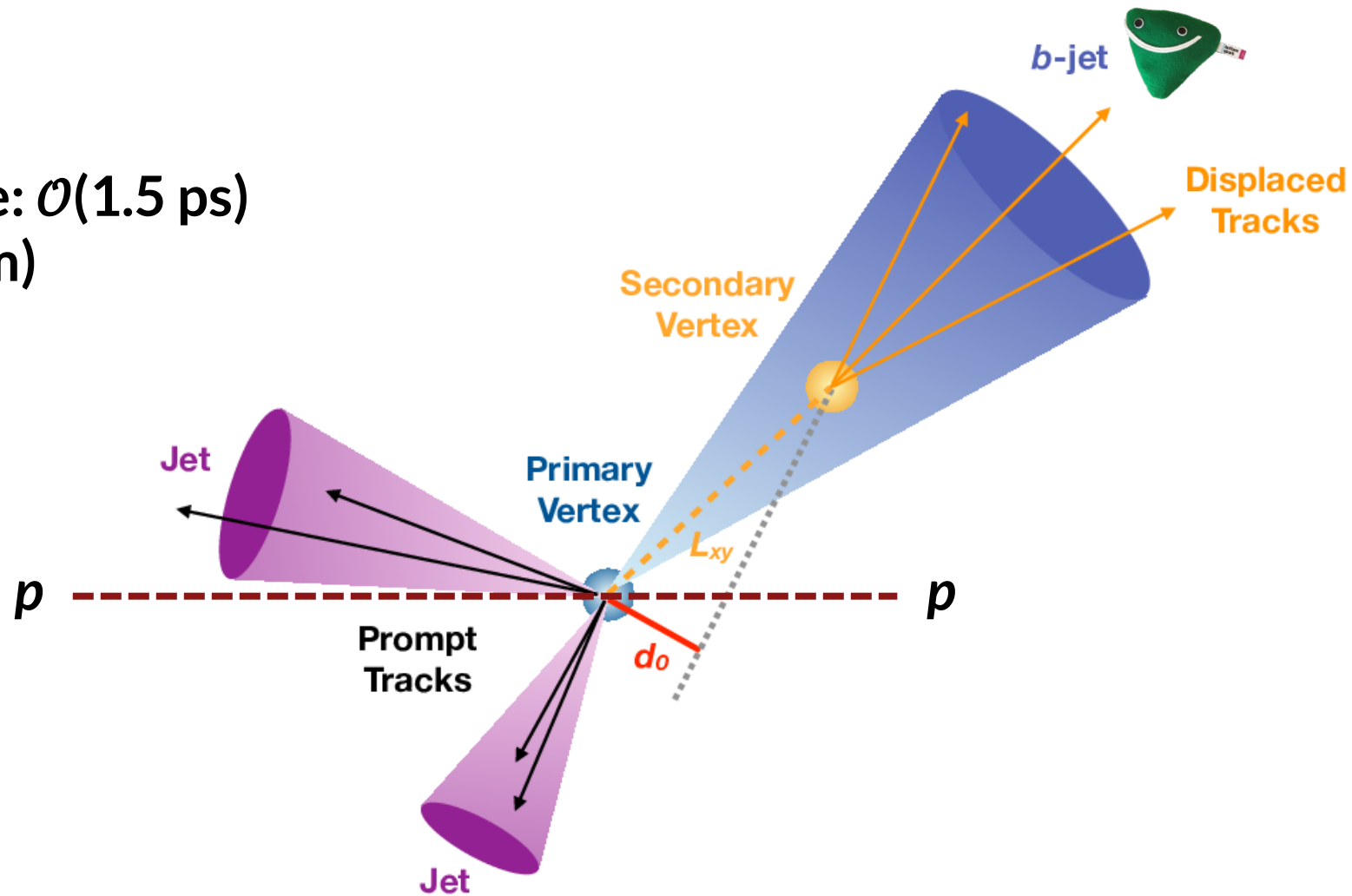
# What is a Jet?

No single quarks →  
Spray of high-energy  
particles



# Identifying jets from *b*-quarks

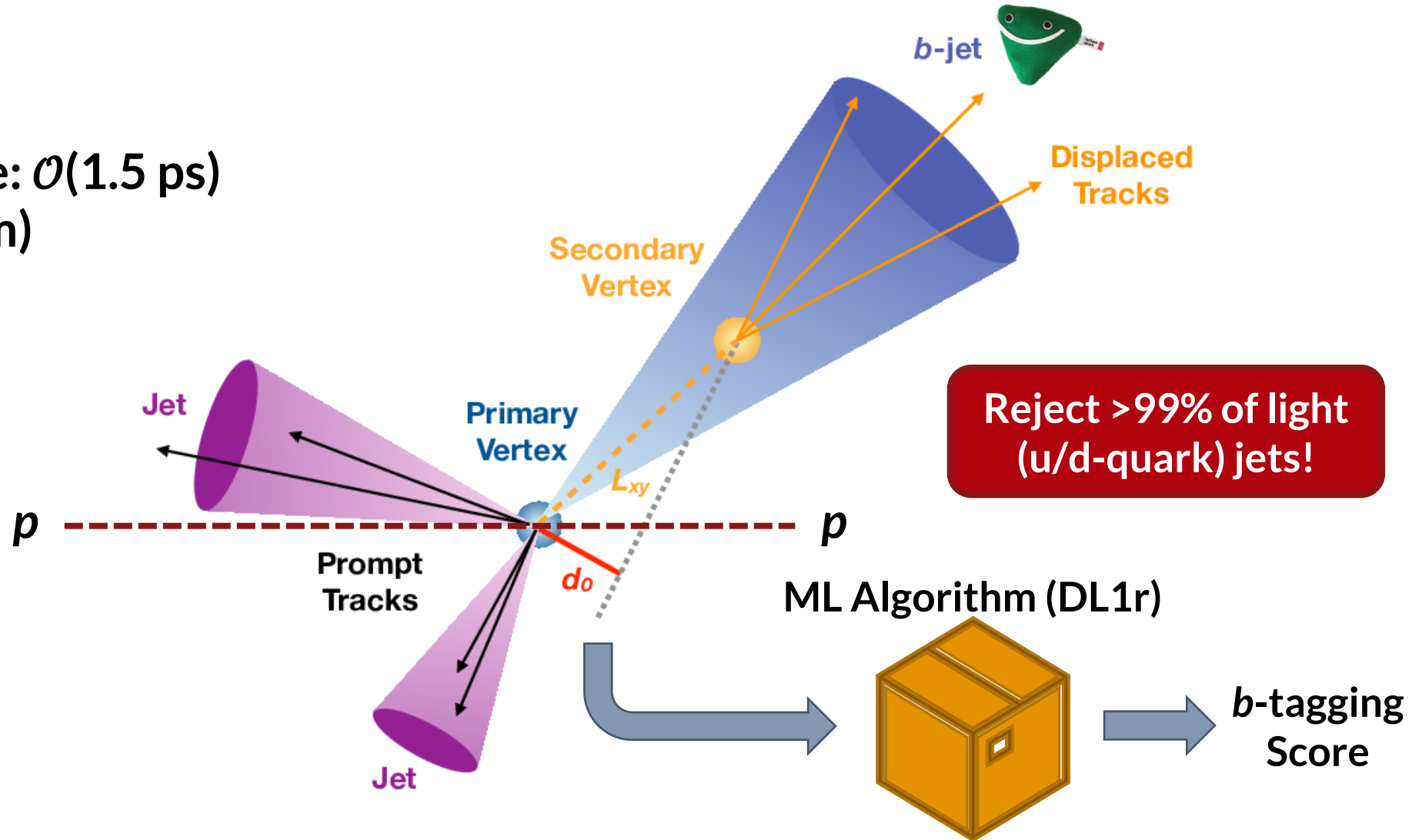
B-meson lifetime:  $\mathcal{O}(1.5 \text{ ps})$   
 $\rightarrow L: \mathcal{O}(\text{mm})$



TRIG-2018-08

# Identifying jets from *b*-quarks

B-meson lifetime:  $\mathcal{O}(1.5 \text{ ps})$   
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TRIG-2018-08



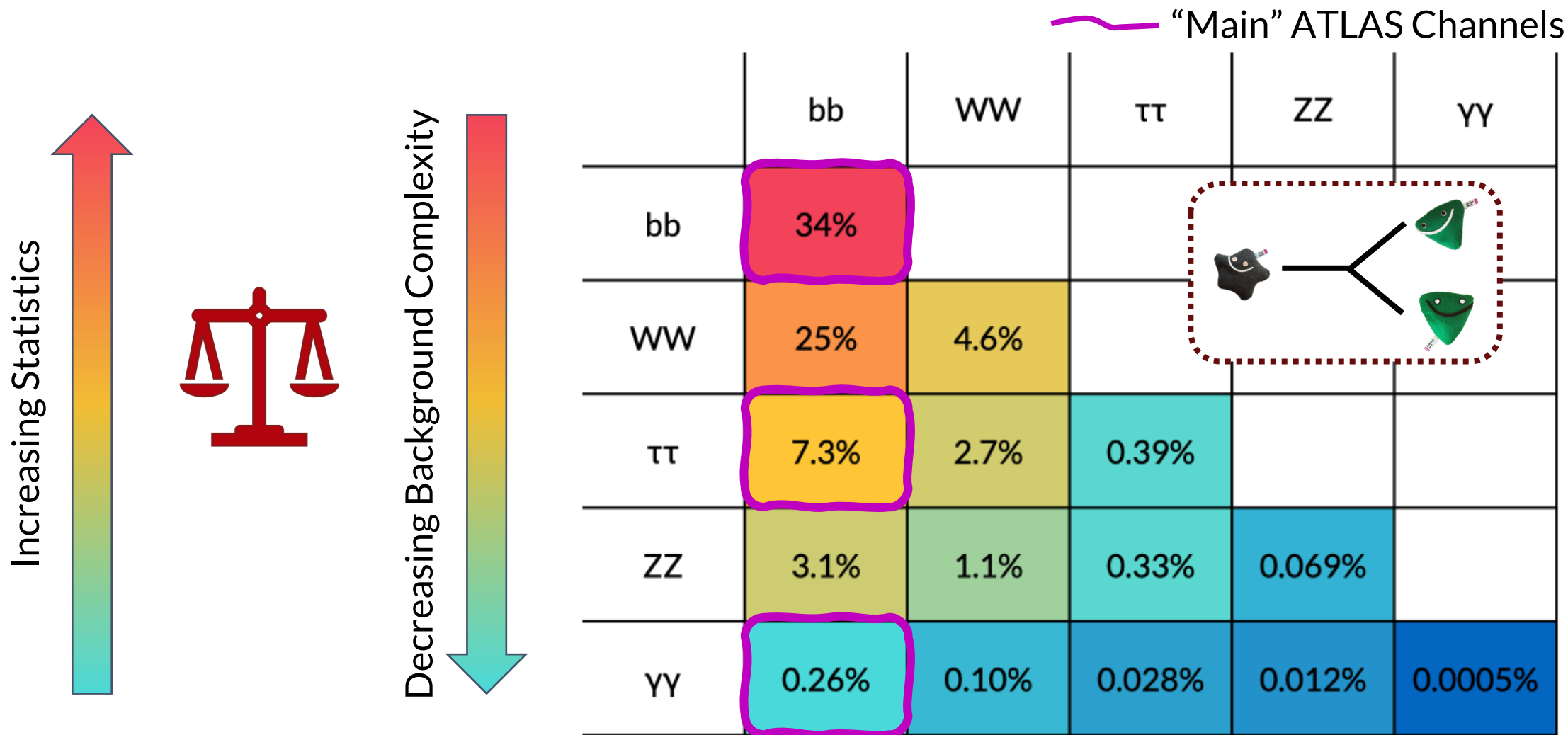
# A measurement probing Higgs Boson self-interactions

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[arxiv:2301.03212](https://arxiv.org/abs/2301.03212)

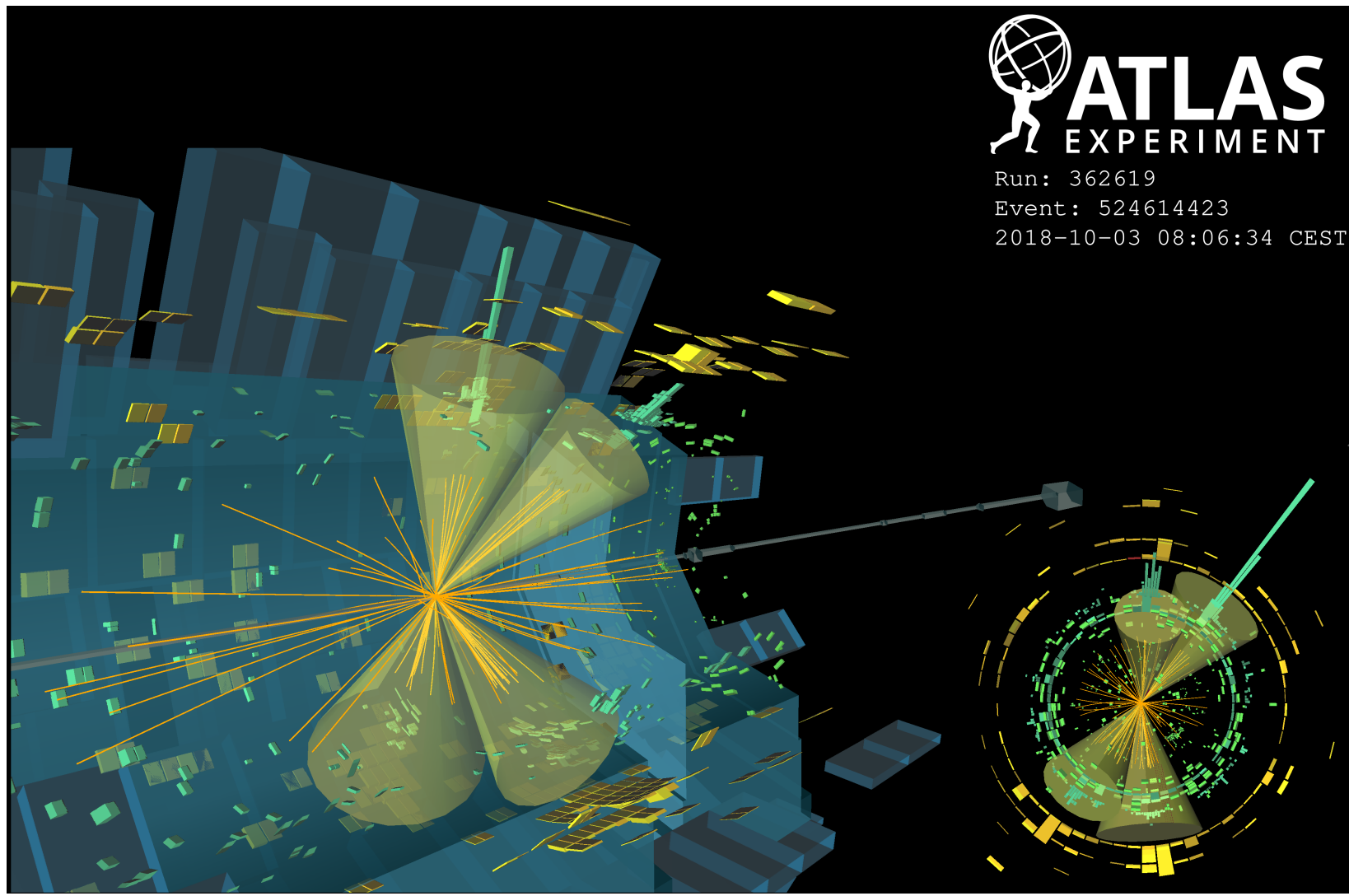
The ATLAS  $HH \rightarrow b\bar{b}b\bar{b}$  Analysis

# Di-Higgs Boson Decays



# What Makes 4b a Challenging Final State?

~2400 HH Events  
(ATLAS Run 2)




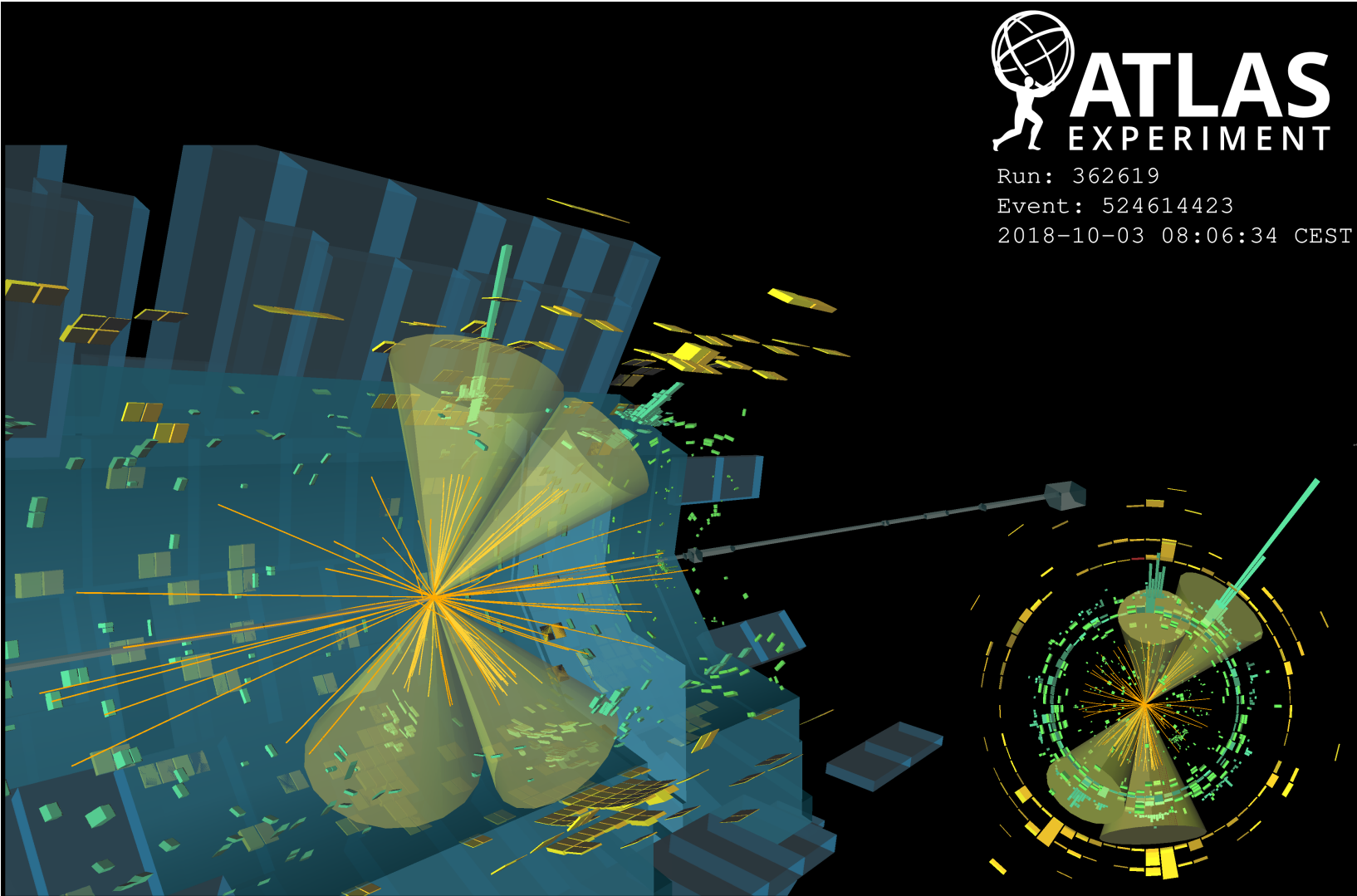
# What Makes 4b a Challenging Final State?

~2400  $HH$  Events  
(ATLAS Run 2) 



$$BR(HH \rightarrow b\bar{b}b\bar{b}) \sim \frac{1}{3}$$

~800  $HH \rightarrow b\bar{b}b\bar{b}$  Events 




**ATLAS**  
EXPERIMENT  
Run: 362619  
Event: 524614423  
2018-10-03 08:06:34 CEST

# What Makes 4b a Challenging Final State?

~2400  $HH$  Events  
(ATLAS Run 2) 



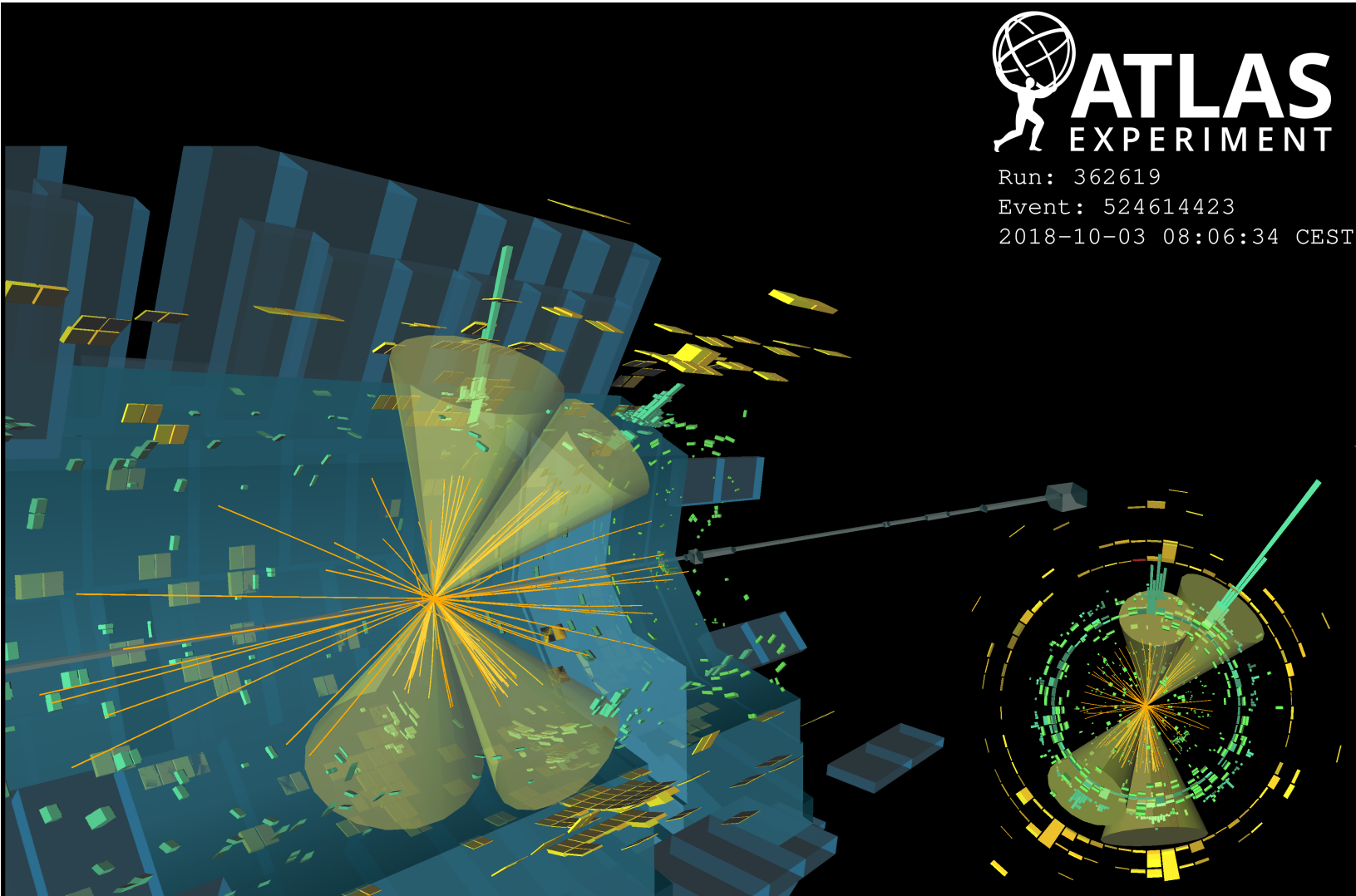
$$BR(HH \rightarrow b\bar{b}b\bar{b}) \sim \frac{1}{3}$$

~800  $HH \rightarrow b\bar{b}b\bar{b}$  Events 



Trigger+Acceptance

~500  $HH \rightarrow b\bar{b}b\bar{b}$  Events  
(~20 VBF)



**ATLAS**  
EXPERIMENT  
Run: 362619  
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# What Makes 4b a Challenging Final State?

~2400  $HH$  Events  
(ATLAS Run 2) 



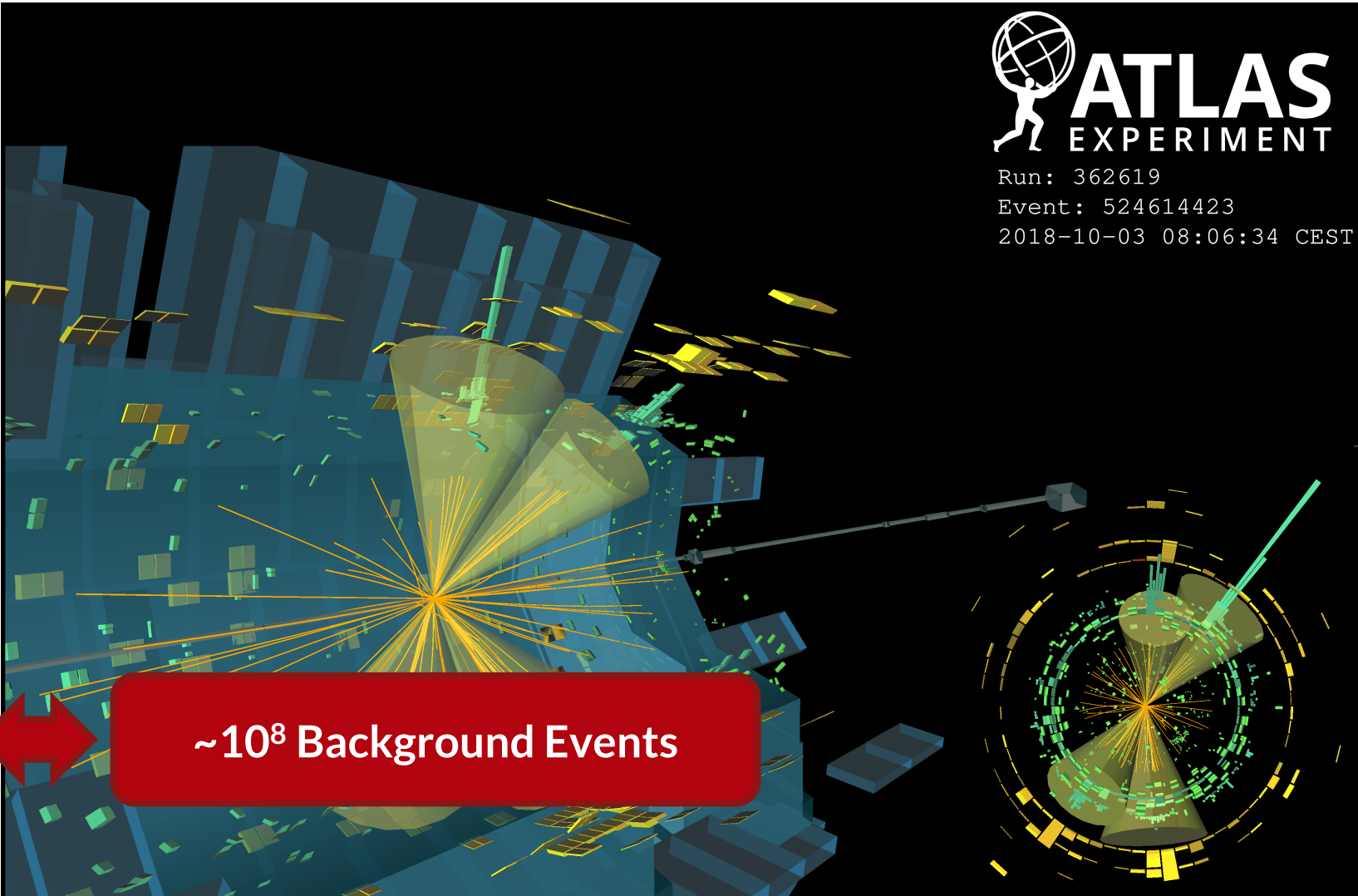
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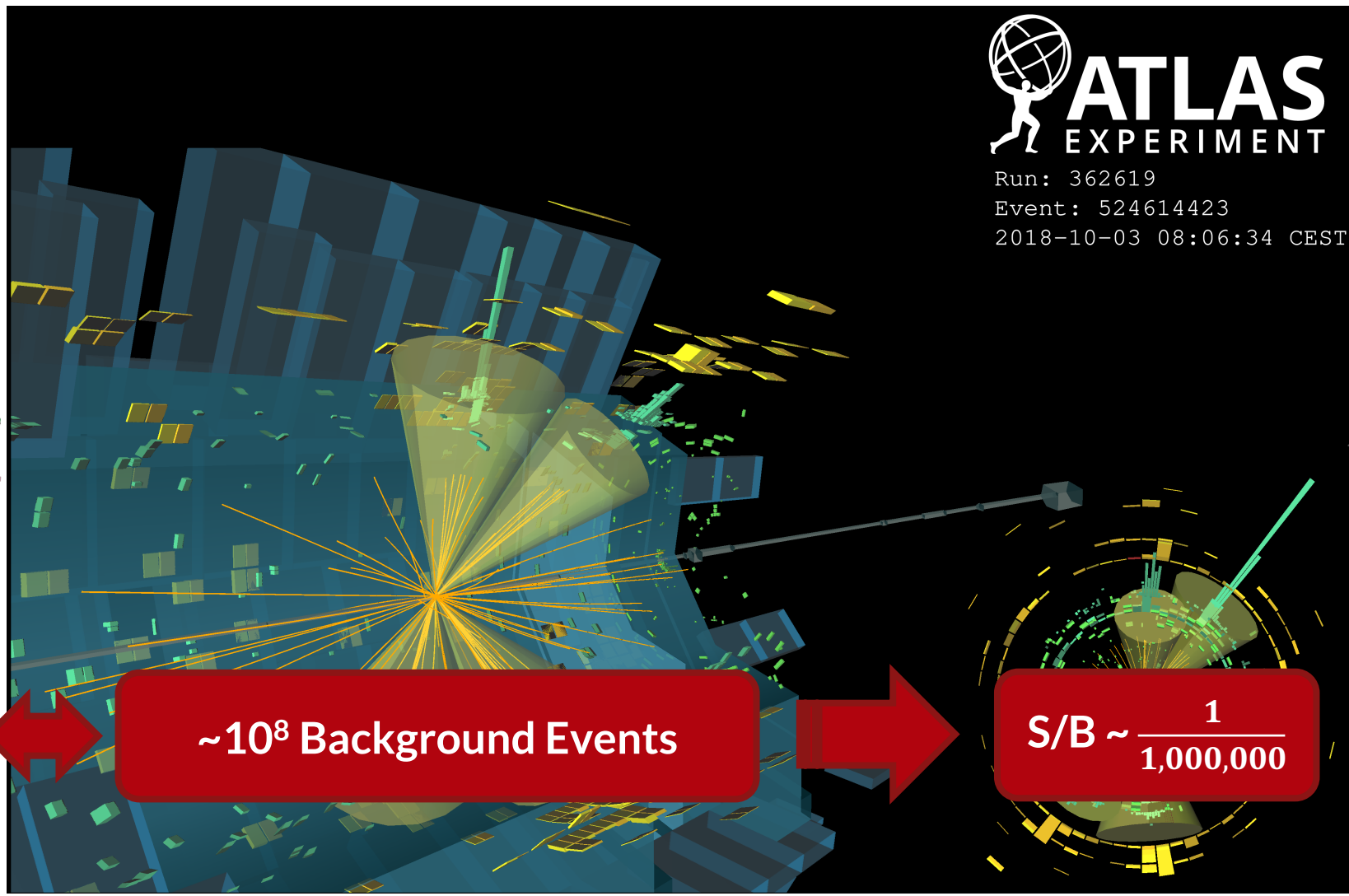
~2400  $HH$  Events  
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↓  $BR(HH \rightarrow b\bar{b}b\bar{b}) \sim \frac{1}{3}$

~800  $HH \rightarrow b\bar{b}b\bar{b}$  Events 

↓ Trigger+Acceptance

~500  $HH \rightarrow b\bar{b}b\bar{b}$  Events  
(~20 VBF)



**ATLAS**  
EXPERIMENT  
Run: 362619  
Event: 524614423  
2018-10-03 08:06:34 CEST

~10<sup>8</sup> Background Events

S/B ~  $\frac{1}{1,000,000}$

# What Makes 4b a Challenging Final State?

~2400  $HH$  Events  
(ATLAS Run 2)



$$BR(HH \rightarrow b\bar{b}b\bar{b}) \sim \frac{1}{3}$$

~800  $HH \rightarrow b\bar{b}b\bar{b}$  Events



Trigger+Acceptance

~500  $HH \rightarrow b\bar{b}b\bar{b}$  Events  
(~20 VBF)

ATLAS EXPERIMENT  
Run: 362619  
Event: 524614423  
2018-10-03 08:06:34 CEST

QCD "Multijet"

Many  $b$ -jets + light-jets

~ $10^8$  Background Events

S/B ~  $\frac{1}{1,000,000}$



# What Makes 4b a Challenging Final State?

~2400  $HH$  Events  
(ATLAS Run 2)



$$BR(HH \rightarrow b\bar{b}b\bar{b}) \sim \frac{1}{3}$$

~800  $HH \rightarrow b\bar{b}b\bar{b}$  Events



Trigger+Acceptance

~500  $HH \rightarrow b\bar{b}b\bar{b}$  Events  
(~20 VBF)



~10<sup>8</sup> Background Events



S/B ~  $\frac{1}{1,000,000}$

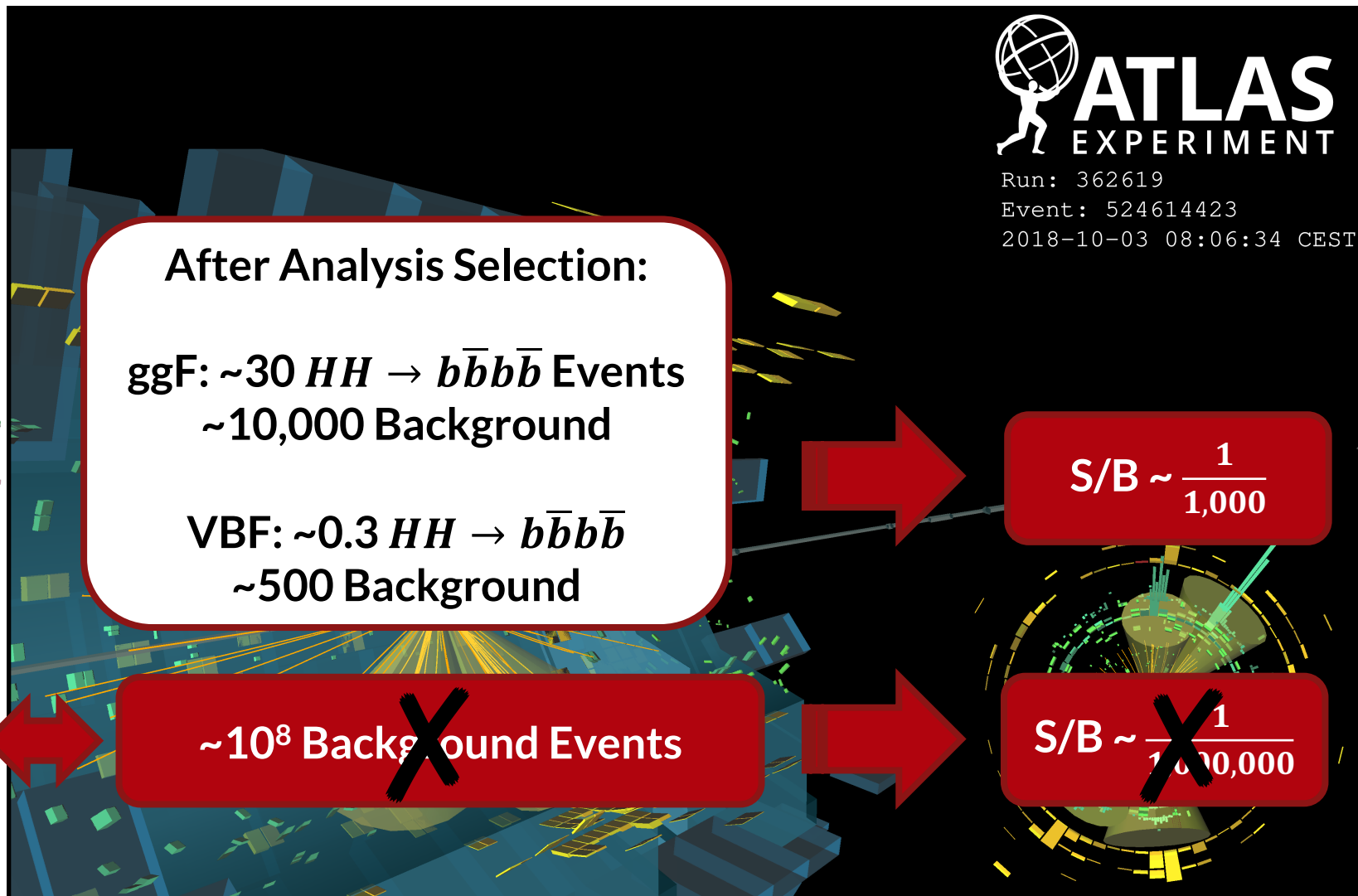
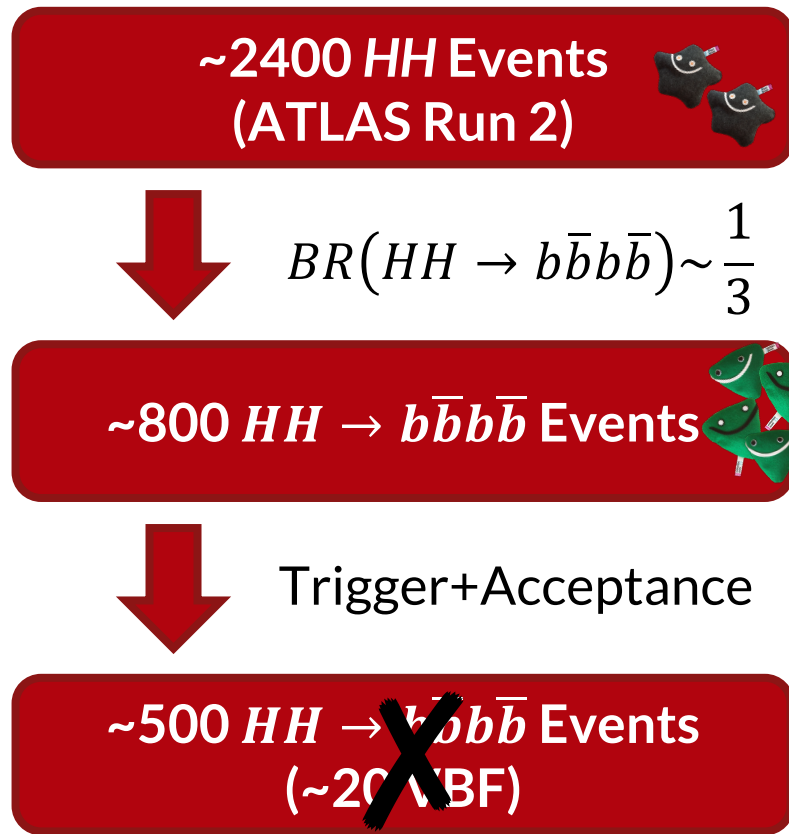
ATLAS EXPERIMENT  
Run: 362619  
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2018-10-03 08:06:34 CEST

“The small signal cross section combined with the huge QCD 4b background make it **essentially impossible** to determine the Higgs boson self-coupling in  $pp \rightarrow 4b$ .”

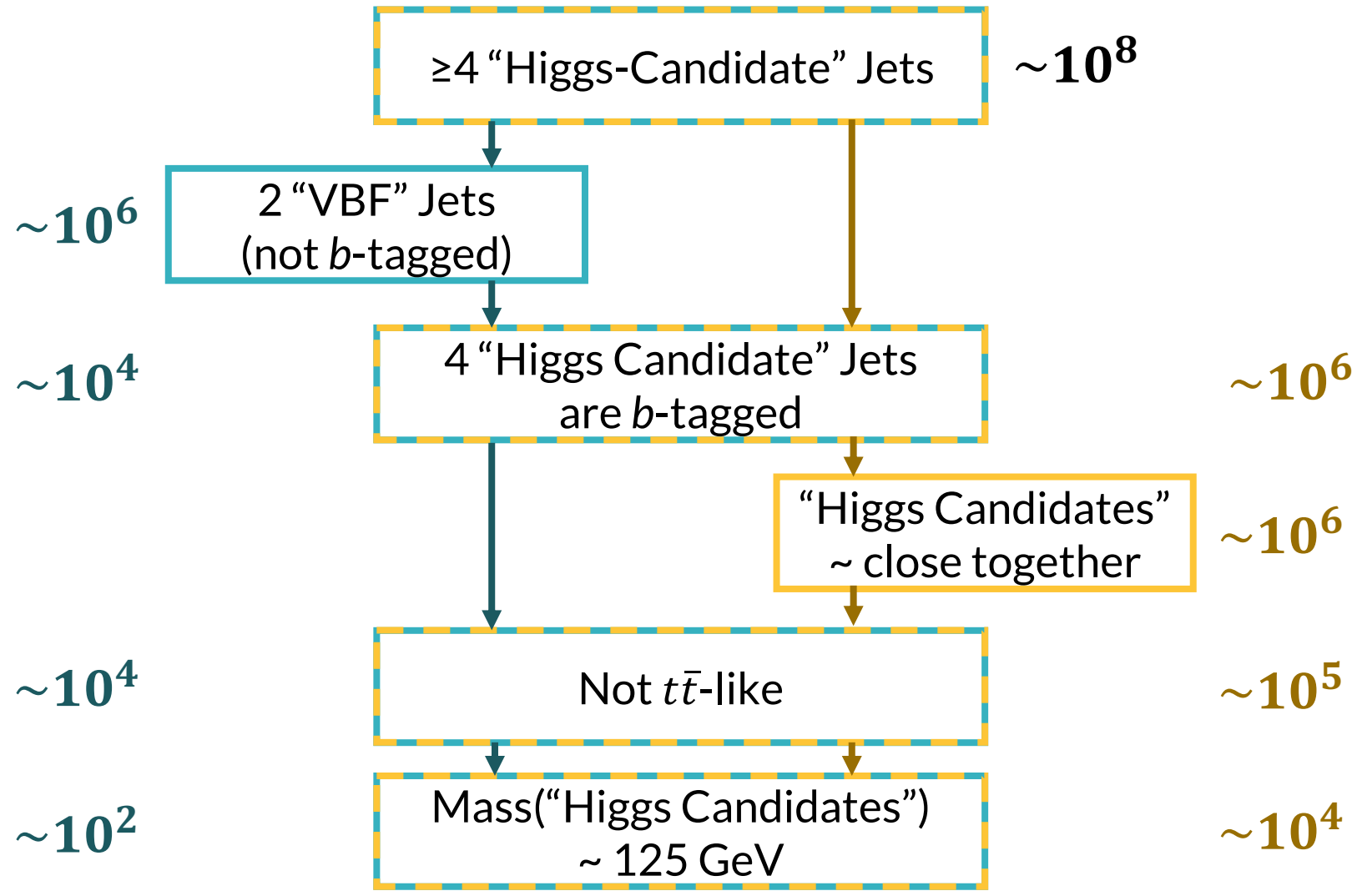
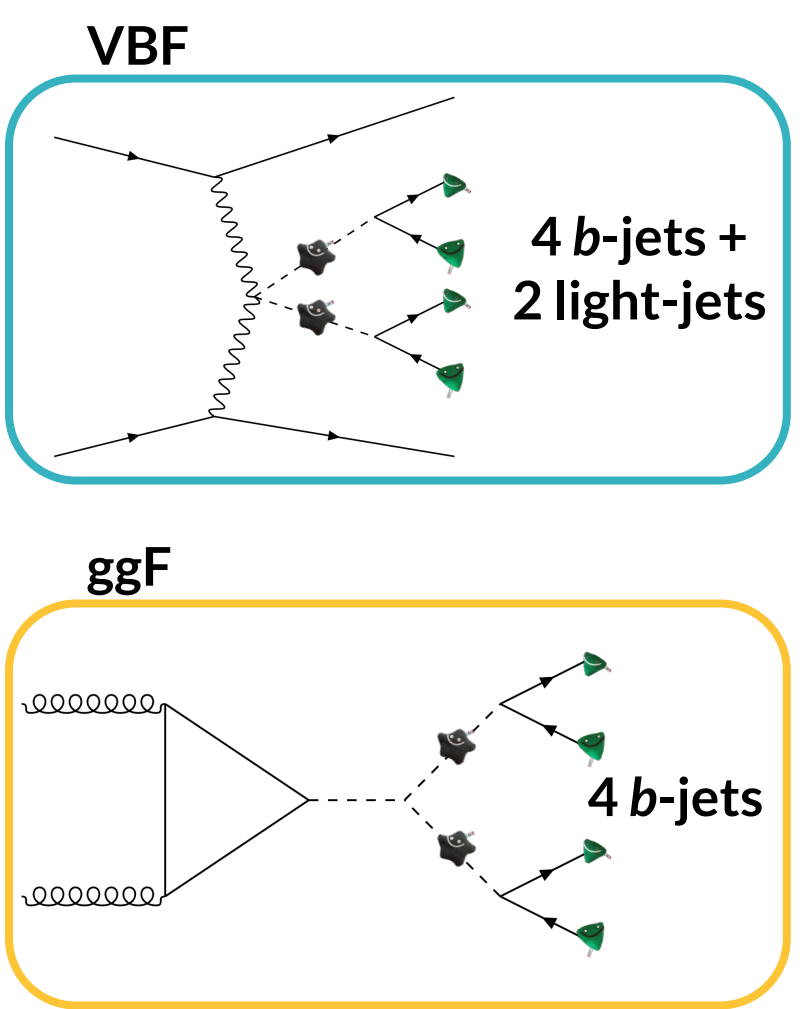
[from “Examining the Higgs boson potential at lepton and hadron colliders: a comparative analysis,” Baur et. al., [CERN-TH/2003-069](#)]

Credit to L. Cadamuro for finding this nice quote!

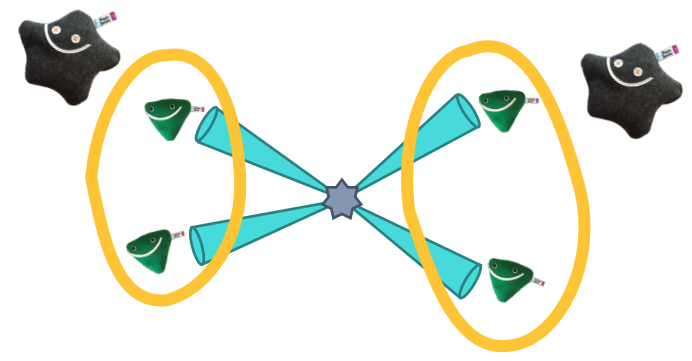
# What Makes 4b a Challenging Final State?



# Isolating $HH \rightarrow b\bar{b}b\bar{b}$ Events

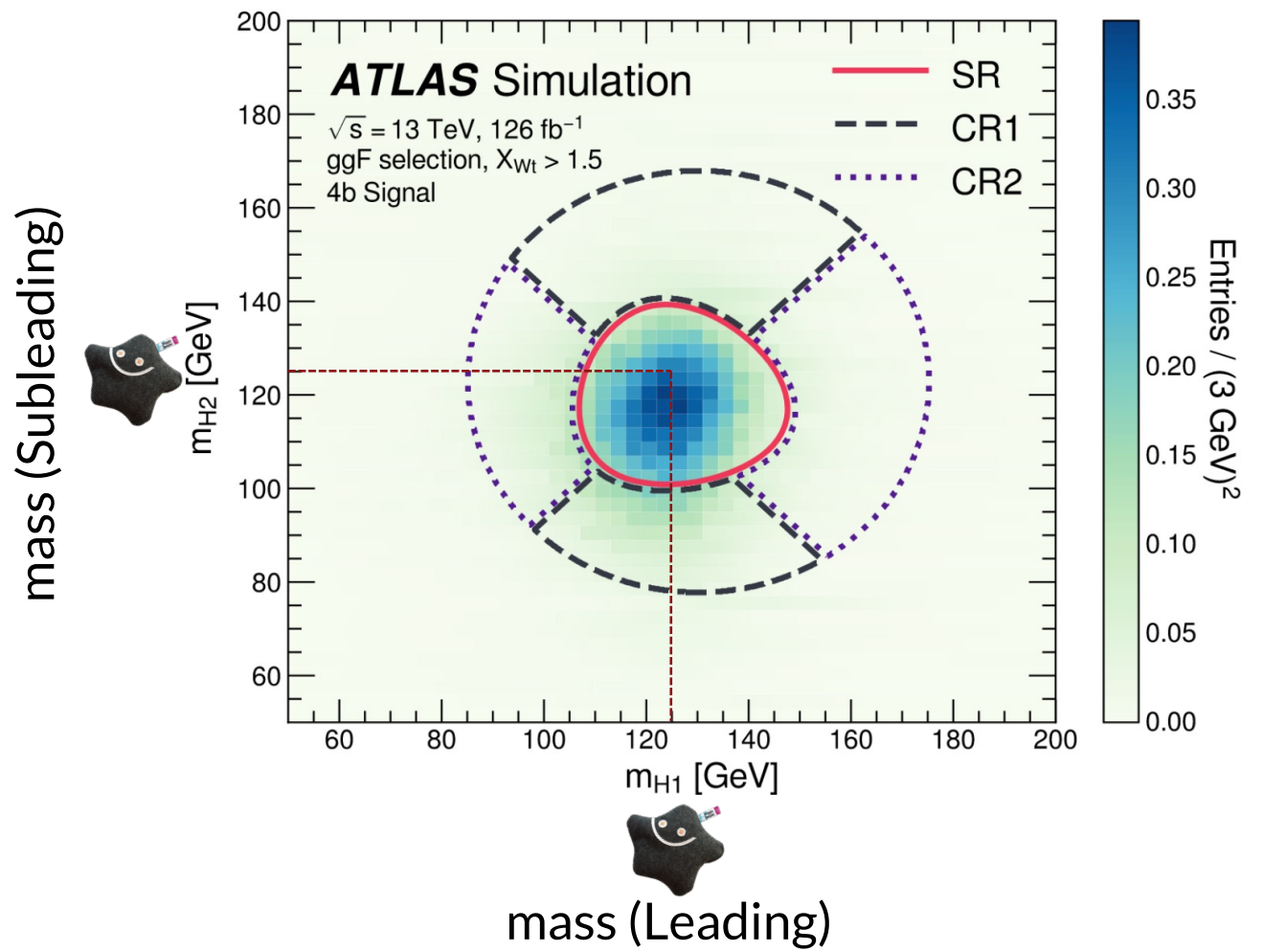


# The "Mass-Plane"

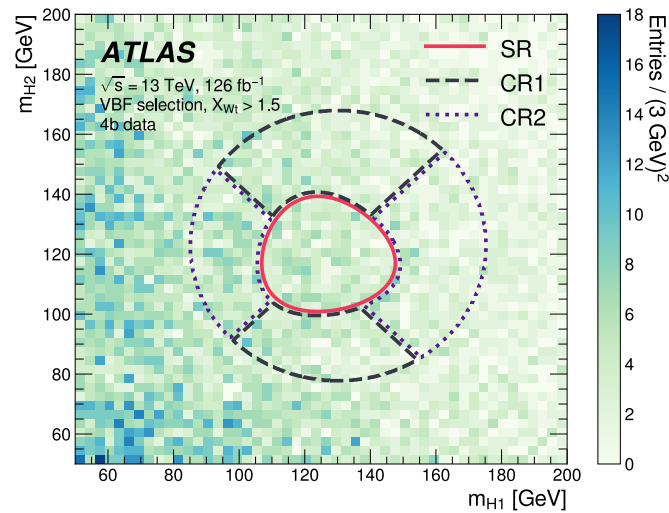
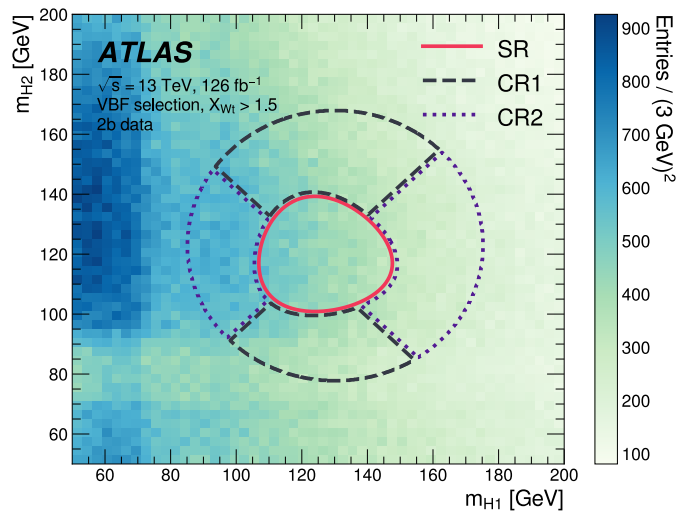
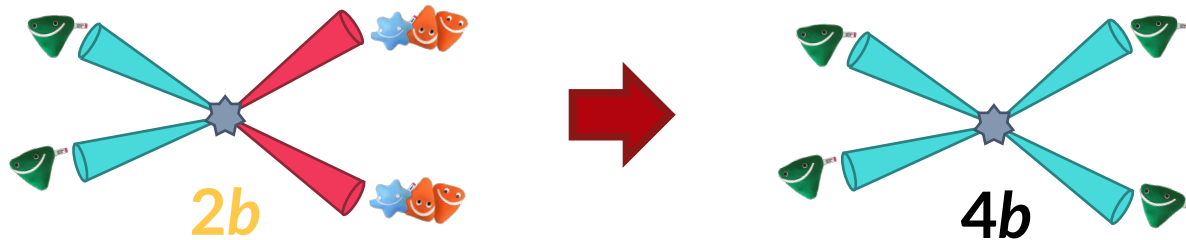


Require reconstructed Higgs Boson candidate masses  $\sim 125$  GeV

→ Define "Signal Region"



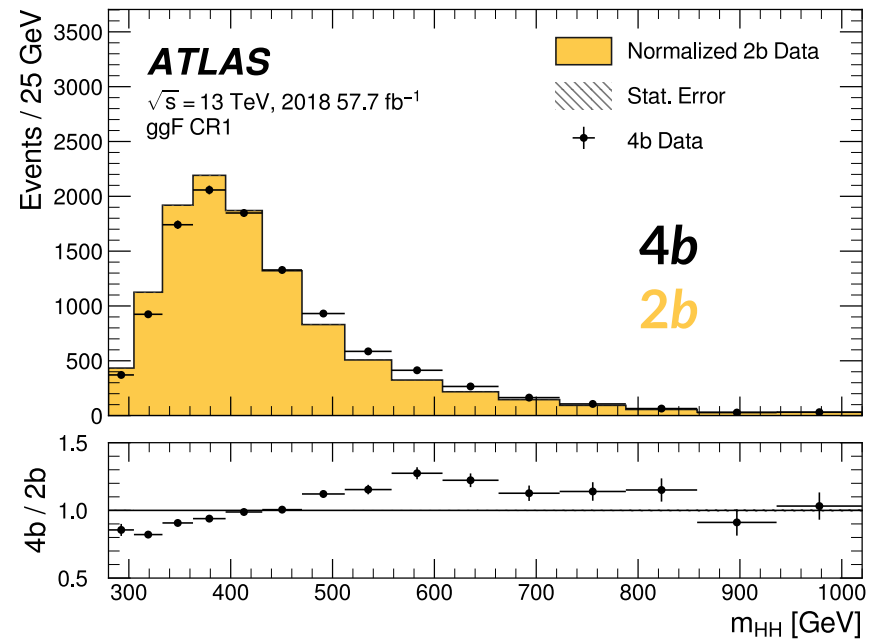
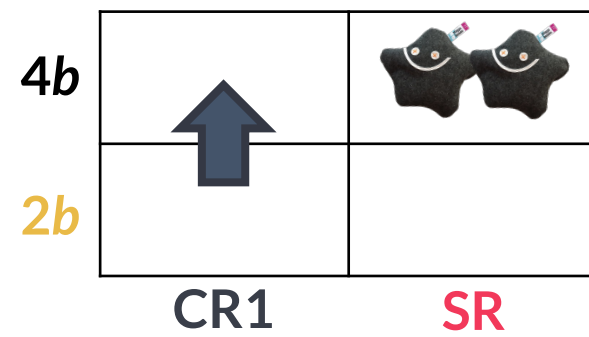
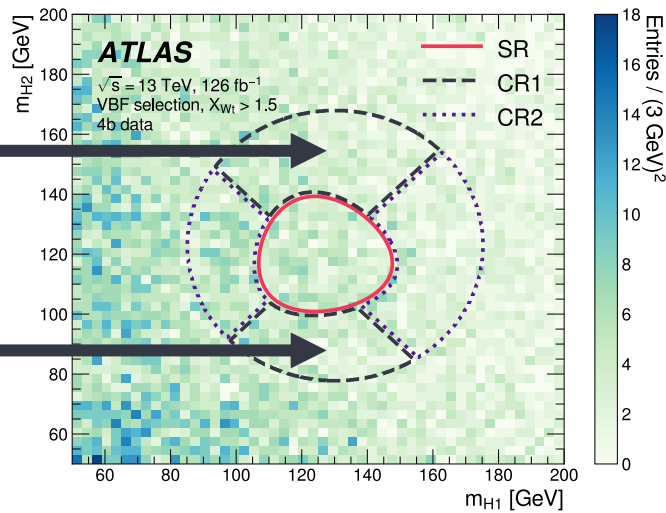
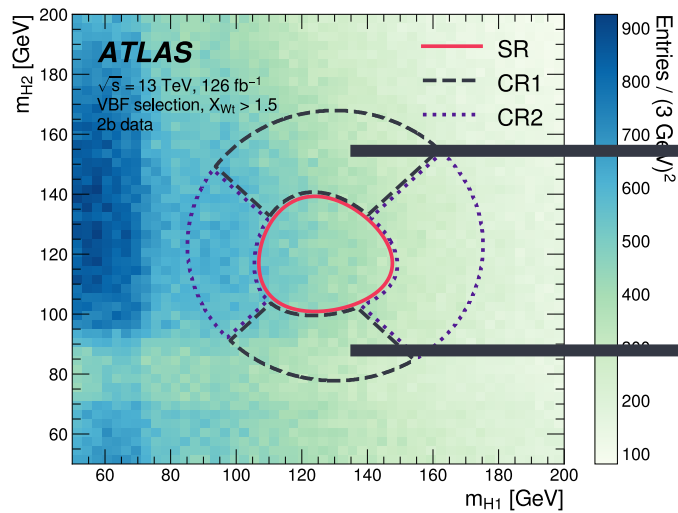
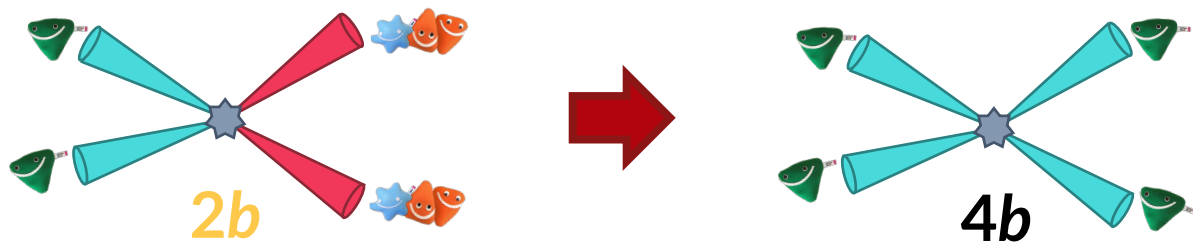
# Background Modeling Strategy



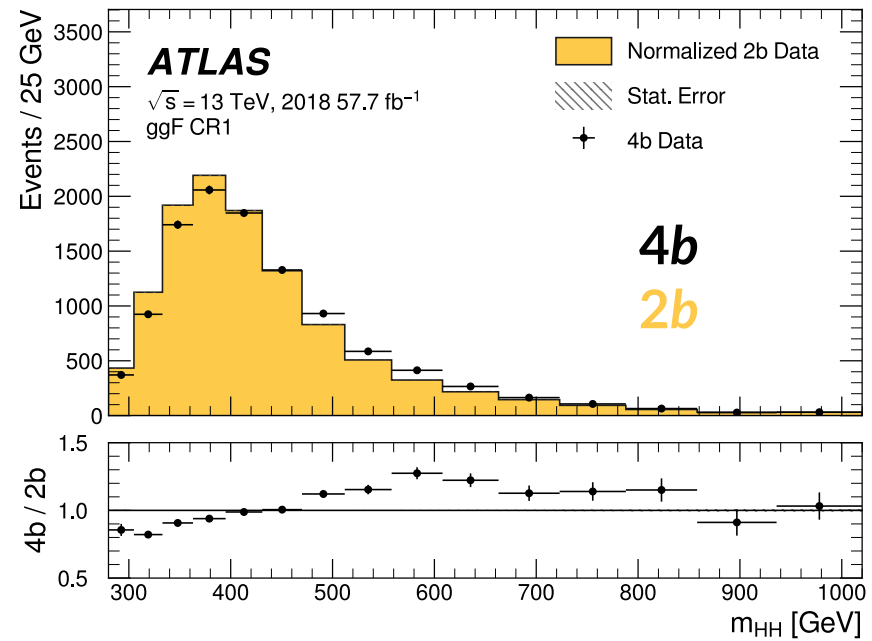
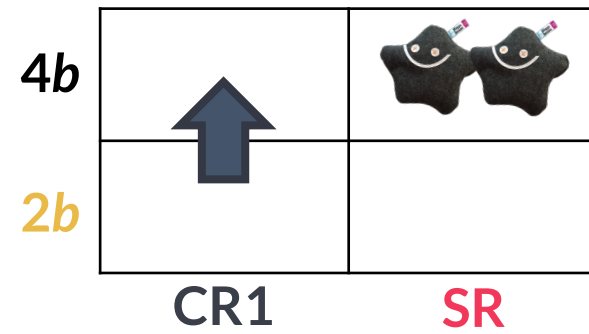
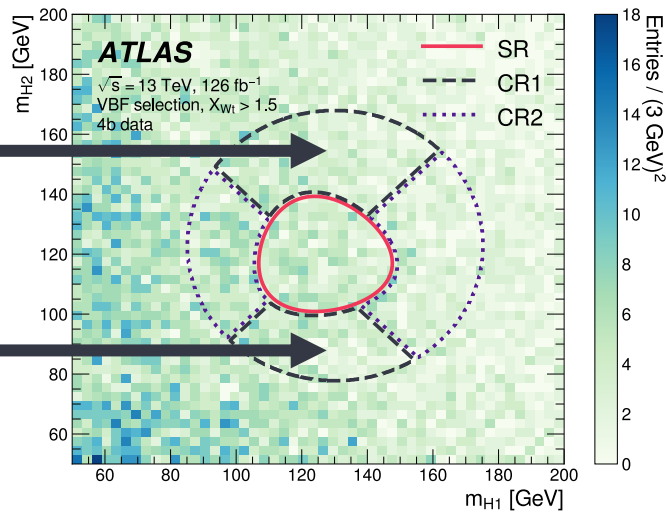
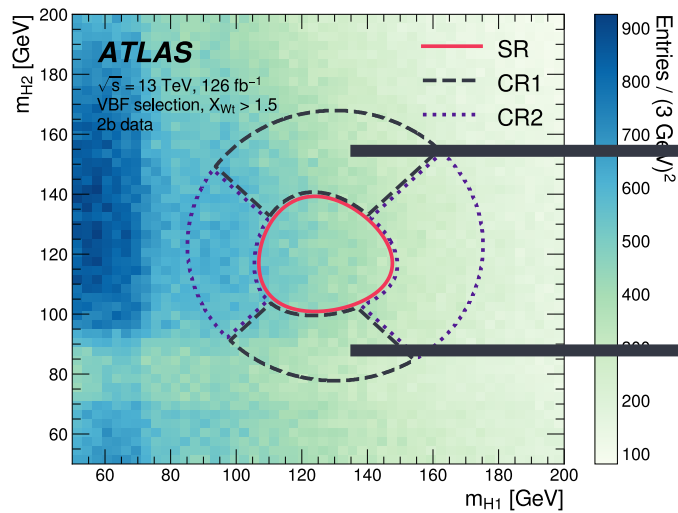
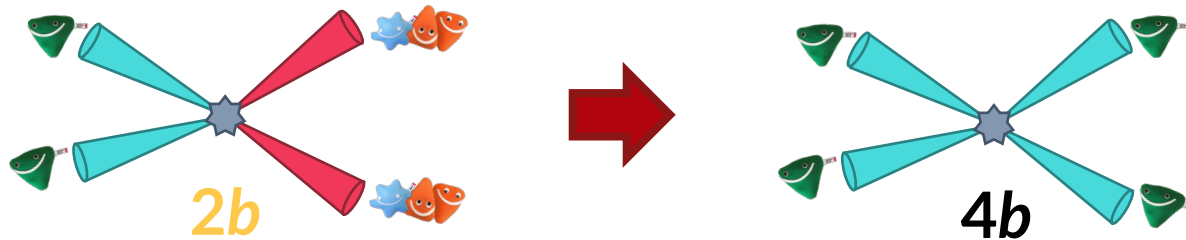
2b background processes  
 ~ 4b background processes

→ use 2b data to estimate  
 backgrounds in the 4b region?

# Background Modeling Strategy

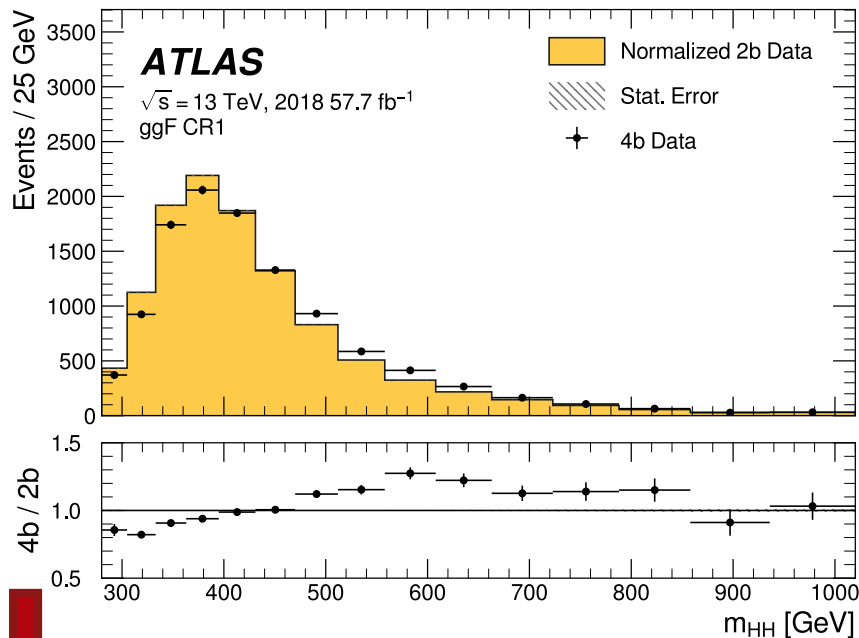


# Background Modeling Strategy



1-Dimensional *density ratio*  
 $w(x) = p_{4b}(x) / p_{2b}(x)$

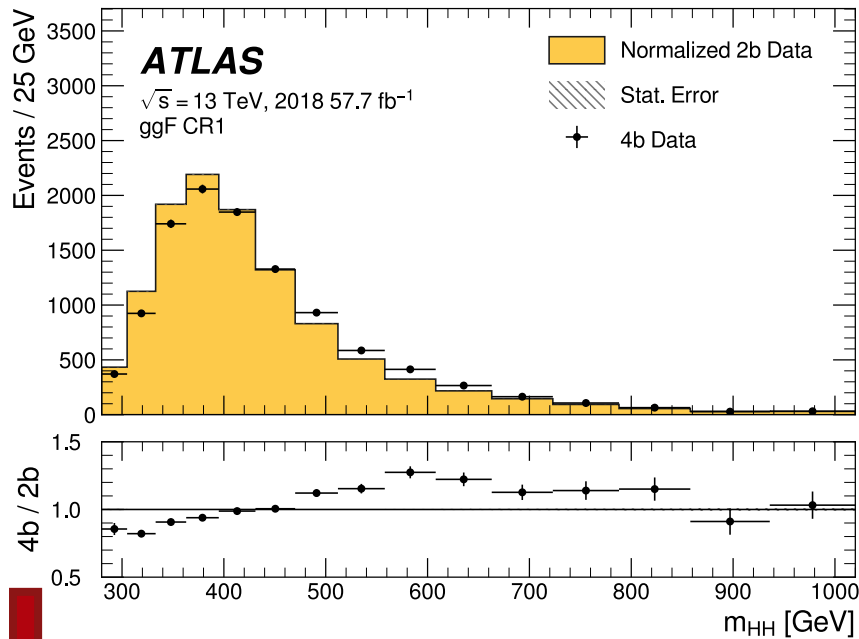
# Density Ratio Estimation with Histograms



- 1-Dimensional Reweighting
- Prone to statistical fluctuations
- No correlation with other kinematics  
 (assumes similar domain  $p_{2b}^{CR} \sim p_{2b}^{SR}$ )

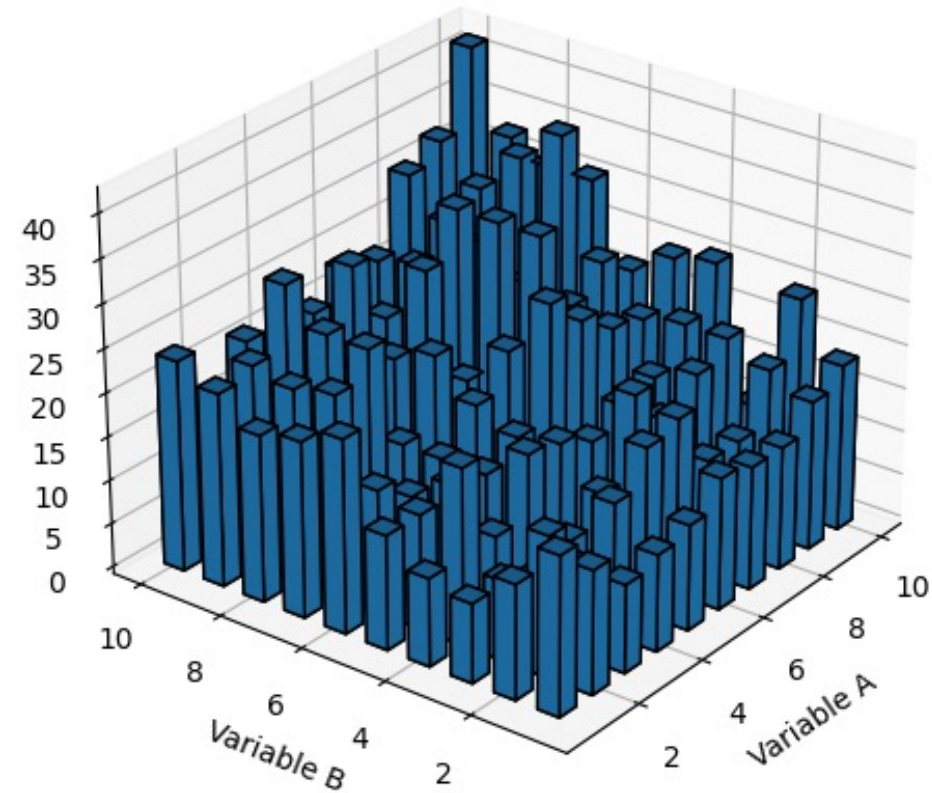


# Density Ratio Estimation with Histograms



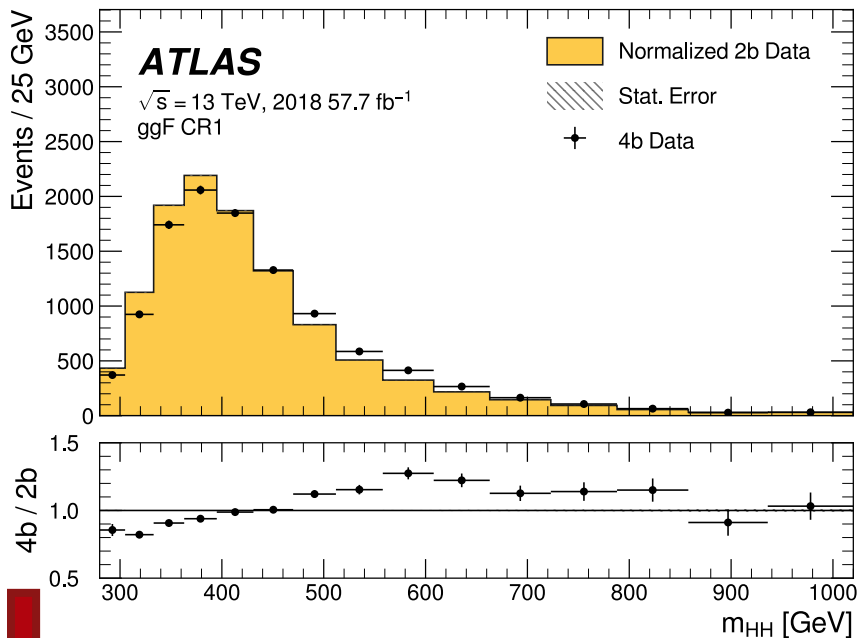
- 1-Dimensional Reweighting
- Prone to statistical fluctuations
- No correlation with other kinematics  
 (assumes similar domain  $p_{2b}^{CR} \sim p_{2b}^{SR}$ )

## Multi-Dimensional Histogram Reweighting?



**Curse of Dimensionality**

# Density Ratio Estimation with Neural Networks



$$w(\vec{x}) = p_{4b}(\vec{x}) / p_{2b}(\vec{x})$$

Train Neural Network with specific Loss function:

$$\mathcal{L}(R(\vec{x})) = \mathbb{E}_{x \sim p_{2b}} \left[ \sqrt{R(\vec{x})} \right] + \mathbb{E}_{x \sim p_{4b}} \left[ \frac{1}{\sqrt{R(\vec{x})}} \right]$$

$$\rightarrow \arg \min_R \mathcal{L}(R(\vec{x})) = w(\vec{x})$$

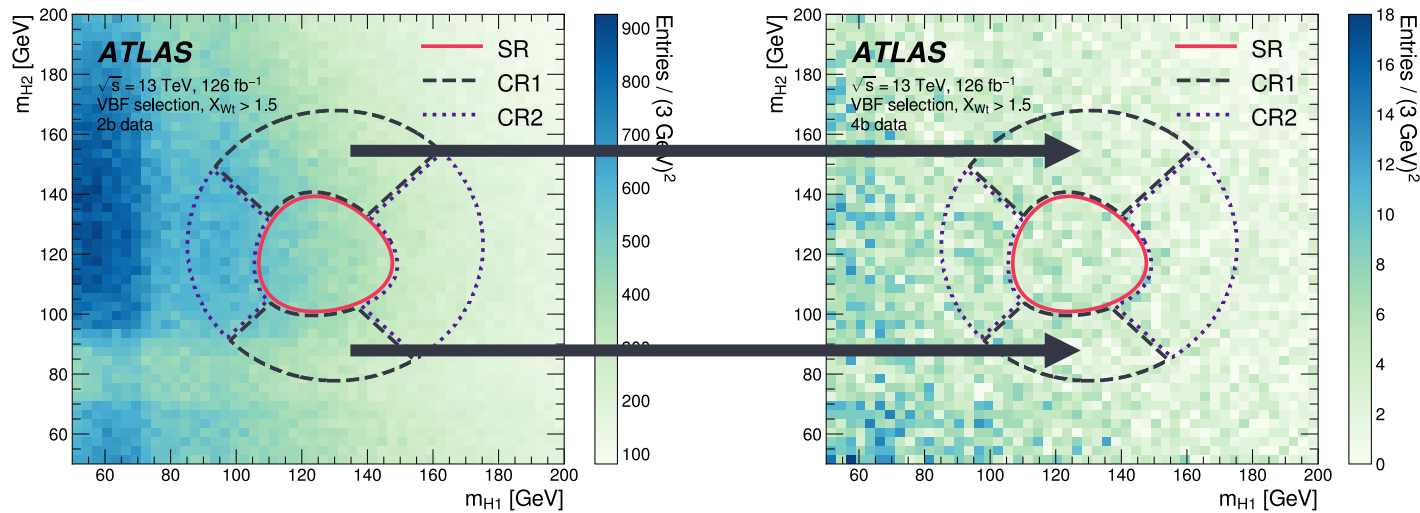
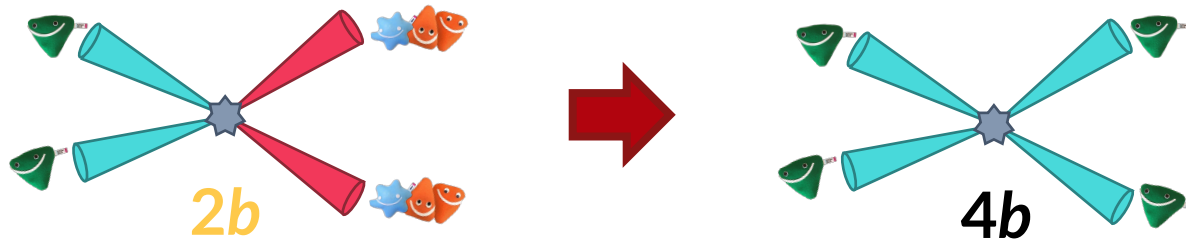
High-dimensional, “Event-level” reweighting!



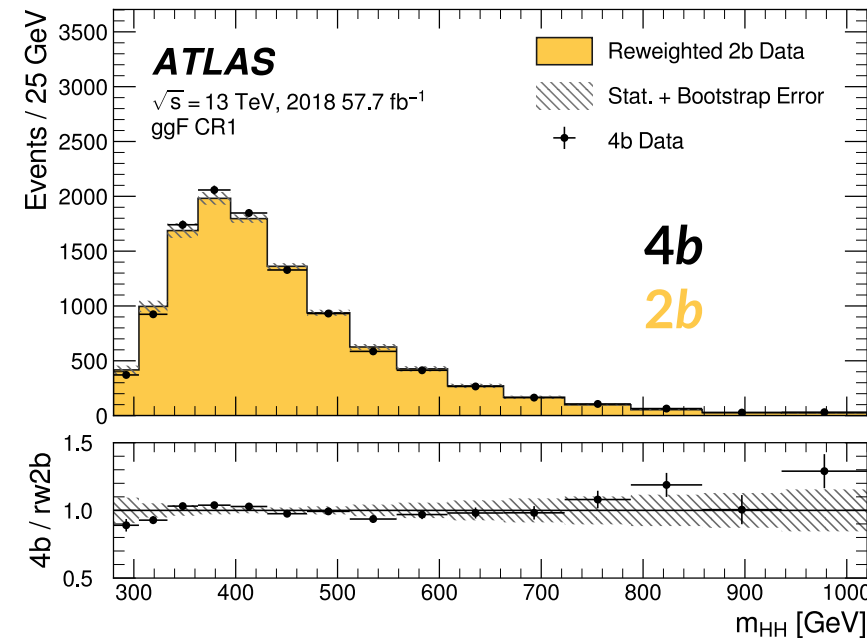
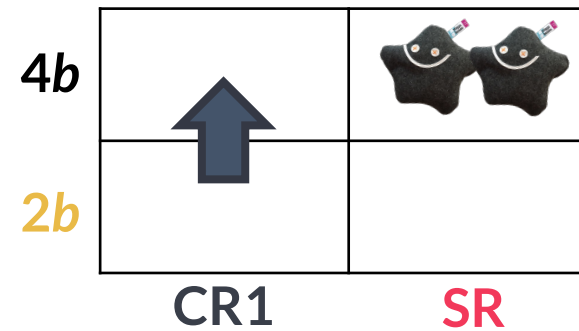
- 1-Dimensional Reweighting
- Prone to statistical fluctuations
- No correlation with other kinematics  
(assume similar domain  $p_{2b}^{CR} \sim p_{2b}^{SR}$ )

[arxiv:1911.00405](https://arxiv.org/abs/1911.00405)  
[Kanamori et. al. \(JMLR\)](#)

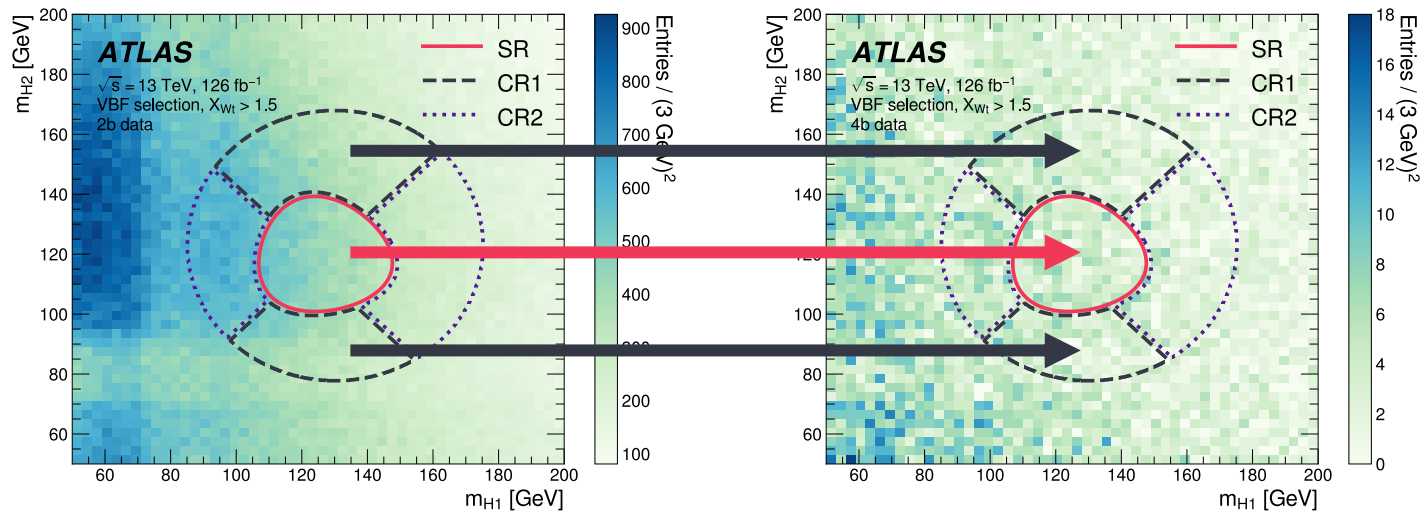
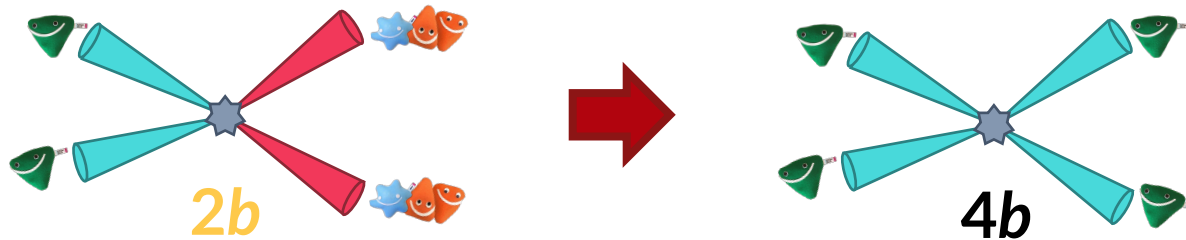
# Background Modeling Strategy



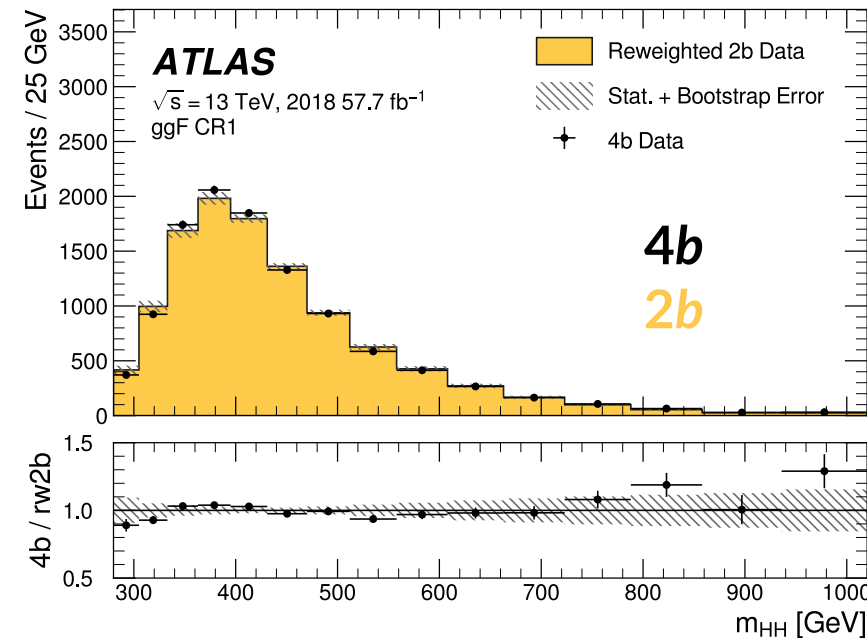
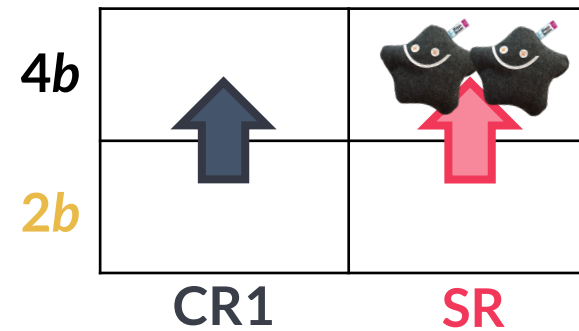
Train in CR1



# Background Modeling Strategy

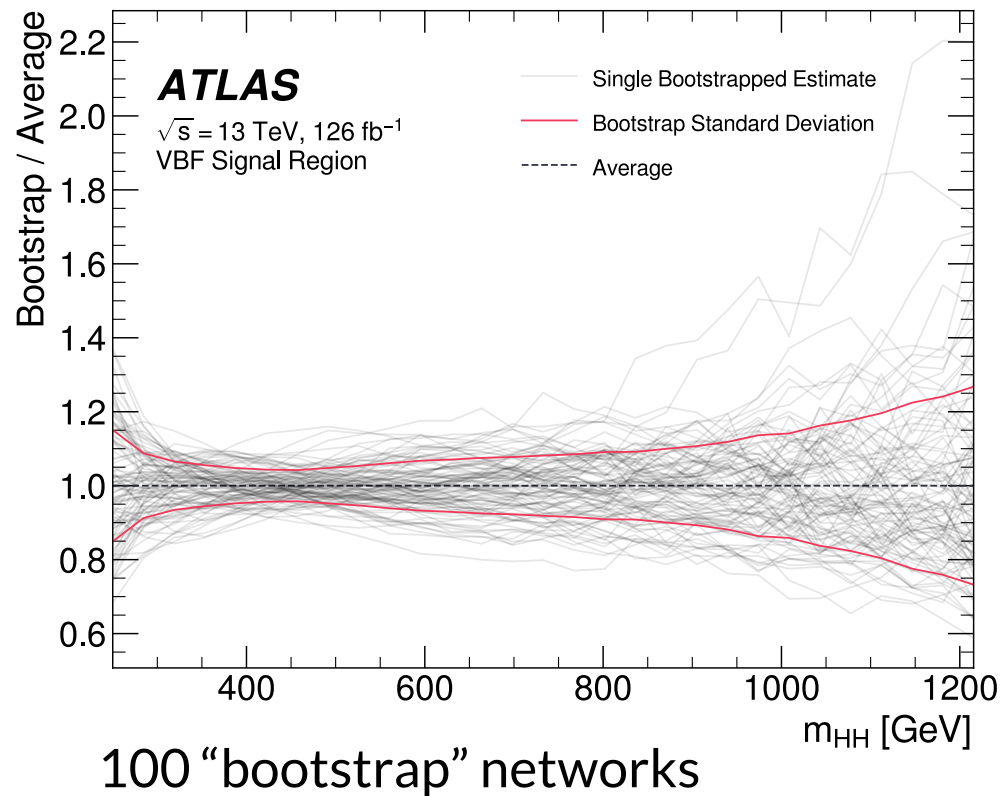


**Train in CR1**  
**Apply in SR**

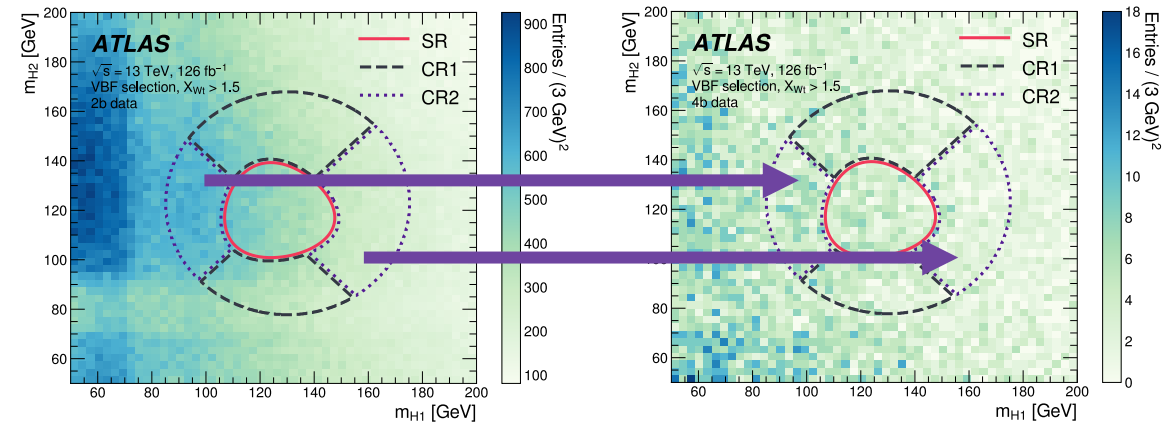
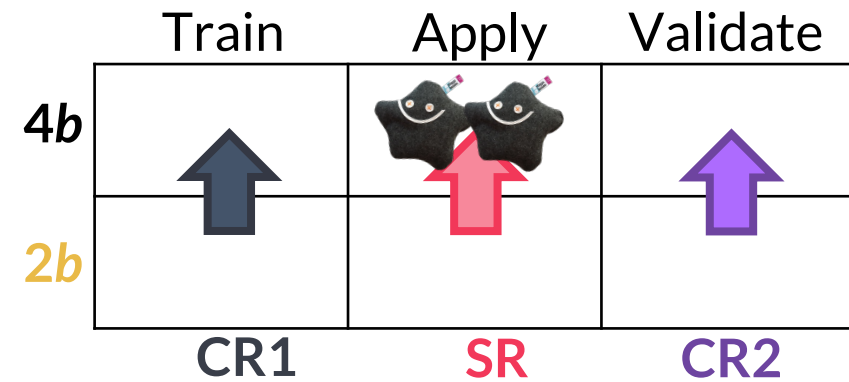


# Background Modeling Strategy: Uncertainties

## Uncertainty from limited training statistics/network initialization

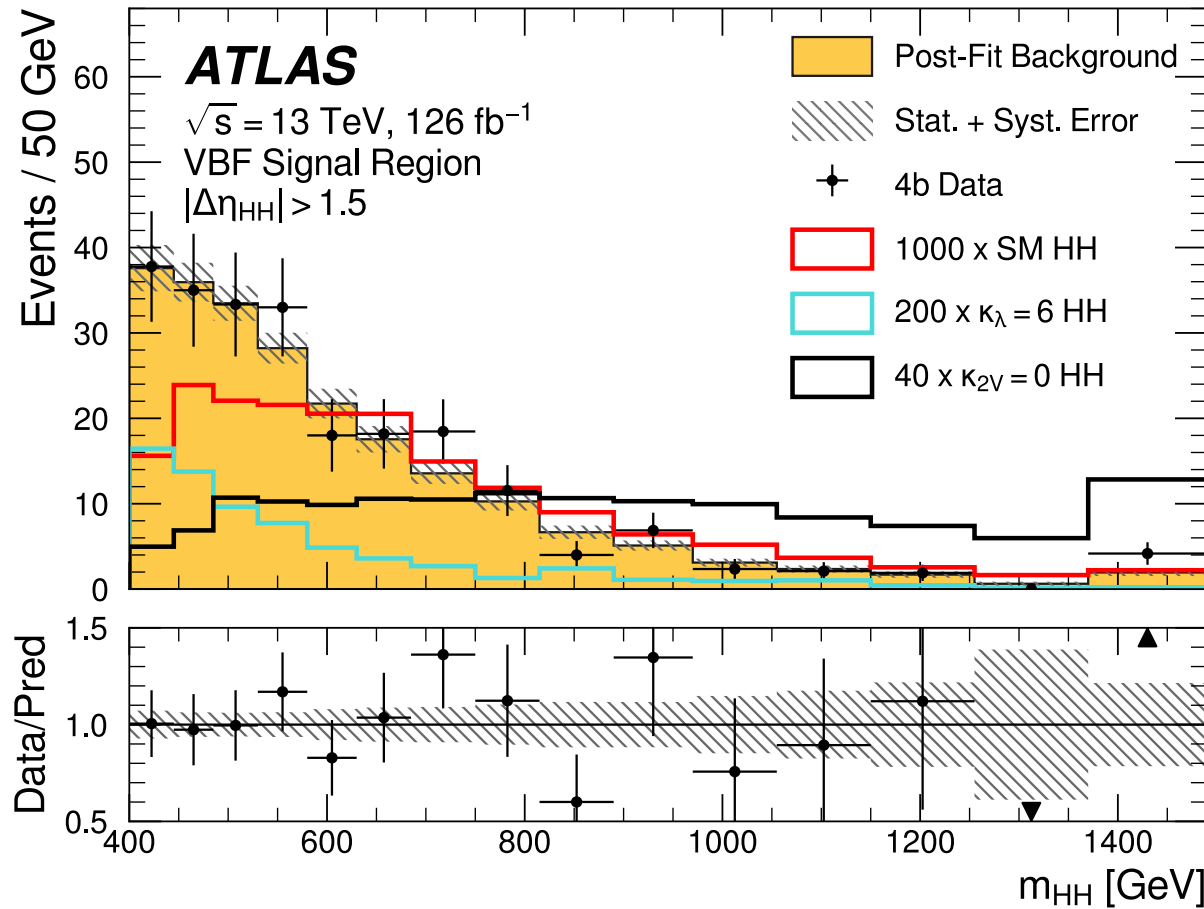


## Uncertainty from domain transfer



# Observed Data

## Observed Data in a VBF Category



Standard Model ( $\kappa_\lambda = \kappa_{2V} = 1$ )

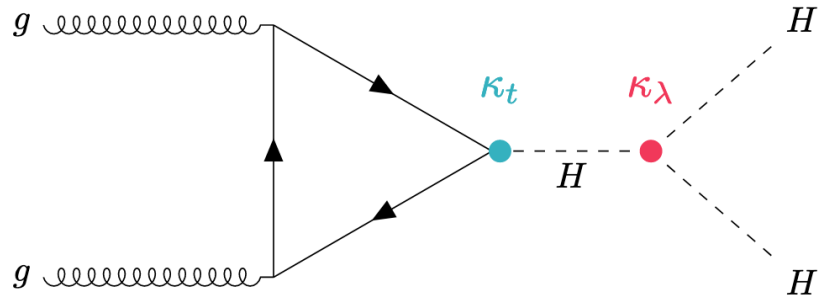
$\kappa_\lambda = 10$  ( $\kappa_{2V} = 1$ )

$\kappa_{2V} = 0$  ( $\kappa_\lambda = 1$ )

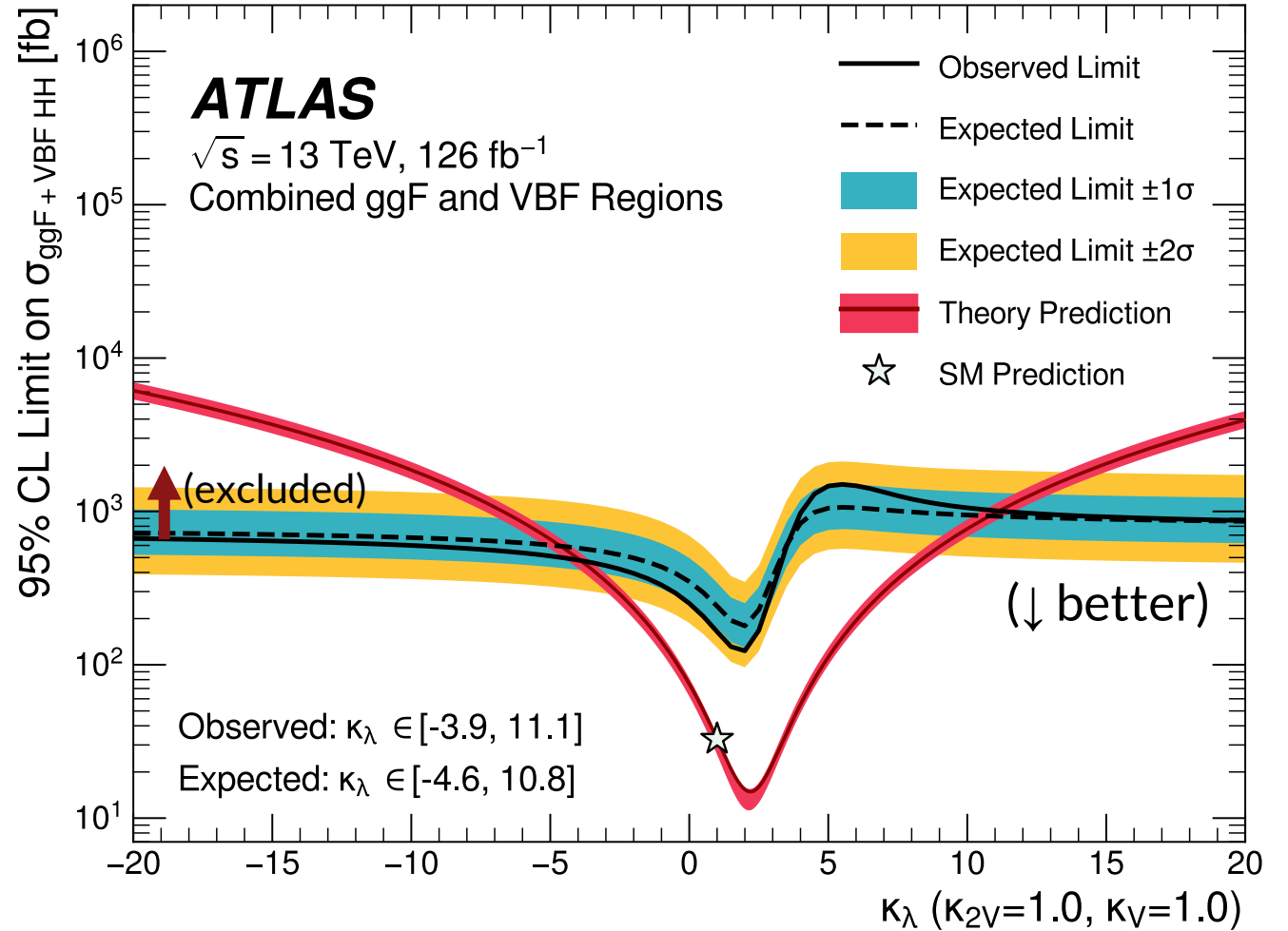
Neural-network  
 reweighted background  
 agrees well with  
 observed data

# Results - $\kappa_\lambda$

## Constraining the $HHH$ coupling

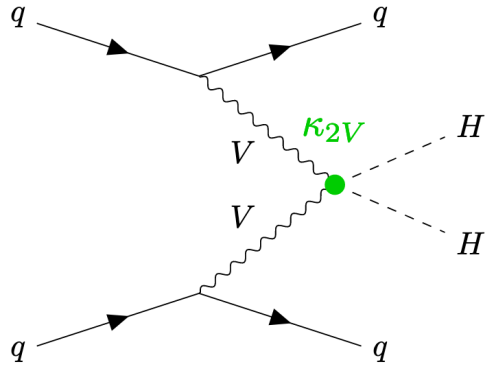


BSM softer  $\rightarrow$  less sensitive

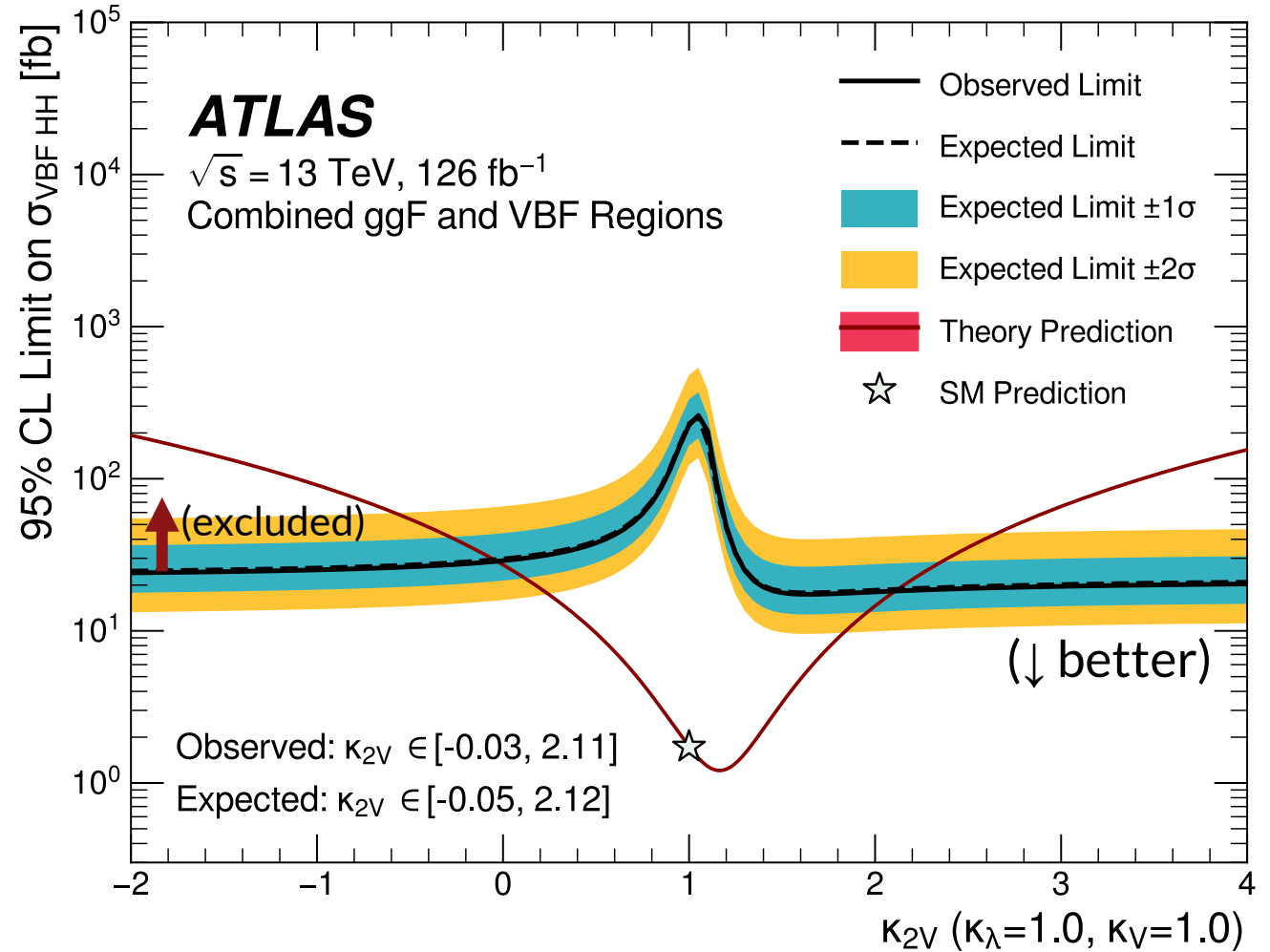


# Results - $\kappa_{2V}$

## Constraining the $HHVV$ coupling



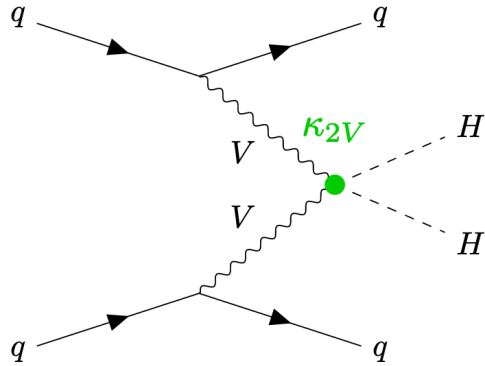
BSM harder  $\rightarrow$  more sensitive





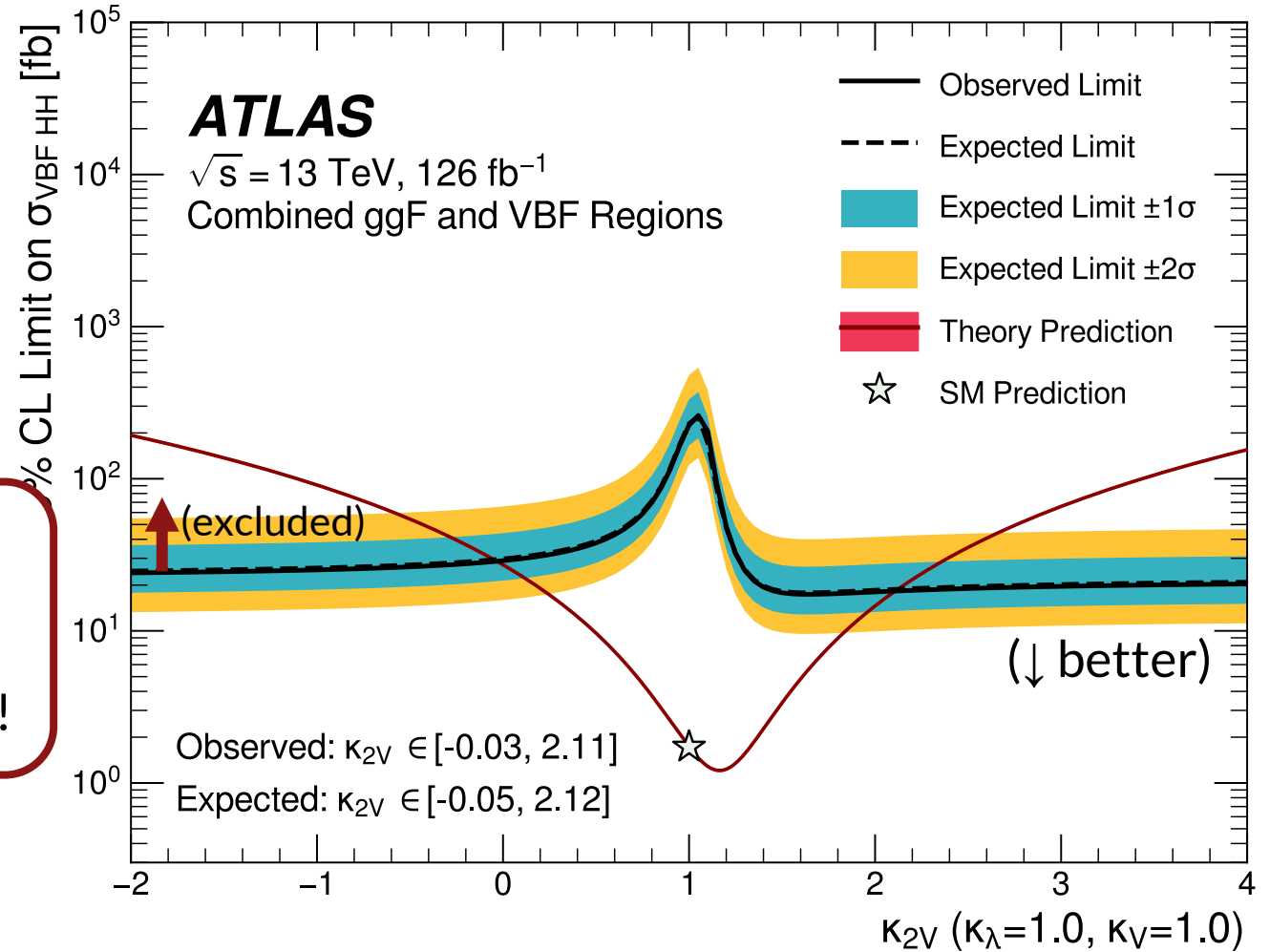
# Results - $\kappa_{2V}$

## Constraining the $HHVV$ coupling



Compared to previous ATLAS result:  
 ~75% improvement on  $\sigma_{VBF}^{SM}$  upper limit!  
 ~30% improvement on allowed  $\kappa_{2V}$  range!

[arxiv:2001.05178](https://arxiv.org/abs/2001.05178)

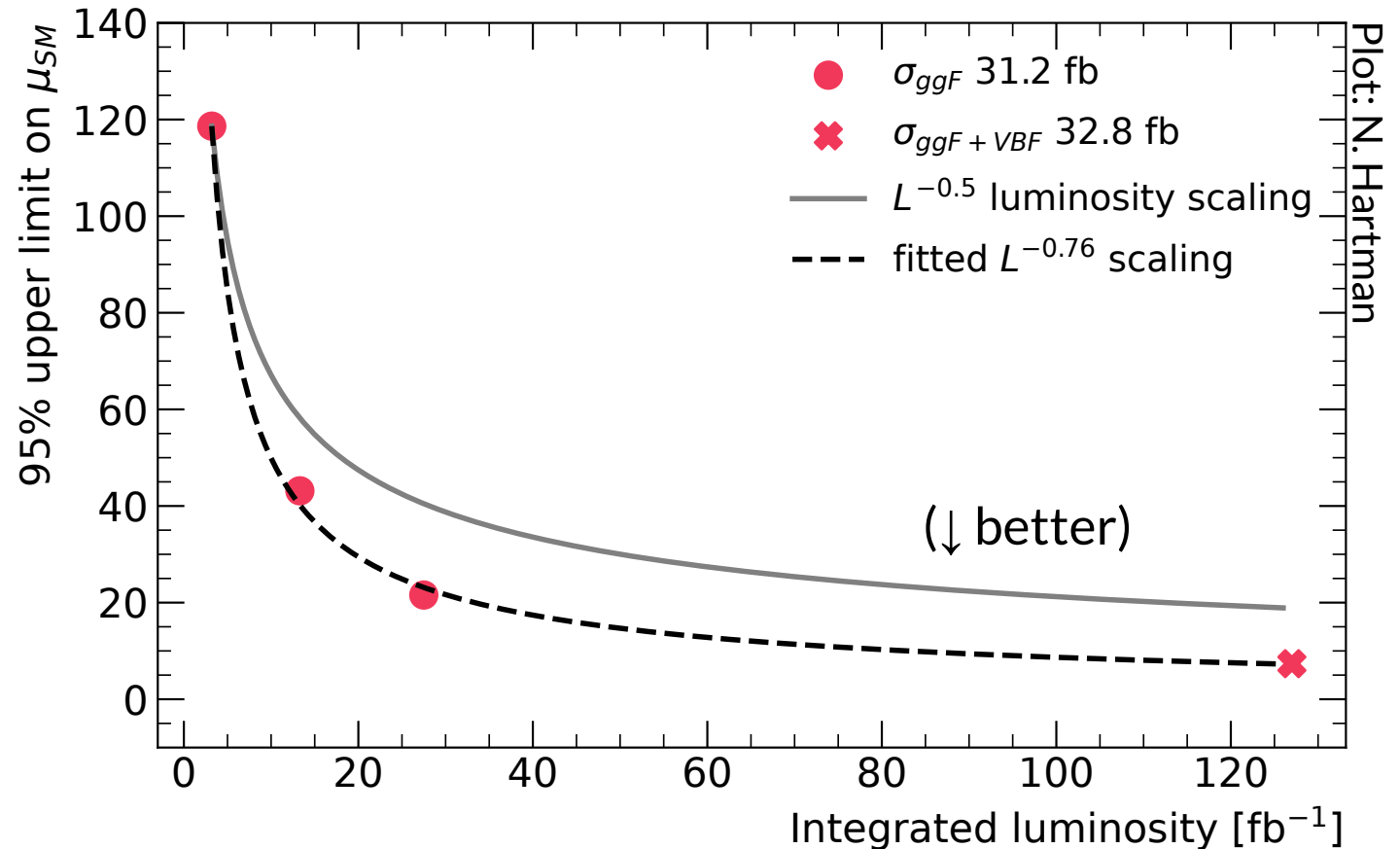


# How Have We Been Improving $HH$ Measurements?

**More data  
&  
Better techniques to analyze data**

Increasing dataset by factor of  $x$  improves limits by  $x^{-0.5}$

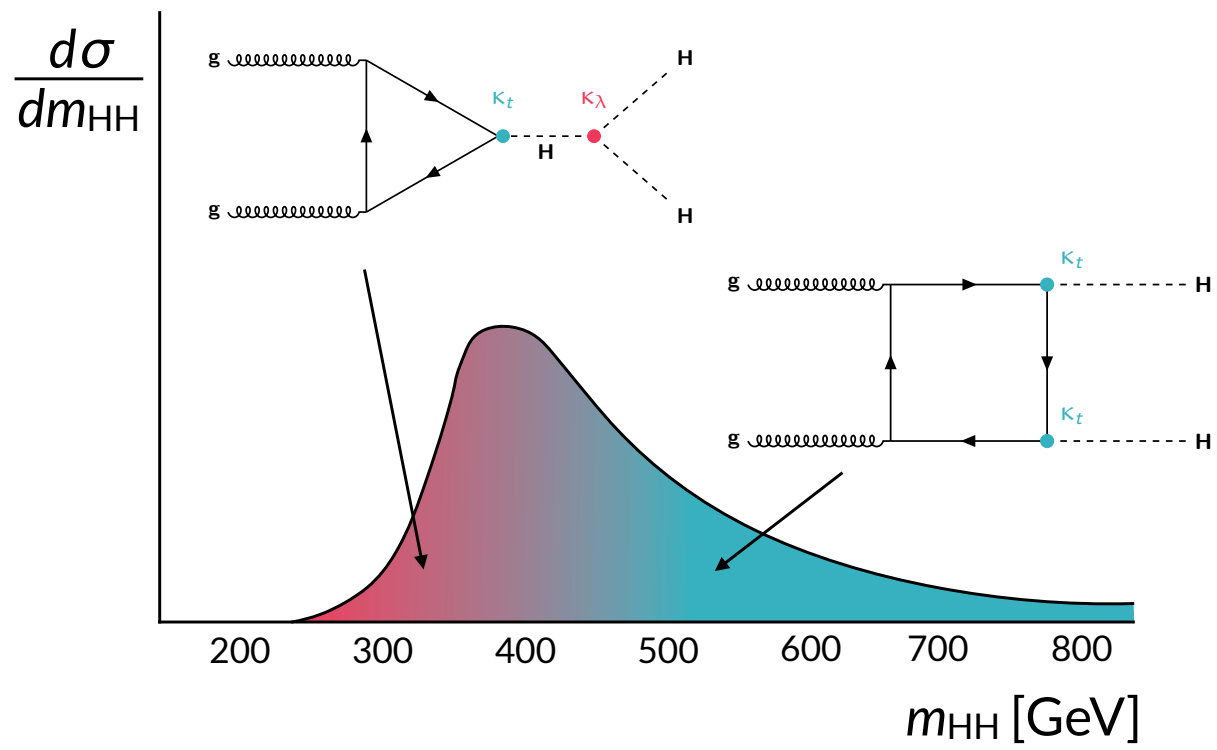
Results improving by factor of  $\sim x^{-0.76}$



# How does this result fit into the broader ATLAS *HH* Program?

## Combination and Future Prospects

# Combination: $HH \rightarrow b\bar{b}b\bar{b}, b\bar{b}\tau\tau, b\bar{b}\gamma\gamma$

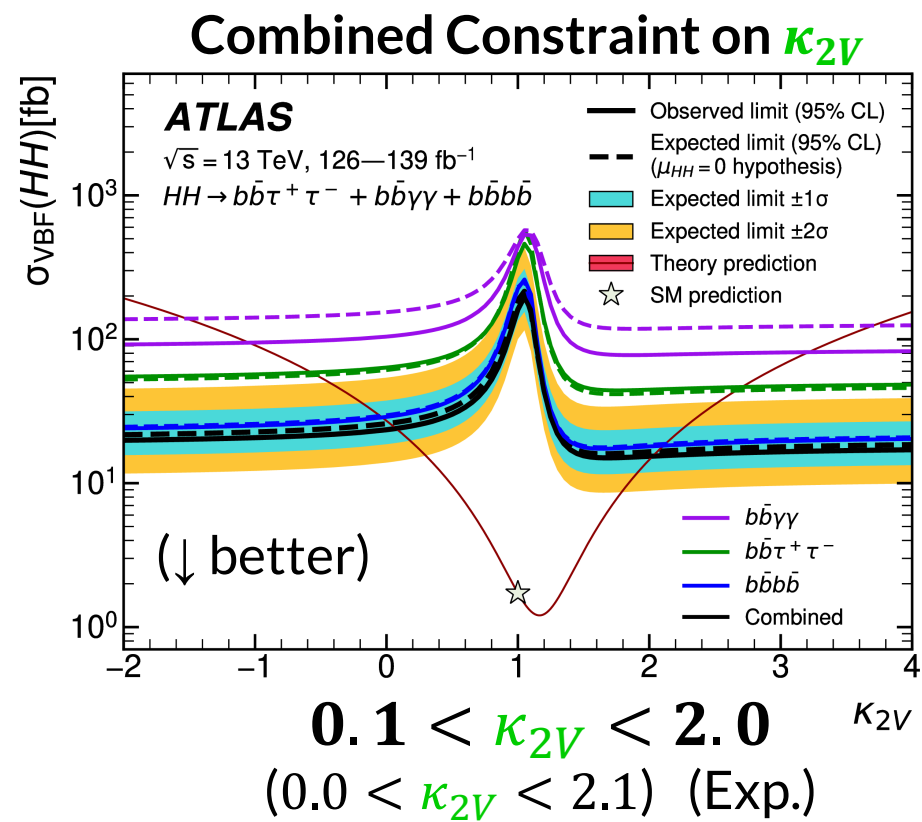
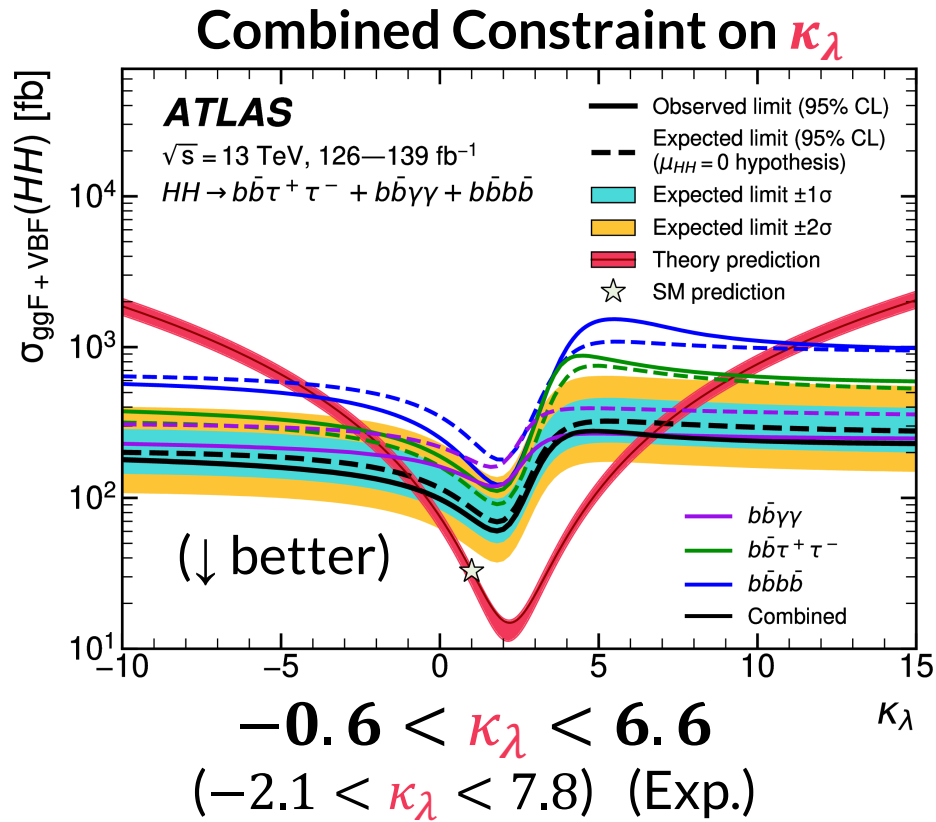


	bb	WW	ττ	ZZ	γγ
bb	34%				
WW	25%	4.6%			
ττ	7.3%	2.7%	0.39%		
ZZ	3.1%	1.1%	0.33%	0.069%	
γγ	0.26%	0.10%	0.028%	0.012%	0.0005%

←  $b\bar{b}\gamma\gamma$        $b\bar{b}\tau\tau$        $b\bar{b}b\bar{b}$  →

~ Sensitive region by decay channel

# Combination: $HH \rightarrow b\bar{b}b\bar{b}, b\bar{b}\tau\tau, b\bar{b}\gamma\gamma$



	bb	WW	$\tau\tau$	ZZ	$\gamma\gamma$
bb	34%				
WW	25%	4.6%			
$\tau\tau$	7.3%	2.7%	0.39%		
ZZ	3.1%	1.1%	0.33%	0.069%	
$\gamma\gamma$	0.26%	0.10%	0.028%	0.012%	0.0005%

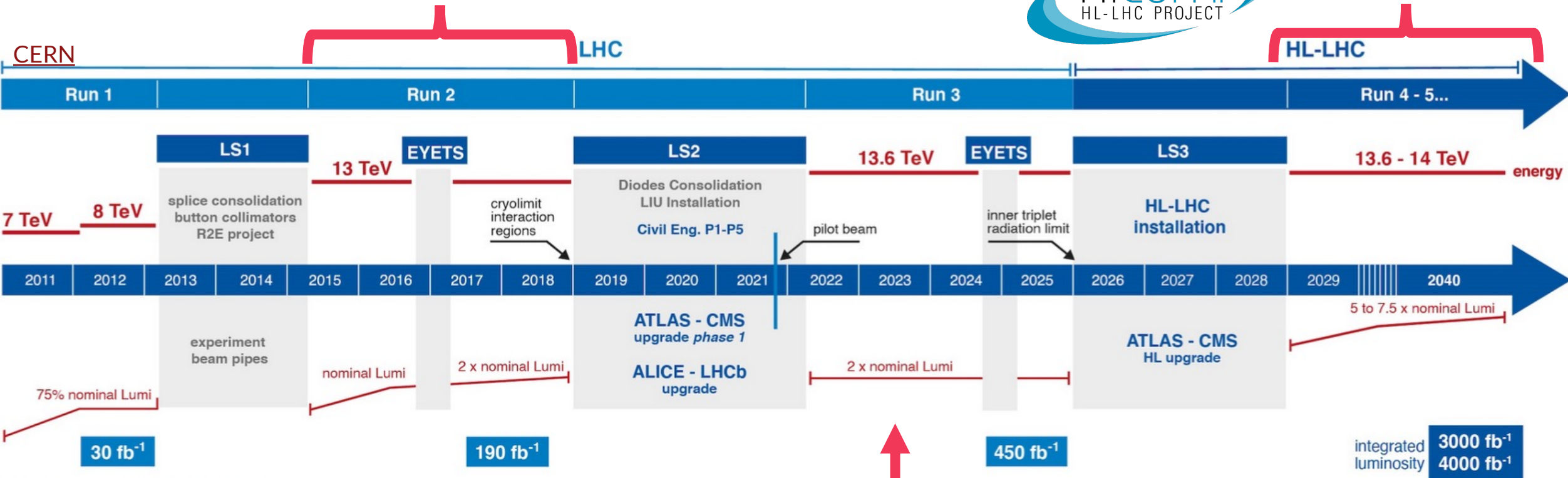
$\rightarrow b\bar{b}b\bar{b}$  final state less sensitive to BSM  $\kappa_\lambda$ , but most sensitive to BSM  $\kappa_{2V}$

# Looking to the Future: The High-Luminosity LHC

Data shown today ~ Run 2



Future: HL-LHC



Today (Run 3 Ongoing)

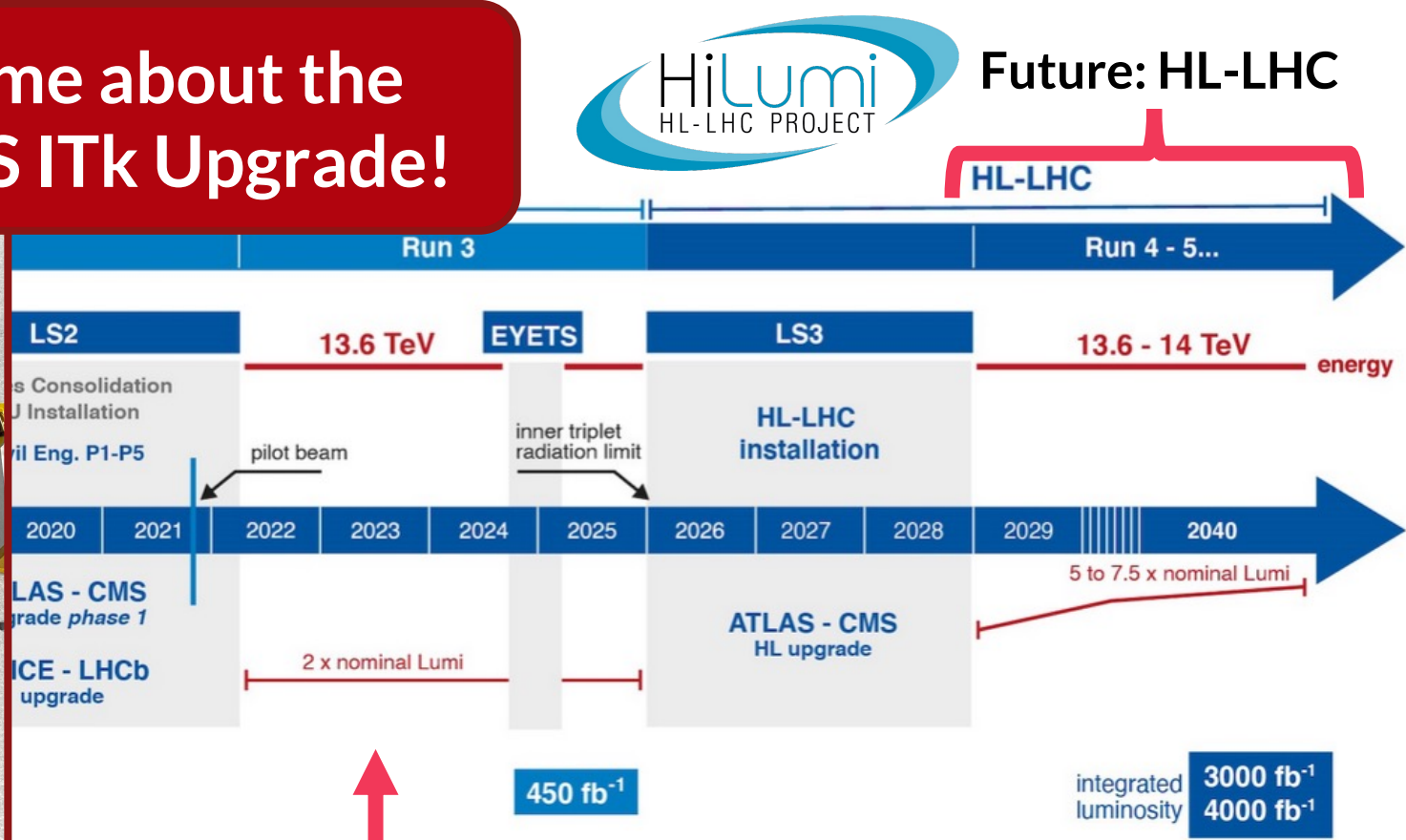
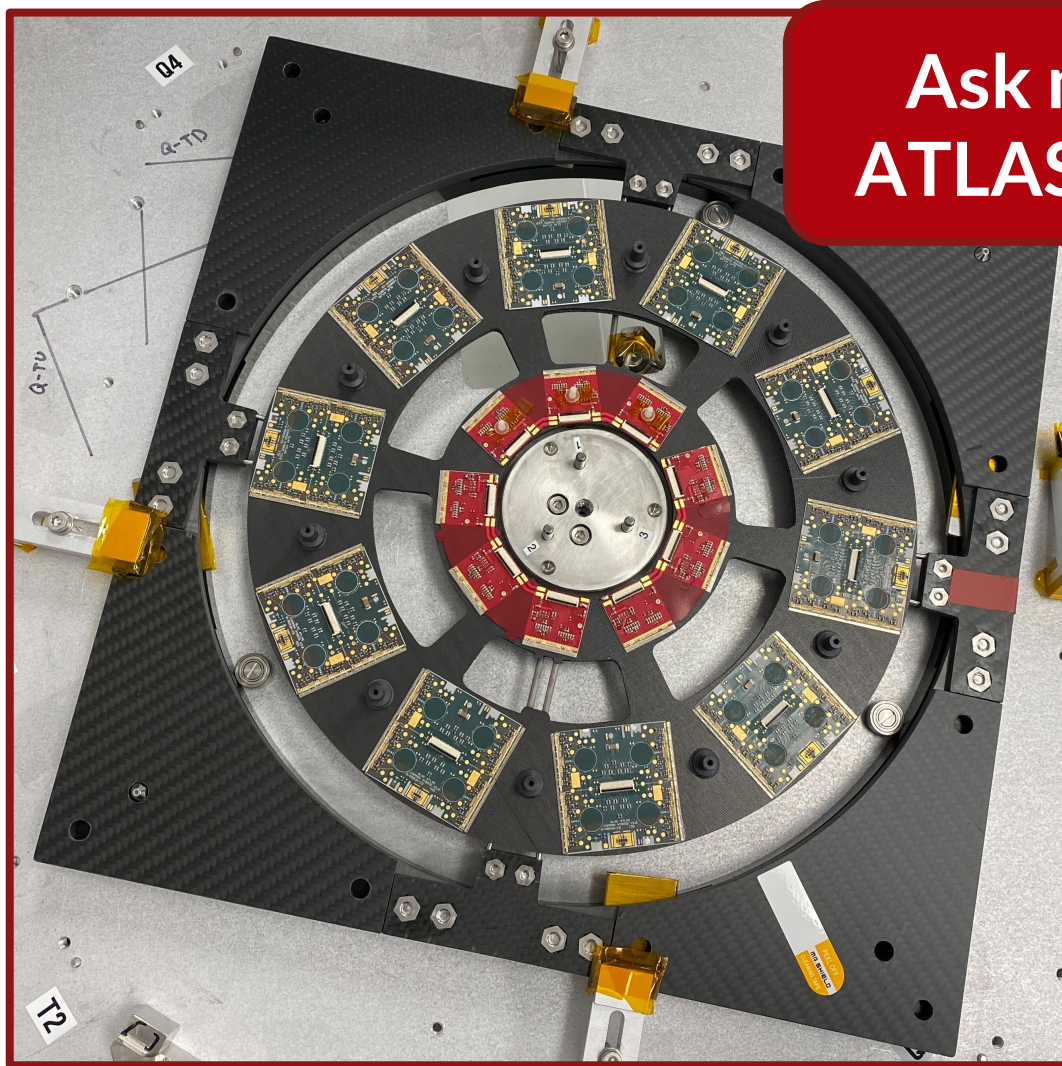
Expect ~20x more data than collected in Run 2!

# Looking to the Future: The High-Luminosity LHC

Ask me about the ATLAS ITk Upgrade!



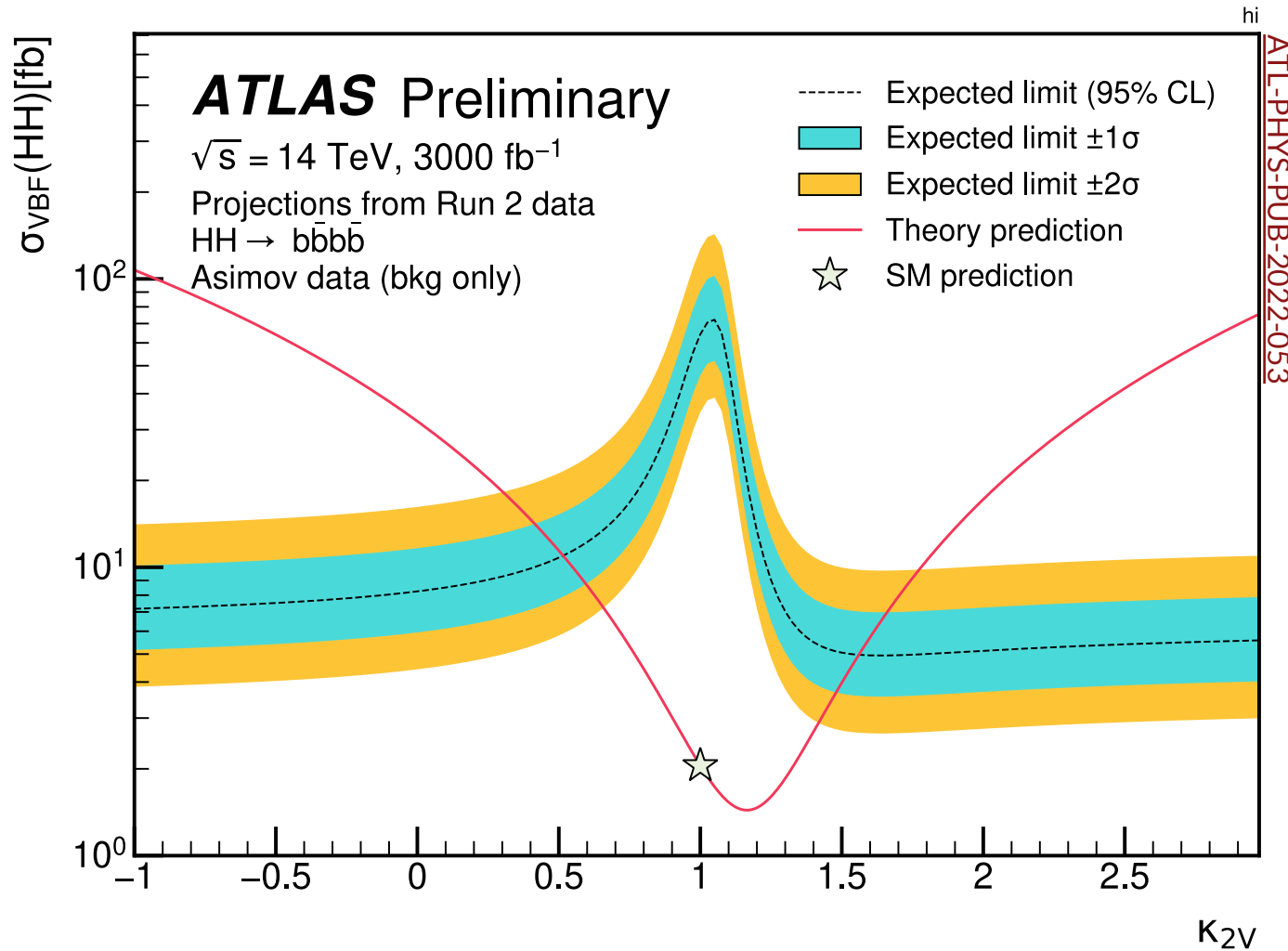
Future: HL-LHC



Today (Run 3 Ongoing)

Expect ~20x more data than collected in Run 2!

# HH Prospects at the High-Luminosity LHC: $\kappa_{2V}$



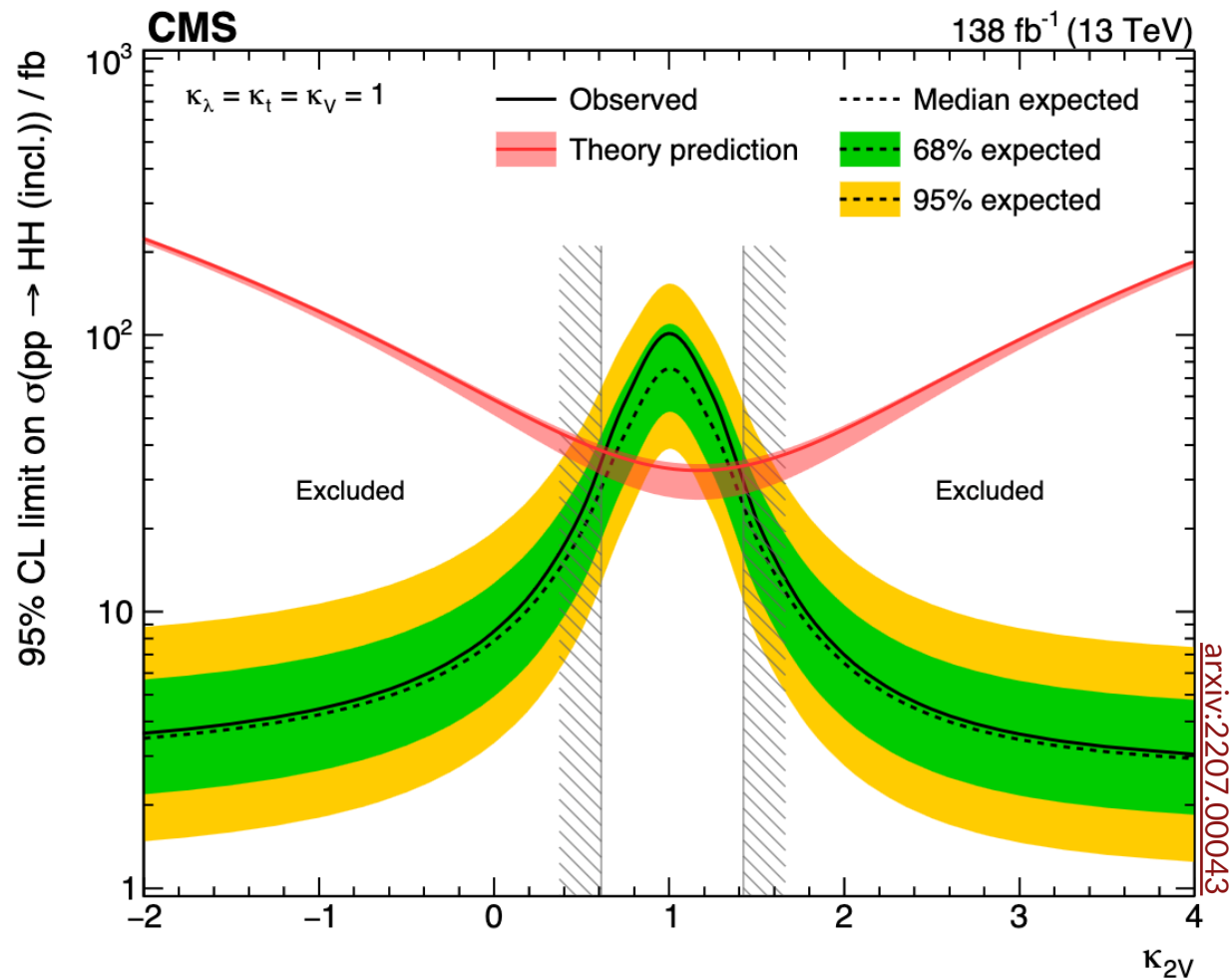
Full HL-LHC Dataset,  
 $HH \rightarrow b\bar{b}b\bar{b}$  only:

$$0.5 < \kappa_{2V} < 1.6$$

→ Sensitive to  $\mathcal{O}(\sim 50\%)$  effects



# How is CMS Doing?

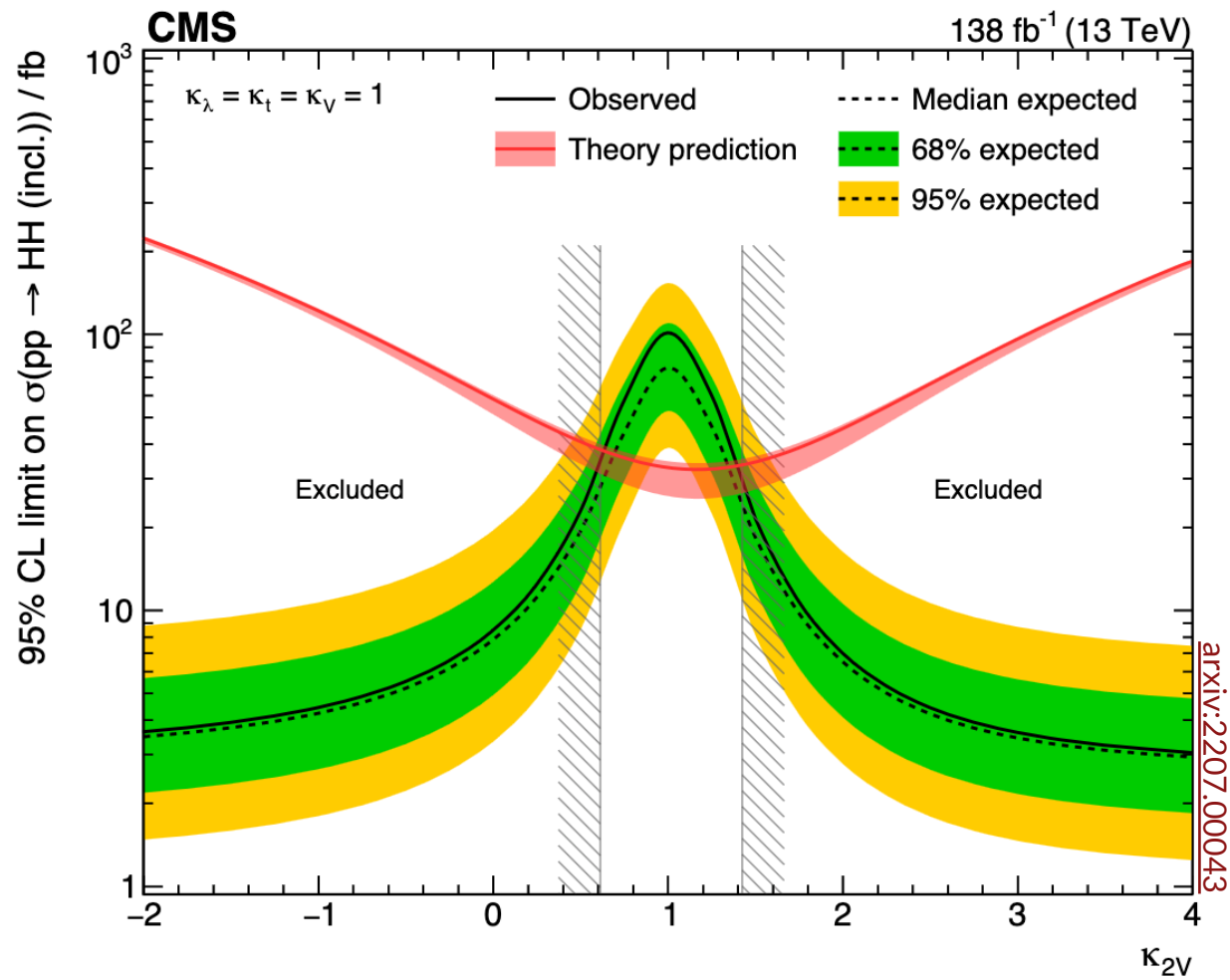


CMS *HH* Combination (Run 2):

$$0.67 < \kappa_{2V} < 1.38$$

... better than ATLAS HL-LHC  
Projection??

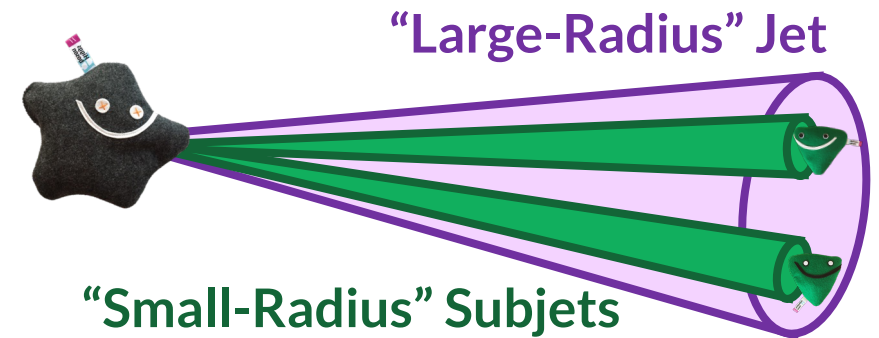
# How is CMS Doing?



CMS *HH* Combination (Run 2):

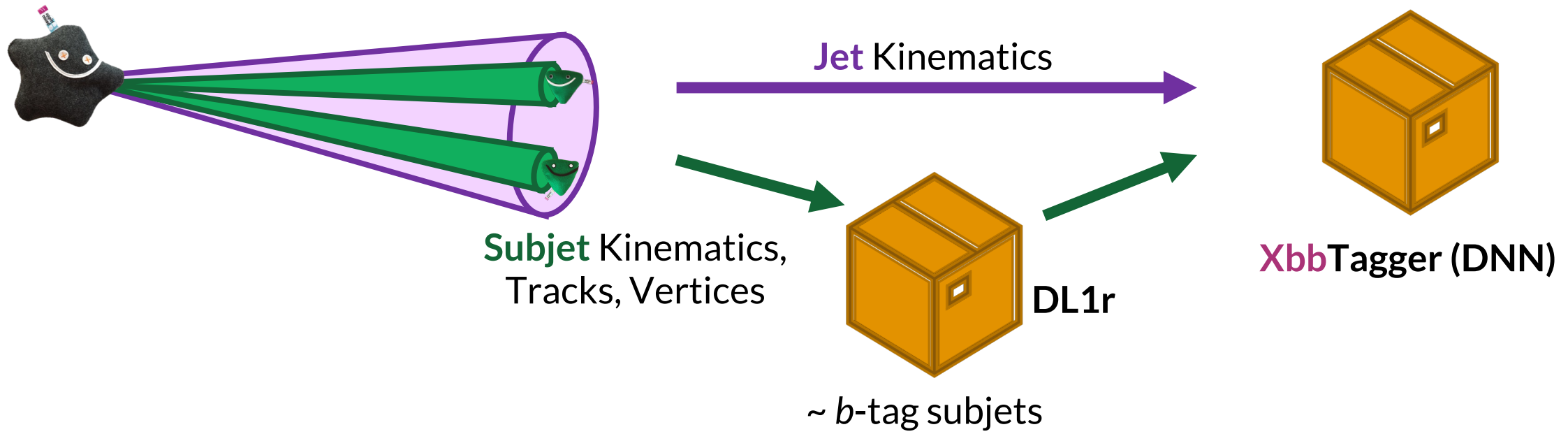
$$0.67 < \kappa_{2V} < 1.38$$

→ Driven by “boosted”  $b\bar{b}b\bar{b}$  analysis!



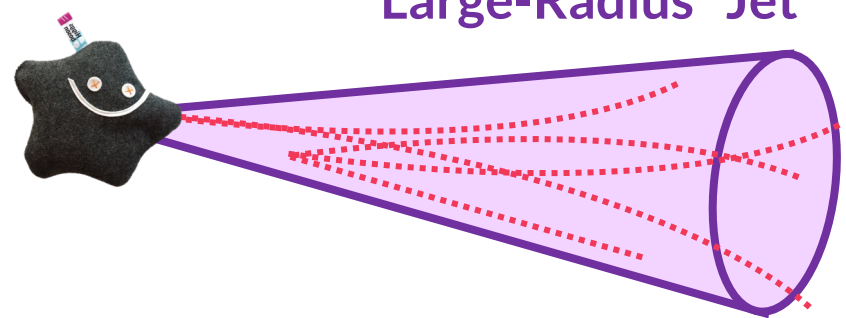
Less background at higher energy +  
 Dedicated ML-based  $H \rightarrow b\bar{b}$  tagging

# Boosted $X \rightarrow b\bar{b}$ Tagging in ATLAS

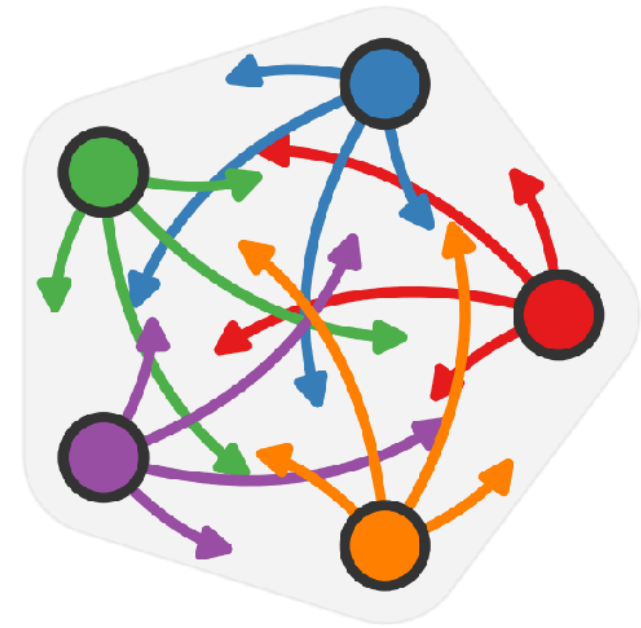


# Boosted $X \rightarrow b\bar{b}$ Tagging in ATLAS

“Large-Radius” Jet



Jet Kinematics, Tracks, Vertices

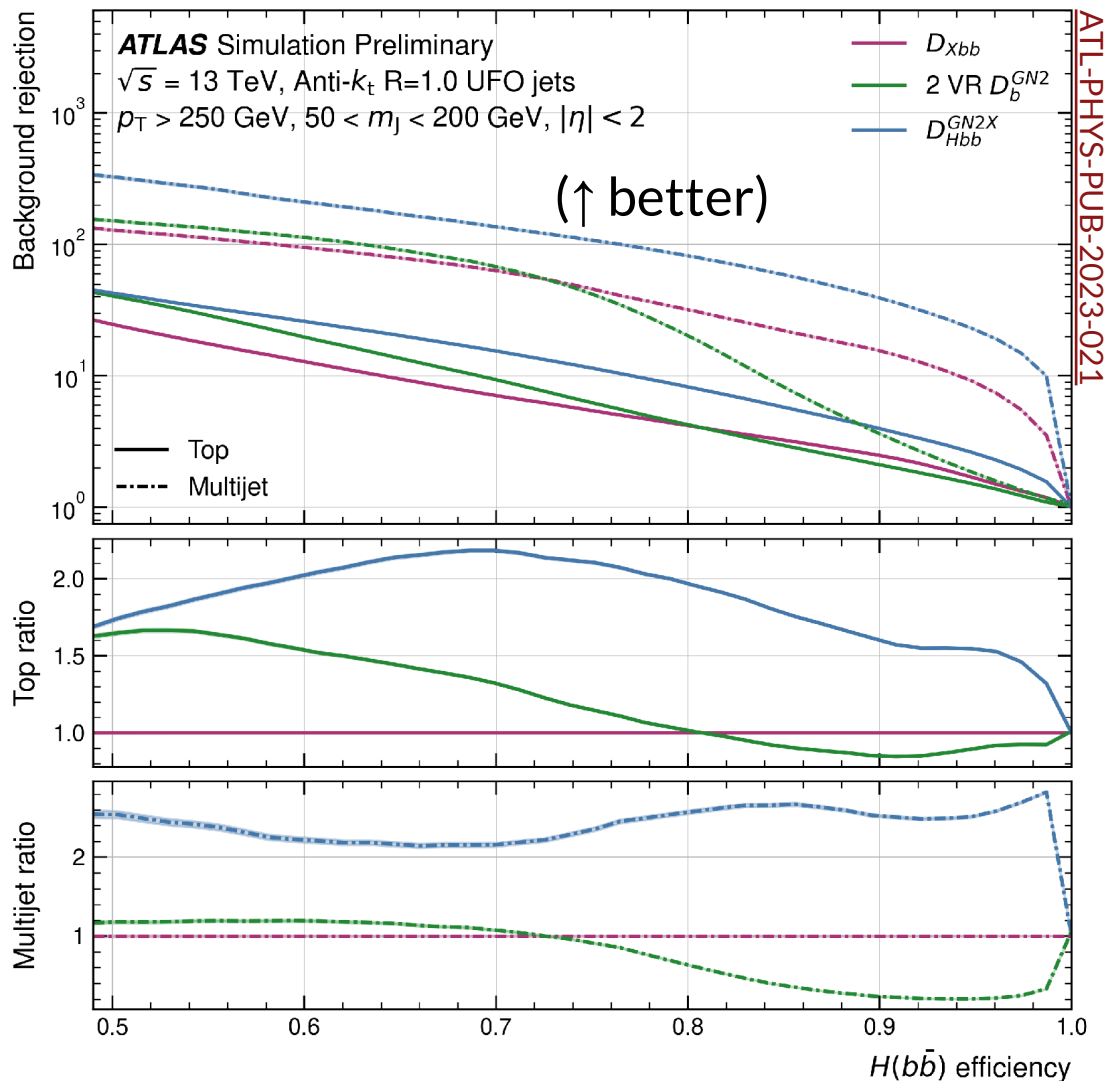


**GN2X Tagger**  
(Transformer Neural Network)

[ATL-PHYS-PUB-2023-021](#)



# Boosted $b\bar{b}$ Tagging in ATLAS Today



Factor of  $\sim 2x$  Improvement in **GN2X** compared to **Xbb**!

Significantly more correlations accessible to **GN2X**

Enabled by new architectures (GNNs/Transformers)

# Conclusions

---

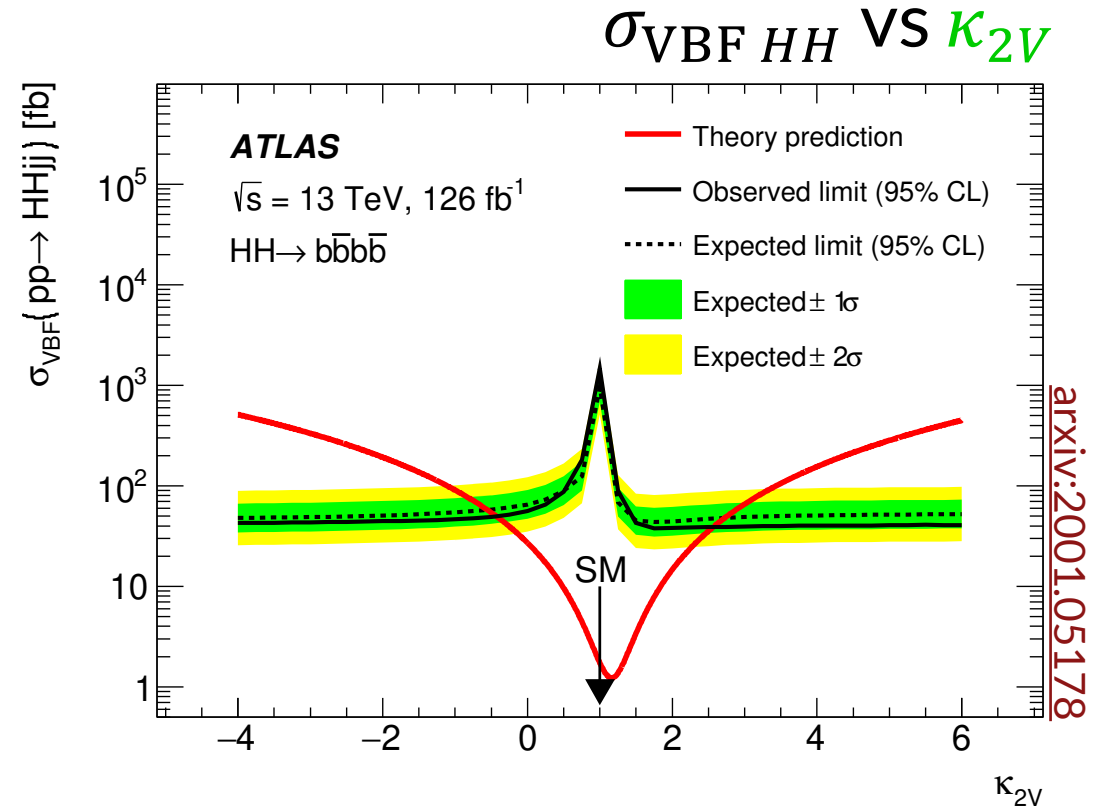
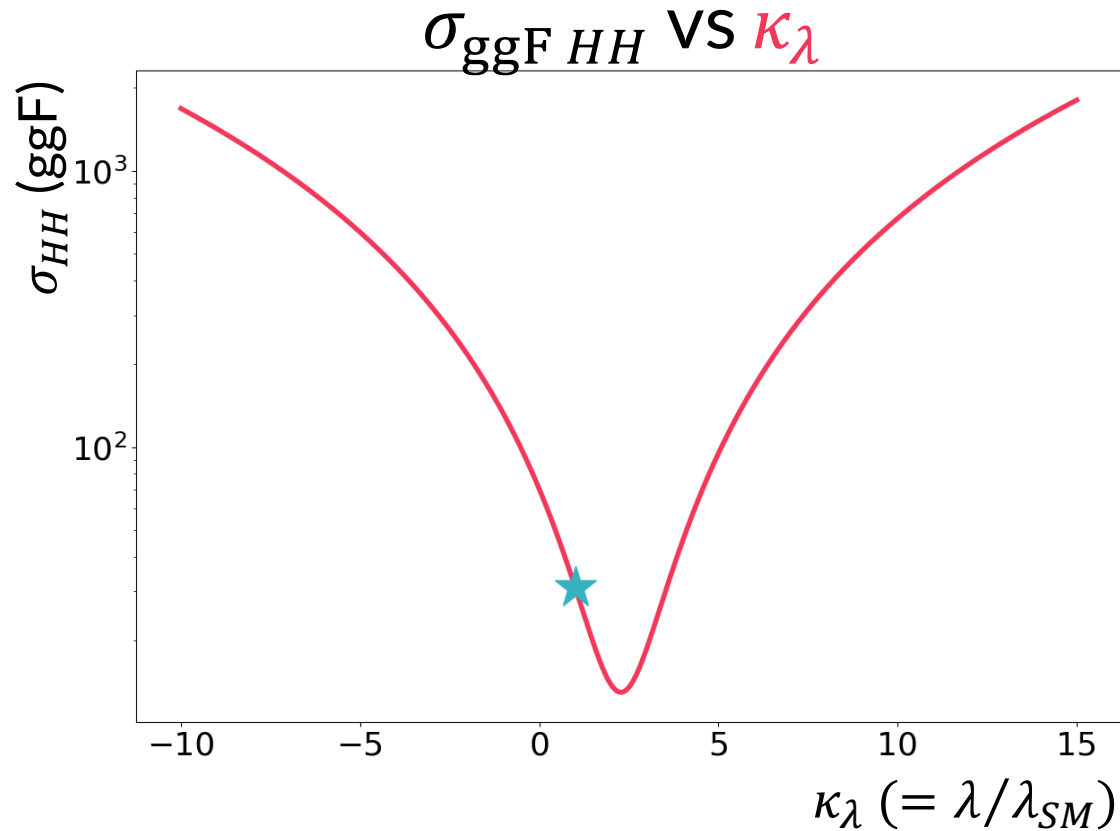
- Measuring  $HH$  production probes the Higgs boson potential, which could hold the key to big question left unanswered by the Standard Model
  - ... but, it's hard to measure!
- Machine learning is enabling measurements in “impossible” channels, like  $b\bar{b}b\bar{b}$
- Clever analysis strategies will allow us to make the best use of upcoming data

**Thanks for listening!**

---

# Additional Material

# Sensitivity to New Physics in the $HHVV$ Coupling



New physics  $\rightarrow$  more signal!



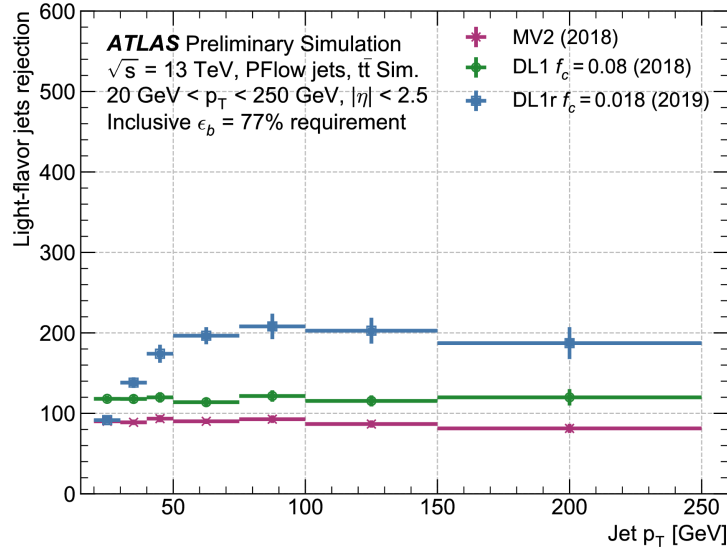
# b-Tagging in ATLAS

Improving ATLAS analyses through Machine Learning-based object identification

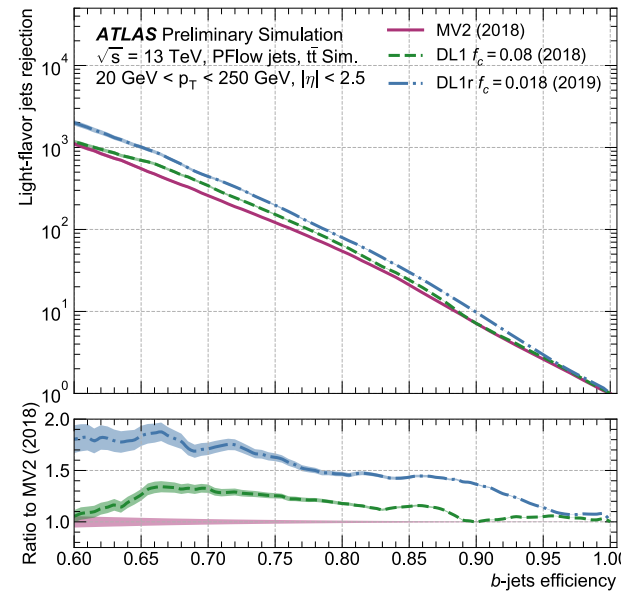
MV2C10: Boosted Decision Tree

DL1r: Deep Neural Network  
([FTAG-2019-005](#))

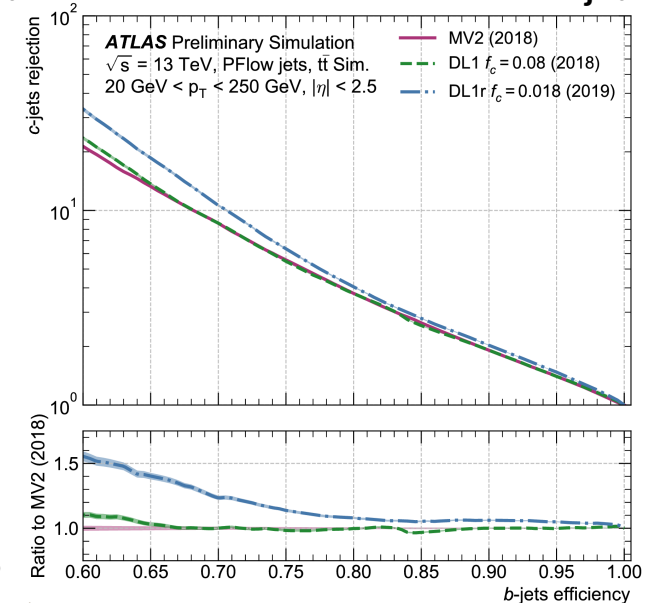
Light jet Rejection vs.  $p_T$



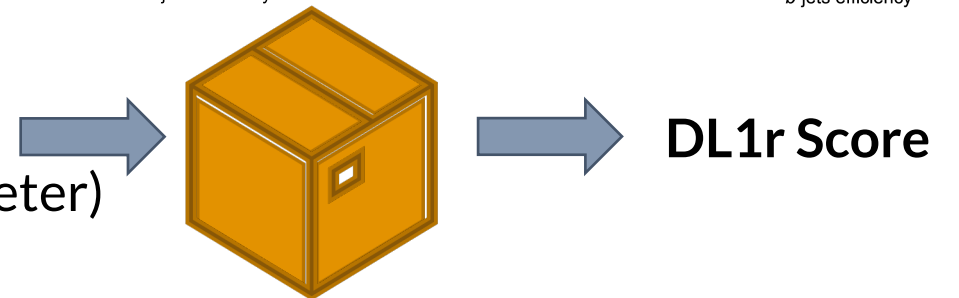
Light jet Rejection vs.  $\epsilon_{b\text{-jet}}$



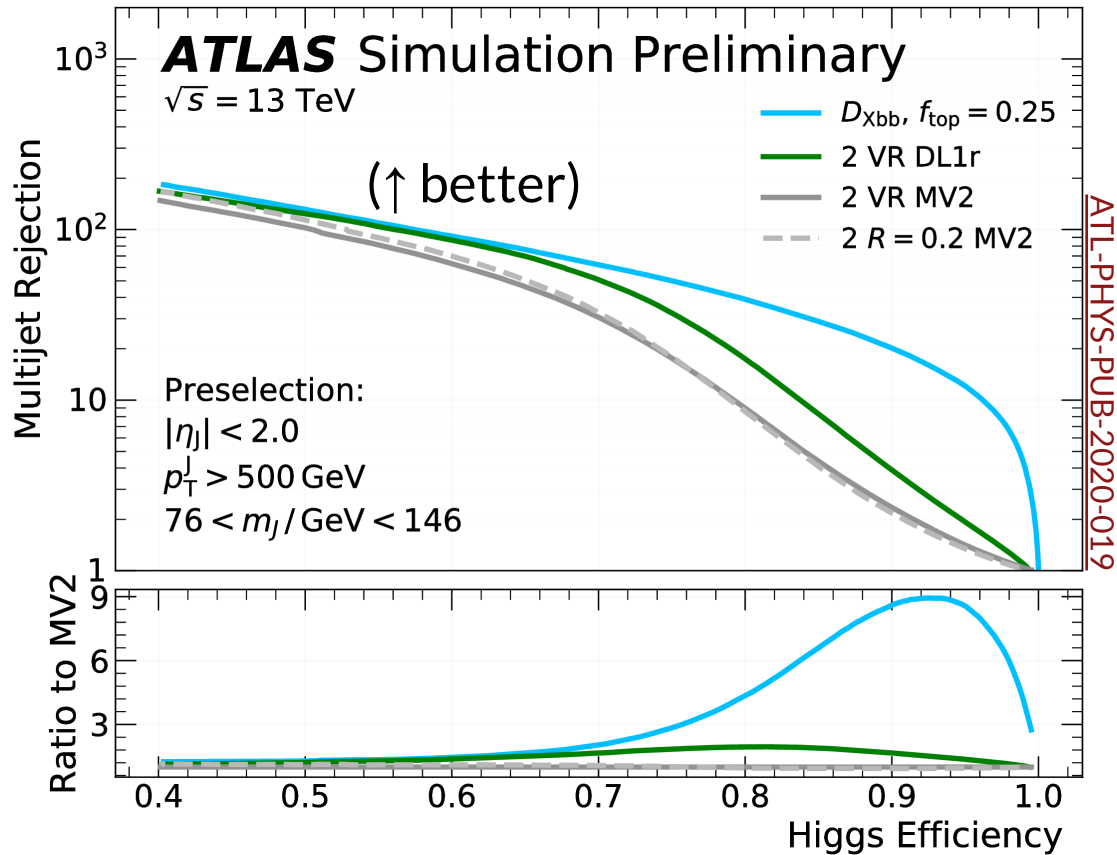
c-jet Rejection vs.  $\epsilon_{b\text{-jet}}$



- RNNIP (Recurrent NN)
- JetFitter (Kalman Filter)
- IP2D/IP3D (Impact Parameter)
- SV1 (Secondary Vertex)



# The Evolution of Boosted $b\bar{b}$ Tagging in ATLAS



Unlike **subject tagging**, **Xbb tagger** accounts for *correlations* between subjects

**Jet Inputs**  
(Kinematics)

**Subject Inputs**  
(Tracks + Vertices)

**Low-Level Algorithms:**  
Utilize Impact Parameter, Secondary Vertices, Reconstructed B decay

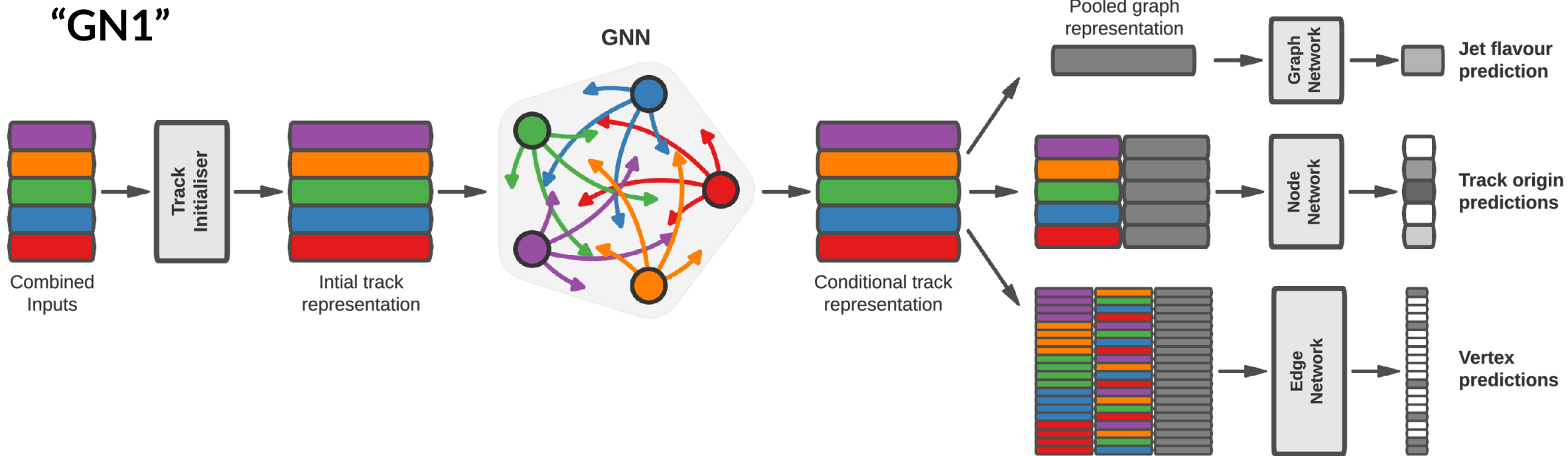
**High-Level Algorithms:**  
Utilize Outputs from Low-Level Algorithms

**ML!**

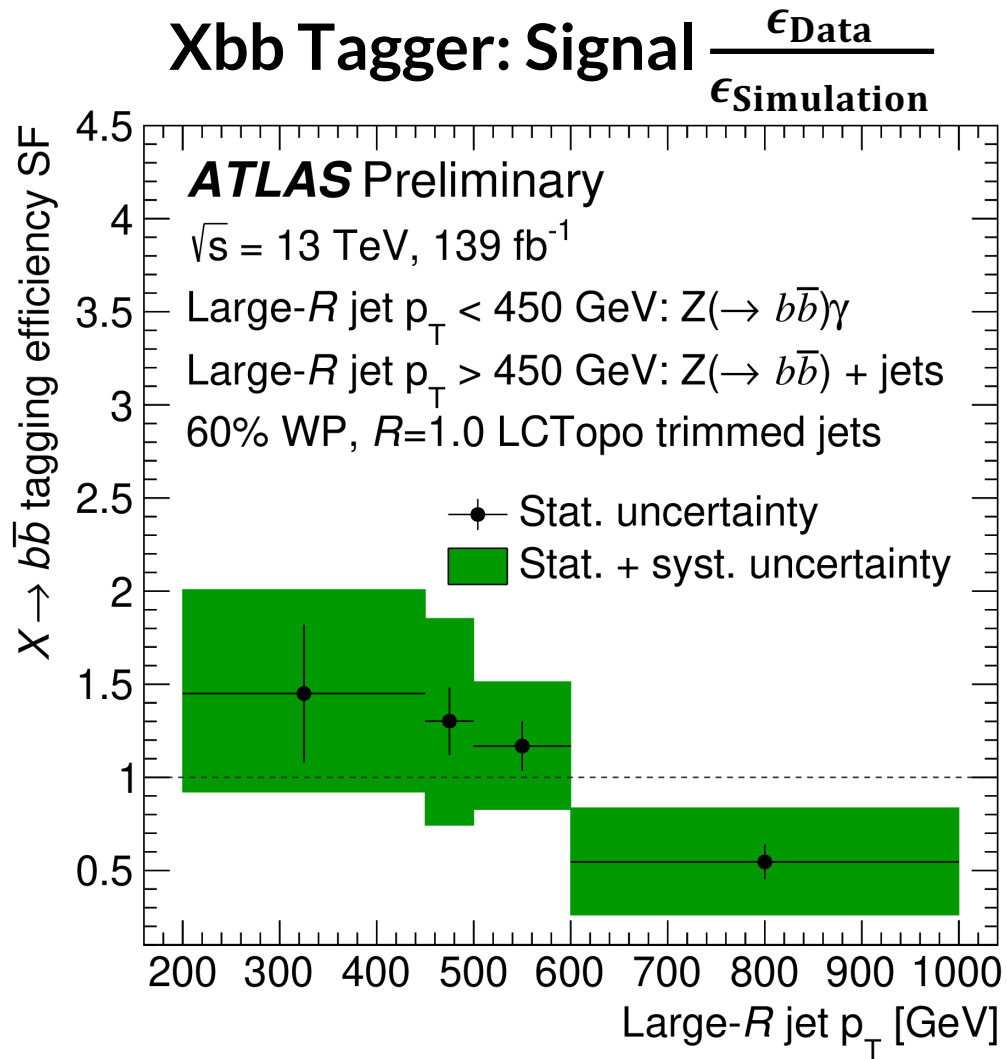
**Xbb Tagger (Neural Network)**

**More ML!**

# GN1 Architecture



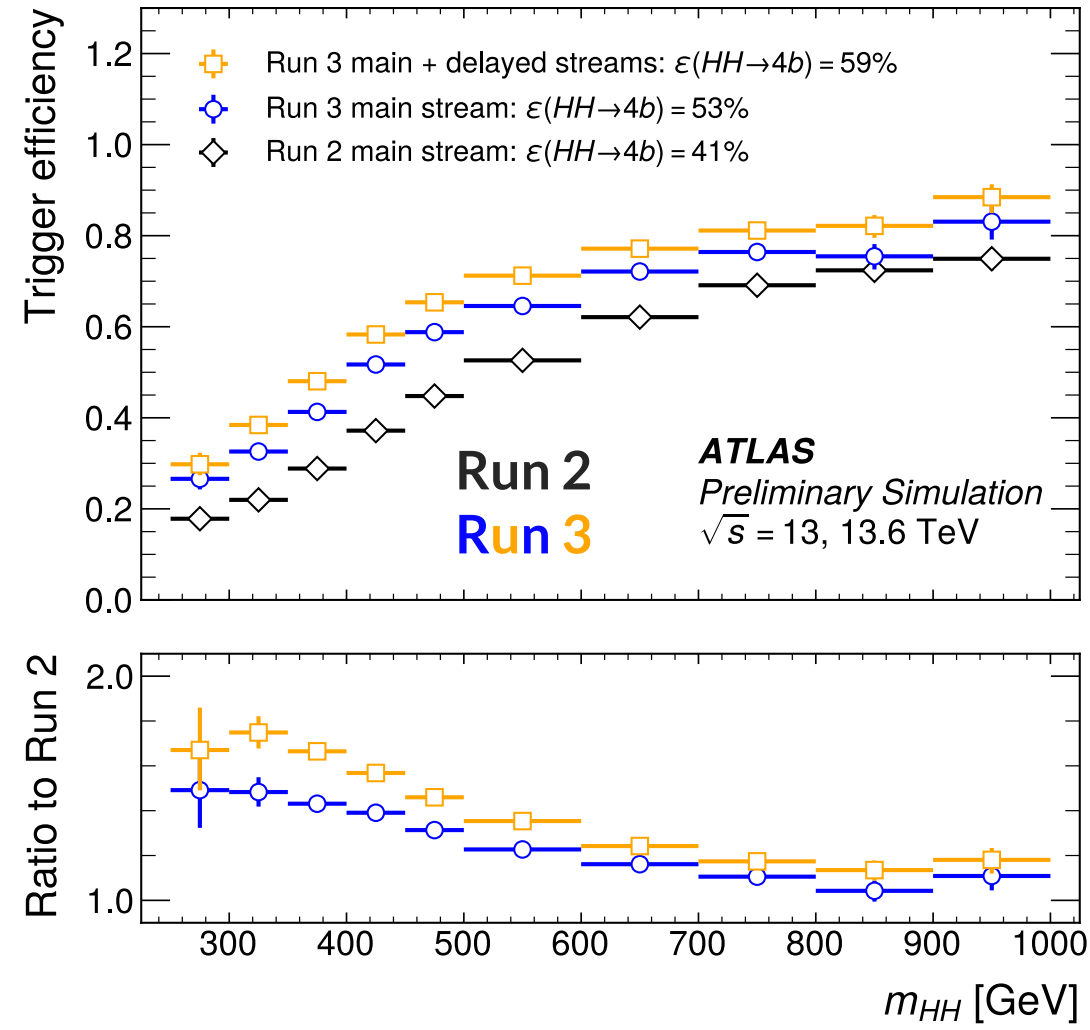
# Performance is not the End of the Story



$\mathcal{O}(30\%)$  uncertainty on the selection efficiency of  $H \rightarrow b\bar{b}$  signal events by the Xbb tagger

Precise calibration critical for the future of GN2X!

# Trigger Efficiency for $ggF\ HH \rightarrow b\bar{b}b\bar{b}$ Events



Combination of Triggers (Run 2):

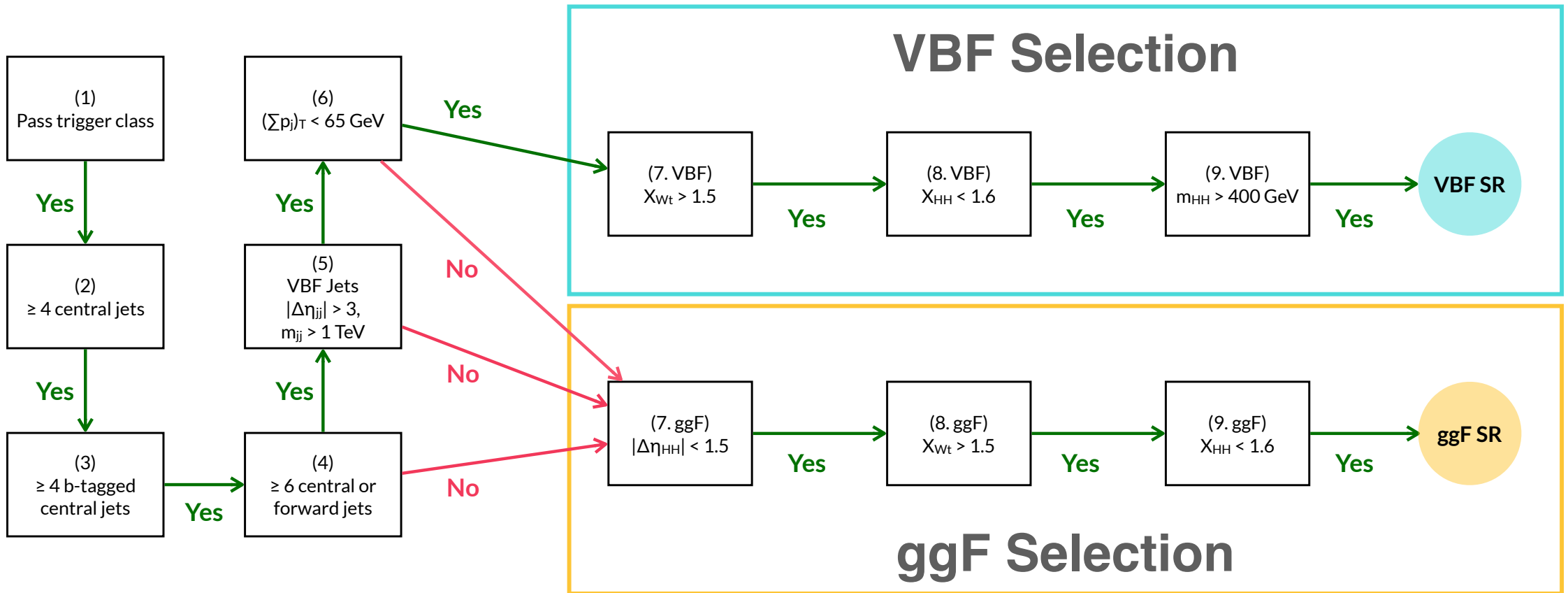
- 2  $b$ -jet + 1 jet
- 2  $b$ -jet + 2 jet

Run 3:

“Asymmetric” requirements on jet  $p_T$

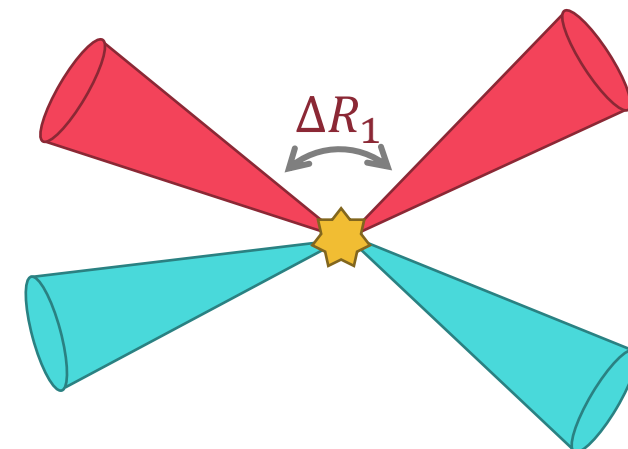
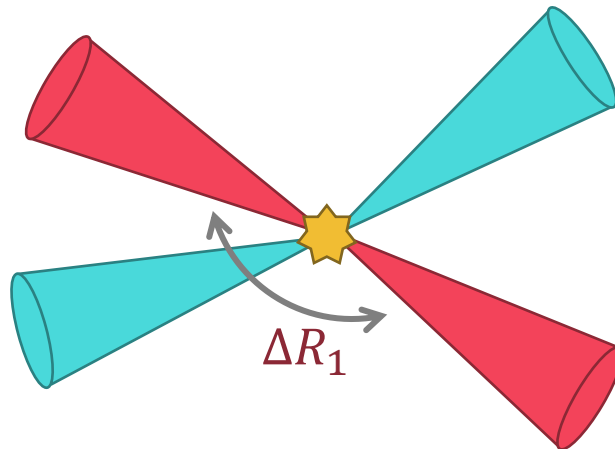
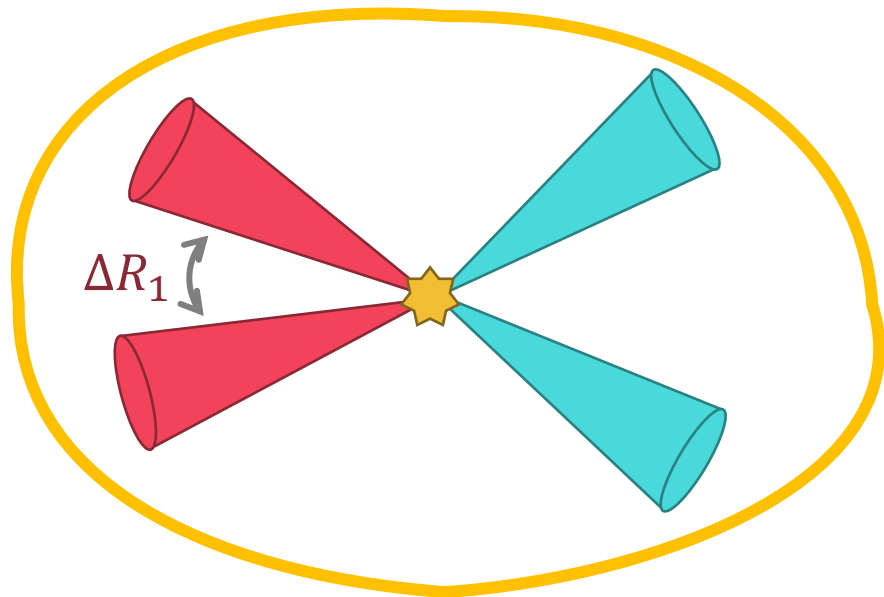
# Full Analysis Selection

$$X_{Wt} = \min \left[ \sqrt{\left(\frac{m_{jj} - m_W}{0.1m_{jj}}\right)^2 + \left(\frac{m_{jjb} - m_t}{0.1m_{jjb}}\right)^2} \right] \quad X_{HH} = \sqrt{\left(\frac{m_{H1} - 124 \text{ GeV}}{0.1m_{H1}}\right)^2 + \left(\frac{m_{H2} - 117 \text{ GeV}}{0.1m_{H2}}\right)^2}$$



# “Pairing” Higgs Bosons

Combinatorics: three possible pairings given four  $b$ -tagged jets



Pairing  $\geq 70\%$  accurate for VBF  
 ( $\geq 90\%$  for  $\kappa_{2V}$  far from 1)



“Leading” Reconstructed Higgs Boson

“Subleading” Reconstructed Higgs Boson

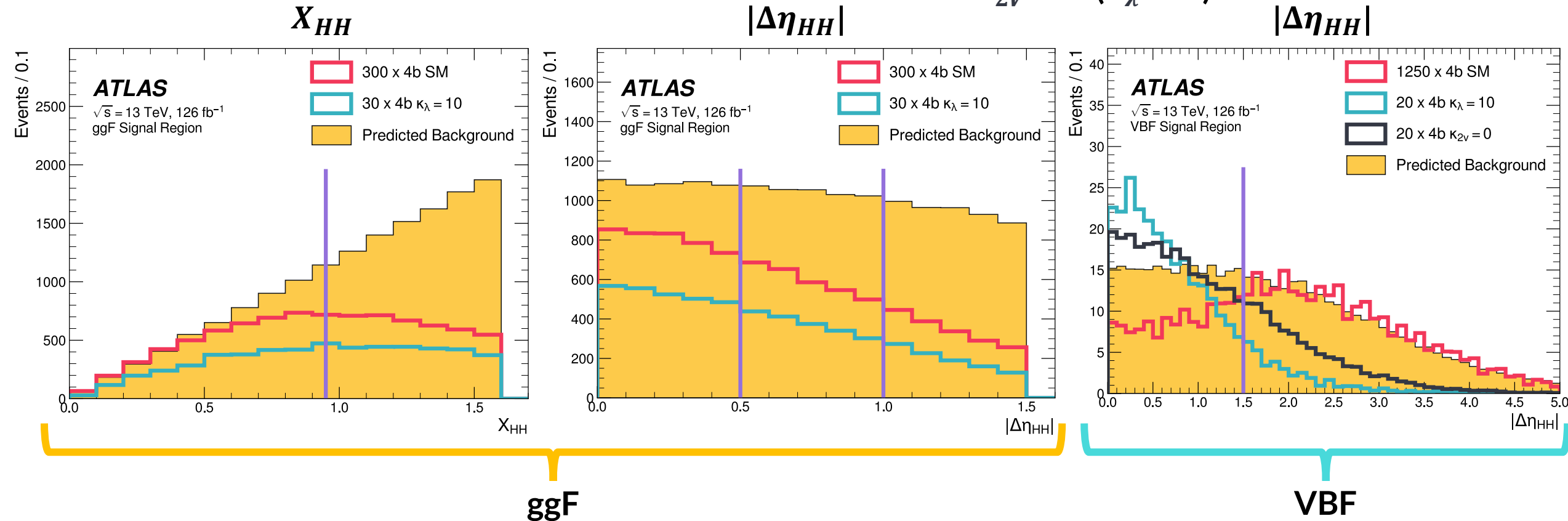
# Categorization

Isolate different physics ( $\kappa_\lambda, \kappa_{2V}$ ) scenarios

Standard Model ( $\kappa_\lambda = \kappa_{2V} = 1$ )

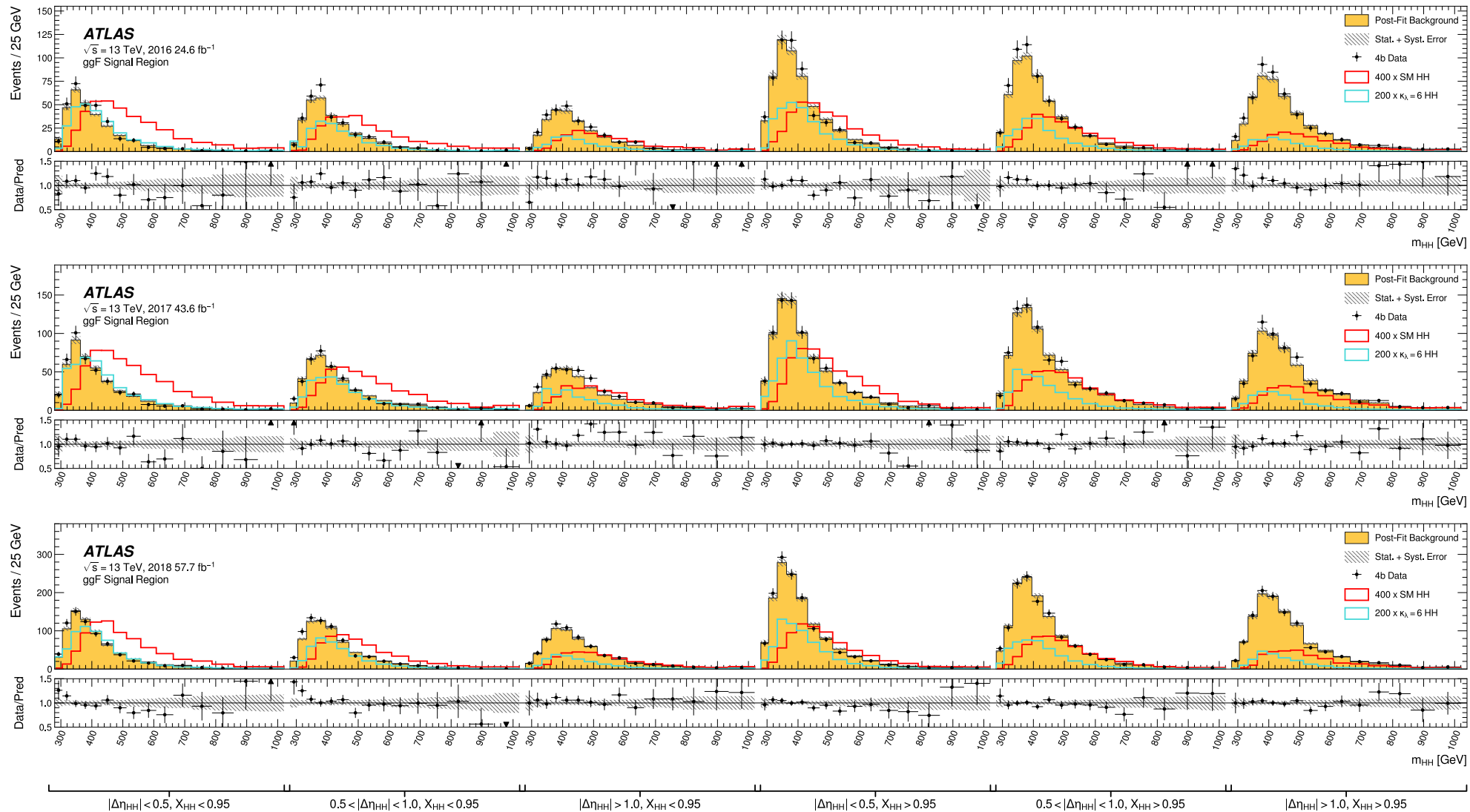
$\kappa_\lambda = 10$  ( $\kappa_{2V} = 1$ )

$\kappa_{2V} = 0$  ( $\kappa_\lambda = 1$ )

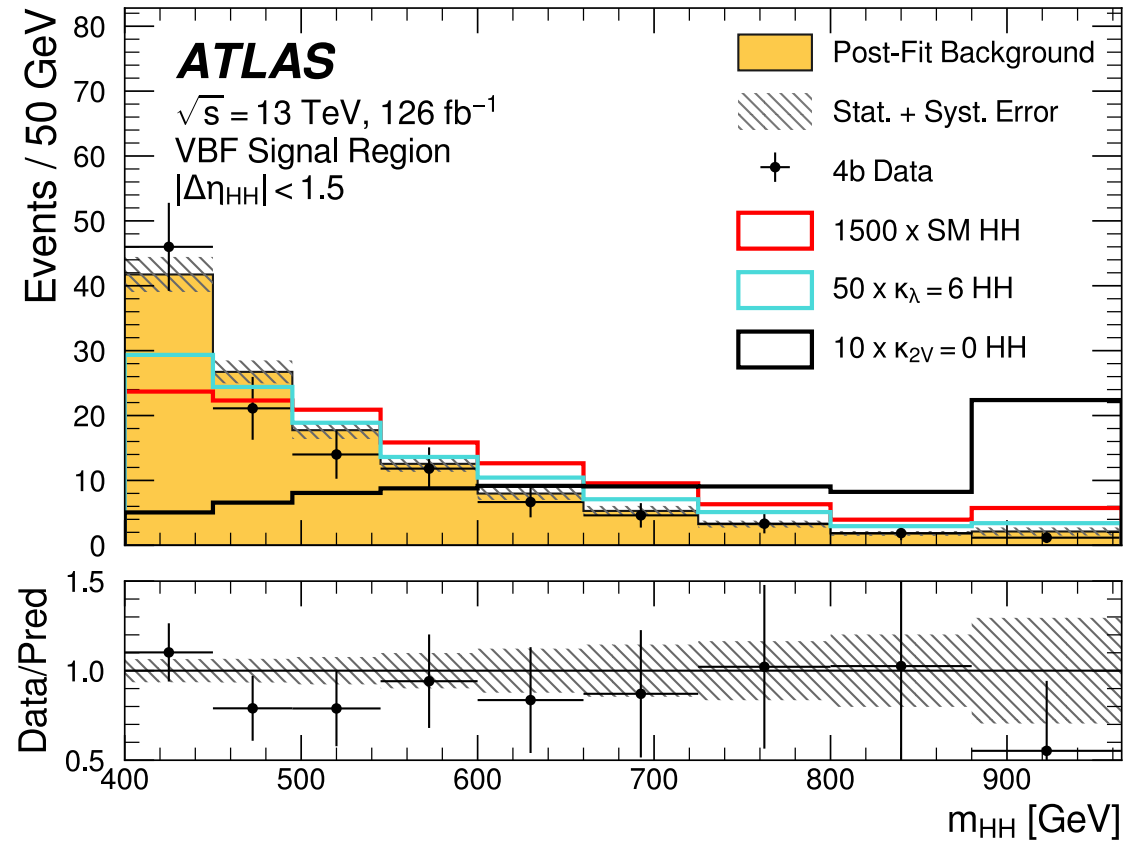
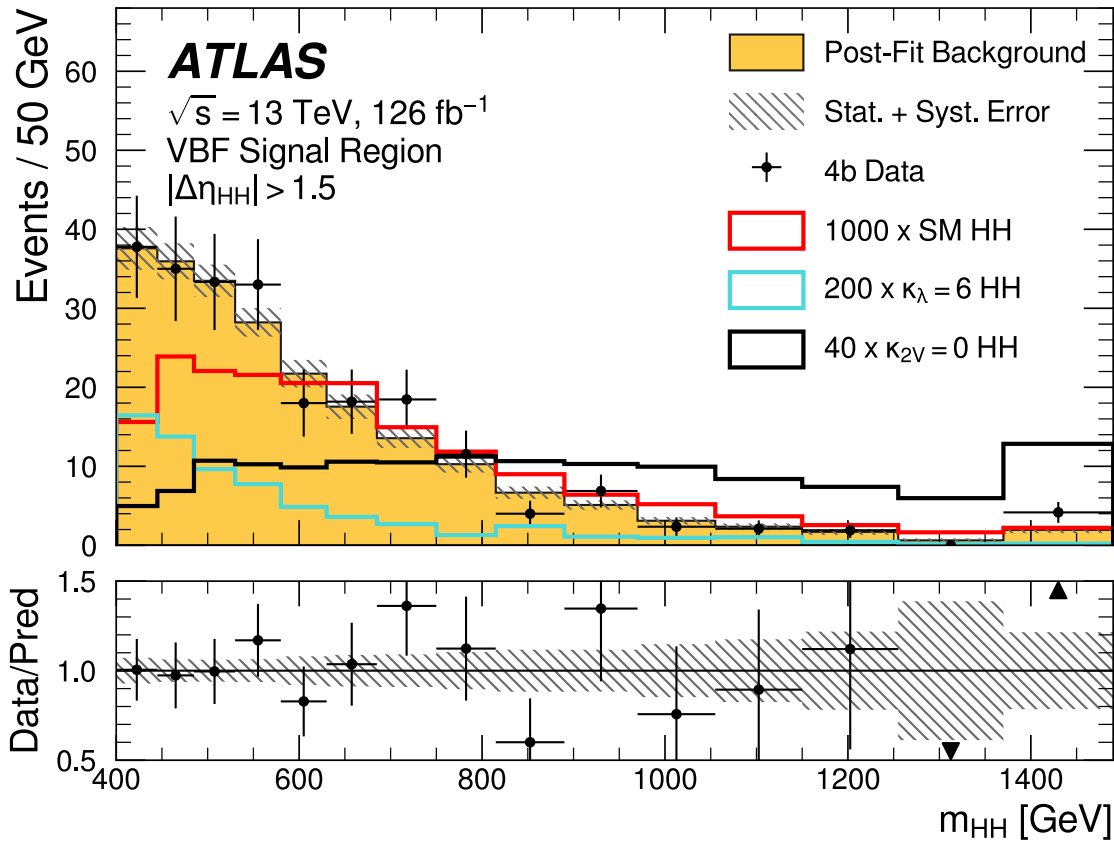




# Observed $m_{HH}$ Distributions in ggF Categories



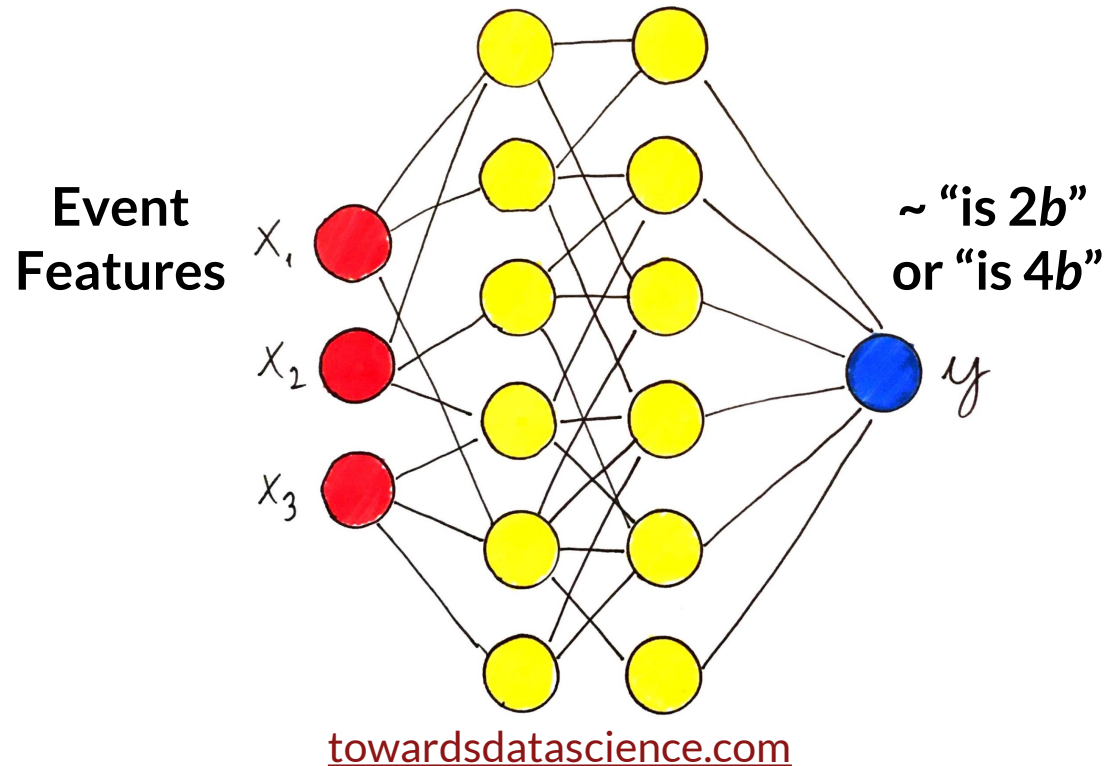
# Observed $m_{HH}$ Distributions in VBF Categories



# Neural Networks for Density Estimation

(Lemma) best discriminator between two classes:

$$\lambda = \frac{p_A}{p_A + p_B}$$



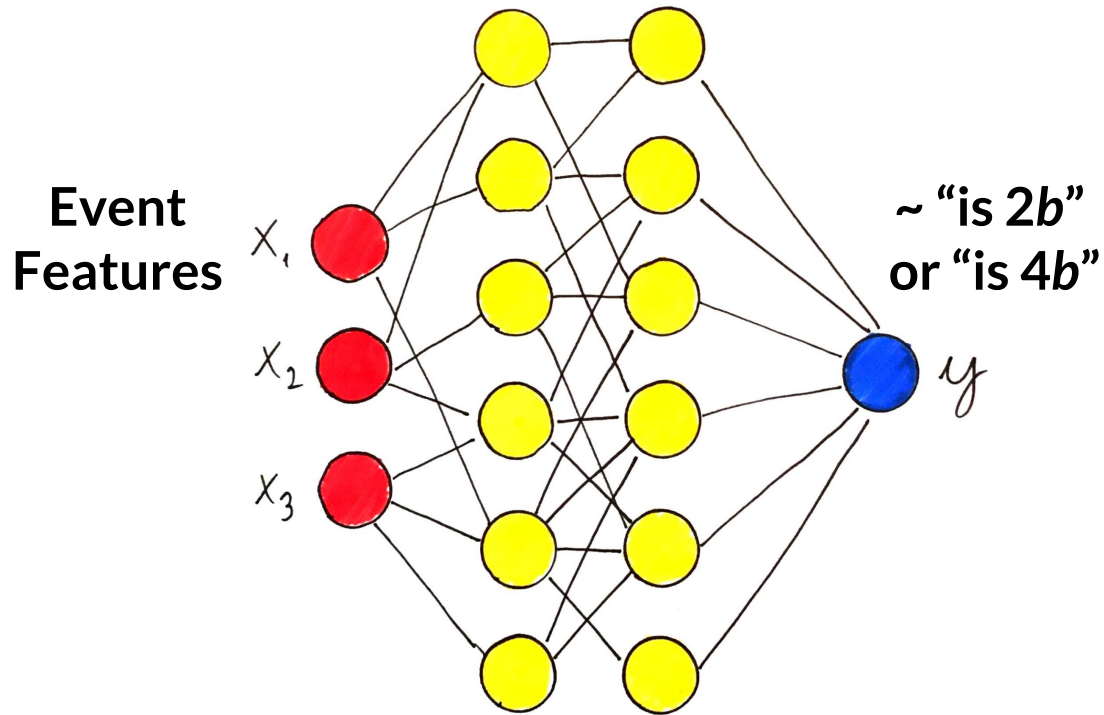
NNs classify data well  $\rightarrow$  approximate  $\lambda$

$$\frac{p_A}{p_B} = \frac{\lambda}{1 - \lambda}$$

$\rightarrow$  a classification NN can approximate the density ratio!

# Neural Networks for Density Estimation

$$p_{2b}(\vec{x}) \cdot w(\vec{x}) = p_{4b}(\vec{x})$$



[towardsdatascience.com](http://towardsdatascience.com)

Train NN with specific Loss function:

$$\mathcal{L}(R(\vec{x})) = \mathbb{E}_{x \sim p_{2b}} \left[ \sqrt{R(\vec{x})} \right] + \mathbb{E}_{x \sim p_{4b}} \left[ \frac{1}{\sqrt{R(\vec{x})}} \right]$$

$$\rightarrow \arg \min_R \mathcal{L}(R(\vec{x})) = w(\vec{x})$$

“Event-level” reweighting!

[arxiv:1911.00405](https://arxiv.org/abs/1911.00405)  
[Kanamori et. al. \(JMLR\)](#)

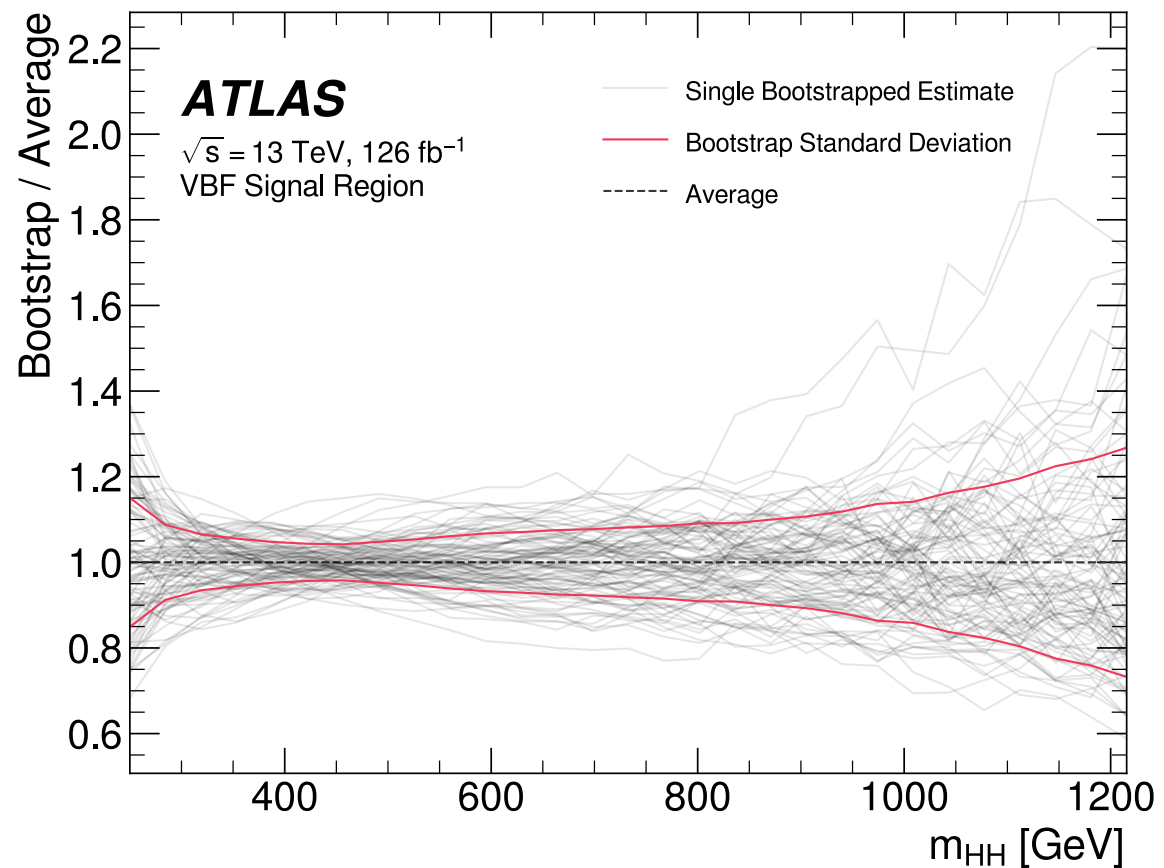
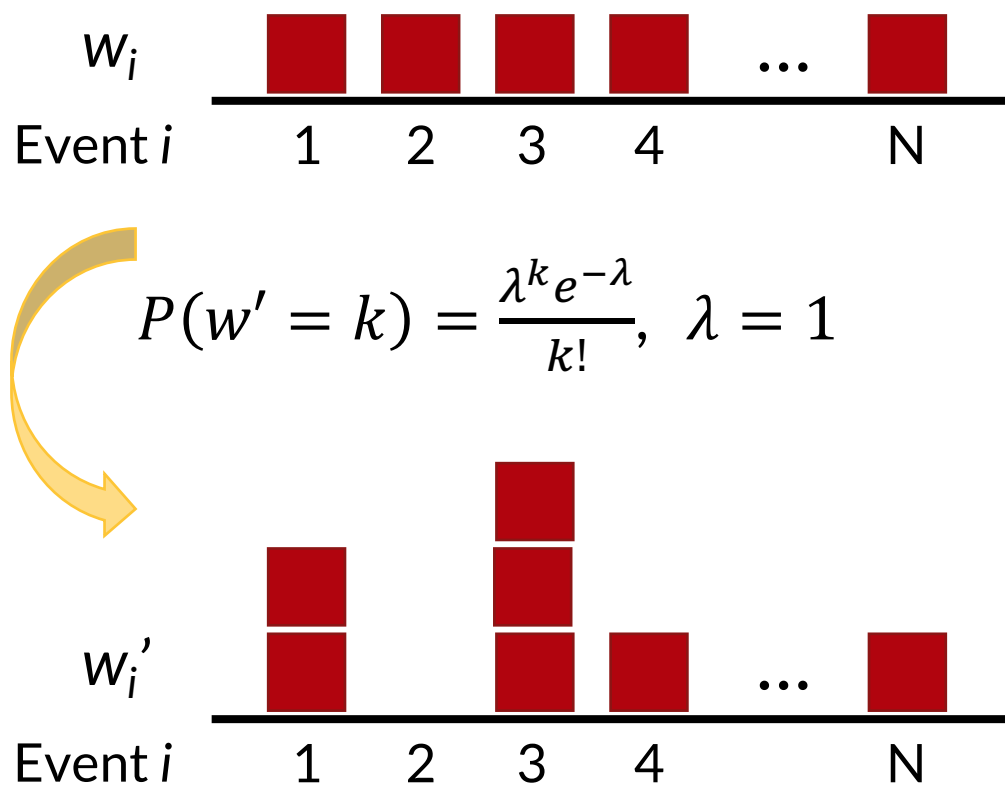
# Reweighting Neural Network – Details

## Architecture and Input Variables

	ggF	VBF	
<p>3 Densely-Connected Hidden Layers (50 Nodes Each)</p>	<ol style="list-style-type: none"> <li>1. <math>\log(p_T)</math> of the 2<sup>nd</sup> leading Higgs boson candidate jet</li> <li>2. <math>\log(p_T)</math> of the 4<sup>th</sup> leading Higgs boson candidate jet</li> <li>3. <math>\log(\Delta R)</math> between the closest two Higgs boson candidate jets</li> <li>4. <math>\log(\Delta R)</math> between the other two Higgs boson candidate jets</li> <li>5. Average absolute <math>\eta</math> value of the Higgs boson candidate jets</li> <li>6. <math>\log(p_T)</math> of the di-Higgs system</li> <li>7. <math>\Delta R</math> between the two Higgs boson candidates</li> <li>8. <math>\Delta\phi</math> between jets in the leading Higgs boson candidate</li> <li>9. <math>\Delta\phi</math> between jets in the subleading Higgs boson candidate</li> <li>10. <math>\log(X_{Wt})</math></li> <li>11. Number of jets in the event</li> <li>12. Trigger class index as one-hot encoder</li> </ol>	<ol style="list-style-type: none"> <li>1. Maximum dijet mass from the possible pairings of the four Higgs boson candidate jets</li> <li>2. Minimum dijet mass from the possible pairings of the four Higgs boson candidate jets</li> <li>3. Energy of the leading Higgs boson candidate</li> <li>4. Energy of the subleading Higgs boson candidate</li> <li>5. Second-smallest <math>\Delta R</math> between the jets in the leading Higgs boson candidate (from the three possible pairings for the leading Higgs candidate)</li> <li>6. Average absolute <math>\eta</math> value of the four Higgs boson candidate jets</li> <li>7. <math>\log(X_{Wt})</math></li> <li>8. Trigger class index as one-hot encoder</li> <li>9. Year index as one-hot encoder (for years inclusive training)</li> </ol>	<p>3 Densely-Connected Hidden Layers (20 Nodes Each)</p>
<p>Single-Node Output</p>			<p>Single-Node Output</p>

# Background Modeling – Uncertainties

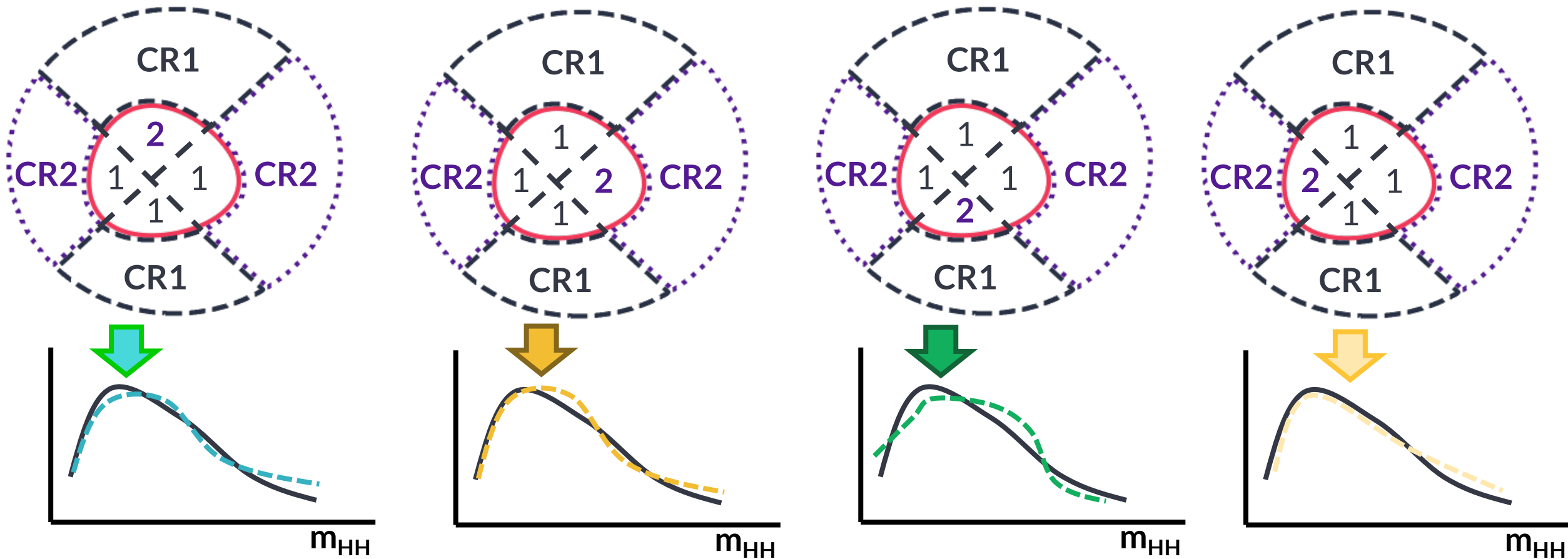
Bootstrap Uncertainty – quantifying “noise” in the neural network training



# Background Modeling

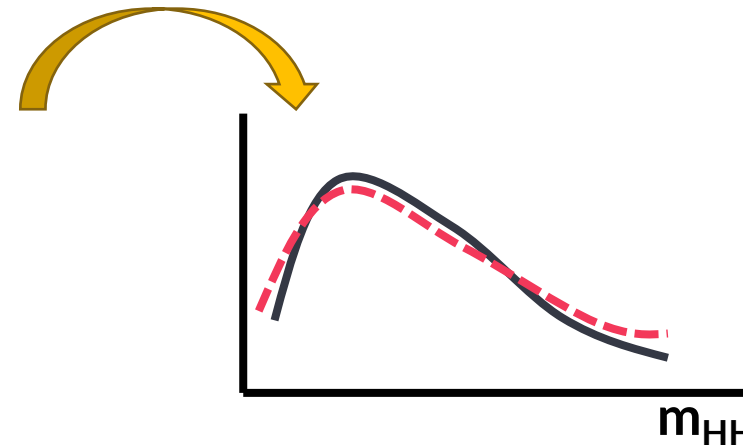
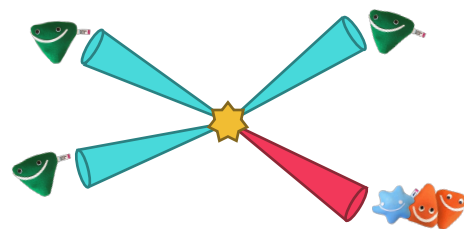
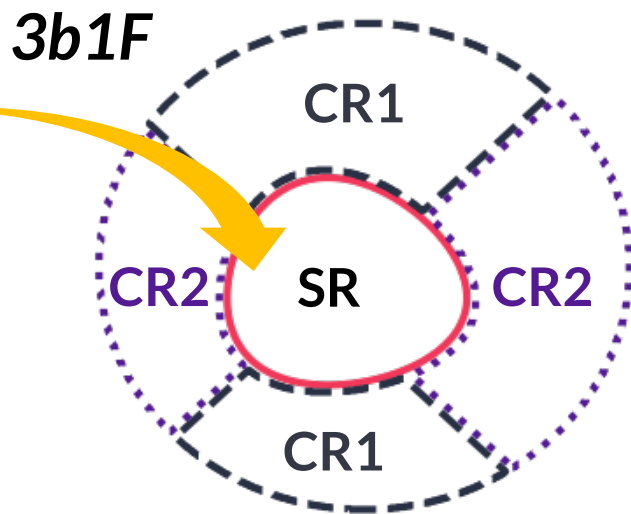
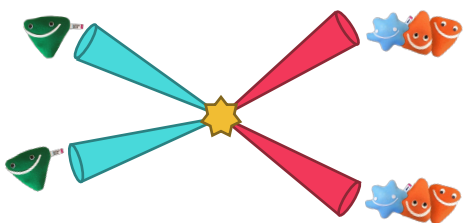
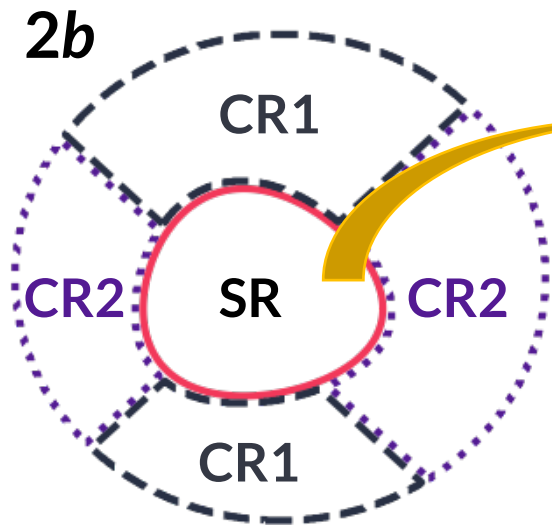
“Shape” Uncertainty – quantifying variations across the mass plane

Alternative Training in CR2 for each SR “Quadrant”



# Background Modeling

“Non-closure” Uncertainty – testing the background modeling in an orthogonal dataset

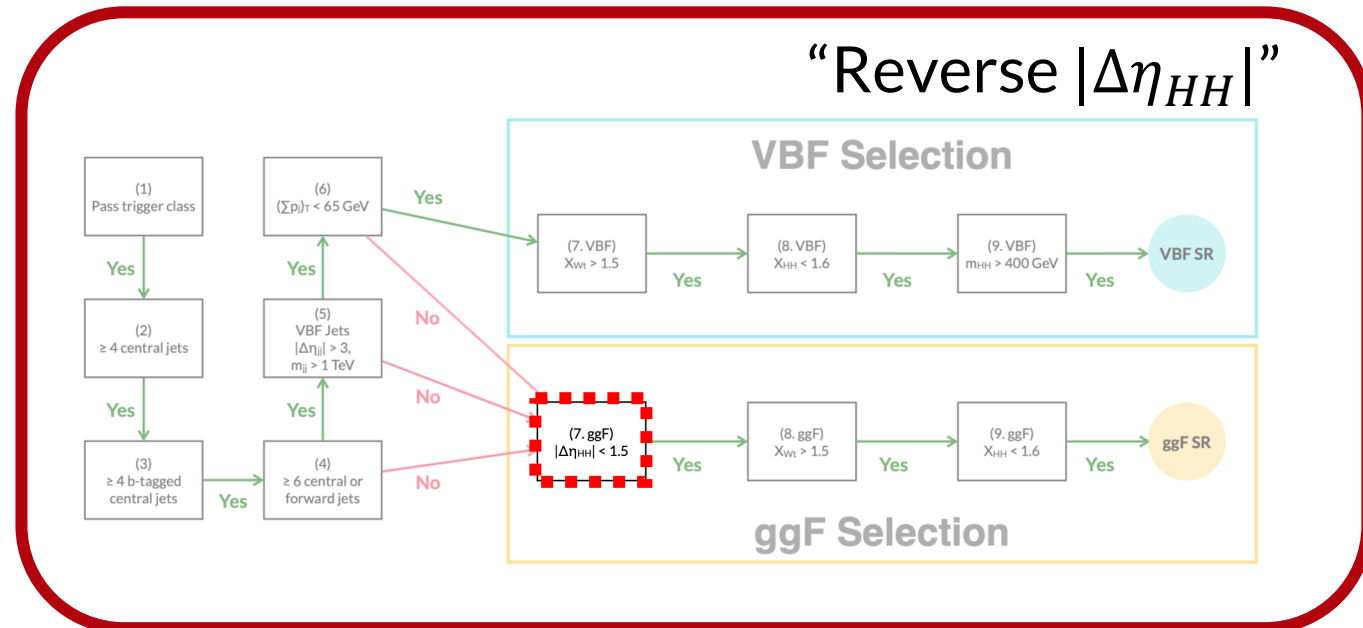
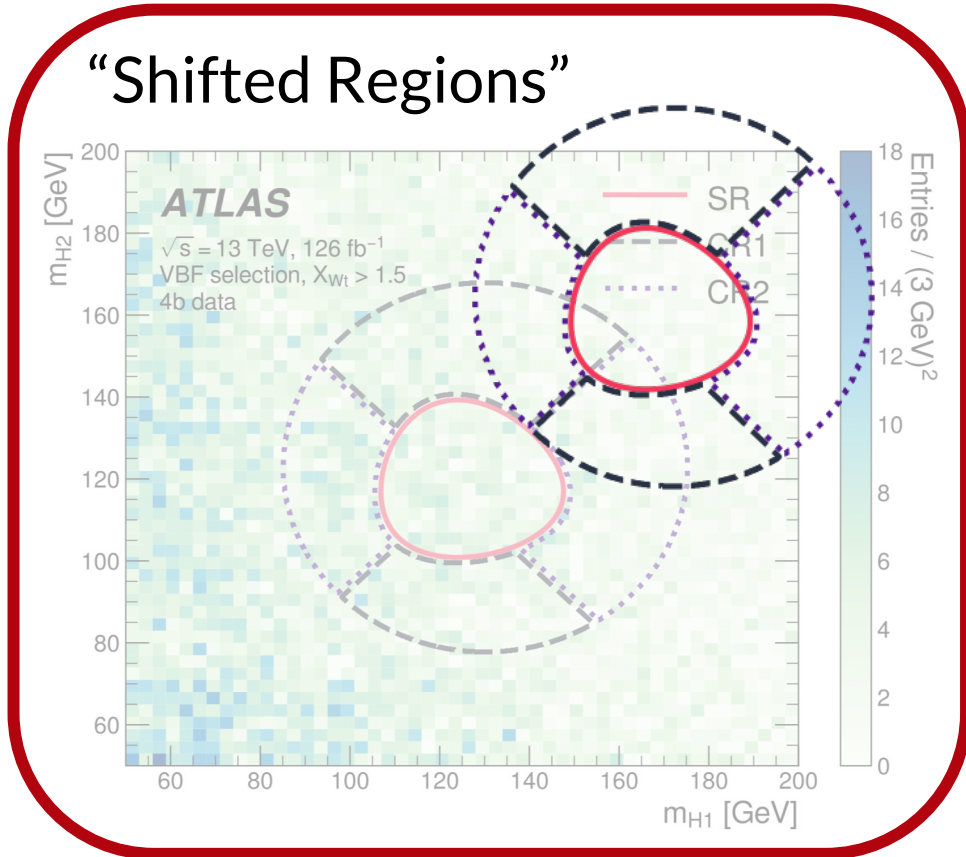


**ggF Only!**



# Other Background Modeling Checks

Further validating the procedure



Simulated  $t\bar{t}$  and multiple-b-jet events

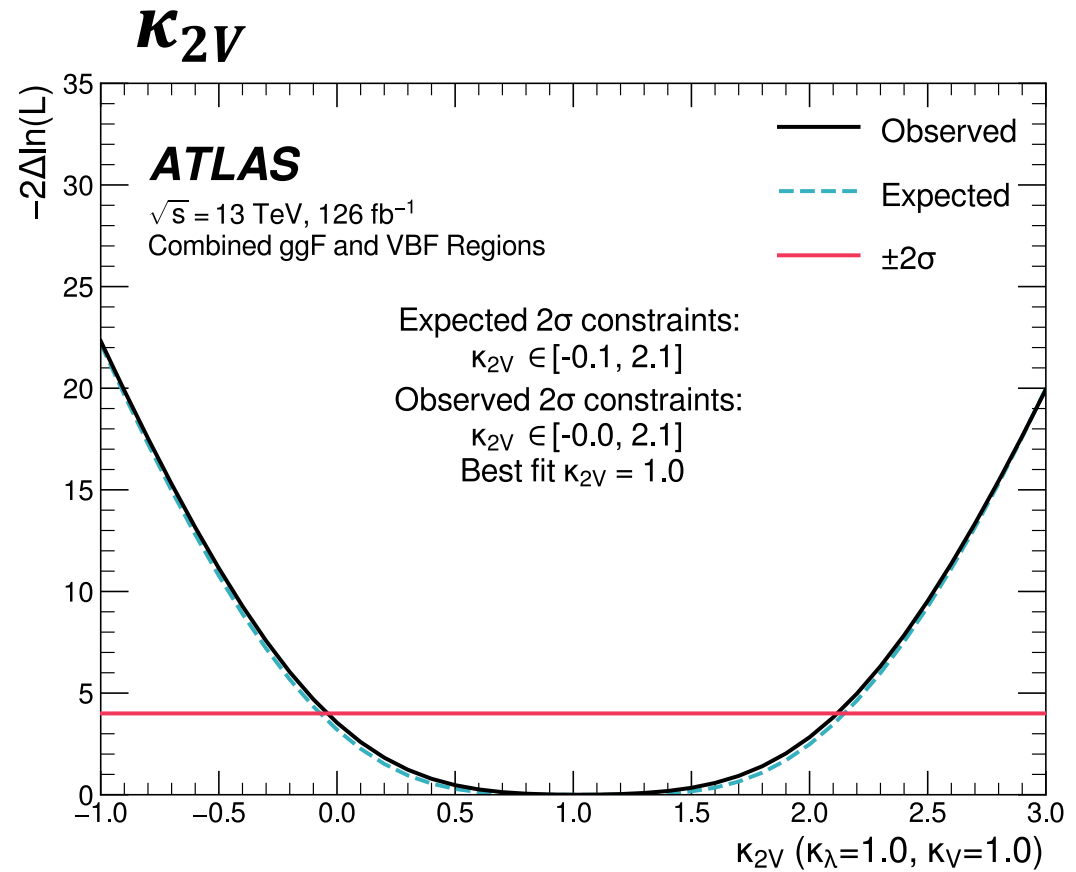
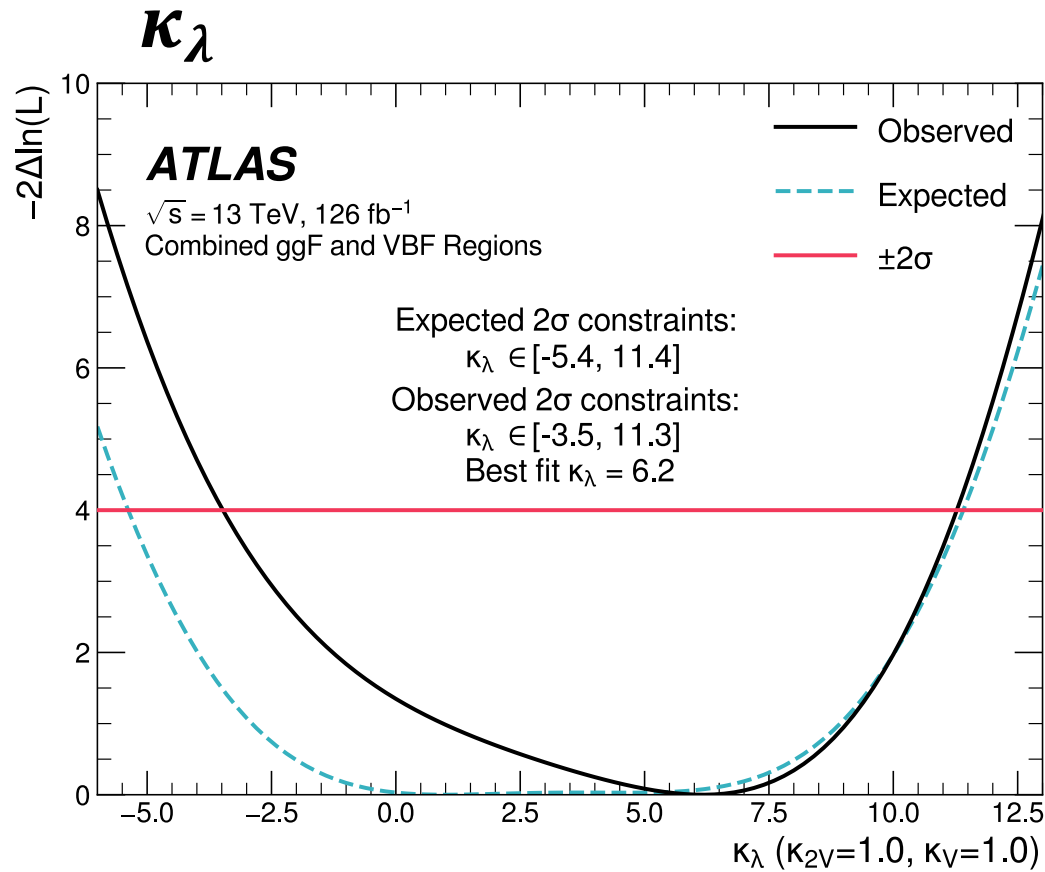
ggF Only!

# Table of Event Yields

Both ggF (top) and VBF (bottom) signal regions

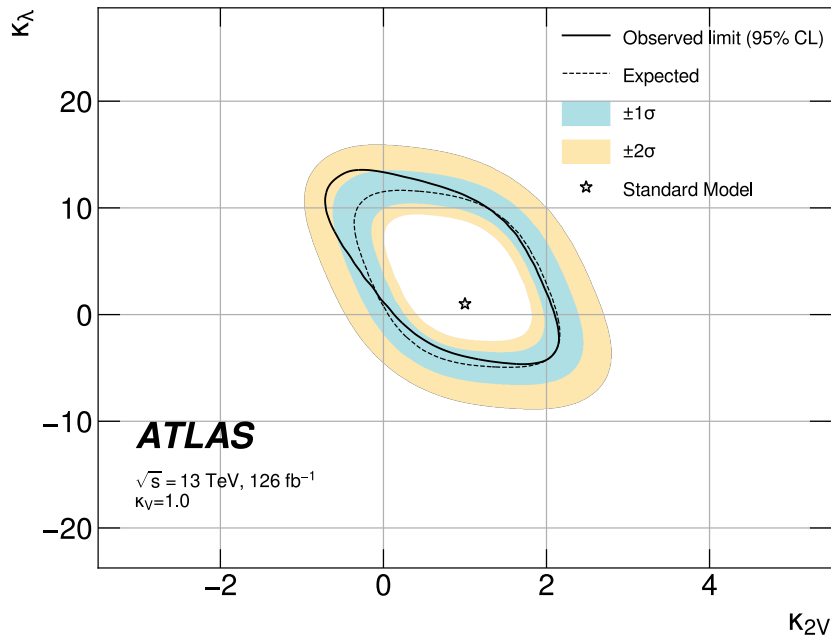
Category	Data	Expected Background	ggF Signal SM	VBF Signal SM
ggF signal region				
$ \Delta\eta_{HH}  < 0.5, X_{HH} < 0.95$	1940	1935(25)	7.0	0.038
$ \Delta\eta_{HH}  < 0.5, X_{HH} > 0.95$	3602	3618(37)	6.5	0.036
$0.5 <  \Delta\eta_{HH}  < 1.0, X_{HH} < 0.95$	1924	1874(21)	5.1	0.037
$0.5 <  \Delta\eta_{HH}  < 1.0, X_{HH} > 0.95$	3540	3492(35)	4.7	0.040
$ \Delta\eta_{HH}  > 1.0, X_{HH} < 0.95$	1880	1739(22)	2.9	0.043
$ \Delta\eta_{HH}  > 1.0, X_{HH} > 0.95$	3285	3212(37)	2.8	0.041
VBF signal region				
$ \Delta\eta_{HH}  < 1.5$	116	125.3(44)	0.37	0.090
$ \Delta\eta_{HH}  > 1.5$	241	230.6(53)	0.06	0.21

# More Results (Likelihood Scans)

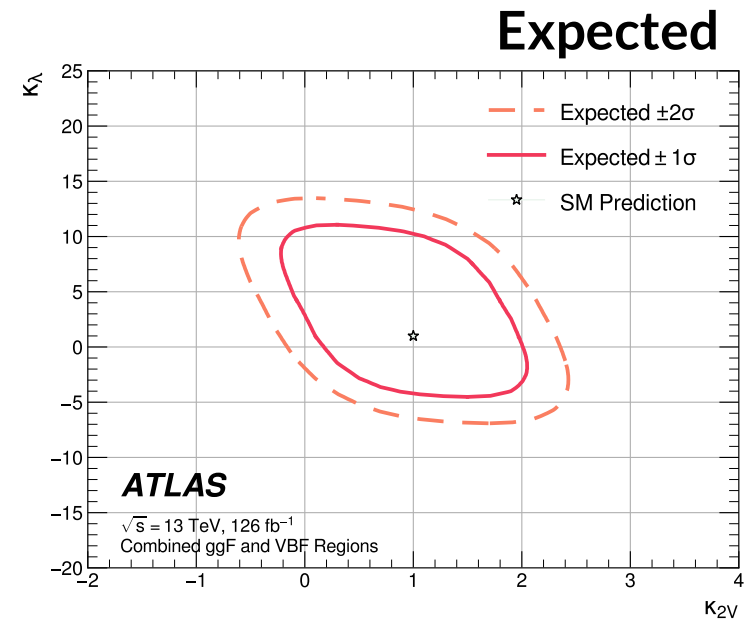
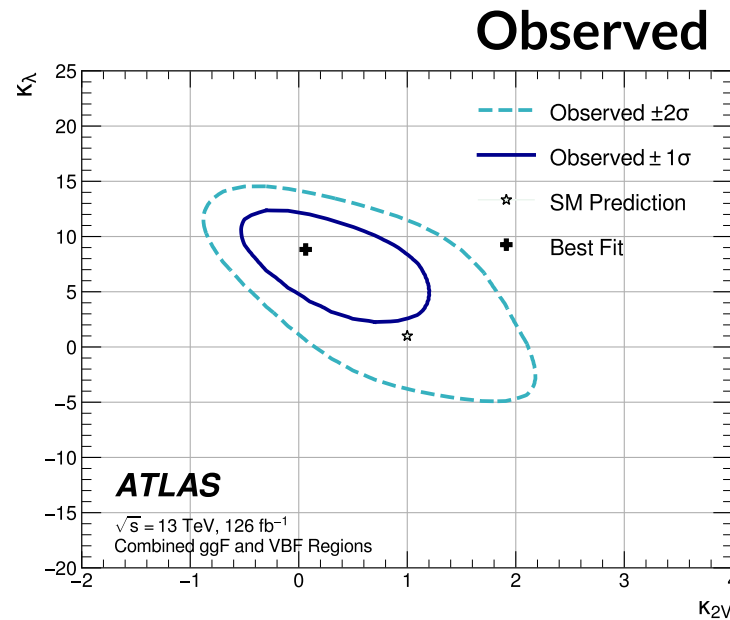


# More Results (2D Limits)

“95% CL” (2D in  $\kappa_\lambda$  vs.  $\kappa_{2V}$ )

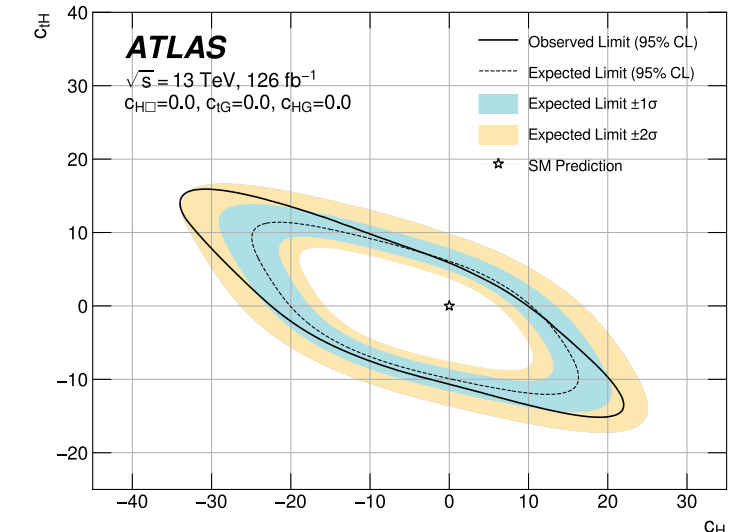
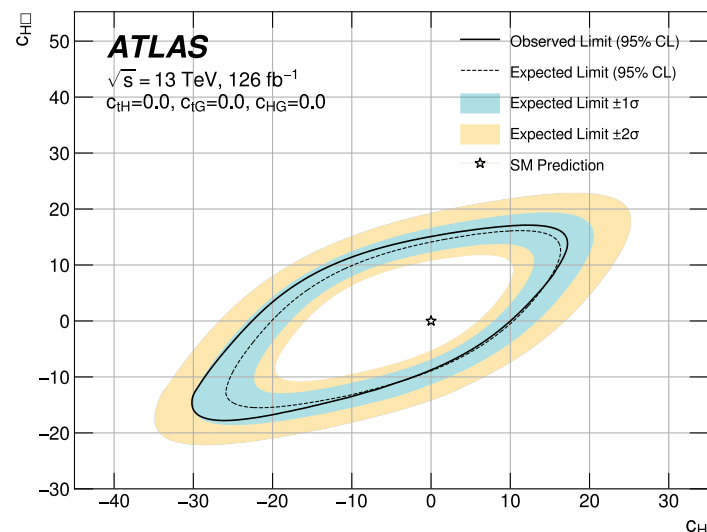
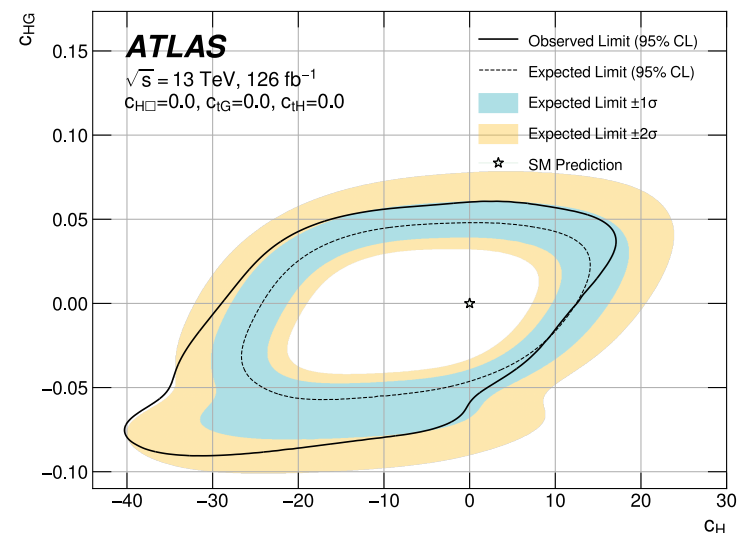
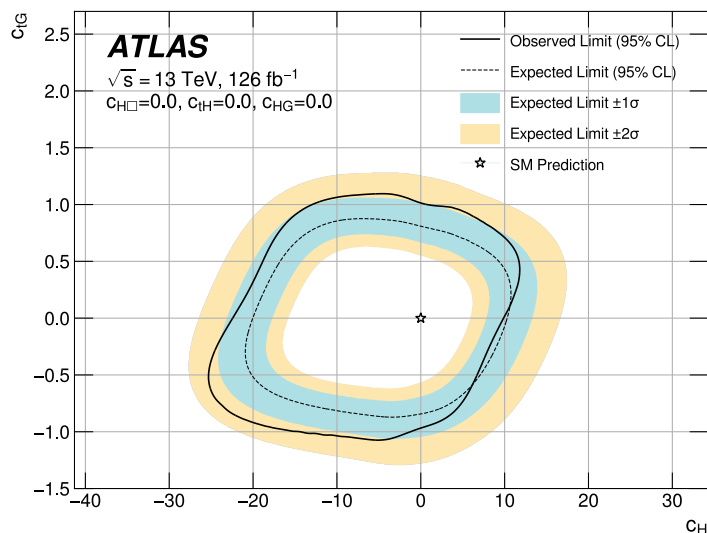
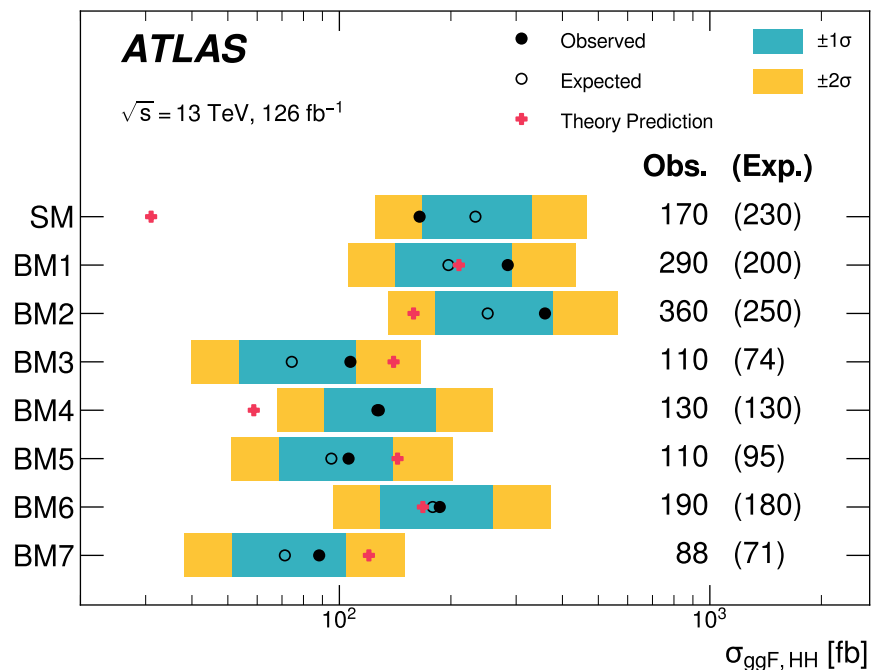


“Log Likelihood Scan” (2D in  $\kappa_\lambda$  vs.  $\kappa_{2V}$ )



# HEFT and SMEFT Constraints

ggF only



# Uncertainties

Dominant uncertainties:

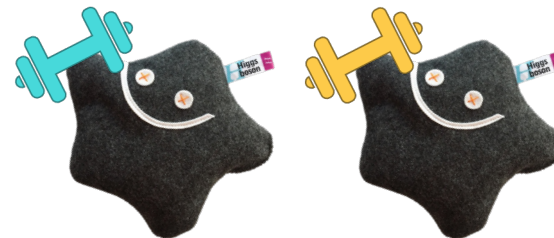
Theoretical signal modeling

Experimental background modeling

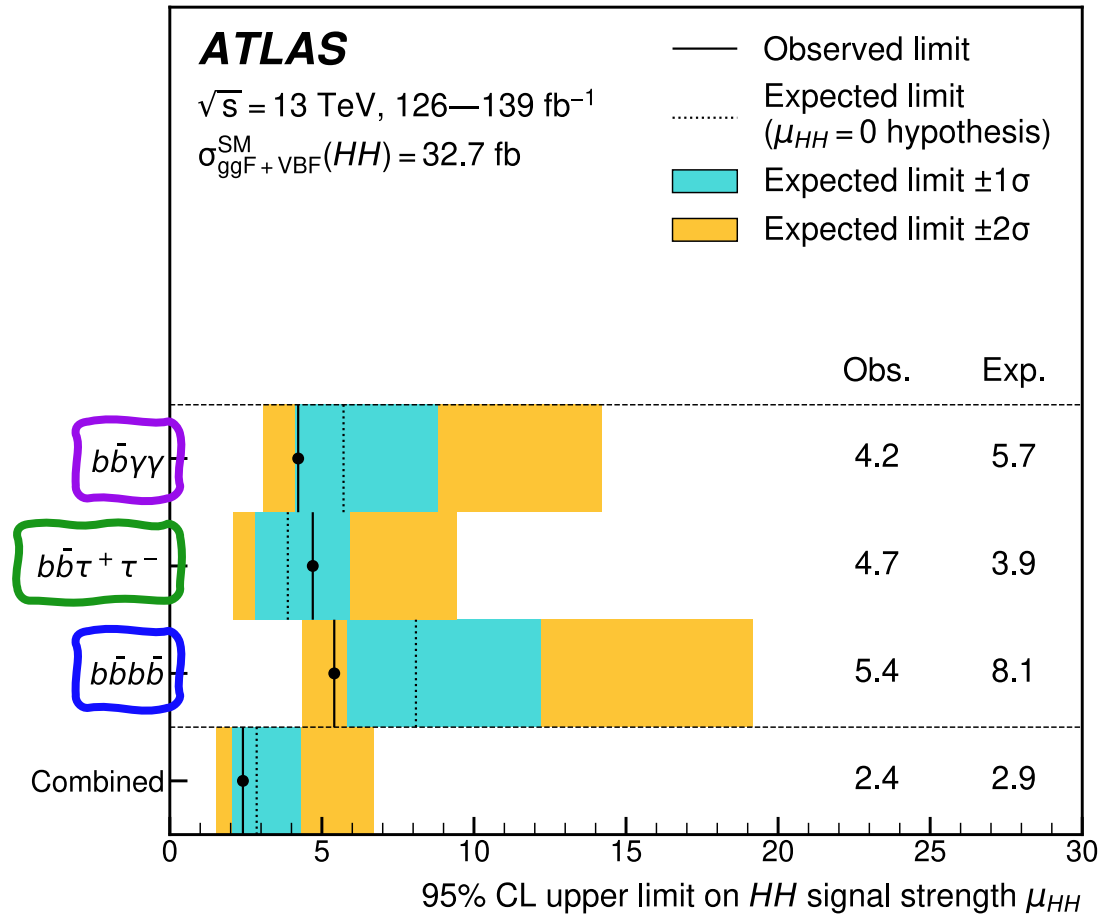
Uncertainties	$\mu_{ggF+VBF}$
Statistical Only	6.0
+ Background Modeling	7.1
+ Theoretical	8.1

$\mu_{ggF+VBF}$  (Upper limit on HH signal strength)

Source of Uncertainty	$\Delta\mu/\mu$
<b>Theory uncertainties</b>	
Theory uncertainty in signal cross-section	-9.0%
All other theory uncertainties	-1.4%
<b>Background modeling uncertainties</b>	
Bootstrap uncertainty	-7.1%
CR to SR extrapolation uncertainty	-7.5%
3b1f nonclosure uncertainty	-2.0%



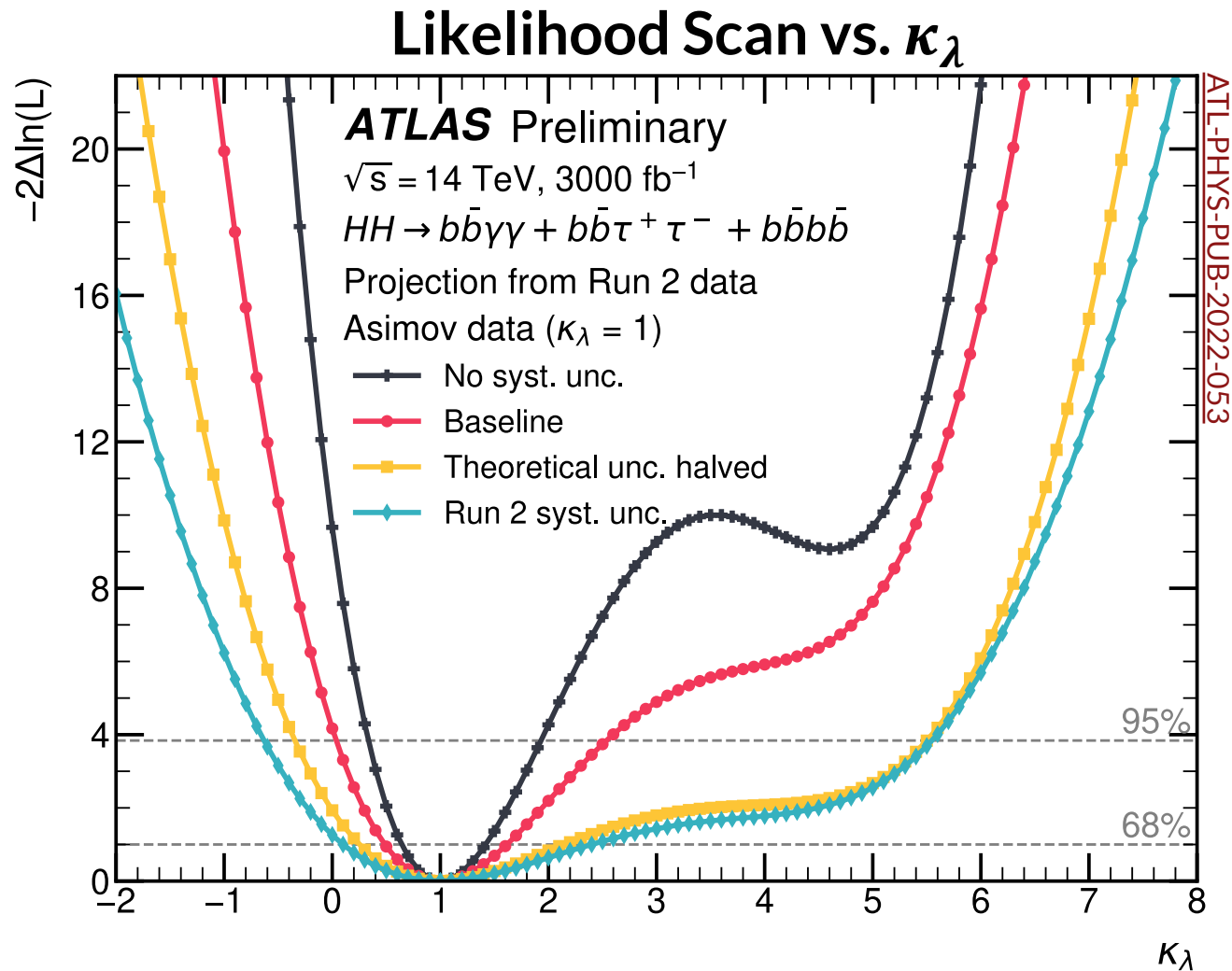
# Combination: $HH \rightarrow b\bar{b}b\bar{b}, b\bar{b}\tau\tau, b\bar{b}\gamma\gamma$



	bb	WW	$\tau\tau$	ZZ	$\gamma\gamma$
bb	34%				
WW	25%	4.6%			
$\tau\tau$	7.3%	2.7%	0.39%		
ZZ	3.1%	1.1%	0.33%	0.069%	
$\gamma\gamma$	0.26%	0.10%	0.028%	0.012%	0.0005%

Combined upper-limit on SM  $HH$  Cross-Section:  
 $2.4 \times \sigma_{SM}$  (2.9 Exp.)

# HH Prospects at the High-Luminosity LHC: $\kappa_\lambda$



Full HL-LHC Dataset,  
 “Baseline” Uncertainty Scenario:

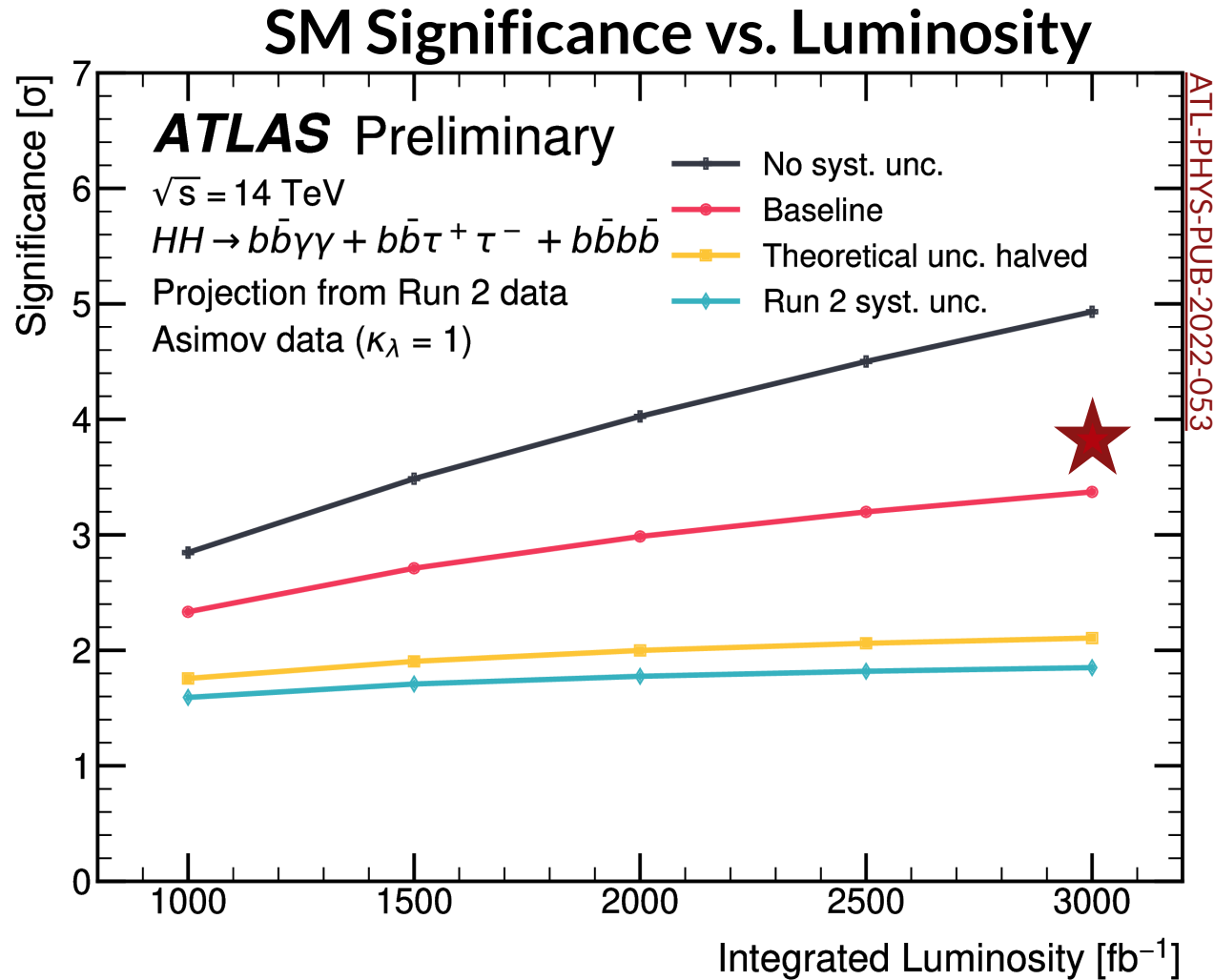
$$0.0 < \kappa_\lambda < 2.5$$

→ Move from probing  $\mathcal{O}(\sim 10)$   
 effects to  $\mathcal{O}(\sim 1)$  effects

☆ “Log Likelihood Scan” limits  
 utilize different assumptions  
 (expected background *includes*  
 SM  $HH$  signal)



# HH Prospects at the High-Luminosity LHC



~ Observation sensitivity (3.4σ) to SM HH signal by end of HL-LHC!

→ If our understanding of the Higgs potential is roughly correct, we should be able to see a “bump”

# HH Prospects @ HL-LHC: Uncertainty Scenarios

## Baseline Scenario

Systematic uncertainties	Scale factors for HL-LHC baseline scenario
Theoretical uncertainty	0.5
b-jet tagging efficiency	0.5
c-jet tagging efficiency	0.5
Light-jet tagging efficiency	1.0
Jet energy scale and resolution	1.0
Luminosity	0.6
Background bootstrap uncertainty	0.5
Background shape uncertainty	1.0

## Other Scenarios:

- No Systematic Uncertainties (Statistical Only)

- Run 2 Systematic Uncertainties

- Run 2 Systematic Uncertainties, with theoretical uncertainties halved