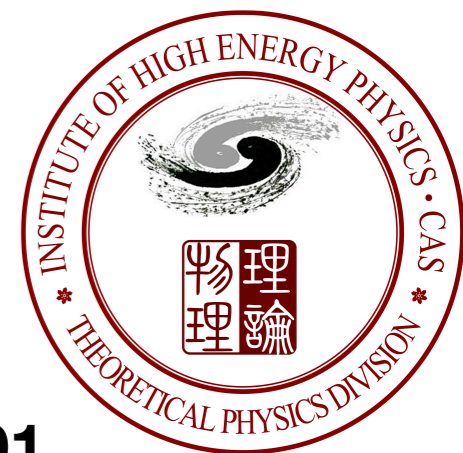
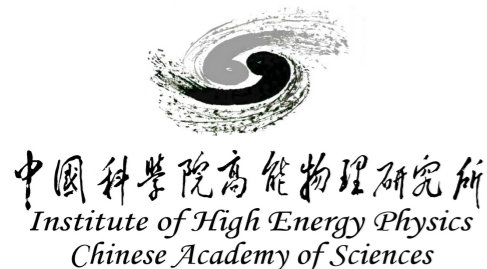


# Improving measurement on Higgs-gluon effective coupling

Zhao Li  
IHEP-CAS

USTC Sep 12 2019



based on PRD98 (2018) no.7, 076010 & arXiv:1901.09391

LIVE SCIENCE. [www.LiveScience.com](http://www.LiveScience.com)

# What is a Higgs Boson?

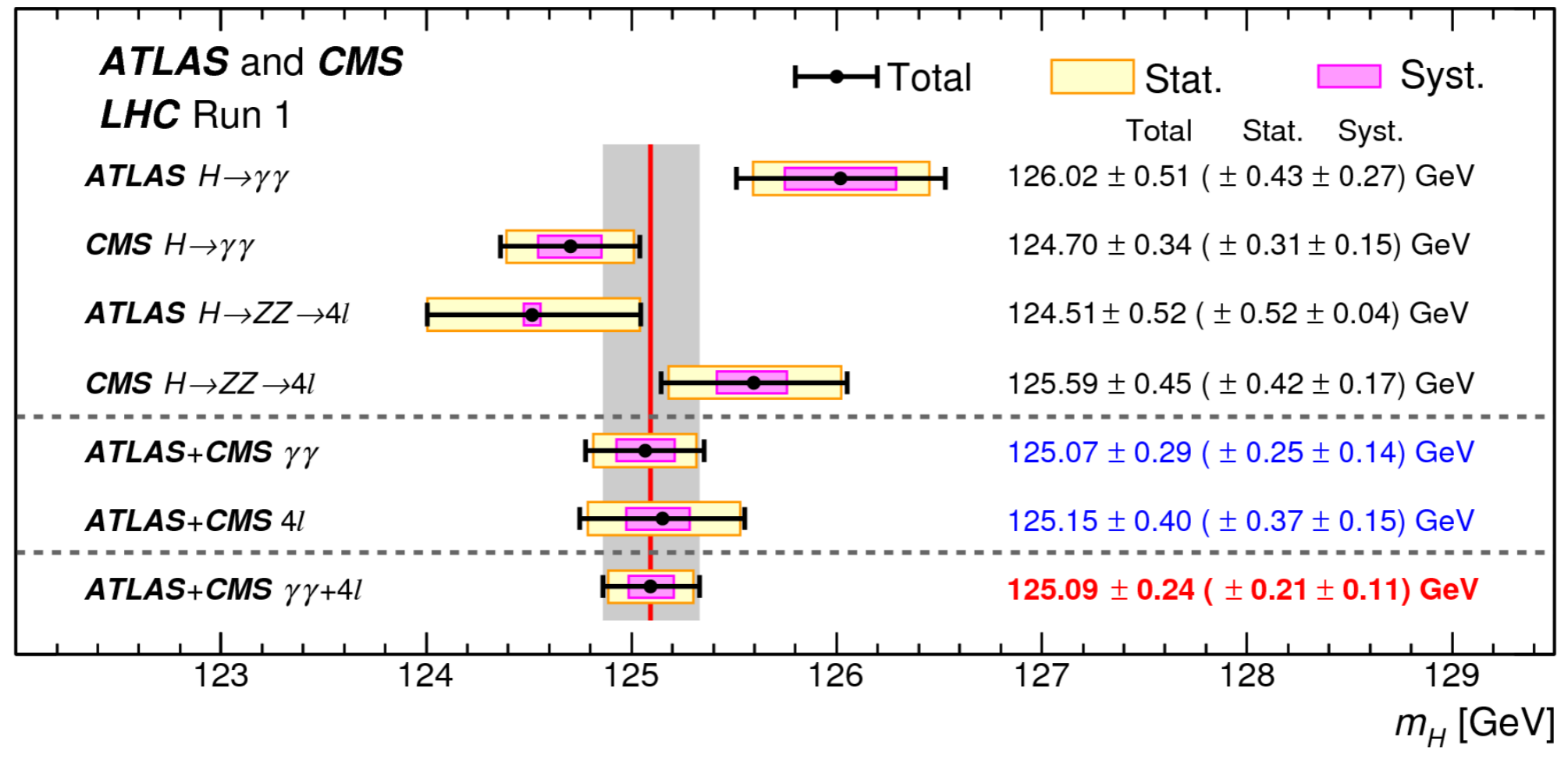
The elusive Higgs boson, if found, would complete the Standard Model of physics. It is thought that matter obtains mass by interacting with the Higgs field. If Higgs did not exist, according to the model, everything in the universe would be massless.

## The "cocktail party" analogy

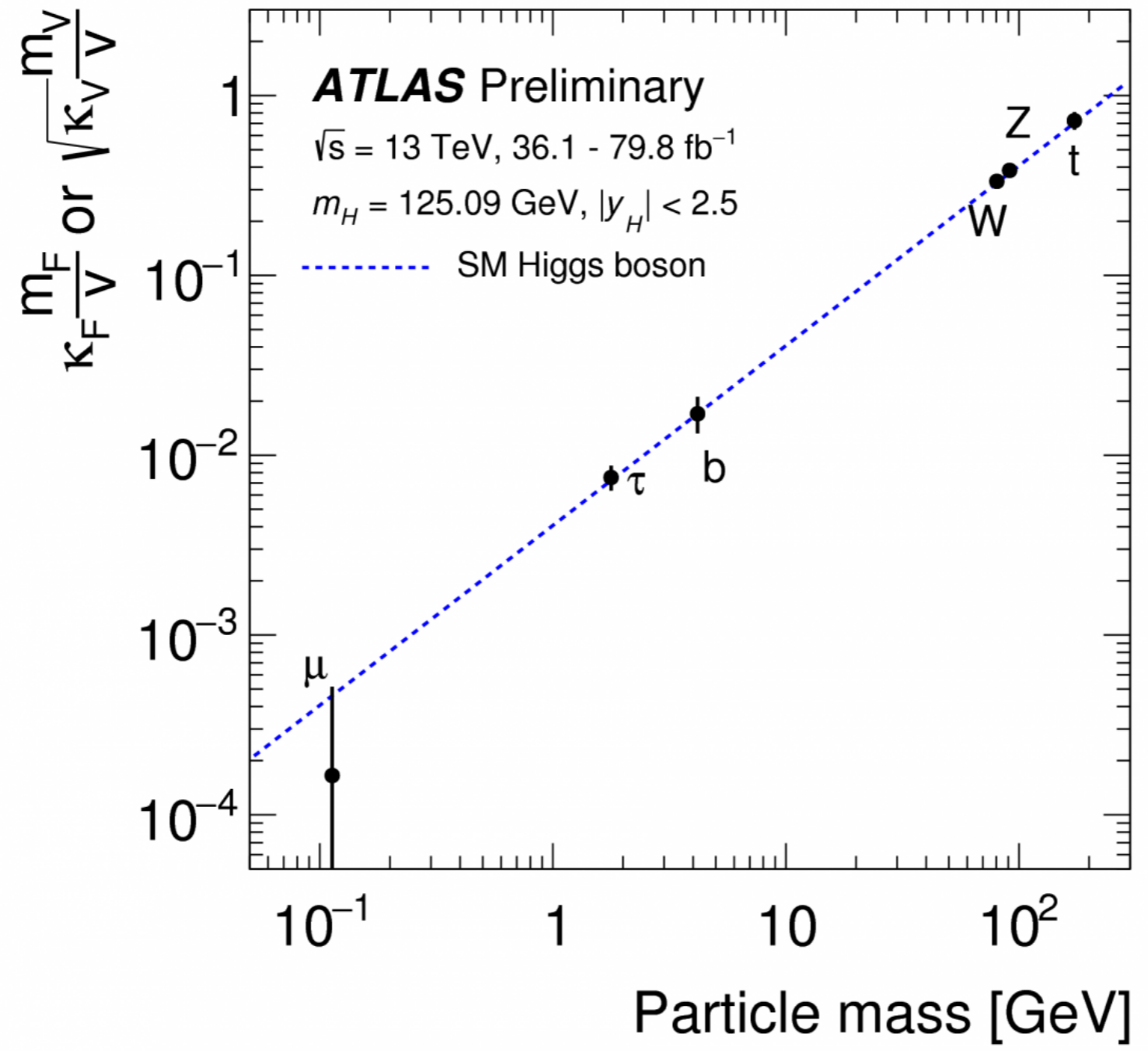
Imagine a party where guests are evenly spaced around the room. The room of guests represents the Higgs field, which is everywhere in the universe. Suddenly a celebrity enters. Guests notice the celebrity and rush in closer to be near her, forming a tight knot.

As the celebrity passes through the room, the concentrated clump of guests surrounding her gives the group additional momentum. The clump is harder to stop than one guest alone would be, and so we can say that the clump has acquired mass.

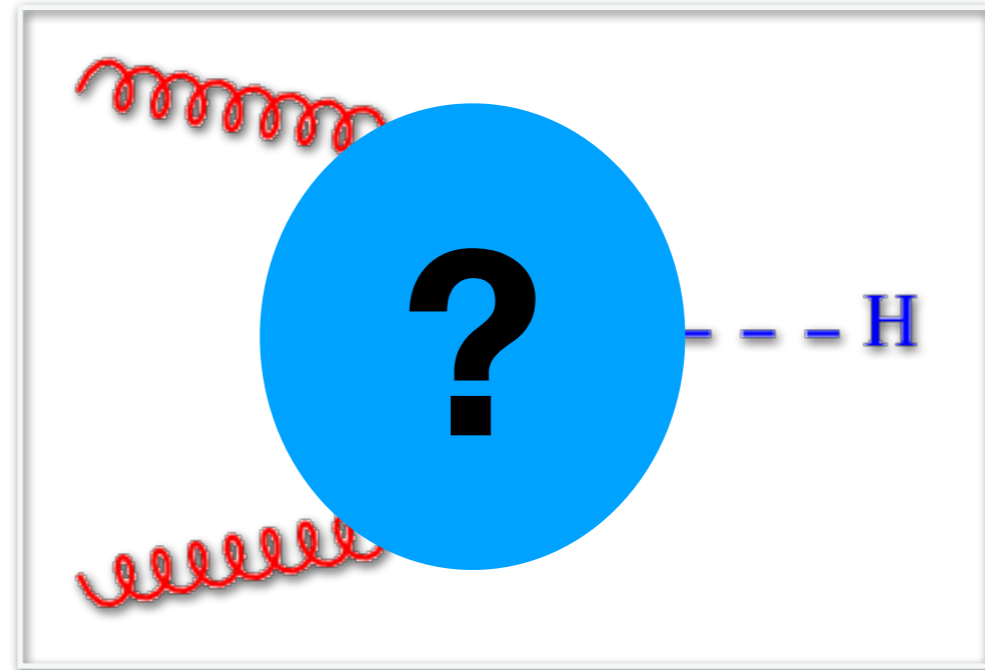
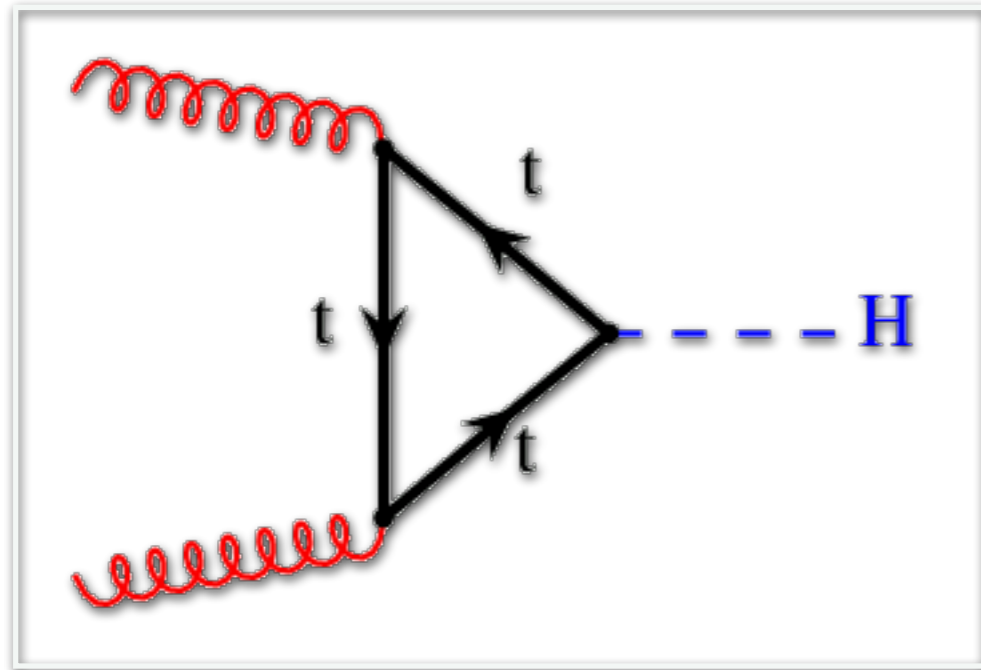
SOURCE: CERN  
KARL TATE / © LiveScience.com



# Higgs Properties, i.e. couplings/interactions



# Direct or Indirect modification

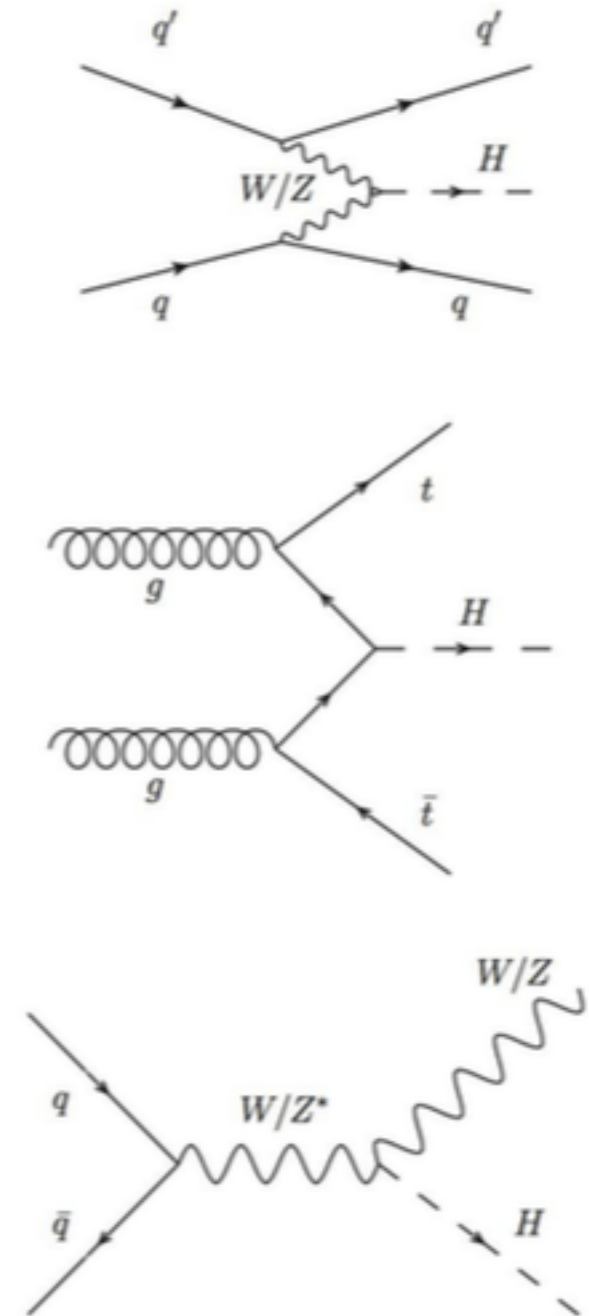
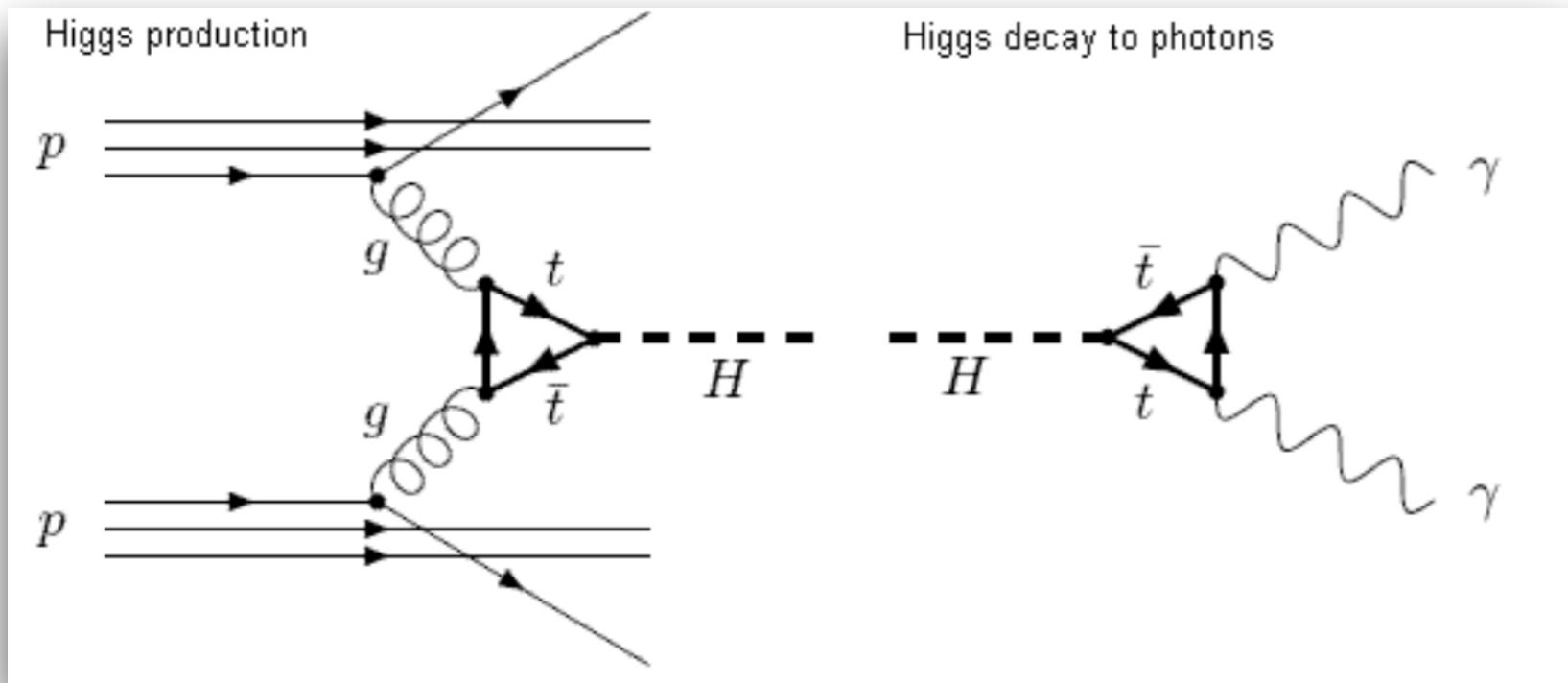


$$\mathcal{L}_{hgg} = \kappa_g c_{\text{SM}}^g \frac{\alpha_s}{12\pi v} h G_{\mu\nu}^a G^{a\mu\nu},$$

**SUSY? Little Higgs? Extra Dimensions? etc.**

# Measurement @ LHC

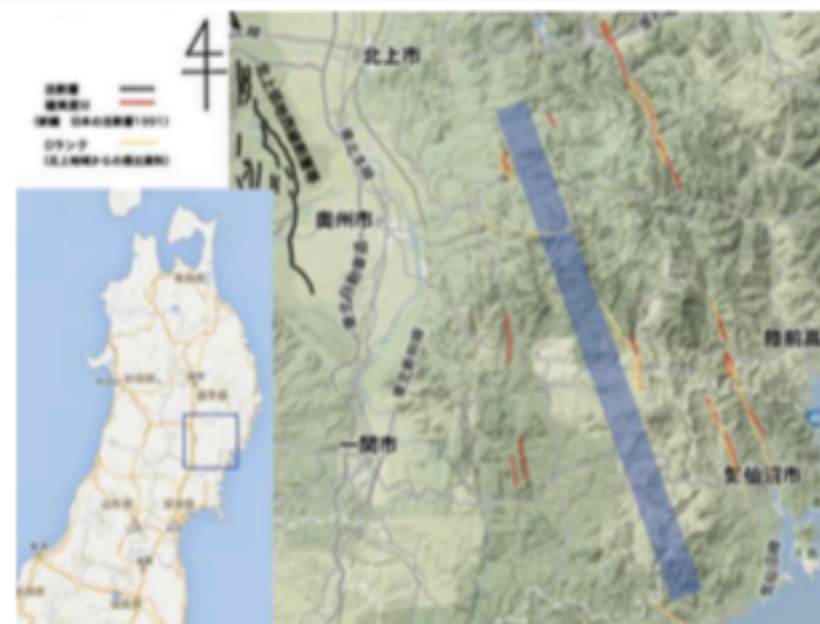
Different production rate  
Different decay BR



# Several Higgs factories under plan



**CEPC@90-240 GeV (China)**  
秦皇島 or 雄安?



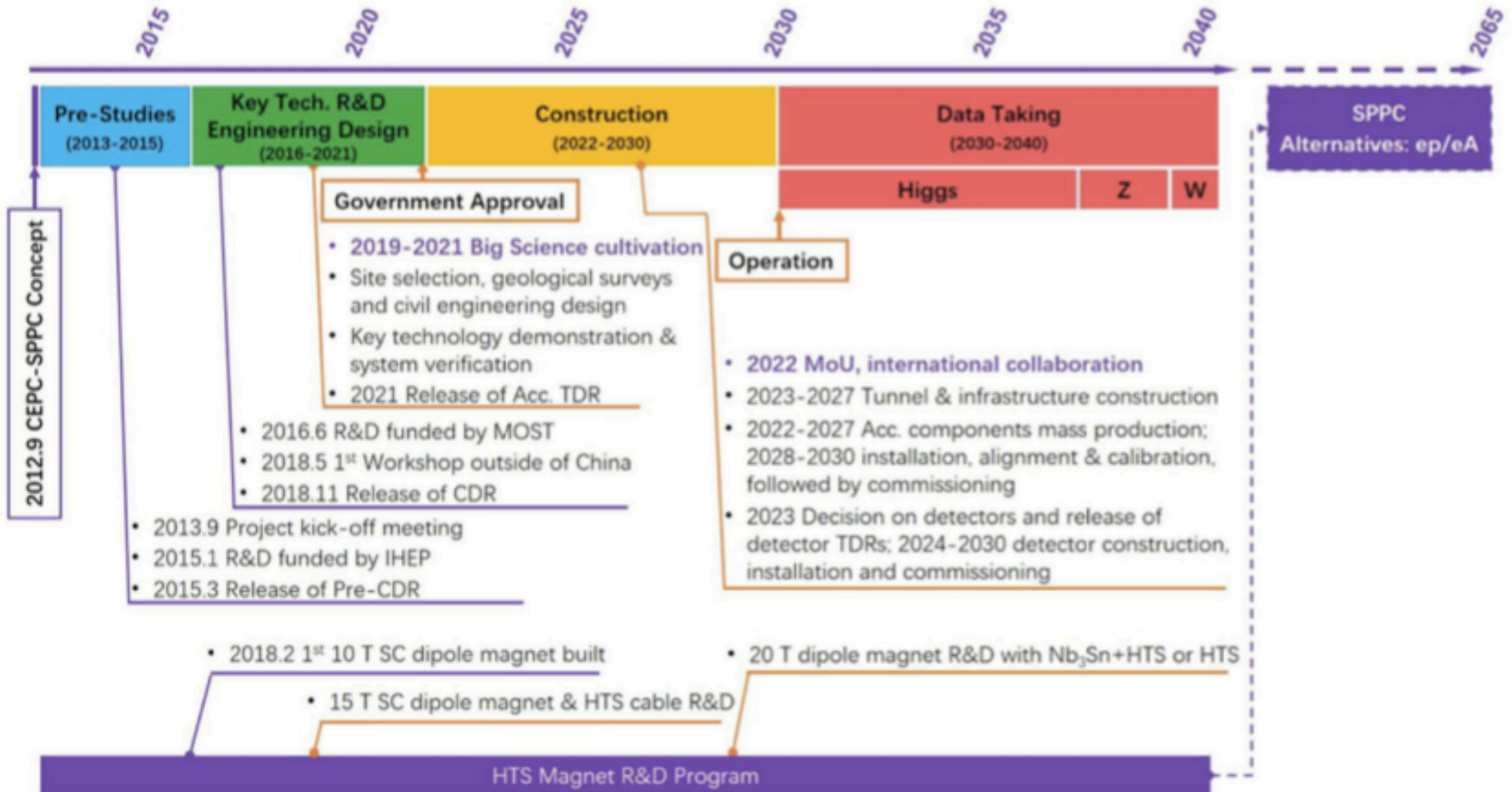
**ILC@500, 350, 250 GeV (Japan)**  
Kitakami Candidate Site



**FCC-ee @ 90-400 GeV (Geneva, EU)**

# CEPC timeline

## CEPC Project Timeline



# CEPC High Lumi Parameters@Higgs

D. Wang

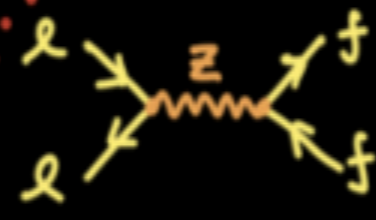
	<i>Higgs</i>	<i>W</i>	<i>Z (3T)</i>	<i>Z (2T)</i>
Number of IPs	2			
Beam energy (GeV)	<b>120</b>	<b>80</b>	<b>45.5</b>	
Circumference (km)	100			
Synchrotron radiation loss/turn (GeV)	1.68	0.33	0.035	
Crossing angle at IP (mrad)	16.5×2			
Piwinski angle	3.78	8.5	27.7	
Number of particles/bunch $N_e$ ( $10^{10}$ )	17.0	12.0	8.0	
<b>Bunch number (bunch spacing)</b>	<b>218 (0.76μs)</b>	<b>1568 (0.20μs)</b>	<b>12000 (25ns+10%gap)</b>	
Beam current (mA)	17.8	90.4	461.0	
Synchrotron radiation power /beam (MW)	<b>30</b>	<b>30</b>	<b>16.5</b>	
Bending radius (km)	10.7			
Momentum compact ( $10^{-5}$ )	0.91			
<b><math>\beta</math> function at IP <math>\beta_x^*/\beta_y^*</math> (m)</b>	<b>0.33/0.001</b>	<b>0.33/0.001</b>	<b>0.2/0.001</b>	
Emittance $\epsilon_x/\epsilon_y$ (nm)	0.89/0.0018	0.395/0.0012	0.13/0.003	0.13/0.00115
Beam size at IP $\sigma_x/\sigma_y$ (μm)	17.1/0.042	11.4/0.035	5.1/0.054	5.1/0.034
Beam-beam parameters $\xi_x/\xi_y$	0.024/0.113	0.012/0.1	0.004/0.053	0.004/0.085
RF voltage $V_{RF}$ (GV)	2.4	0.43	0.082	
RF frequency $f_{RF}$ (MHz) (harmonic)	650 (216816)			
Natural bunch length $\sigma_z$ (mm)	2.2	2.98	2.42	
Bunch length $\sigma_z$ (mm)	3.93	5.9	8.5	
HOM power/cavity (2 cell) (kw)	0.58	0.77	<b>1.94</b>	
Energy spread (%)	0.19	0.098	0.080	
Energy acceptance requirement (%)	<b>1.7</b>	<b>0.90</b>	<b>0.49</b>	
Energy acceptance by RF (%)	3.0	1.27	1.55	
Photon number due to beamstrahlung	0.104	0.050	0.023	
Beamstrahlung lifetime /quantum lifetime* (min)	30/50	>400		
Lifetime (hour)	<b>0.22</b>	<b>1.2</b>	<b>3.2</b>	<b>2.0</b>
$F$ (hour glass)	0.85	0.92	0.98	
<b>Luminosity/IP <math>L</math> (<math>10^{34}\text{cm}^{-2}\text{s}^{-1}</math>)</b>	<b>5.2</b>	<b>14.5</b>	<b>23.6</b>	<b>37.7</b>

\*include beam-beam simulation and real lattice

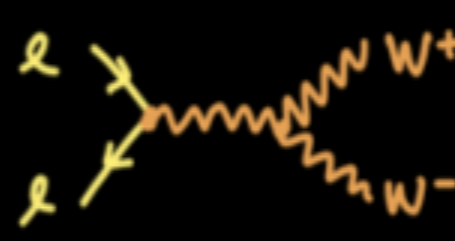


# The CEPC Program

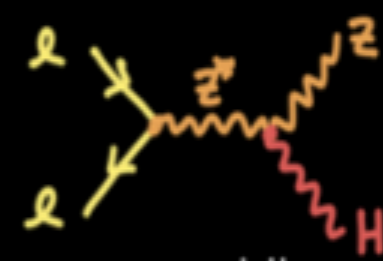
100 km e<sup>+</sup>e<sup>-</sup> collider



Z Mass  
91



WW threshold  
160



Higgs  
240



Also, Z and W factory

- Precision test of SM
- Electroweak physics
- Flavor physics studies: b, c, τ
- QCD studies
- Search for rare decays

2 IPs  
planned

# Results in CDR (2018.11)



All scaled to 240 GeV,  $5.6\text{ab}^{-1}$

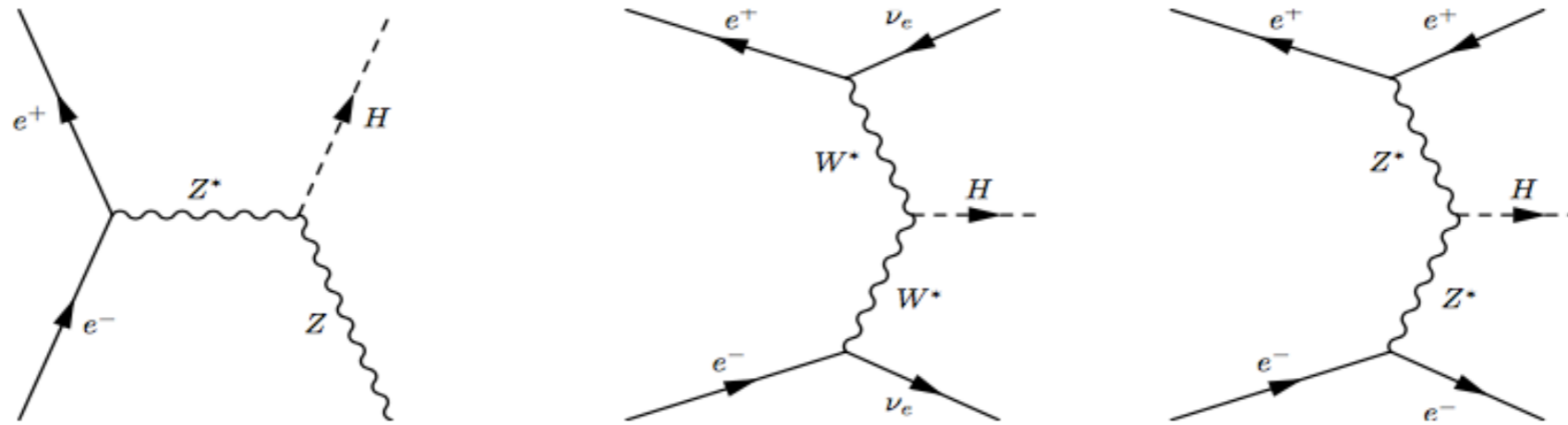
Property	Estimated Precision	
	CEPC-v1	CEPC-v4
$m_H$	5.9 MeV	5.9 MeV
$\Gamma_H$	2.7%	2.8%
$\sigma(ZH)$	0.5%	0.5%
$\sigma(\nu\bar{\nu}H)$	3.0%	3.2%

Decay mode	$\sigma \times \text{BR}$	BR	$\sigma \times \text{BR}$	BR
$H \rightarrow b\bar{b}$	0.26%	0.56%	0.27%	0.56%
$H \rightarrow c\bar{c}$	3.1%	3.1%	3.3%	3.3%
$H \rightarrow gg$	1.2%	1.3%	1.3%	1.4%
$H \rightarrow WW^*$	0.9%	1.1%	1.0%	1.1%
$H \rightarrow ZZ^*$	4.9%	5.0%	5.1%	5.1%
$H \rightarrow \gamma\gamma$	6.2%	6.2%	6.8%	6.9%
$H \rightarrow Z\gamma$	13%	13%	16%	16%
$H \rightarrow \tau^+\tau^-$	0.8%	0.9%	0.8%	1.0%
$H \rightarrow \mu^+\mu^-$	16%	16%	17%	17%
$\text{BR}_{\text{inv}}^{\text{BSM}}$	-	< 0.28%	-	< 0.30%

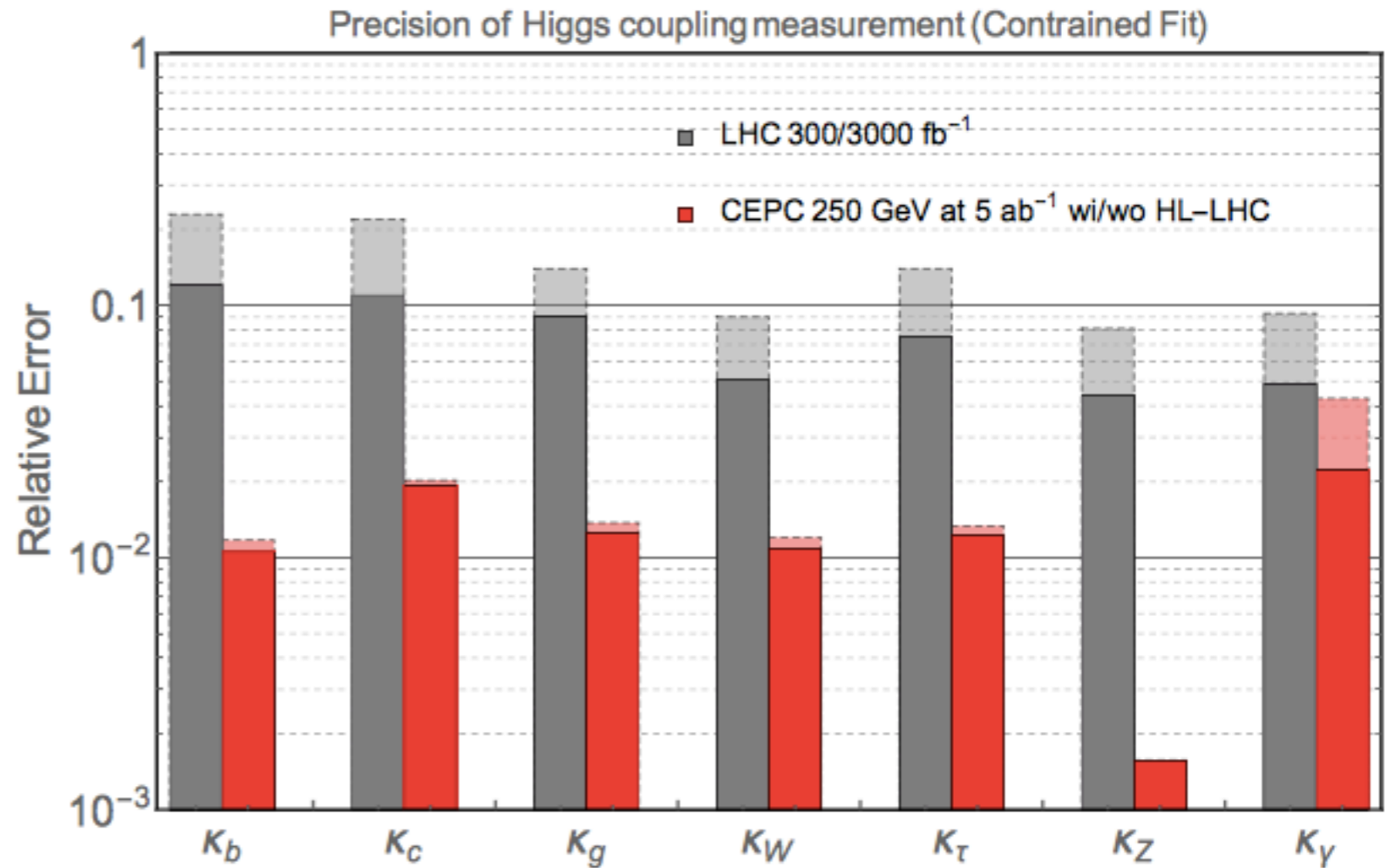
Signal		Precisio	Signal		Precisio	Signal		Precisio
Z	H	n	Z	H	n	Z	H	n
H->qq			H->WW			H-> $\gamma\gamma, Z\gamma$		
ee	bb	1.32%	ee	l $\nu$ l $\nu$	9.52%	$\mu\mu+\tau\tau$	$\gamma\gamma$	23.7%
	cc	13.5%		evqq	4.56%	$\nu\nu$		10.5%
	gg	7.22%		$\mu\nu$ qq	3.93%	qq		9.84%
$\mu\mu$	bb	0.99%	$\mu\mu$	l $\nu$ l $\nu$	7.29%	$\nu\nu$	Z $\gamma$ (qq $\gamma$ )	15.7%
	cc	9.54%		evqq	3.90%	vvH(WW fusion)		
	gg	5.01%		$\mu\nu$ qq	3.90%	$\nu\nu$	bb	3.00%
qq	bb	0.46%	$\nu\nu$	qqqq	1.90%	H-> $\mu\mu$		
	cc	11.1%		evqq	4.65%	qq	$\mu\mu$	17.1%
	gg	3.64%		$\mu\nu$ qq	4.14%	ee		
$\nu\nu$	bb	0.39%	qq	l $\nu$ l $\nu$	11.5%	$\mu\mu$		
	cc	3.83%		qqqq	1.75%	$\nu\nu$		
	gg	1.47%		H->ZZ			H-> $\tau\tau$	
H->Invisible			$\nu\nu$	$\mu\mu$ qq	8.26%	ee	$\tau\tau$	2.75%
qq	ZZ(vvvv)	232%	$\nu\nu$	eeqq	40%	$\mu\mu$		2.61%
ee		370%	$\mu\mu$	$\nu\nu$ qq	7.32%	qq		0.95%
$\mu\mu$		245%	ZH bkg contribution		19.4%	$\nu\nu$		2.66%

**CEPC**团队、国际顾问委员会部分委员和《CEPC概念设计报告》国际评审委员会成员合影 -- 2018年11月14日





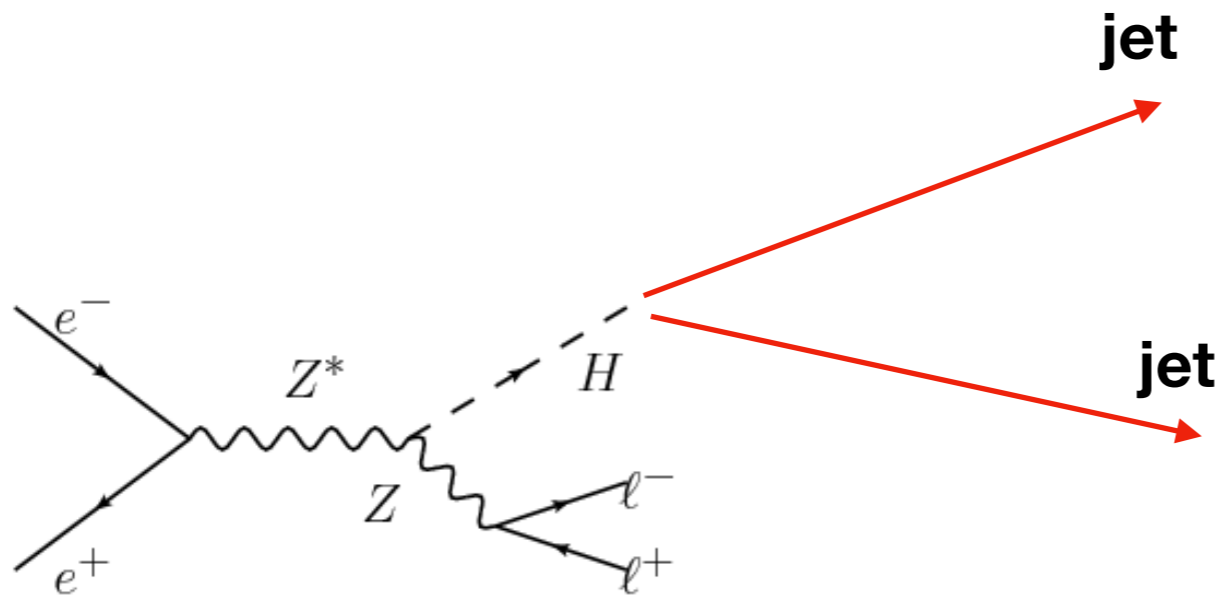
**Figure 3.6** Feynman diagrams of the  $e^+e^- \rightarrow ZH$ ,  $e^+e^- \rightarrow \nu\bar{\nu}H$  and  $e^+e^- \rightarrow e^+e^-H$  processes.



# ggH coupling from $H \rightarrow gg$

$H \rightarrow gg$  decay rate is proportional to ggH coupling

But  $H \rightarrow gg$  is hidden inside  $H \rightarrow jj$



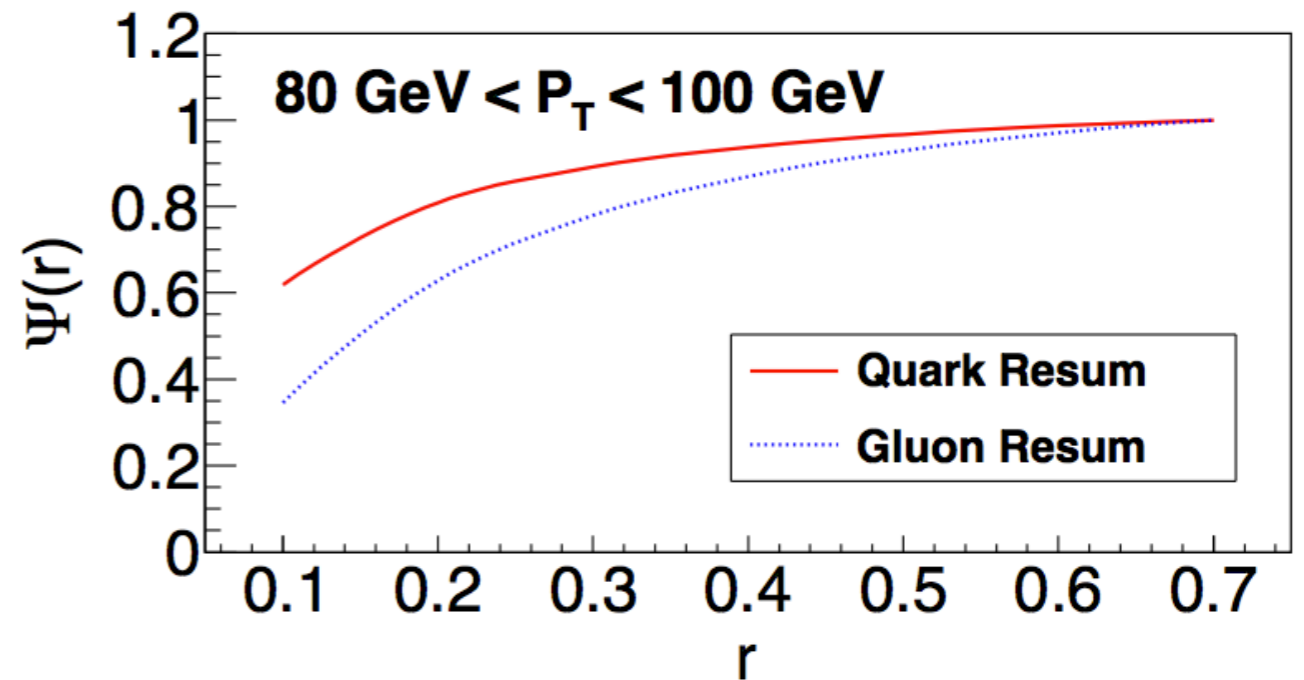
dijet including  $bb$ ,  $cc$  and  $gg$

$gg(8.18\%)$ ,  $c\bar{c}(2.884\%)$  and  $b\bar{b}(58.09\%)$

# Jet Energy Profile

$$\psi(r) = \frac{1}{N_j} \sum_j \psi_j(r) = \frac{1}{N_j} \sum_j \frac{\sum_{r_i < r} p_{T,i}(r_i)}{\sum_{r_i < R} p_{T,i}(r_i)},$$

**Shape of JEP  
reflects the relative  
ratio between quark  
and gluon!**



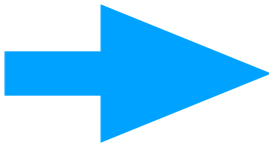
$$\Psi(r) = \frac{N_q \Psi_q(r) + N_g \Psi_g(r)}{N_q + N_g}$$

**H->bb is well measured.  
&  
Assume Hbb Yukawa is true.**

# Optimized uncertainty of effective coupling

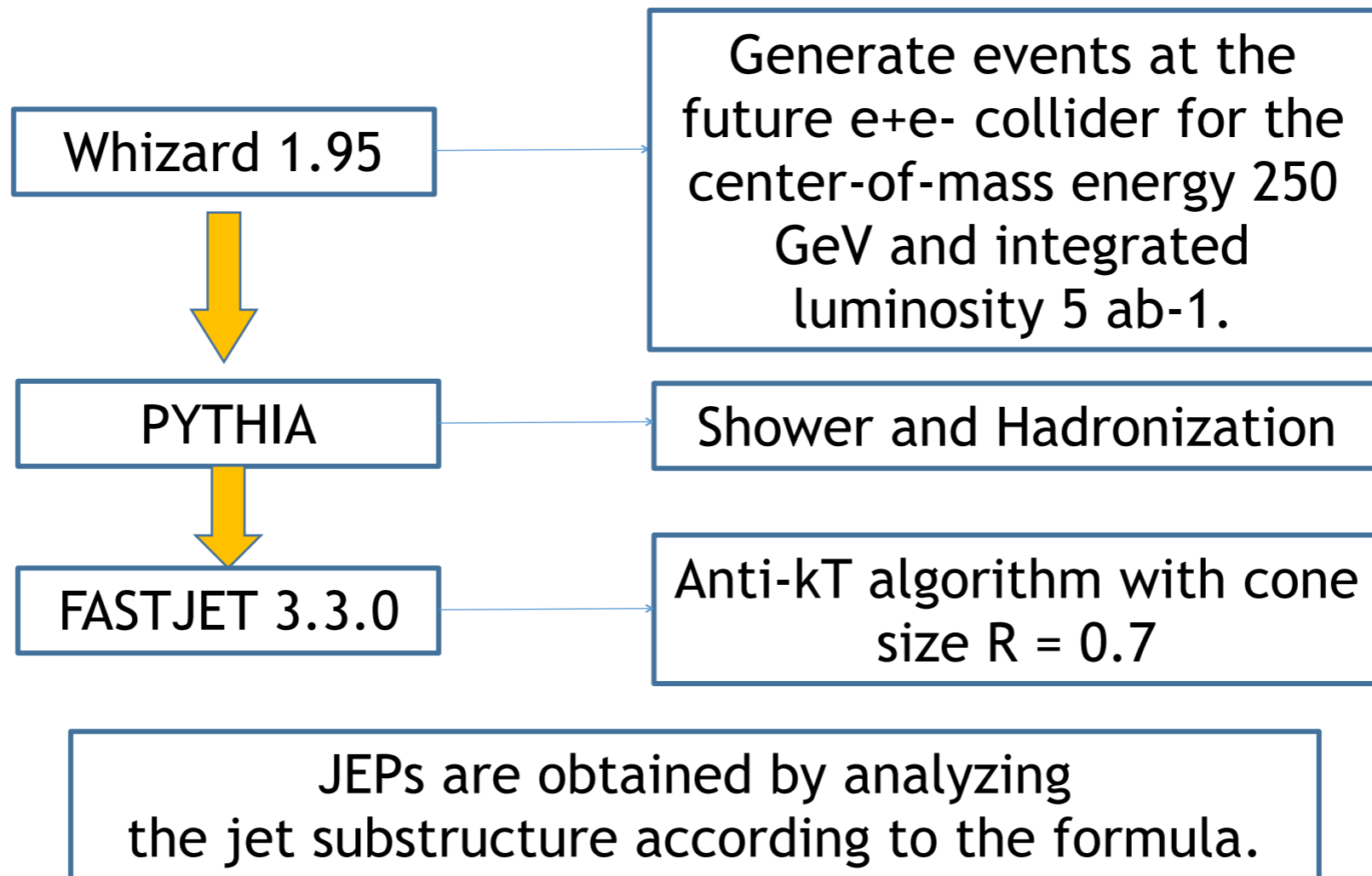
$$Z^N(r) = \frac{\sum_j (\psi_j + b)}{\sum_j^{\text{SM}} (\psi_j + b)},$$

$$\delta\kappa_g^Z = \delta\kappa_g^N \left[ \left( \frac{\sigma(r)}{\psi_g + b} \right)^2 + f_g + f_q \left( \frac{\psi_q + b}{\psi_g + b} \right)^2 + f_{\text{BG}} \left( \frac{\psi_{\text{BG}} + b}{\psi_g + b} \right)^2 \right]^{1/2}.$$

**Minimization**   $\frac{\partial \delta\kappa_g^Z}{\partial b} = 0,$

$$b = \frac{\sigma^2(r) + f_{\text{BG}}(\psi_q - \psi_{\text{BG}})(\psi_g - \psi_{\text{BG}})}{f_q(\psi_g - \psi_q) + f_{\text{BG}}(\psi_g - \psi_{\text{BG}})} - \psi_q.$$

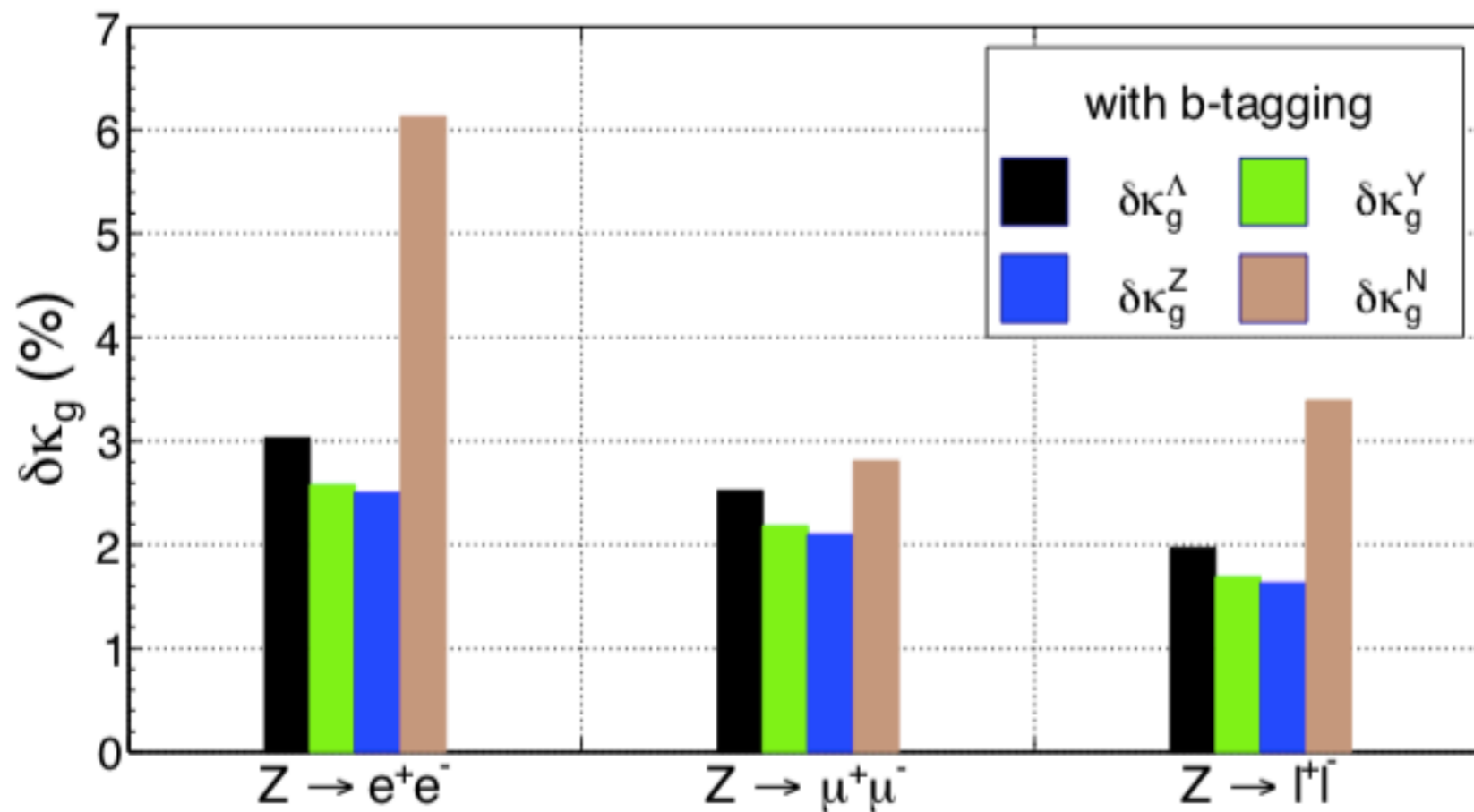
# MC Simulation





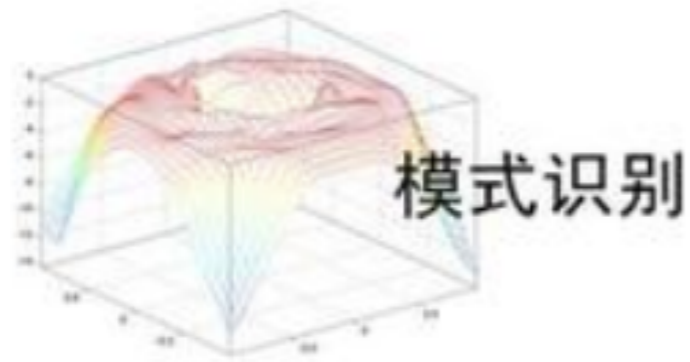
# Probing the Higgs boson-gluon coupling via the jet energy profile at $e^+e^-$ colliders

Gexing Li, Zhao Li, Yandong Liu, Yan Wang, and Xiaoran Zhao  
Phys. Rev. D **98**, 076010 – Published 17 October 2018

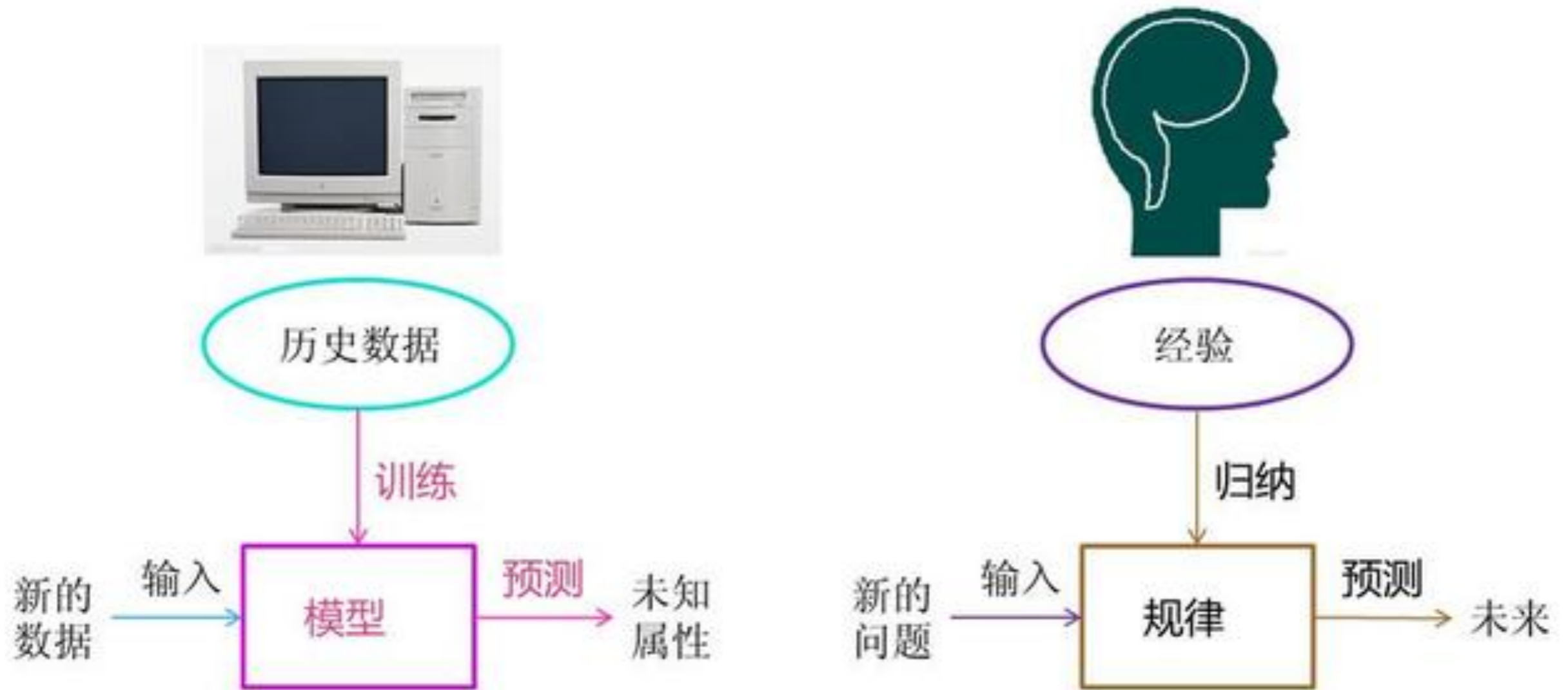


**~50% improvement to reach ~1.6%**

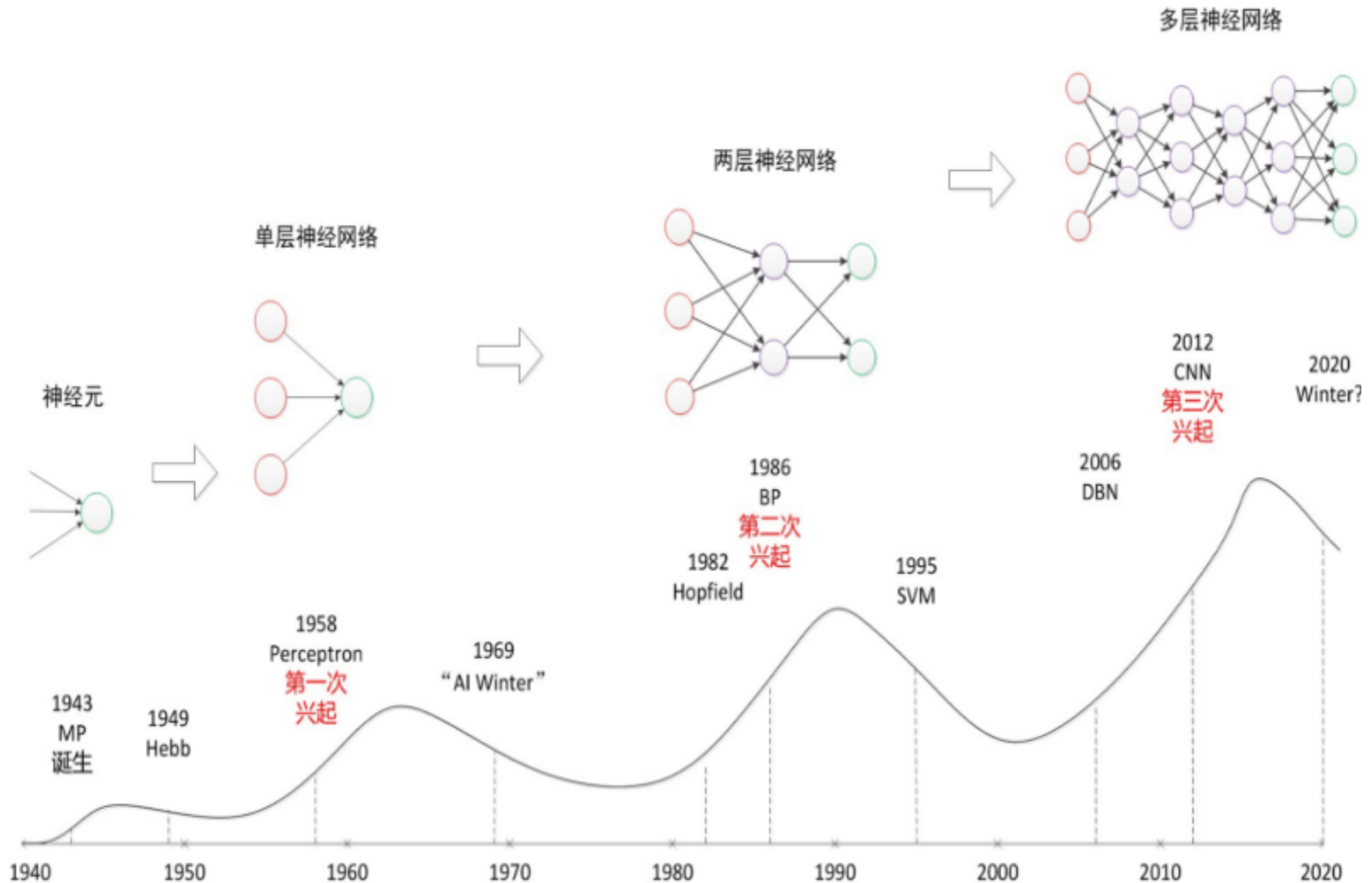
# Machine Learning is widely used in many fields



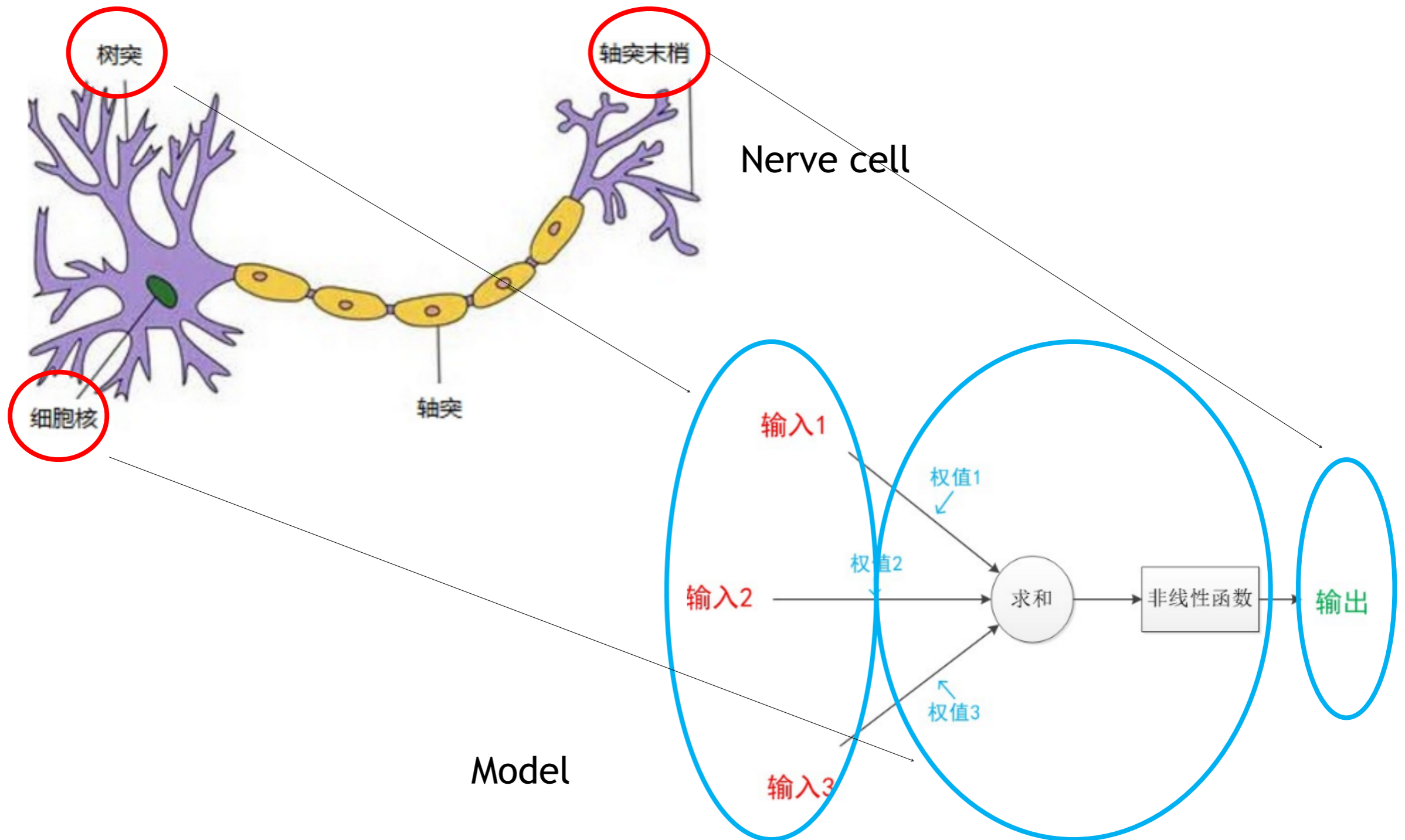
# Machine Learning **VS.** People Learning



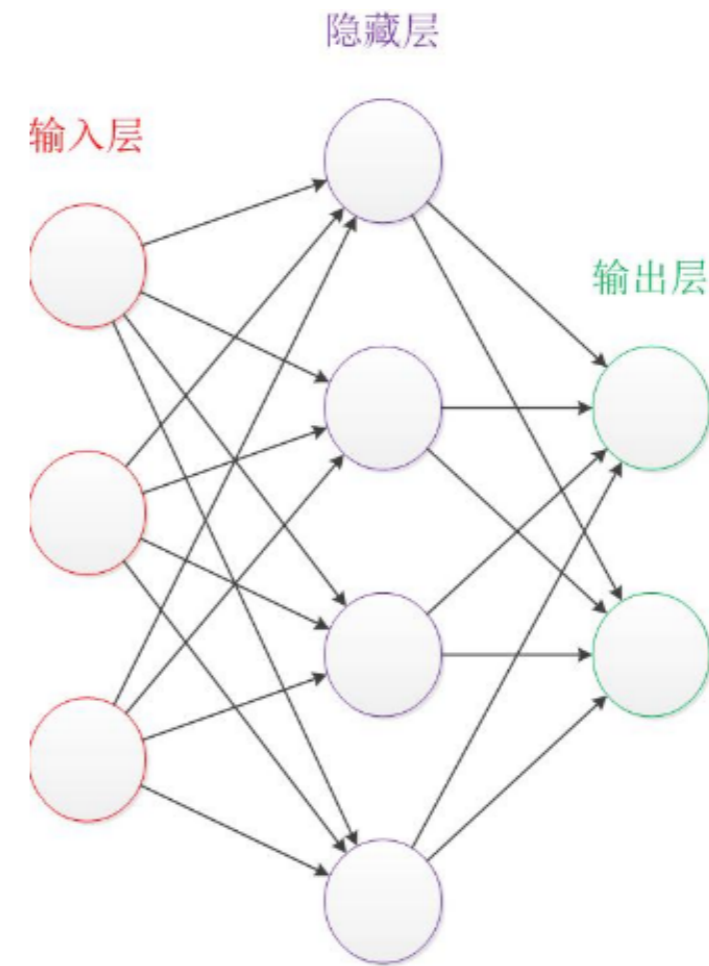
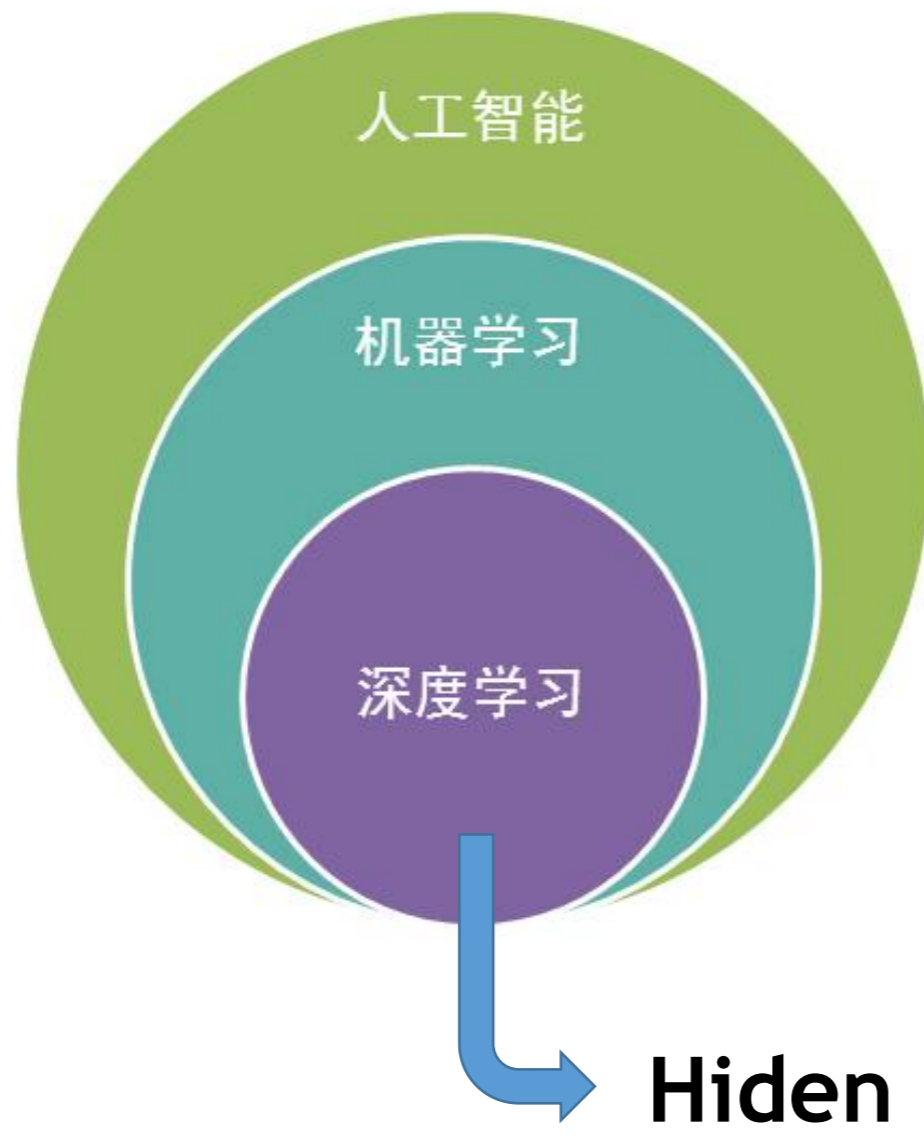
# History of Machine Learning



# Nerve cell



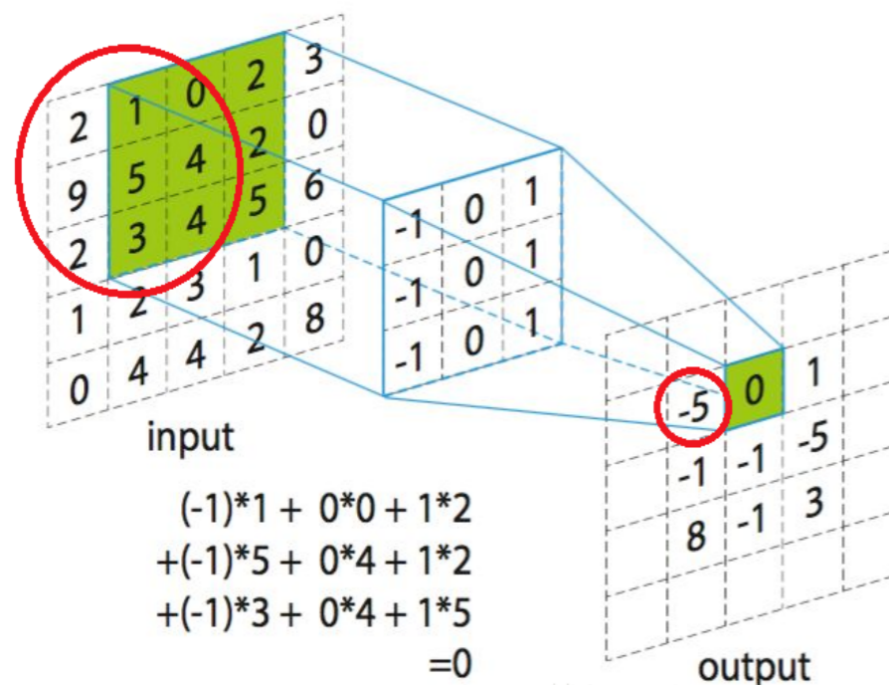
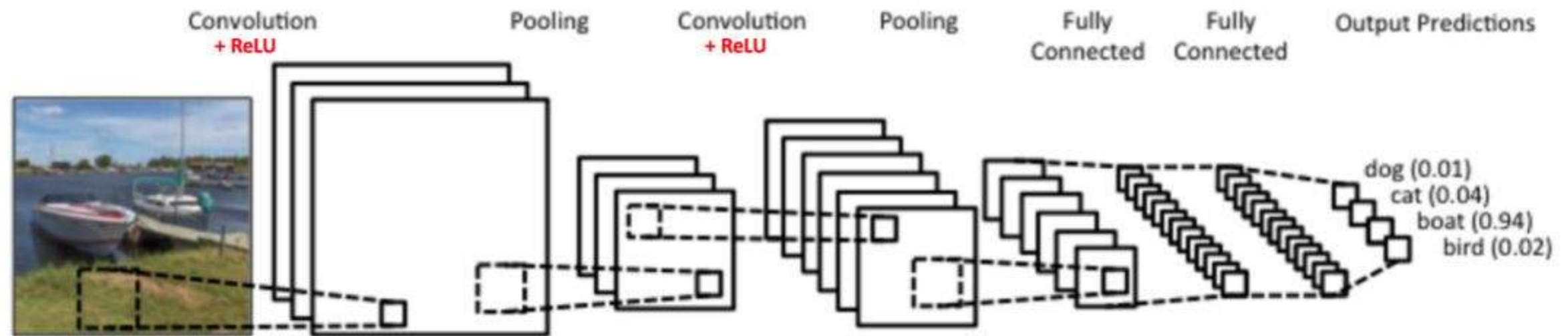
# Deep Learning



Deeper networks can achieve more complex linear classifications.

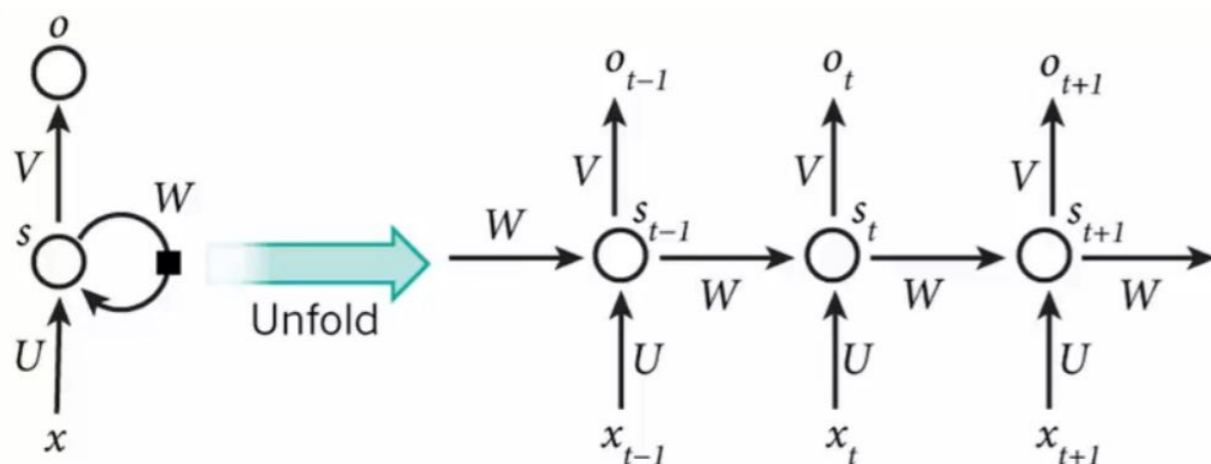
# Convolutional Neural Networks (CNNs)

CNNs is one of the most popular algorithms in deep learning. It has powerful ability of image recognition.



CNNs extract the features from images by the convolutional layers.

# Recursive neural networks (RecNN)

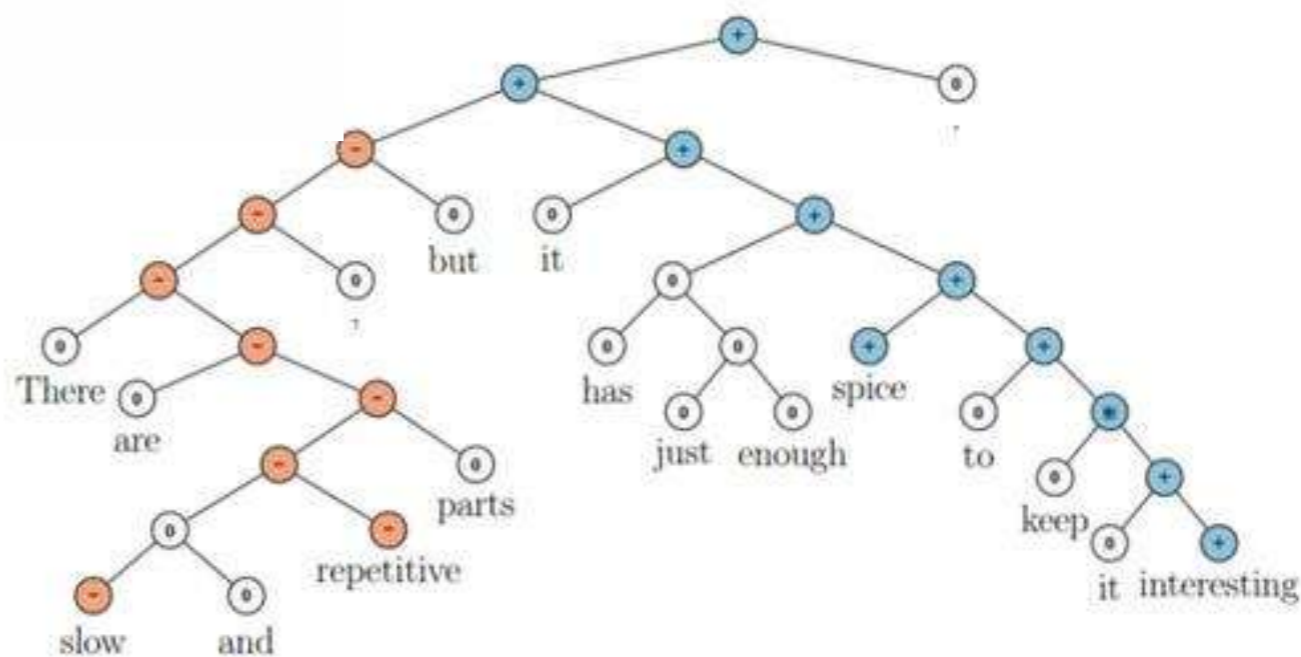


$x_t$ 表示第 $t, t=1,2,3\dots$ 步(step)的输入

$s_t$ 为隐藏层的第 $t$ 步的状态，它是网络的记忆单元。

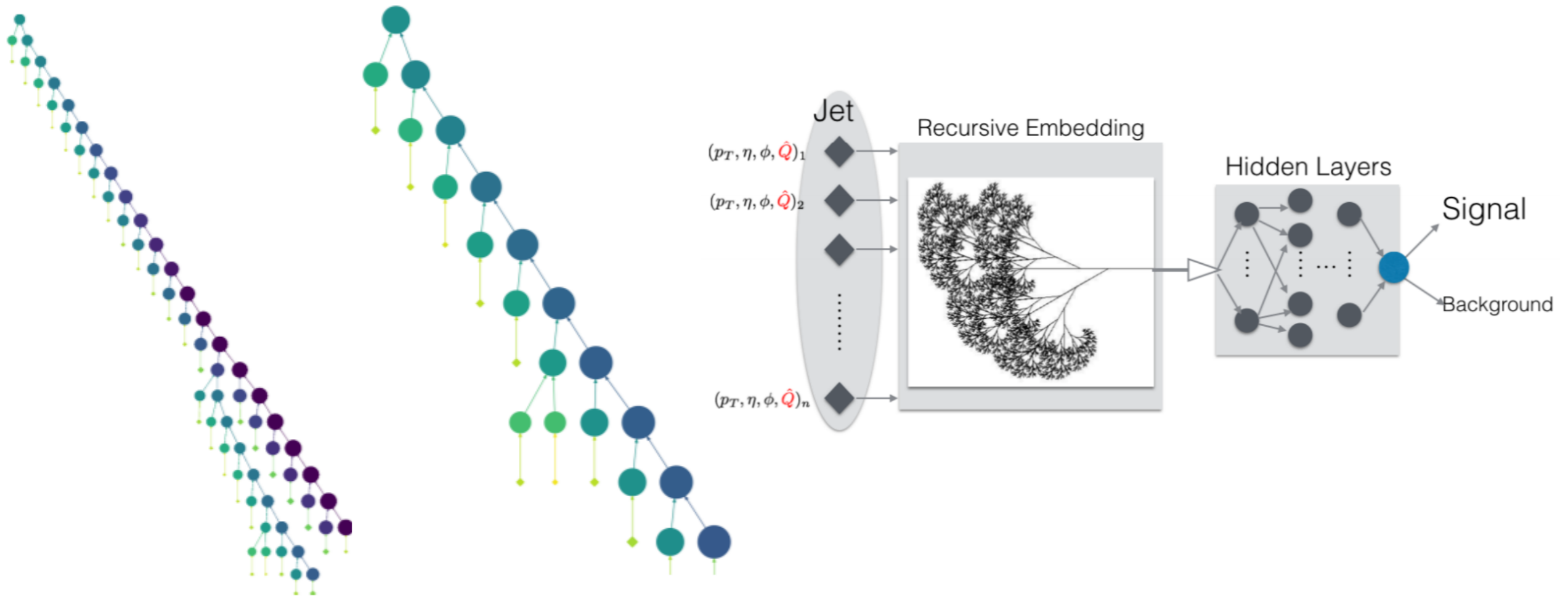
$s_t=f(Ux_t+Ws_{t-1})$ ，其中 $f$ 一般是非线性的激活函数

$o_t$ 是第 $t$ 步的输出，如下个单词的向量表示 $\text{softmax}(Vs_t)$



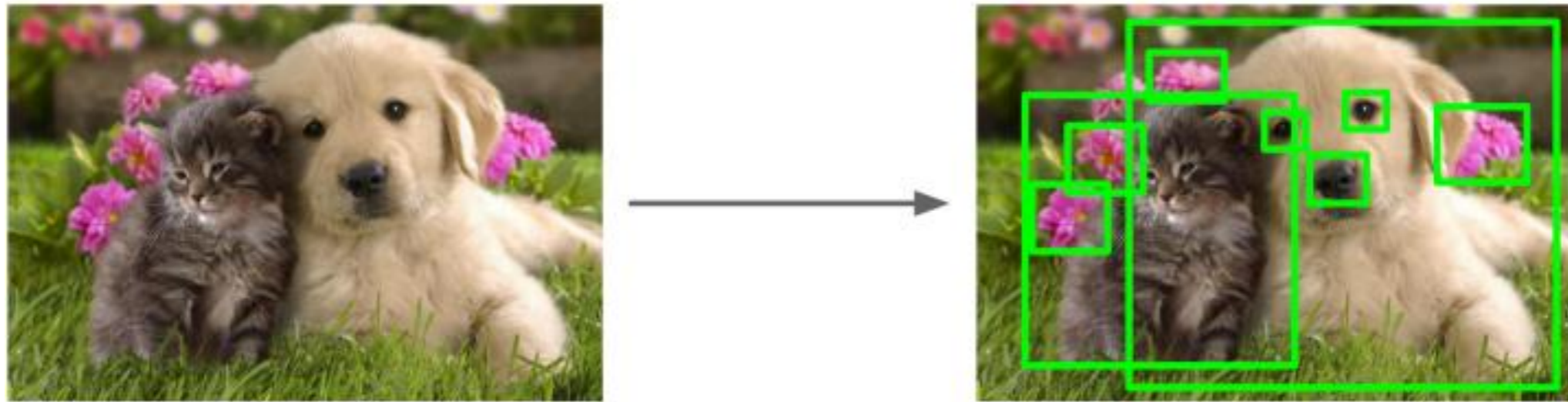


# Identification of quark/gluon jets by RecNN



Typical tree structures for 1 TeV gluon jet (left) and quark jet (right)

# Object detection: Region-based CNN (RCNN)

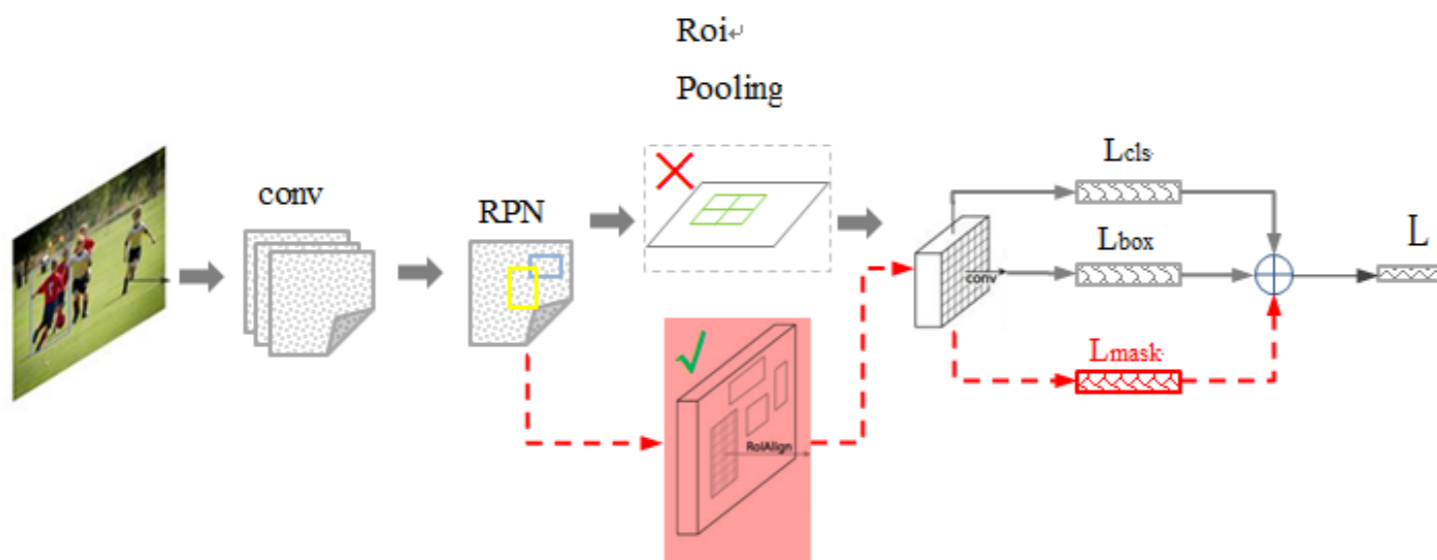


Classification

+

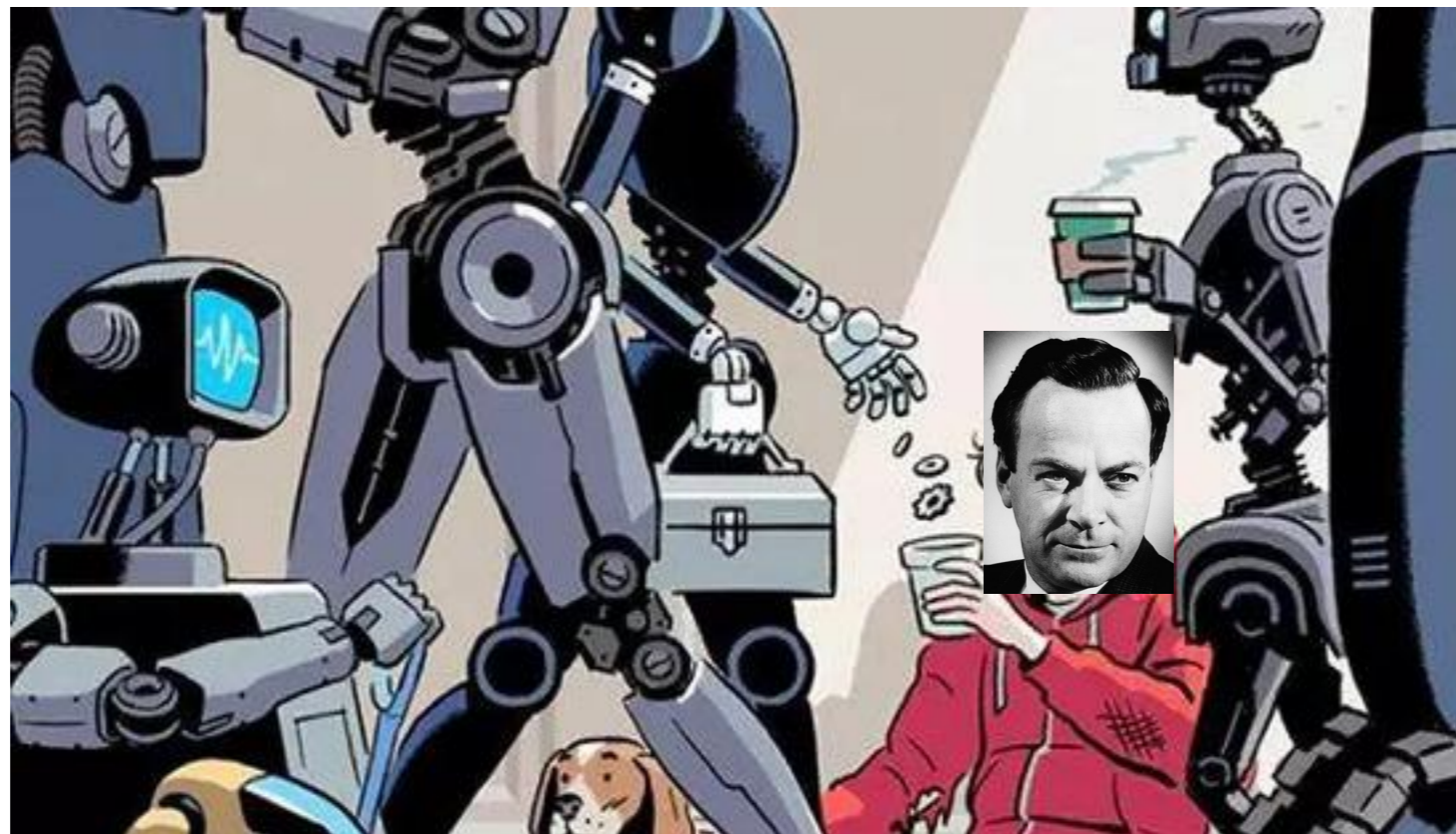
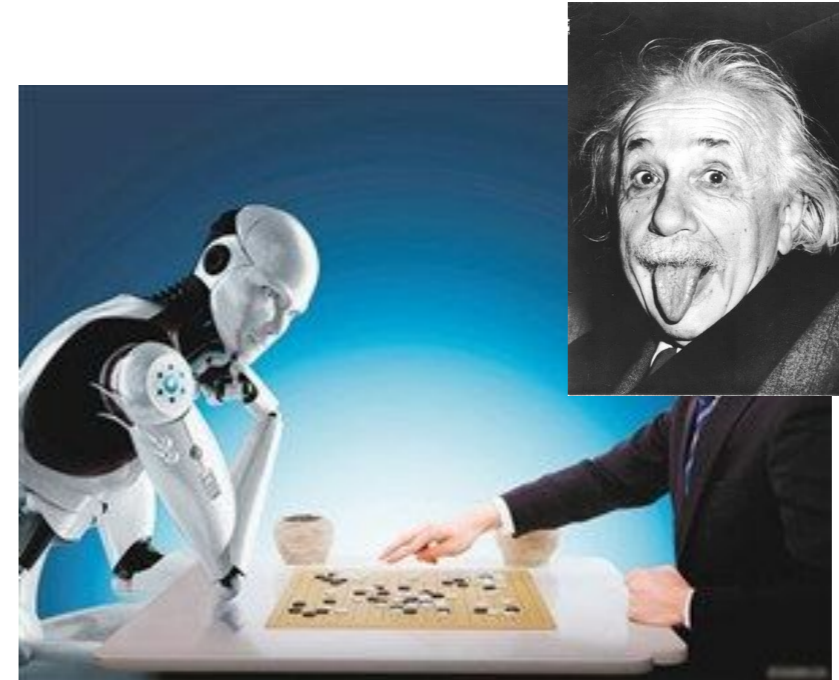
Localization

Evolution: RCNN -> Fast RCNN -> Faster RCNN -> Mask



**Automated jet  
construction  
and  
Classification**

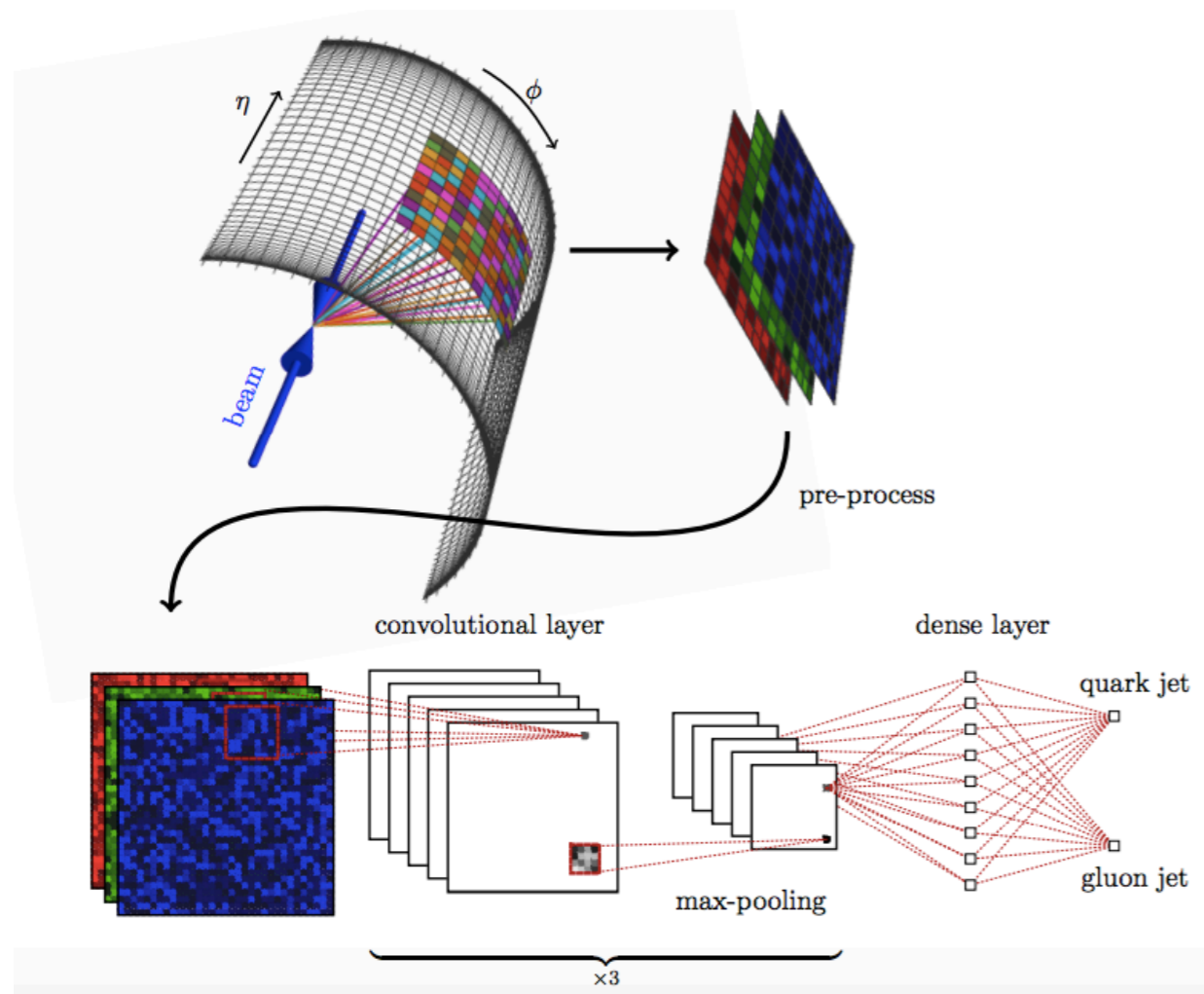
# Machine Learning @ HEP



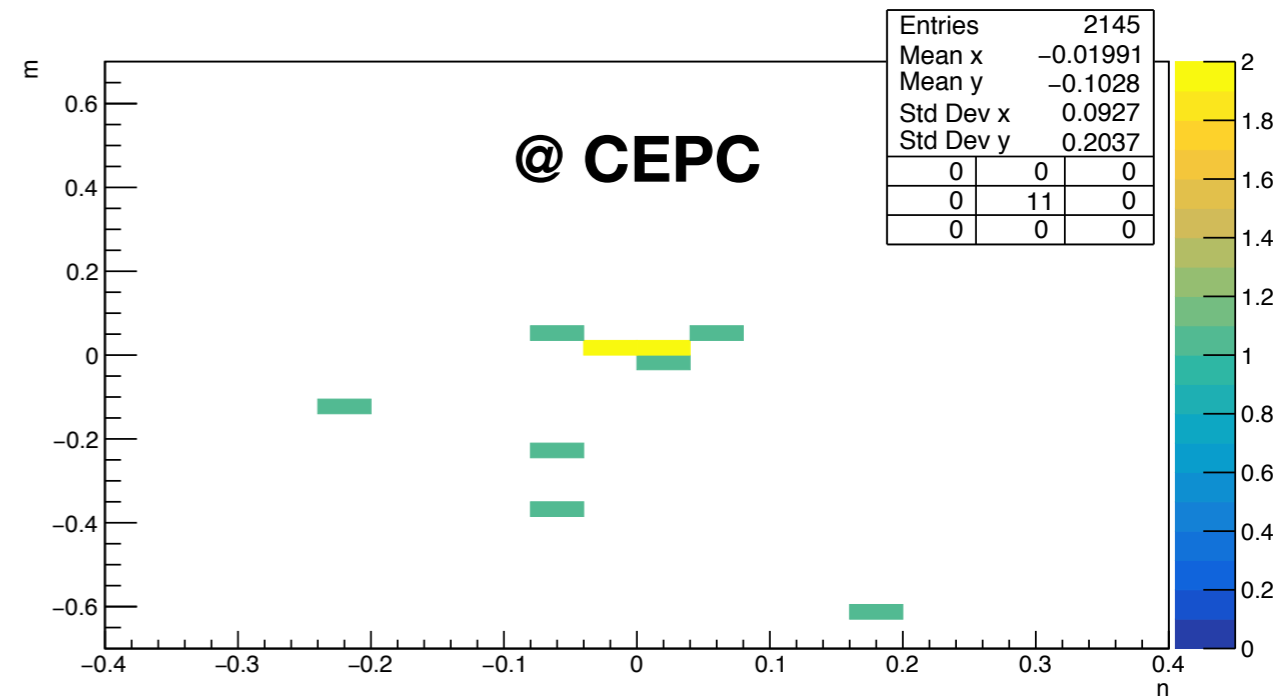
# Machine Learning @ HEP

- **Higgs boson tagging** *PLB 322 (1994) 219-223*
- **boosted W boson tagging** *JHEP1502 (2015) 118*
- **boosted top tagging** *JHEP 1507 (2015) 086*
- **single merged jet tagging** *PRD 93 (2016) 094034*
- **heavy-light quark discrimination** *PRD 94 (2016) 112002*
- **quark-gluon discrimination** *PRL 65 (1990) 1321-1324*
- **scan parameter space in the BSM** *arXiv:1708.06615*
- ...

# CNN for effective coupling measurement



## Images of not-only-jet-but-whole-event



# CNN Configuration

```
nb_filters=64
batch_size=128
nb_epoch=50

model=Sequential()
model.add(Conv2D(nb_filters,(3,3),padding='valid',kernel_initializer="random_normal",input_shape=(33,65,1)))
model.add(Activation('relu'))
model.add(MaxPooling2D(pool_size=(2,2),strides=2))
model.add(Dropout(0.5))

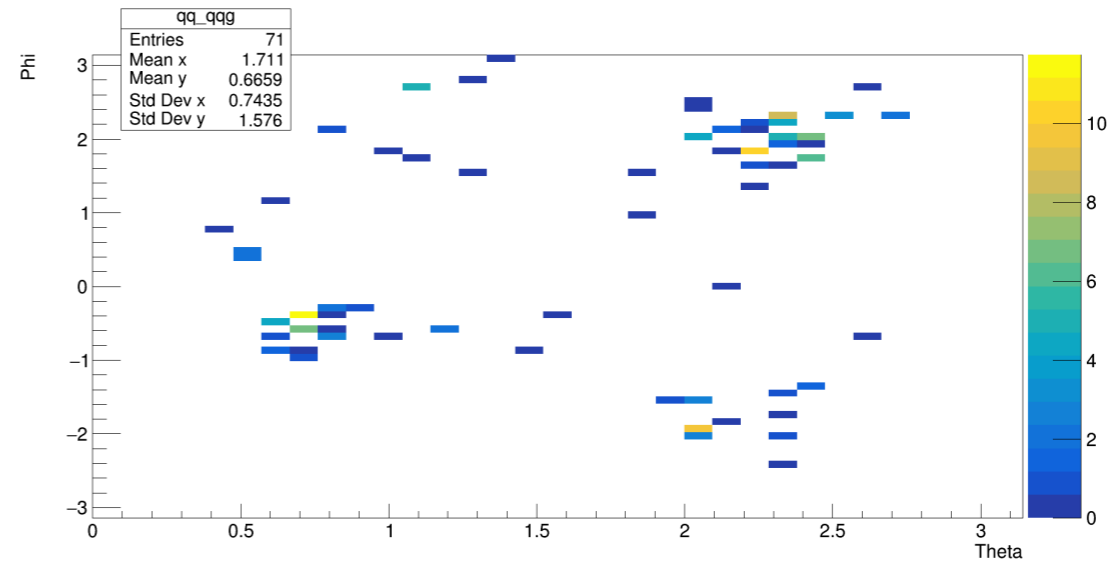
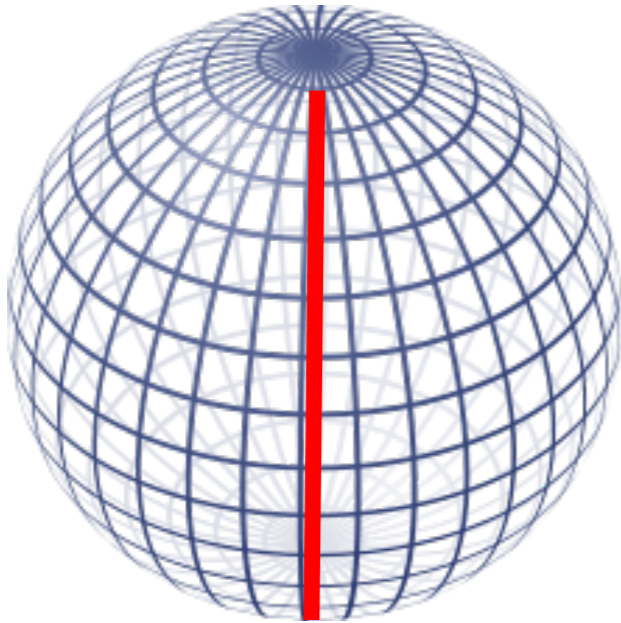
model.add(Conv2D(nb_filters,(3,3),padding='valid',kernel_initializer="random_normal"))
model.add(Activation('relu'))
model.add(MaxPooling2D(pool_size=(2,2),strides=2))
model.add(Dropout(0.5))

model.add(Conv2D(nb_filters,(3,3),padding='valid',kernel_initializer="random_normal"))
model.add(Activation('relu'))
model.add(MaxPooling2D(pool_size=(2,2),strides=2))
model.add(Flatten())
model.add(Dense(128))
model.add(Activation('relu'))
model.add(Dropout(0.5))

model.add(Dense(1))
model.add(Activation('sigmoid'))

adam = Adam(lr=0.0005, beta_1=0.9, beta_2=0.999, epsilon=1e-08)
model.compile(loss='binary_crossentropy',optimizer = adam, metrics=['accuracy'])
early_stopping = EarlyStopping(monitor='val_loss', patience=3, verbose=0, mode='auto')
```

# Recover symmetry via rotation



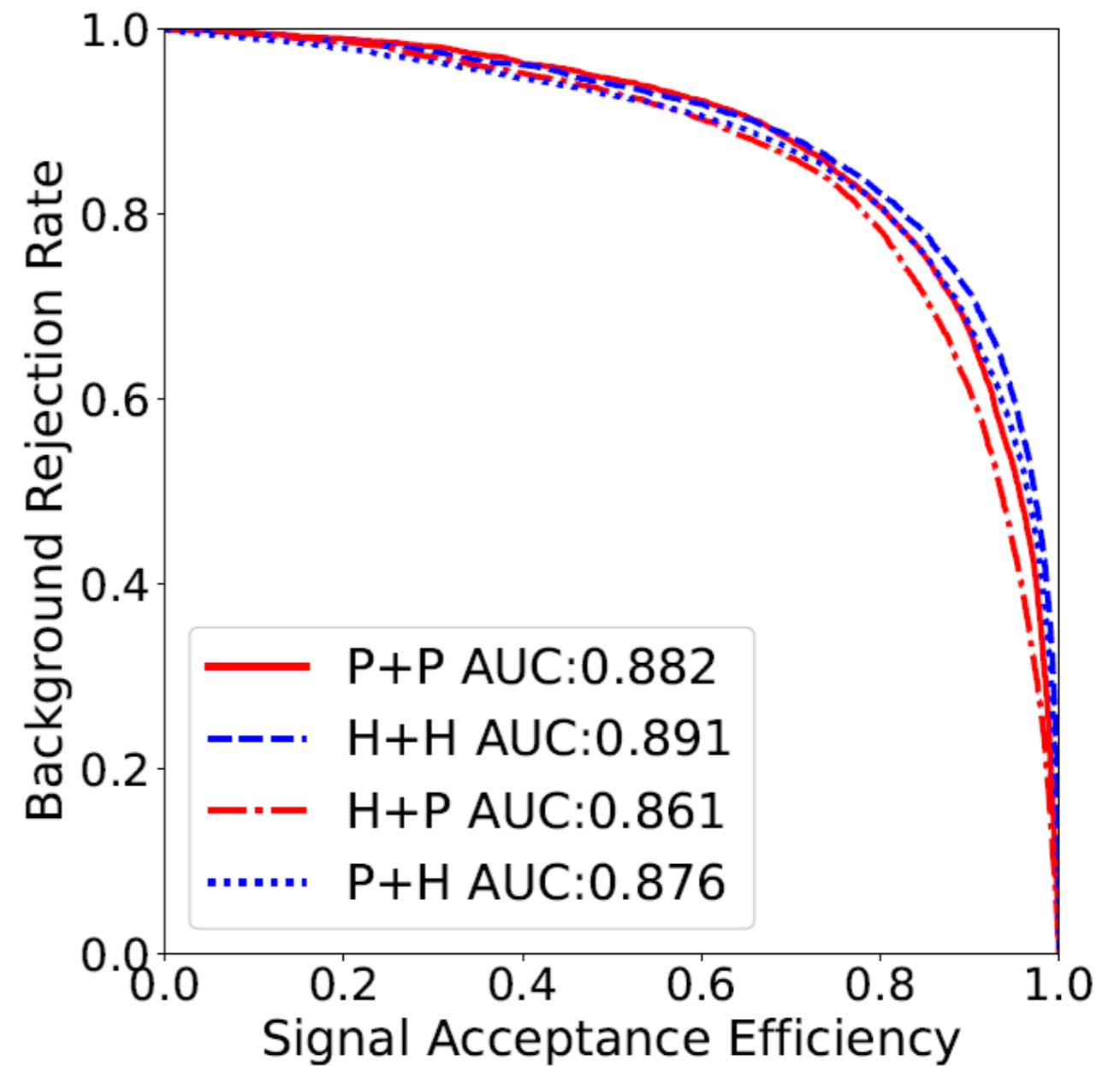
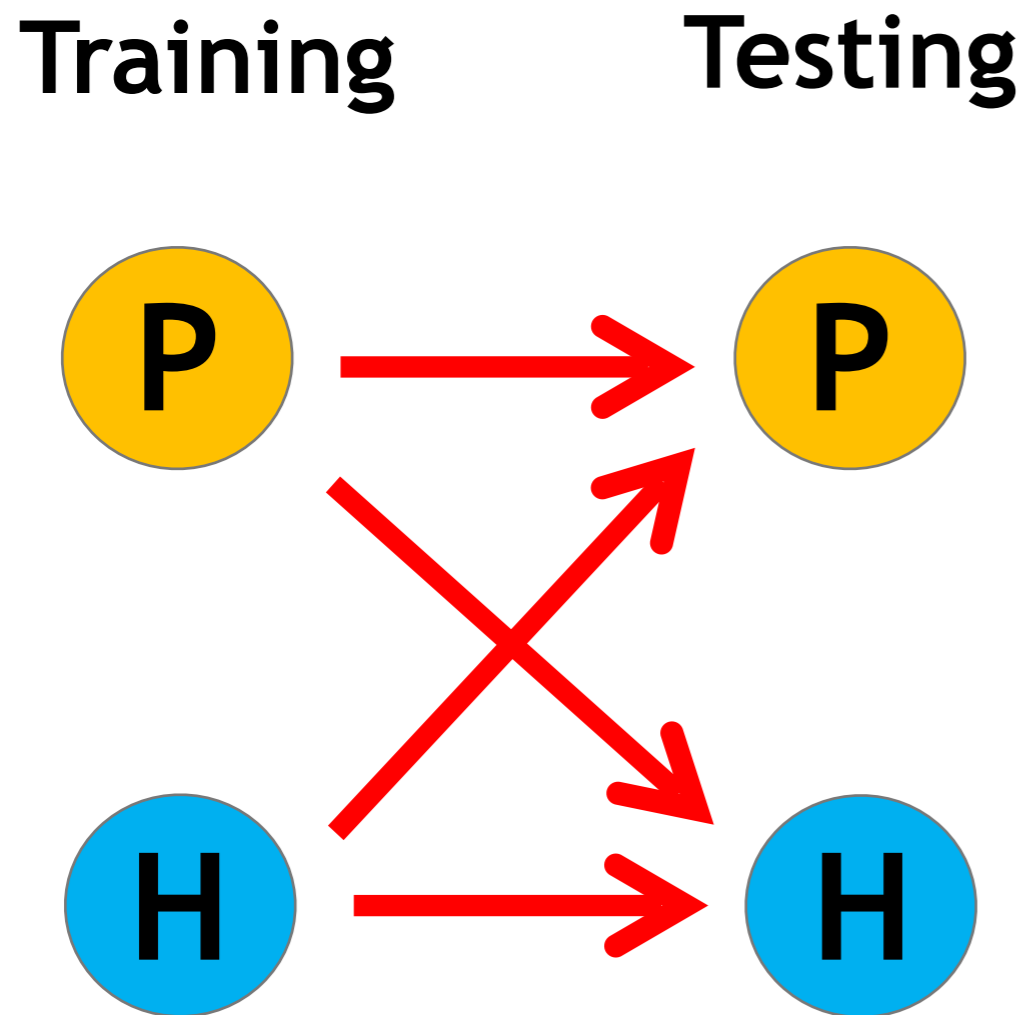
phi symmetry break

Rotate at phi direction

Each rotation turns 13 pixels.

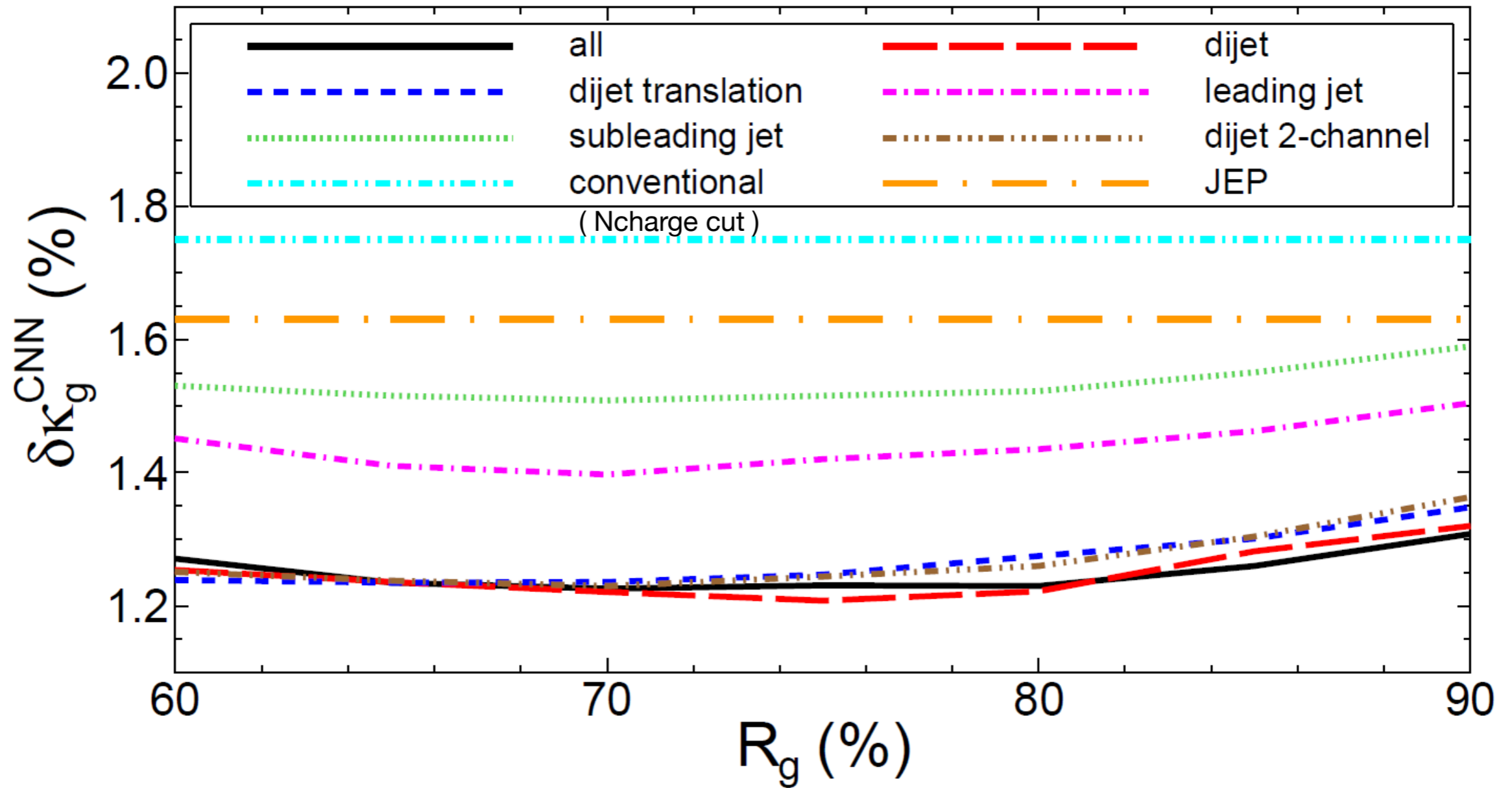
Each image becomes 5 different images.

# Performance of CNNs



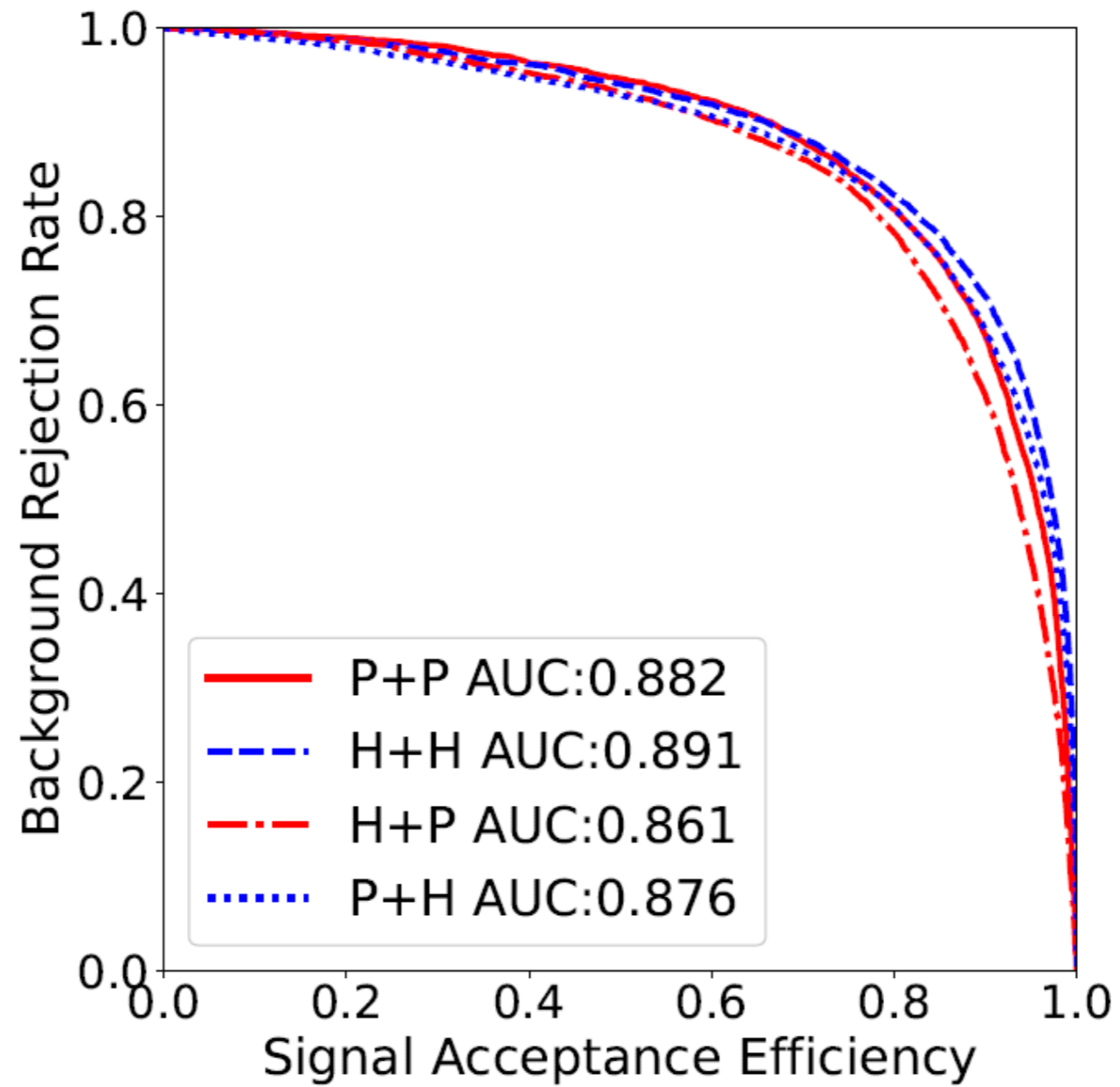


# Improvement of CNNs

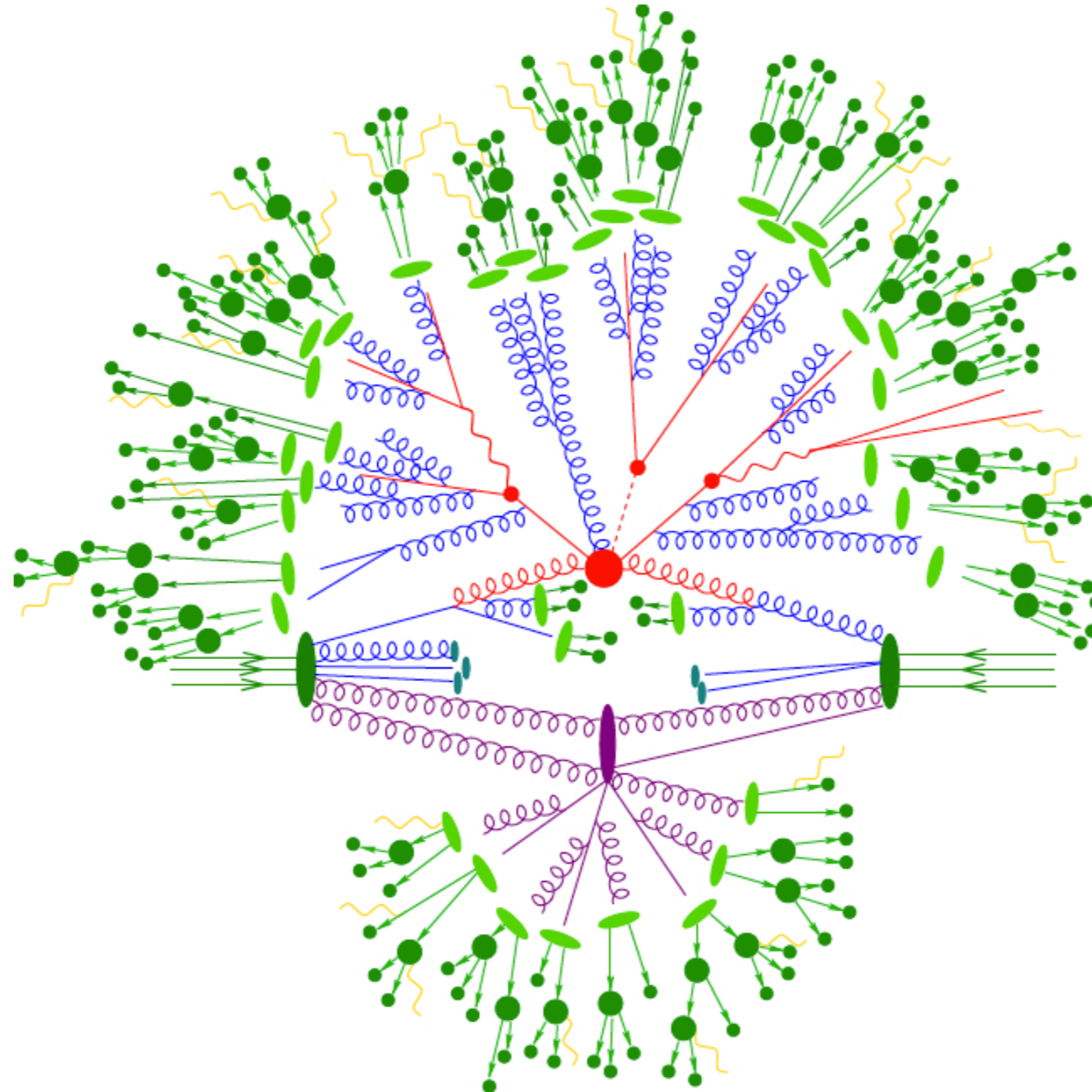


**Further ~30% improvements to reach ~1.2%**

# Revisit AUC comparison between P & H



# Does simulation really simulate physics?



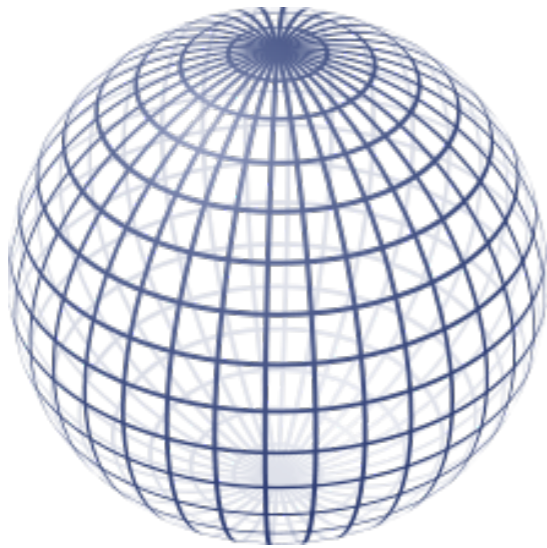
**Parton Shower? Hadronization? Underlying events? etc.**

# Conclusion

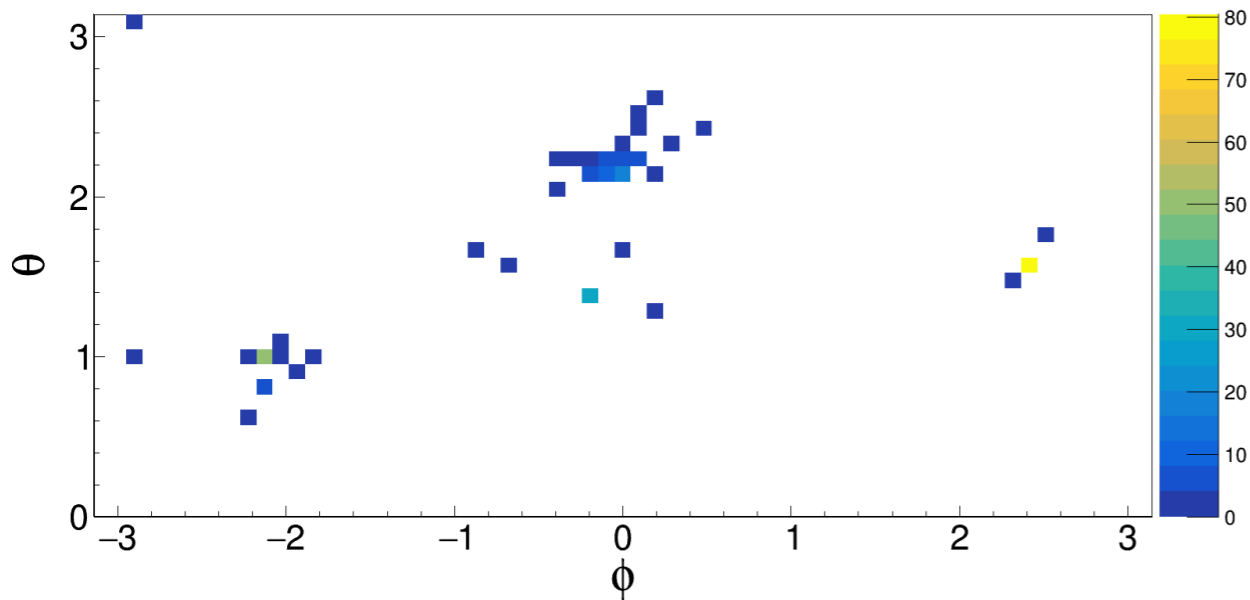
- CEPC can be very precise factory for Higgs investigation.
- Deep learning is full of potential for CEPC physics.
- Maybe deep learning can also help LHC physics.
- However, we should be careful about traps in simulations.

**Backup**

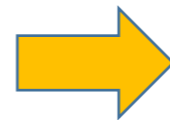
# Convolutional Neural Networks (CNNs)



Energy of all the final state stable particles



2D image (62\*30 pixels)



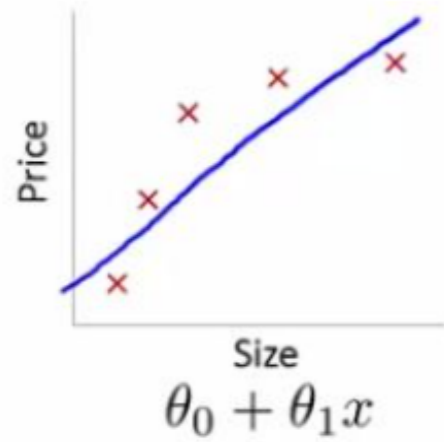
1	1	1	0	0
0 <sub>x1</sub>	1 <sub>x0</sub>	1 <sub>x1</sub>	1	0
0 <sub>x0</sub>	0 <sub>x1</sub>	1 <sub>x0</sub>	1	1
0 <sub>x1</sub>	0 <sub>x0</sub>	1 <sub>x1</sub>	1	0
0	1	1	0	0

Image

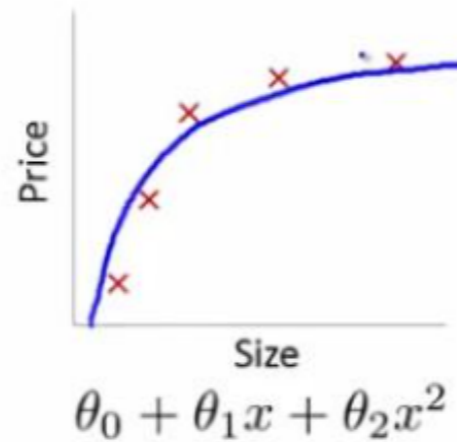
4	3	4
2		

Convolved Feature

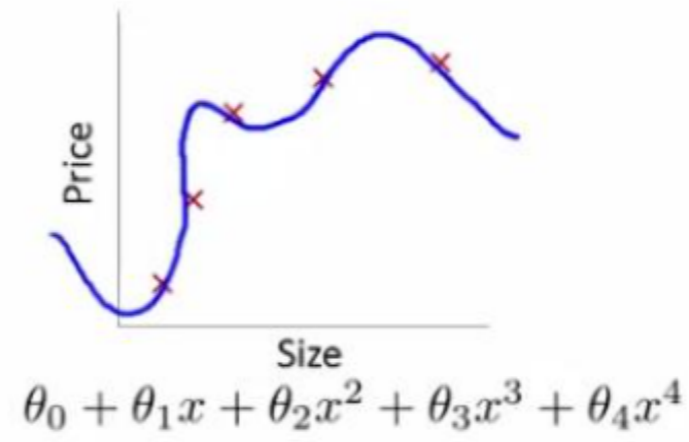
# Overfit



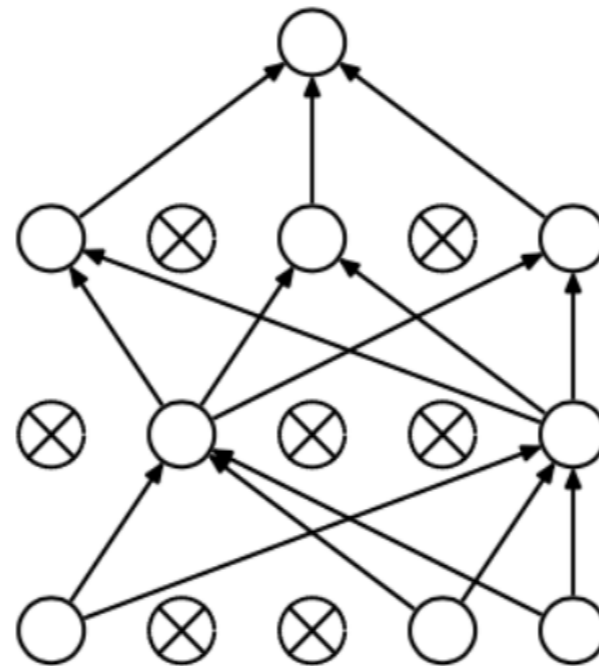
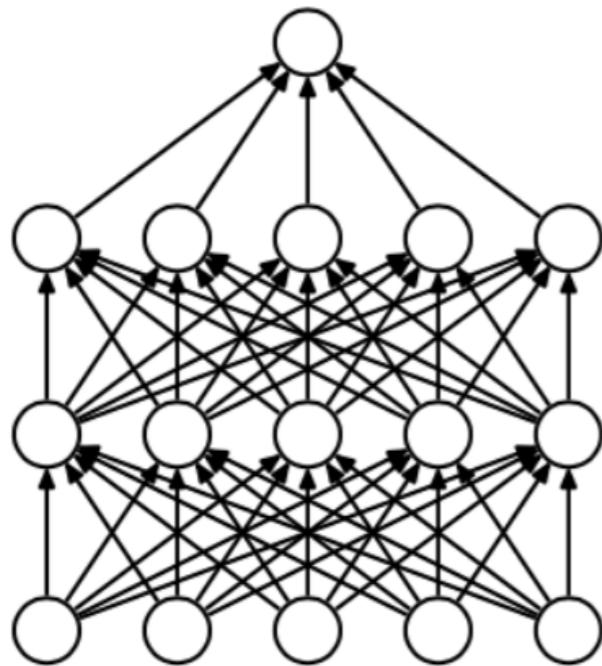
High bias  
(underfit)



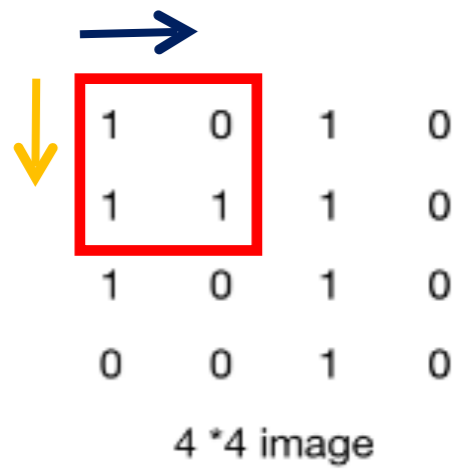
"Just right"



High variance  
(overfit)



## Dropout



Convolutionall



Convolutionall





1	0	1	0
1	1	1	0
1	0	1	0
0	0	1	0

4 \* 4 image



1	-1
1	-1

Filter1

1	1
-1	-1

Filter2

Convolutionall



1	-1	2
1	-1	2
1	-2	2

feature map

Convolutionall



-1	-1	0
1	1	0
1	0	0

feature map

MaxPooling



1	2
1	2

feature\_map1

MaxPooling



1	1
1	1

feature\_map2

1	0	1	0
1	1	1	0
1	0	1	0
0	0	1	0

4 \* 4 image



1	-1
1	-1

Filter1

1	1
-1	-1

Filter2

Convolutional



1	-1	2
1	-1	2
1	-2	2

feature map

Convolutional



-1	-1	0
1	1	0
1	0	0

feature map

MaxPooling



1	2
1	2

feature\_map1

MaxPooling



1	1
1	1

feature\_map2

Flatten

1
2
1
2
1
1
1
1



Fully  
Connected  
Layer

# Max Pooling

