



UNIVERSITÀ  
DI PAVIA

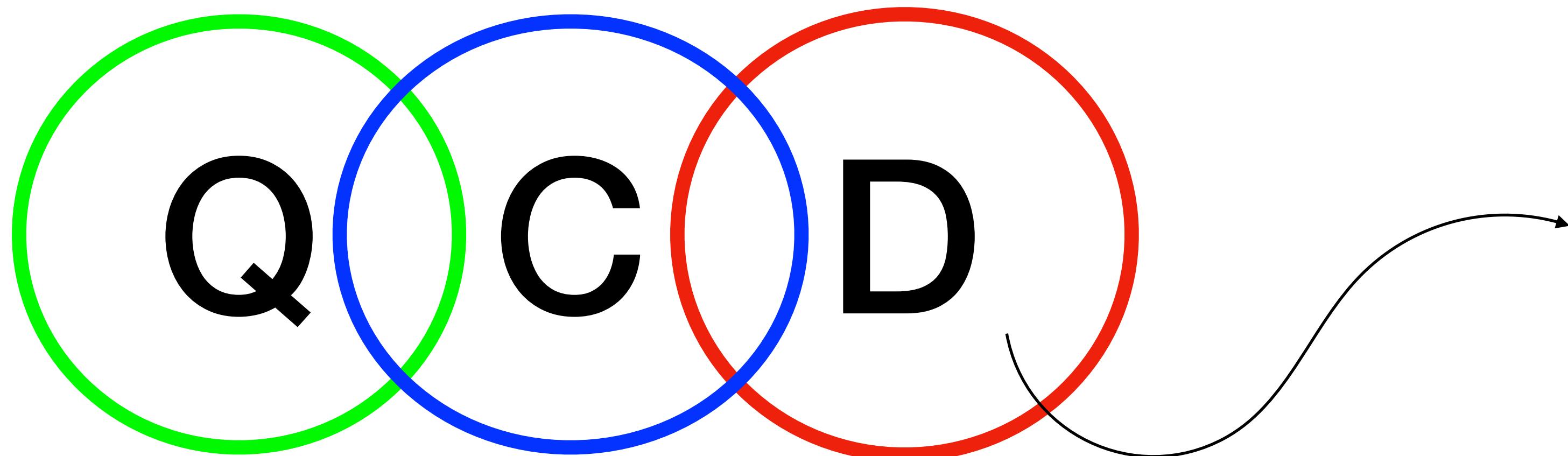


# Extraction of di-hadron fragmentation functions at NNLO

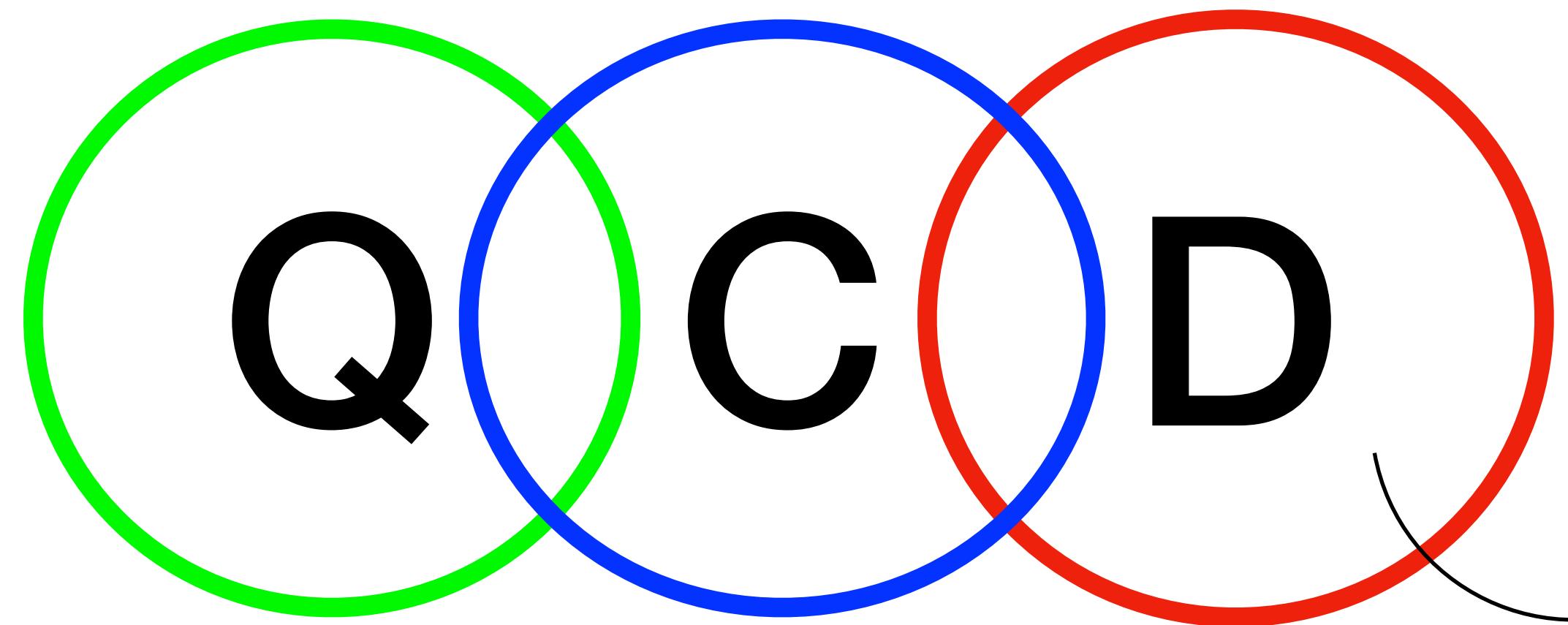
PhD candidate:  
Luca Polano

Supervisor:  
Marco Radici  
Alessandro Bacchetta

TNPI2025, Cortona

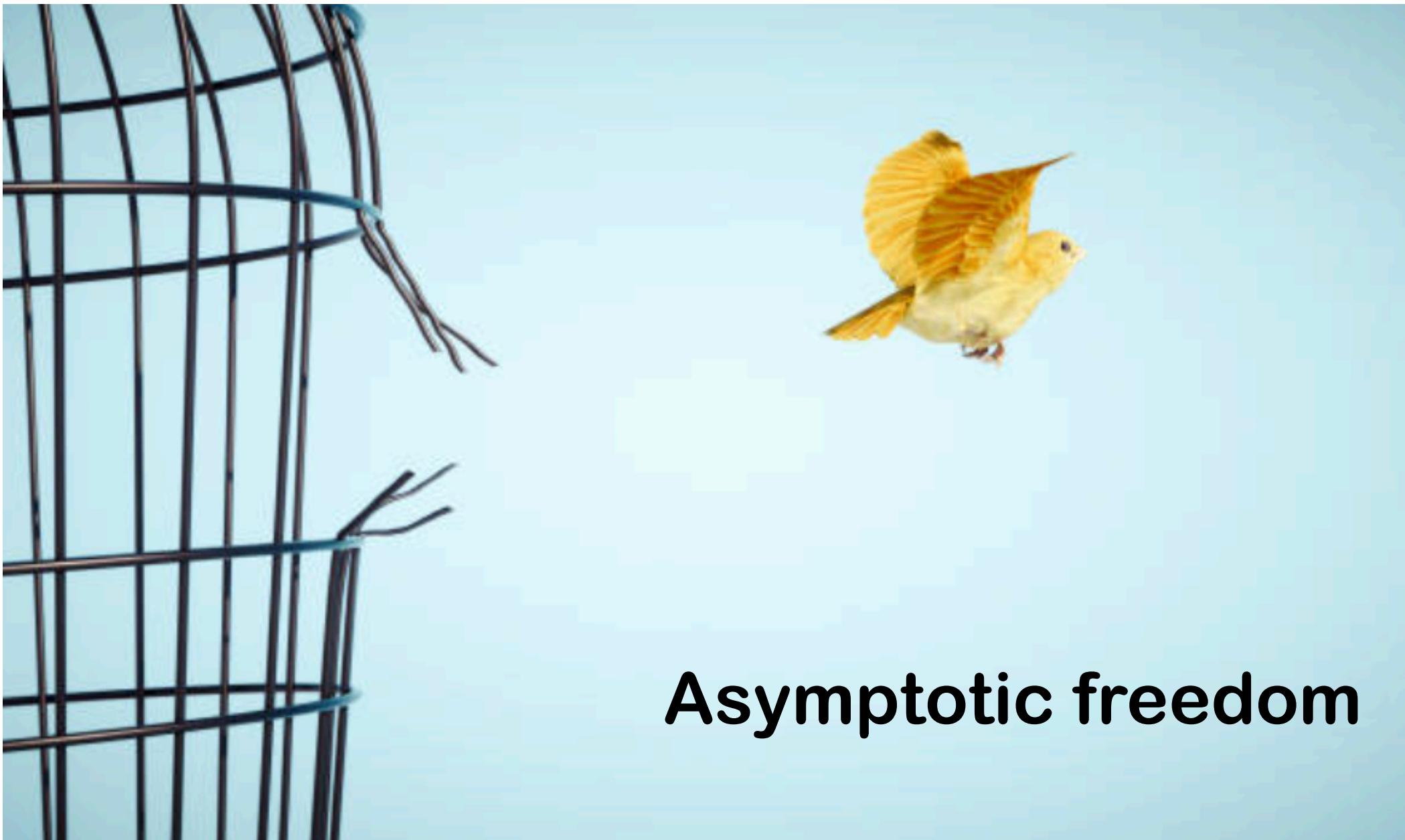


Quarks &  
gluons



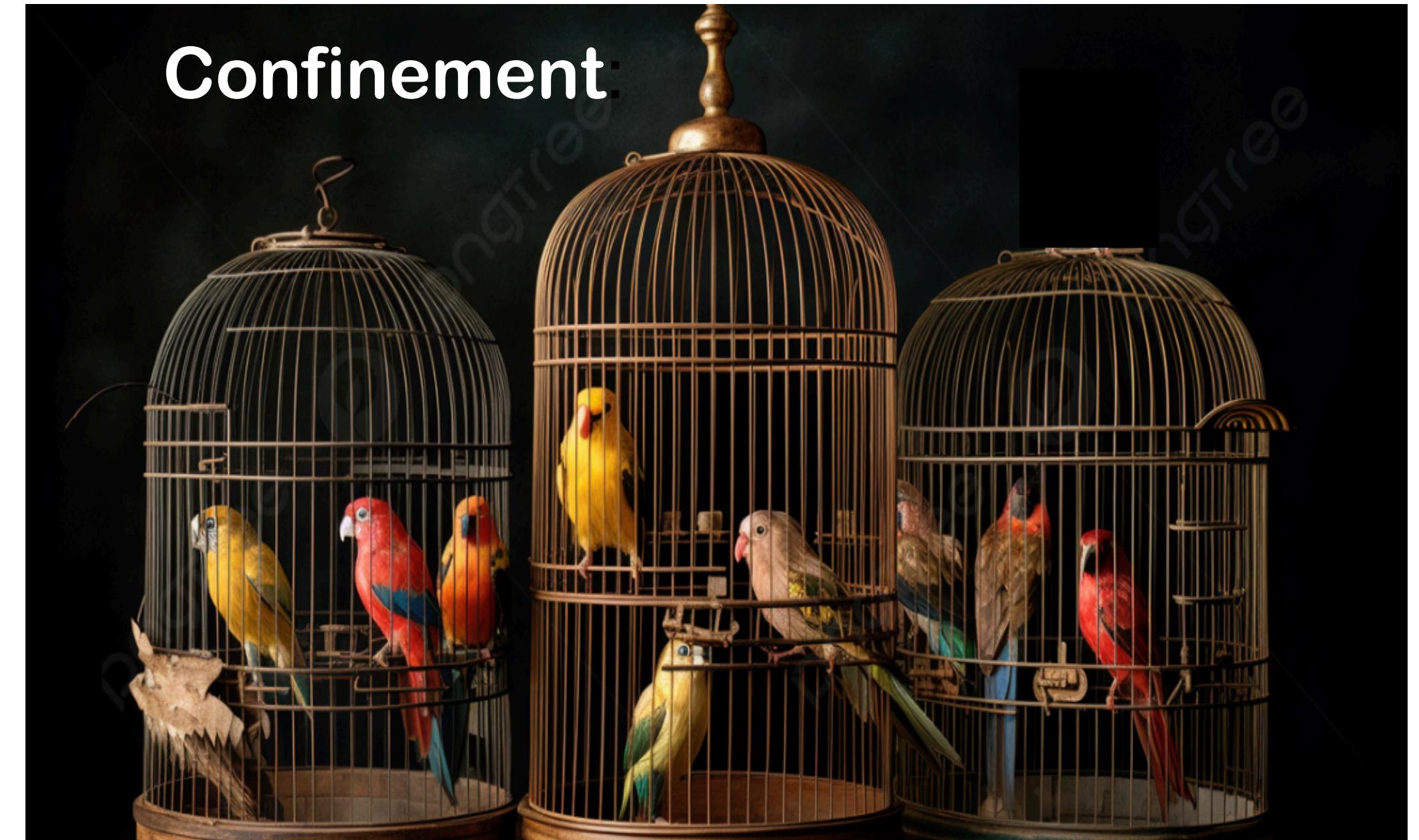
Quarks &  
gluons

High energies

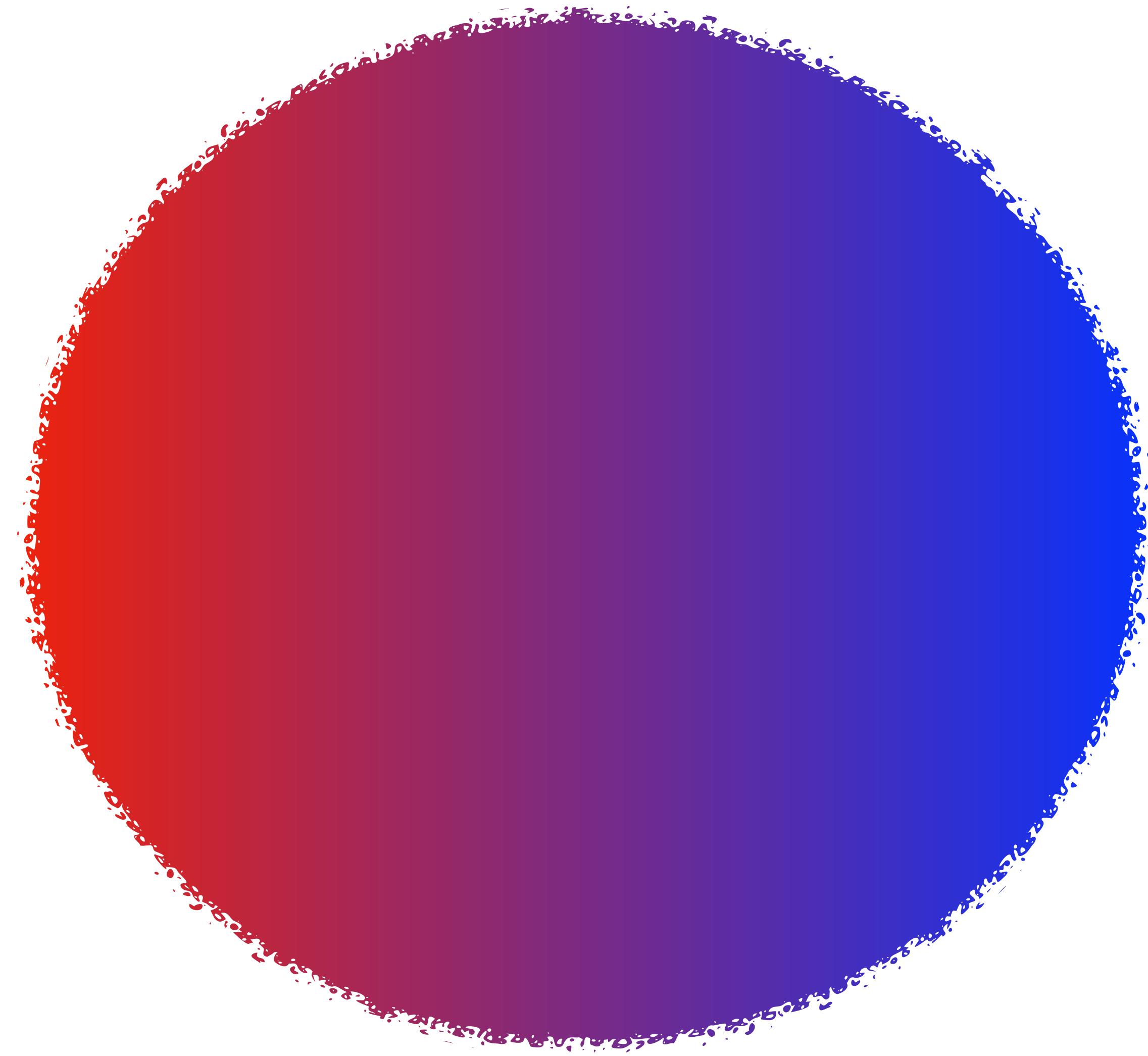


Asymptotic freedom

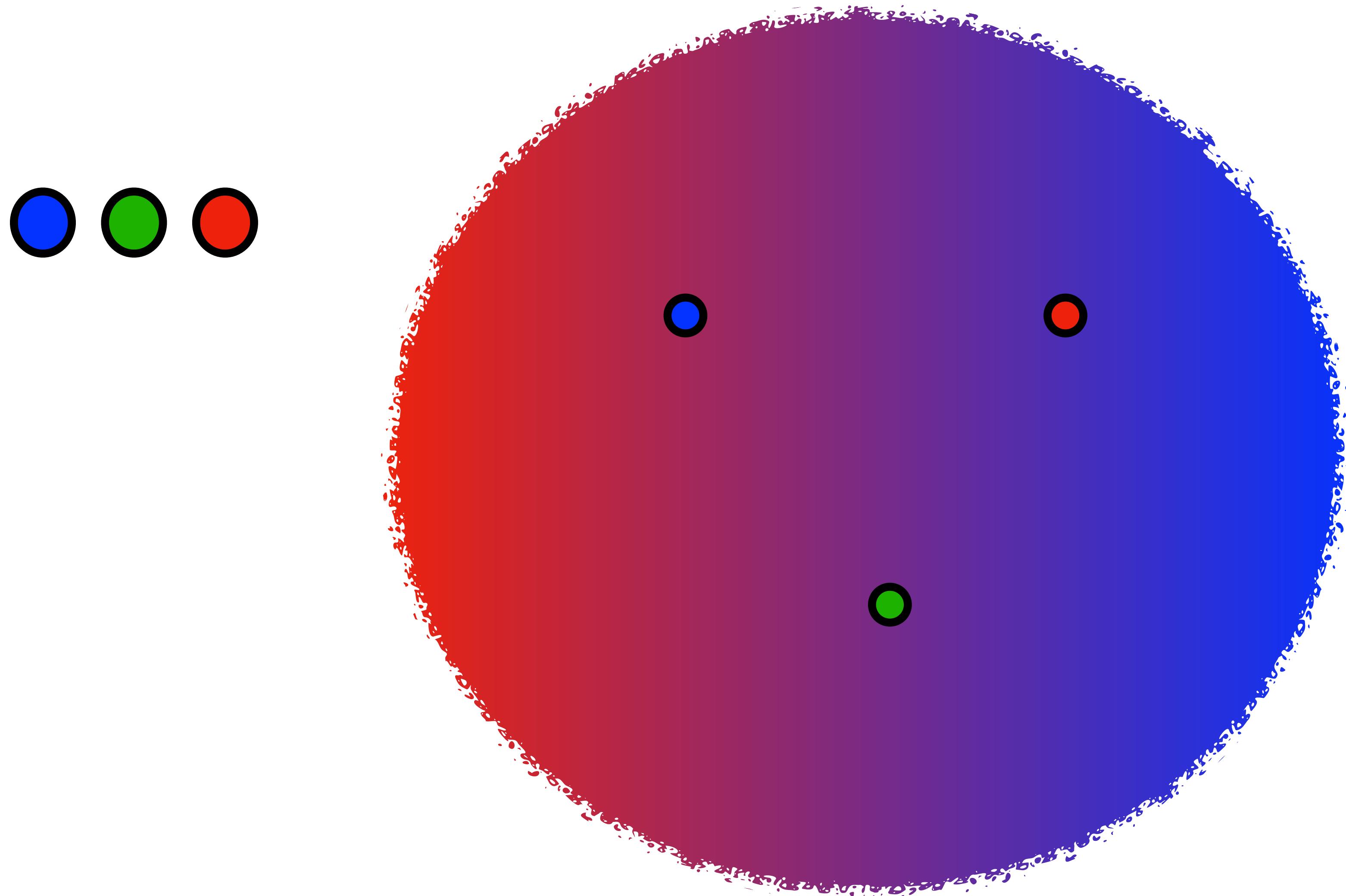
Low,  $\Lambda_{QCD} \sim 200$  MeV



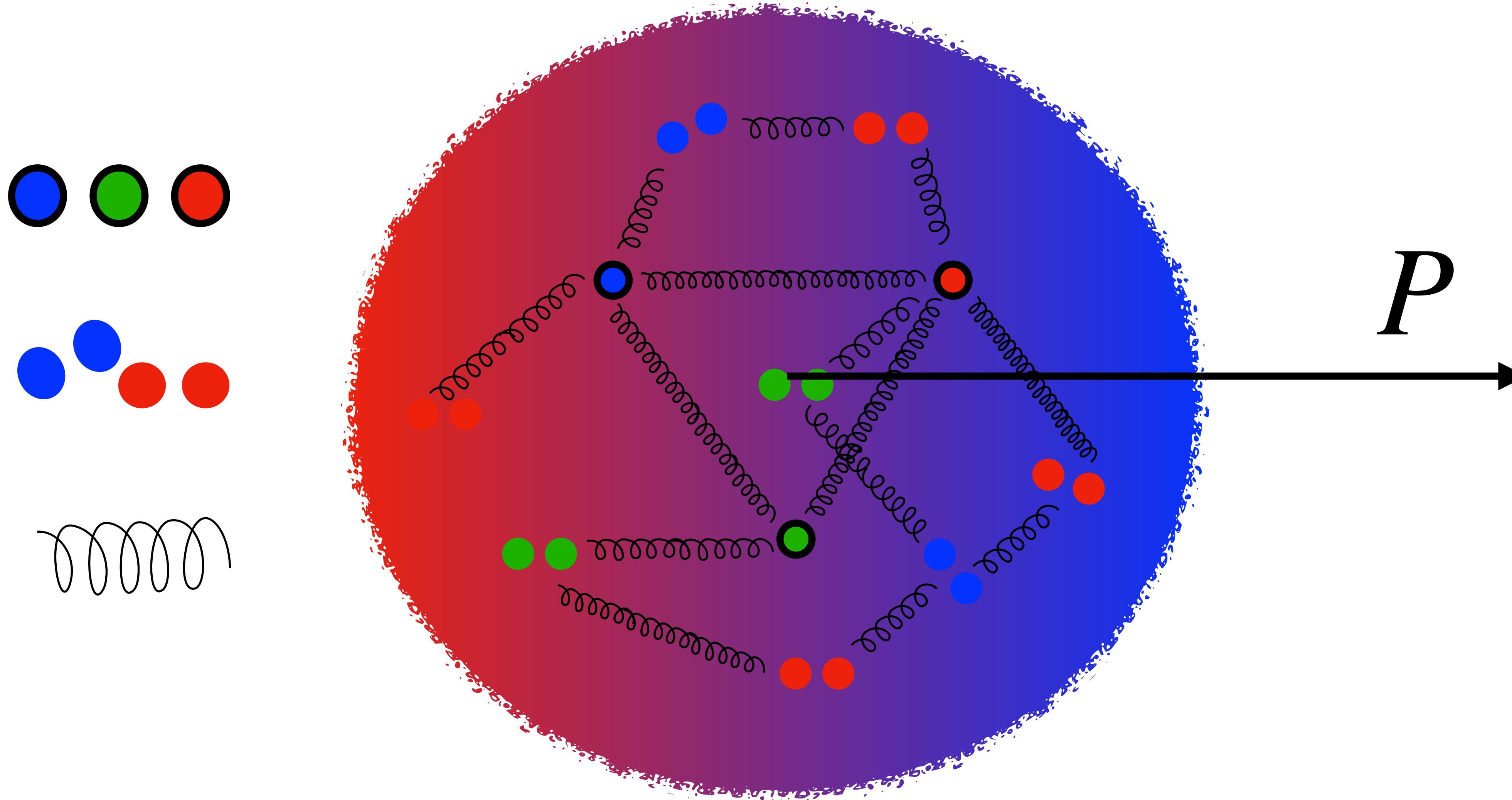
At  $\sim \Lambda_{QCD} \sim 200$  MeV



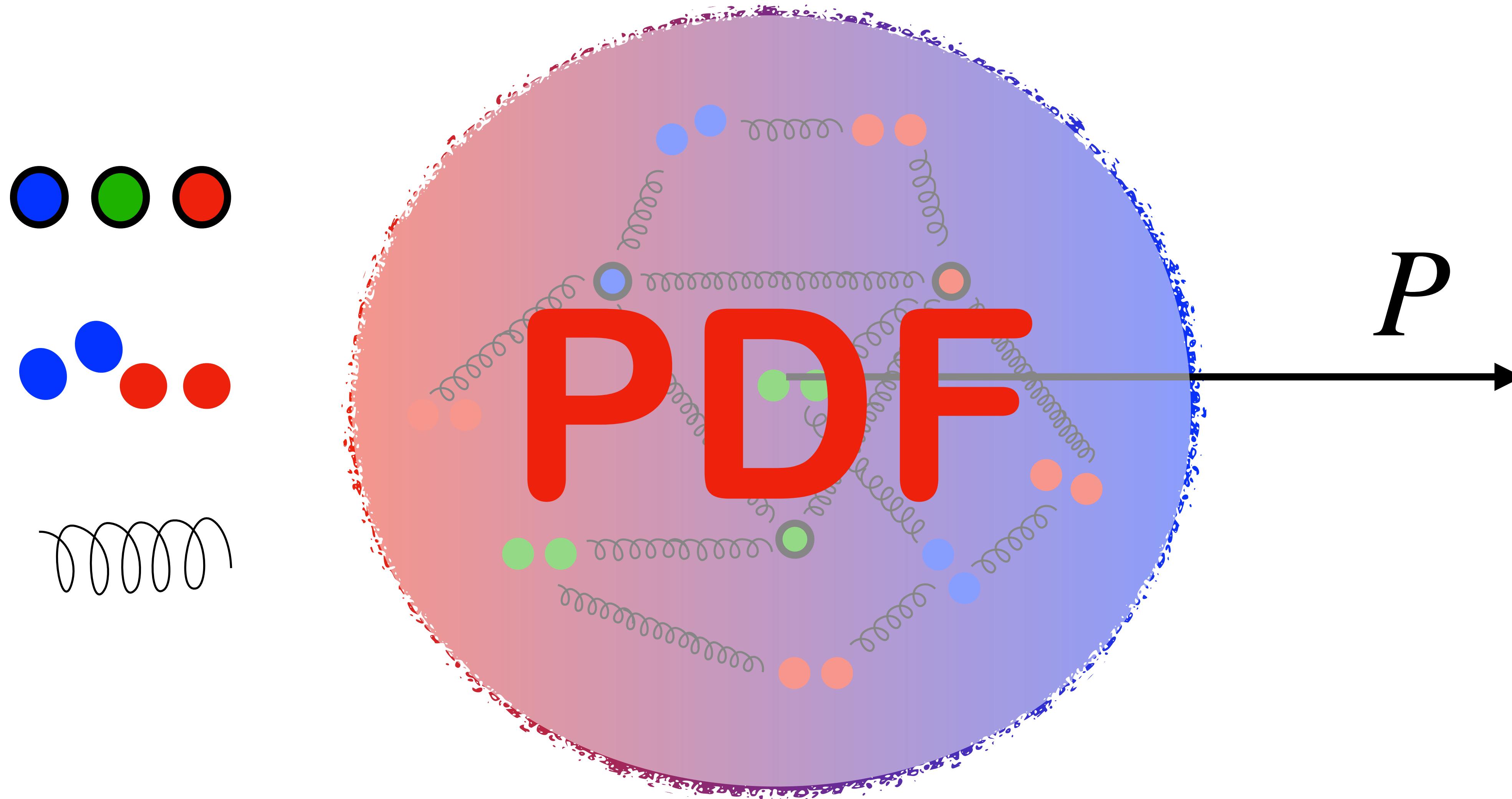
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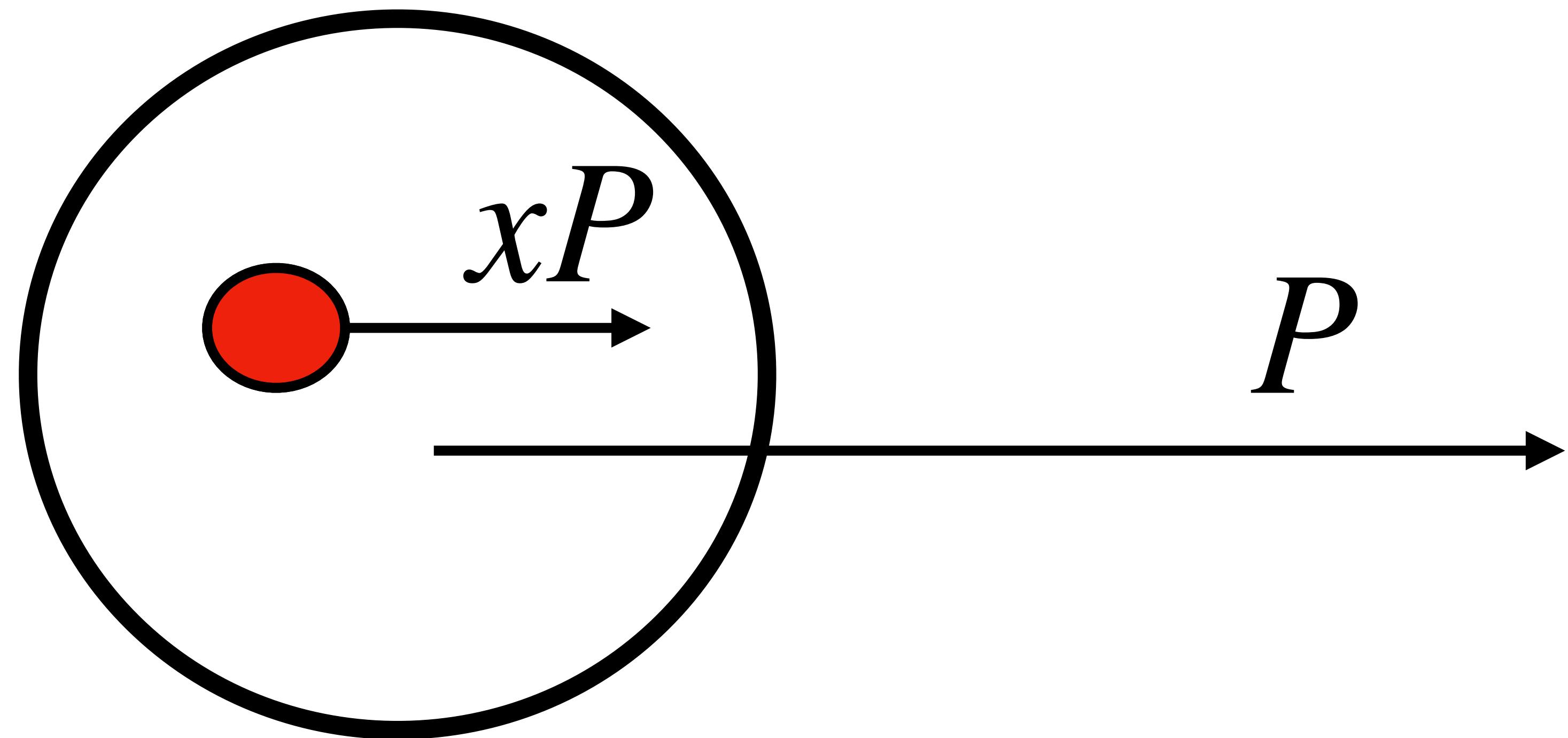


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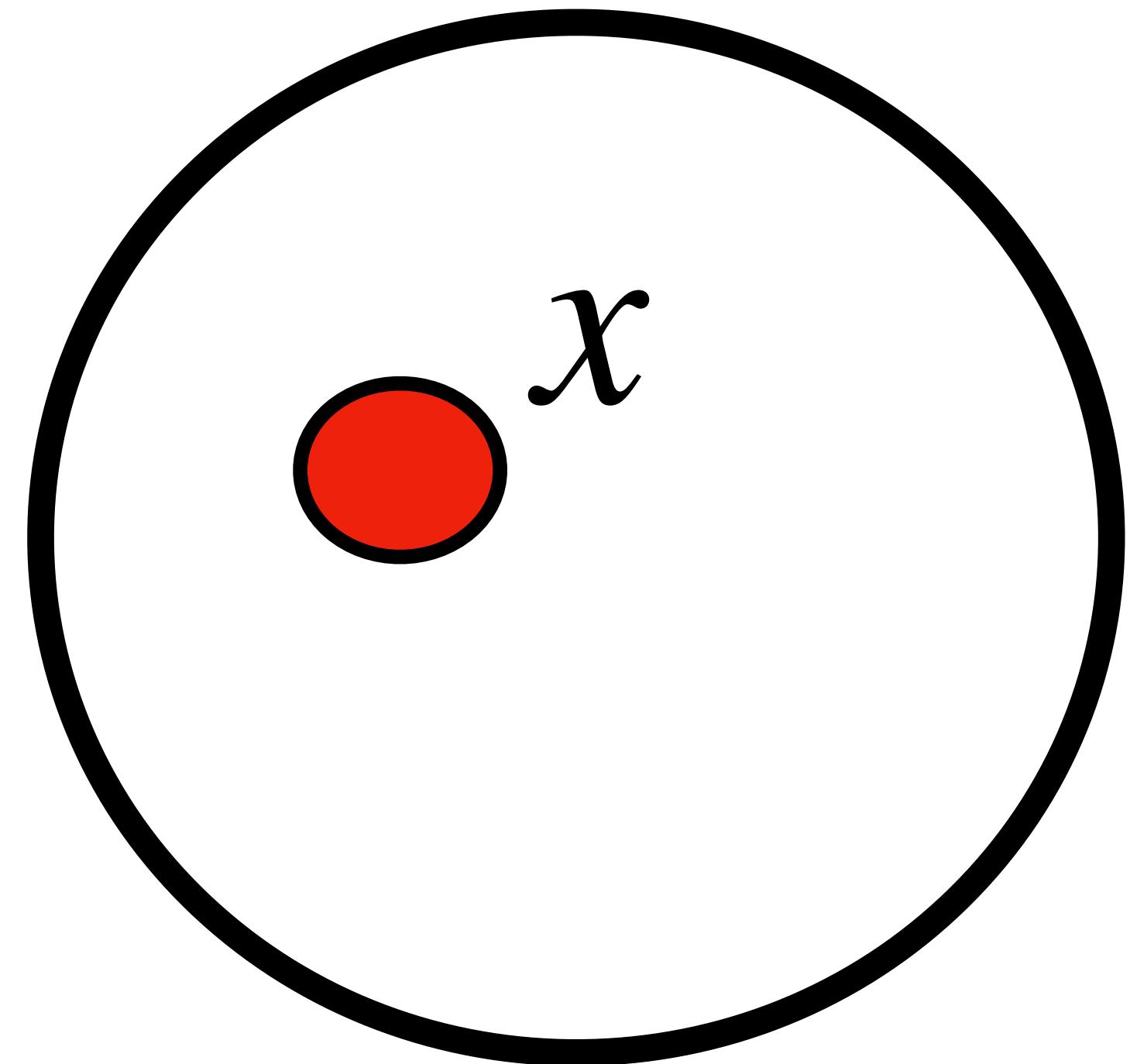
PDF



At  $\sim \Lambda_{QCD} \sim 200$  MeV

PDF

$f_1$

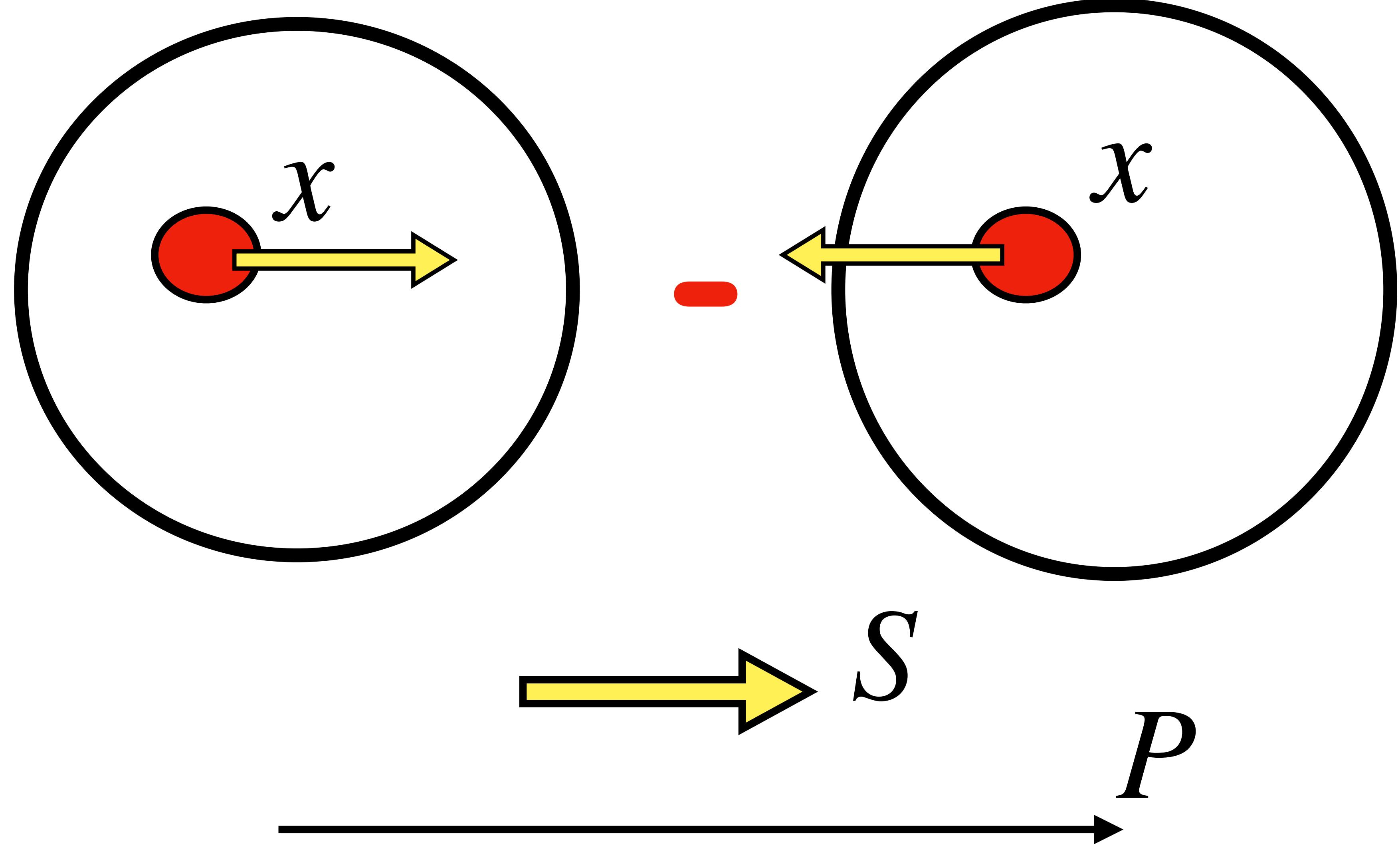


$P$

At  $\sim \Lambda_{QCD} \sim 200$  MeV

PDF

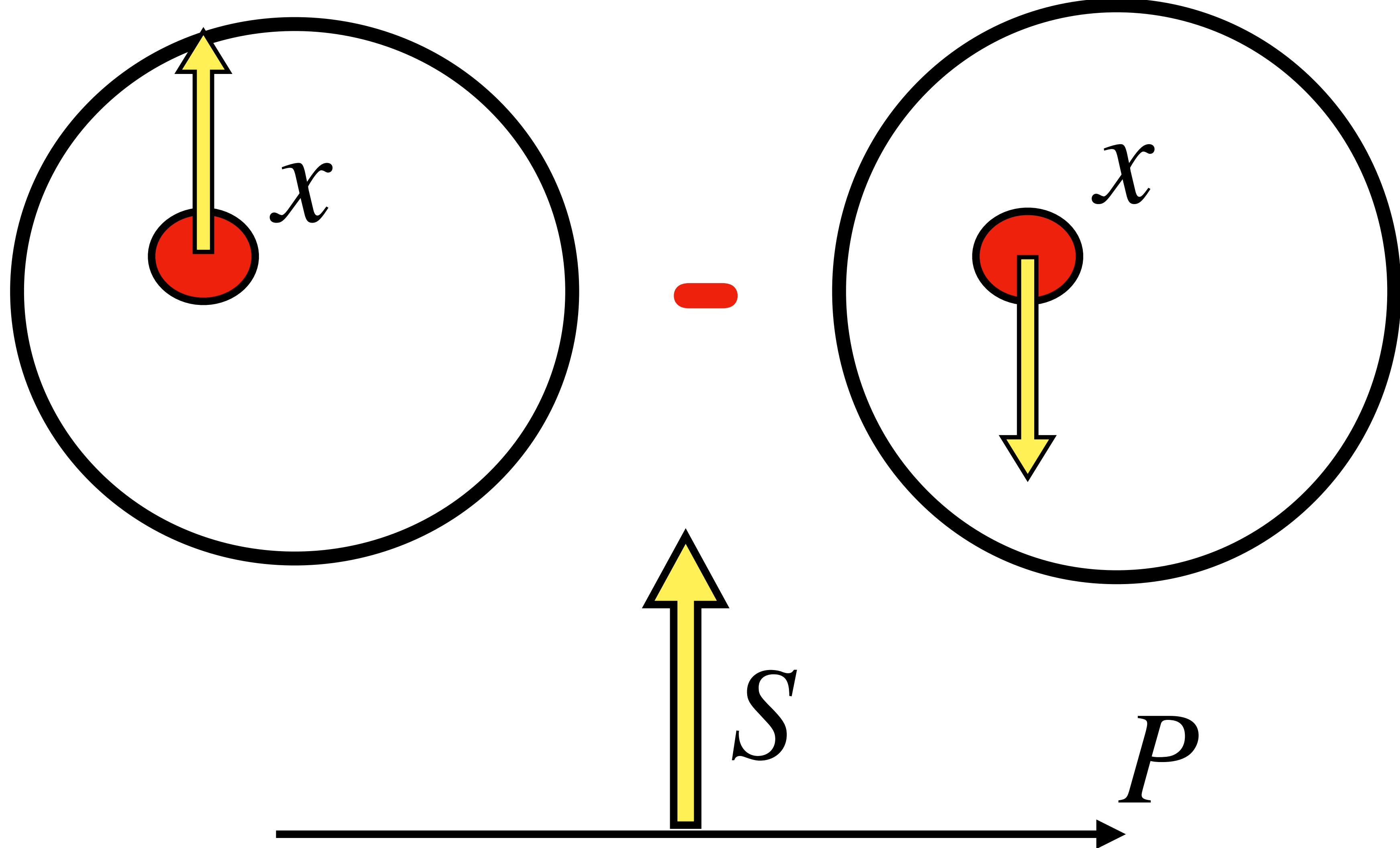
$g_1$



At  $\sim \Lambda_{QCD} \sim 200$  MeV

PDF

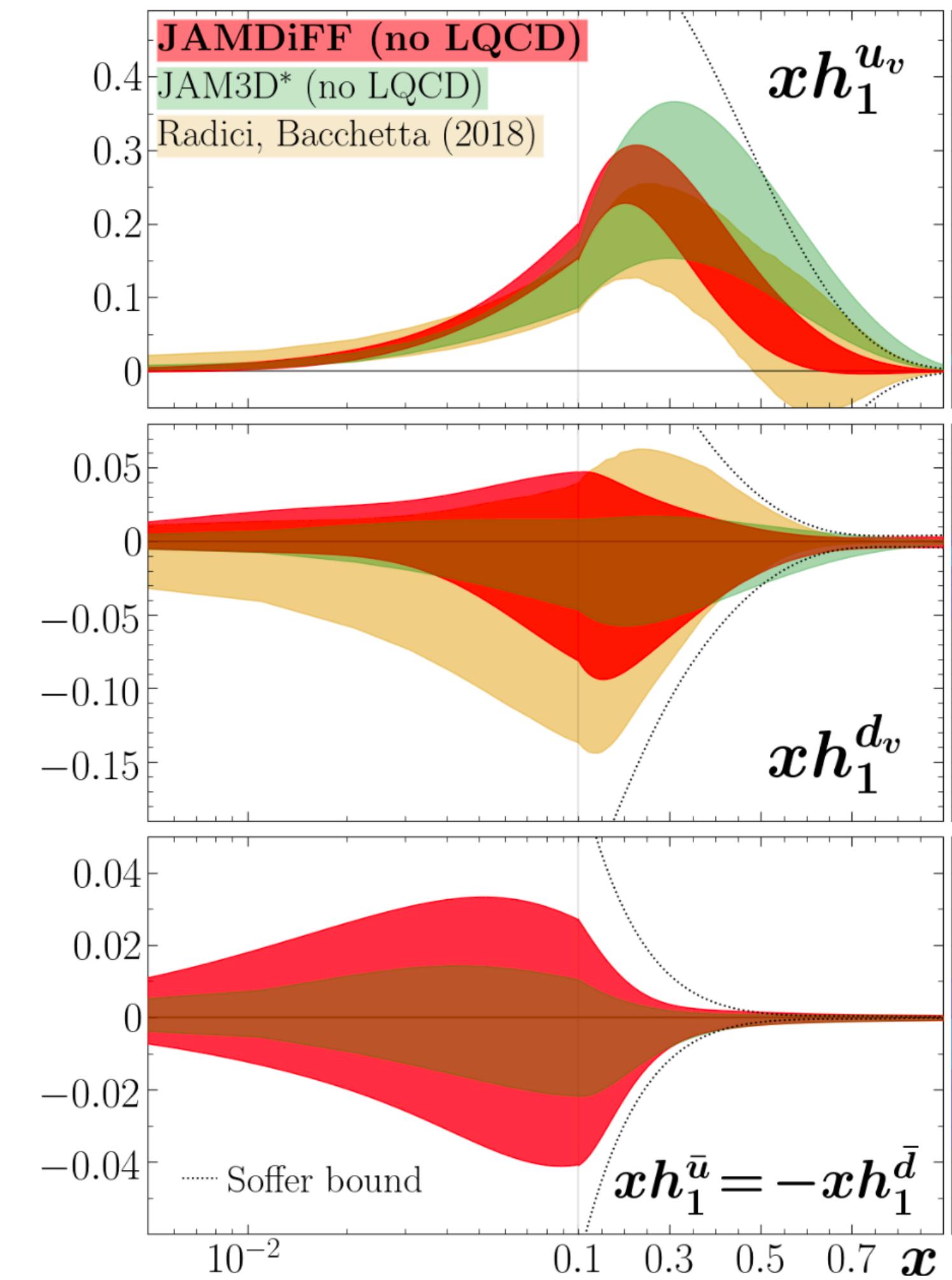
$h_1$



# Why caring about transversity?

N.Sato et al, Phys. Rev. D 109, (2024) 034024

- Have a better knowledge of the proton structure



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- Can be used to investigate physics beyond the Standard Model

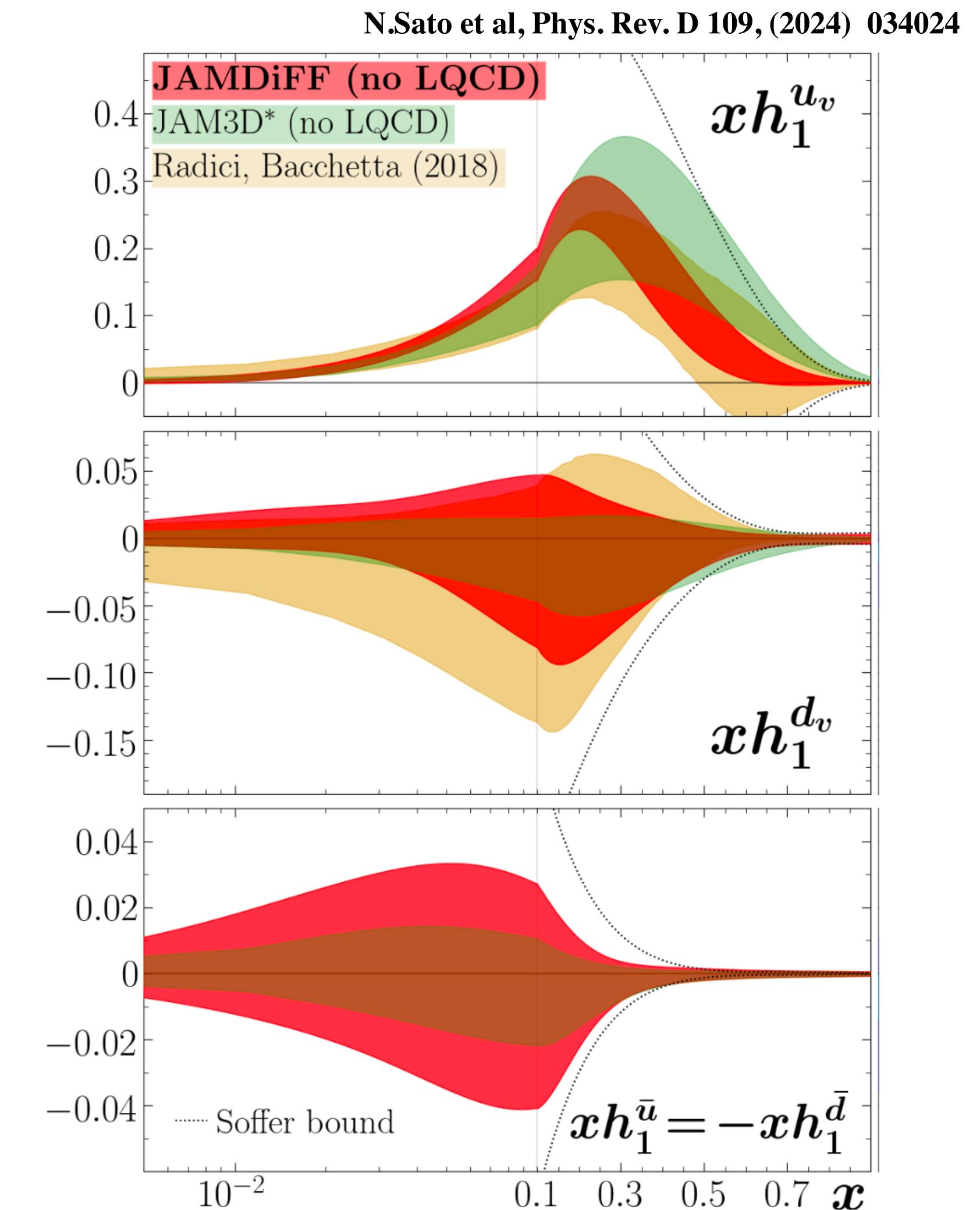
Chiral-odd structures do not appear in the SM  
Tree level Lagrangian

Neutrino  $\beta$ -decay

$$g_T = \delta u - \delta d$$

$$\delta q = \int_0^1 dx h_1^q(x)$$

constraints on CP violation



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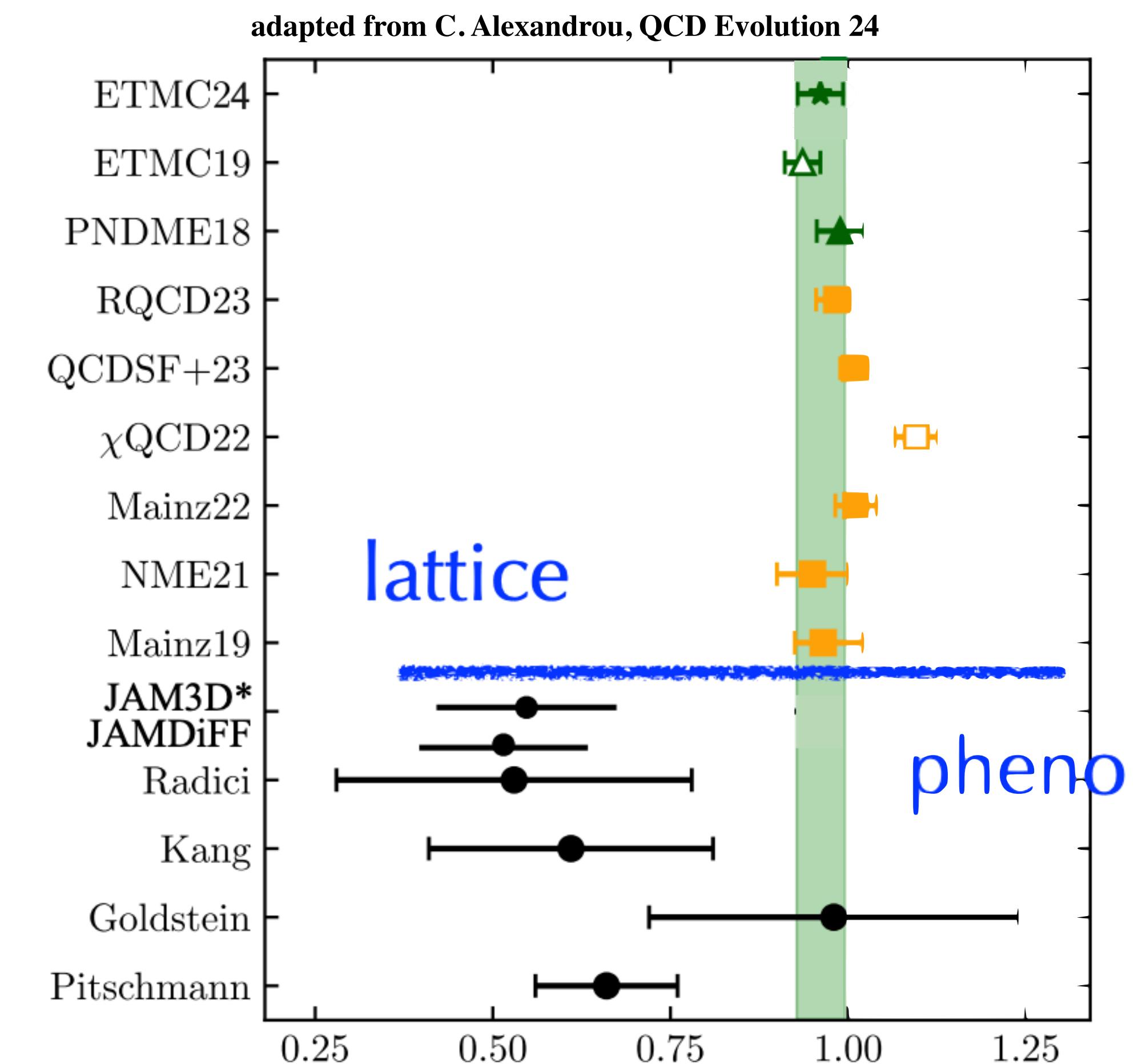
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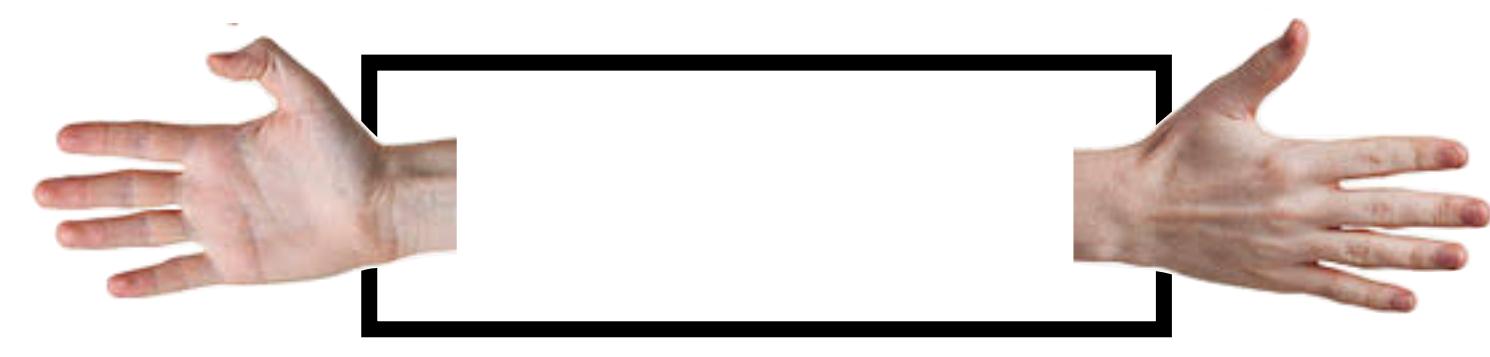
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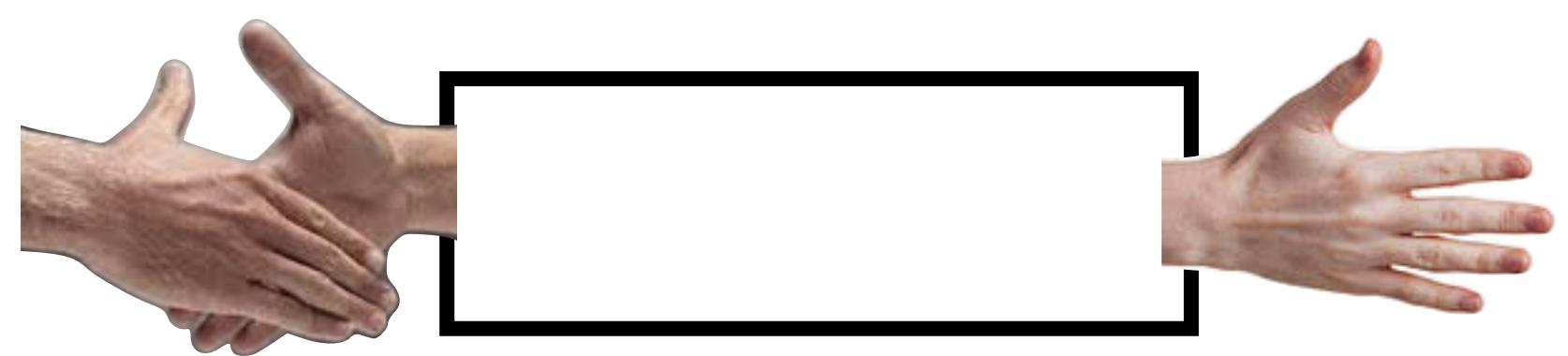
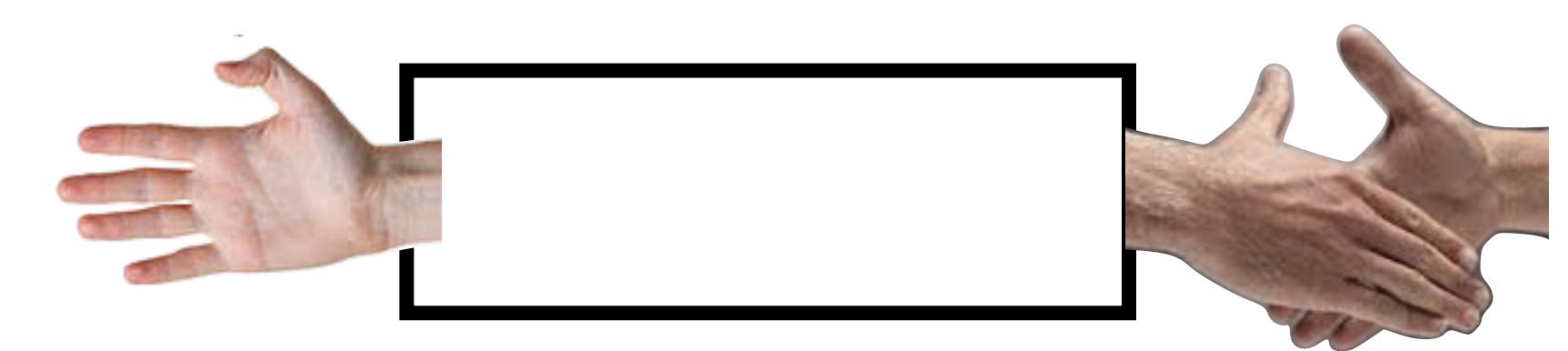


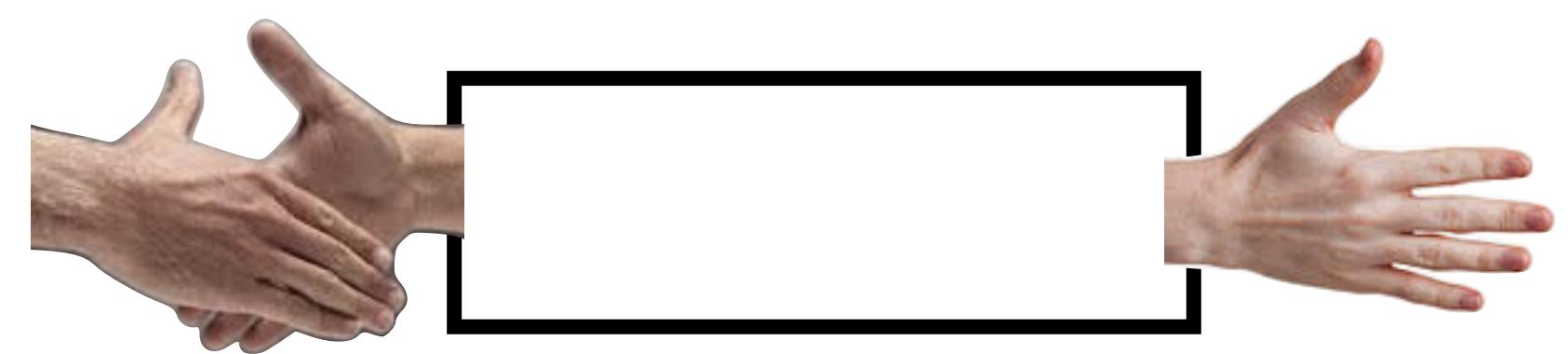
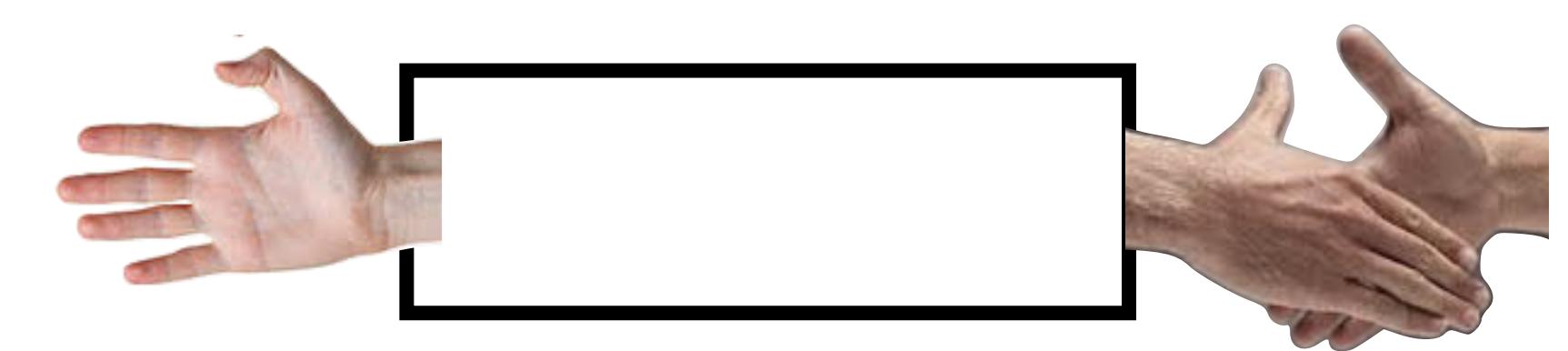


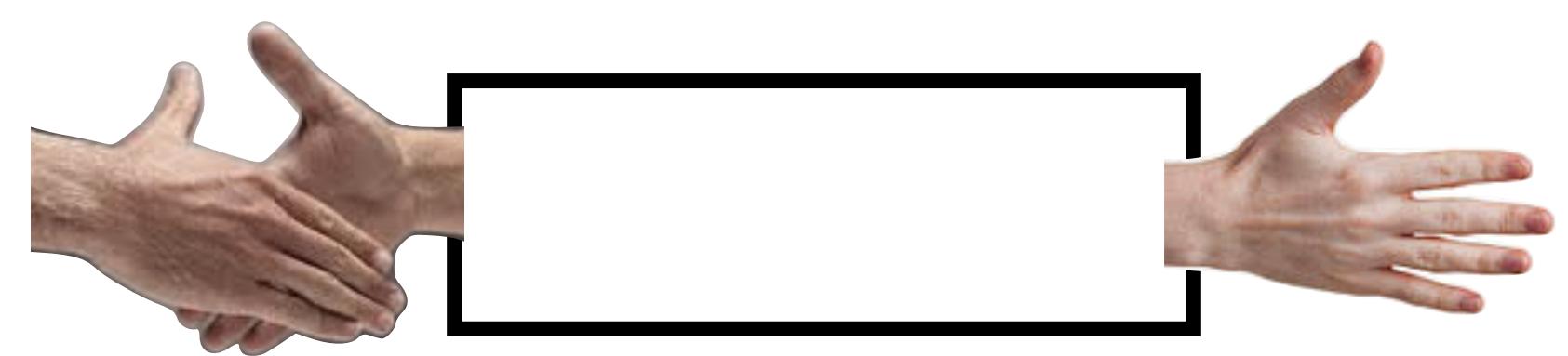
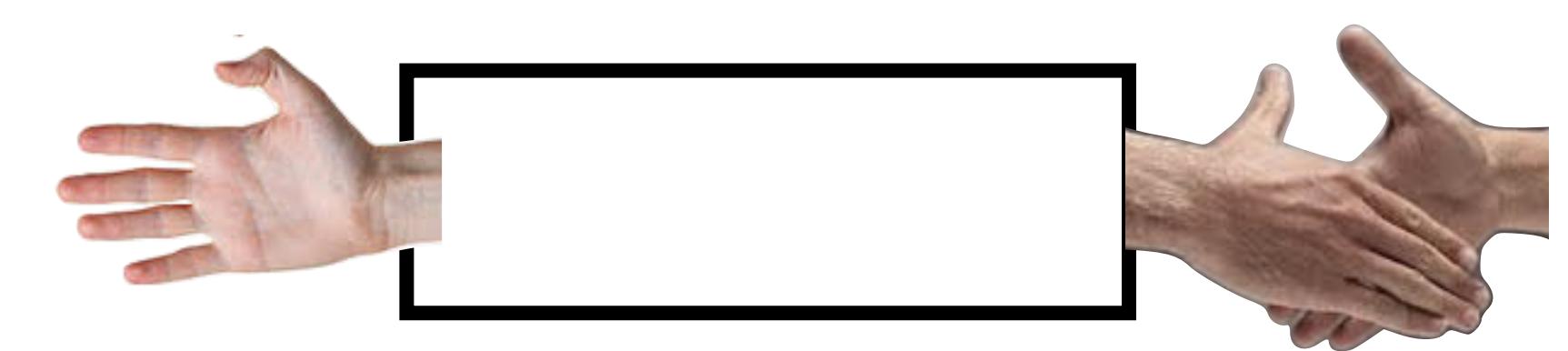
X

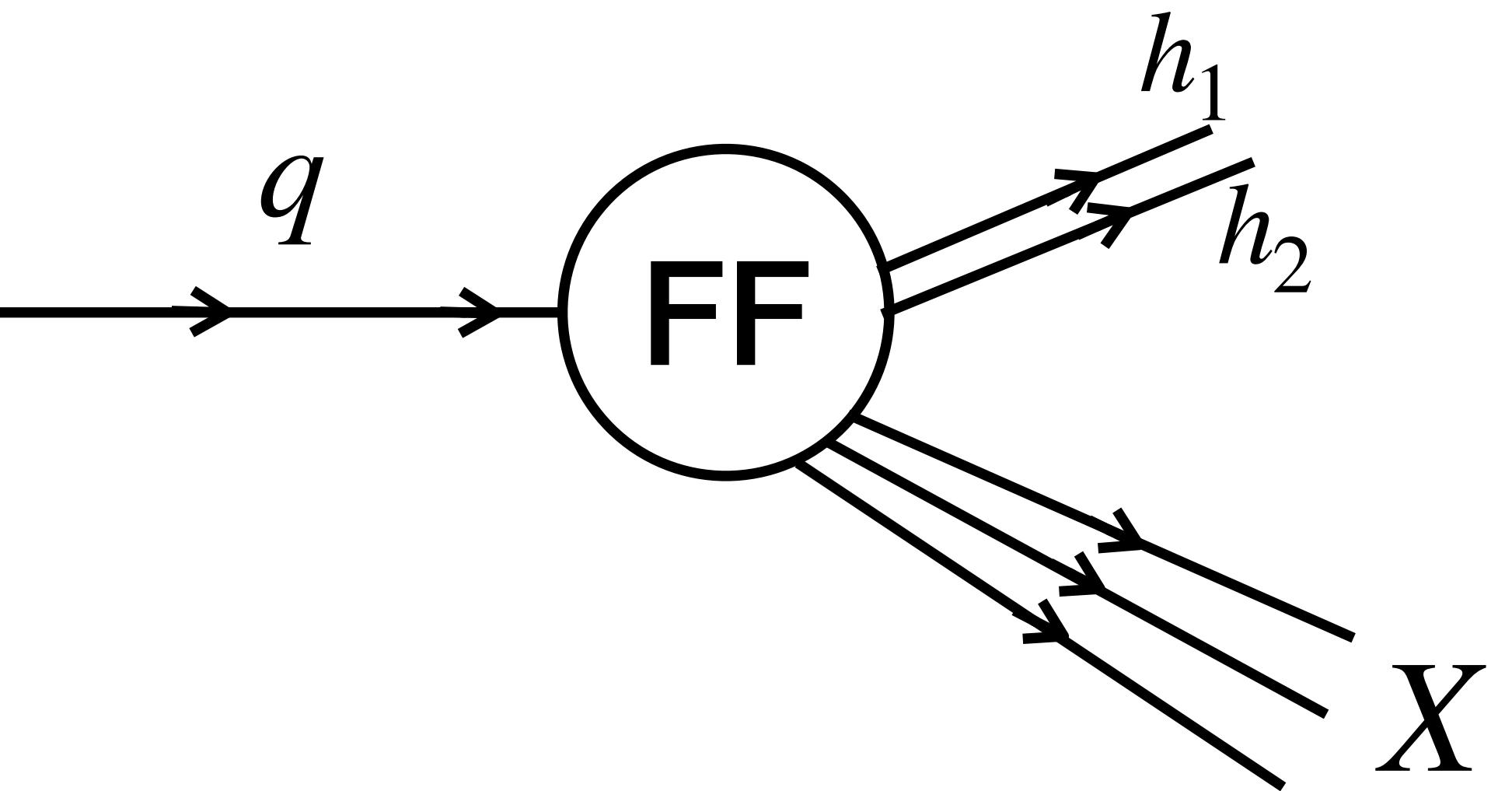
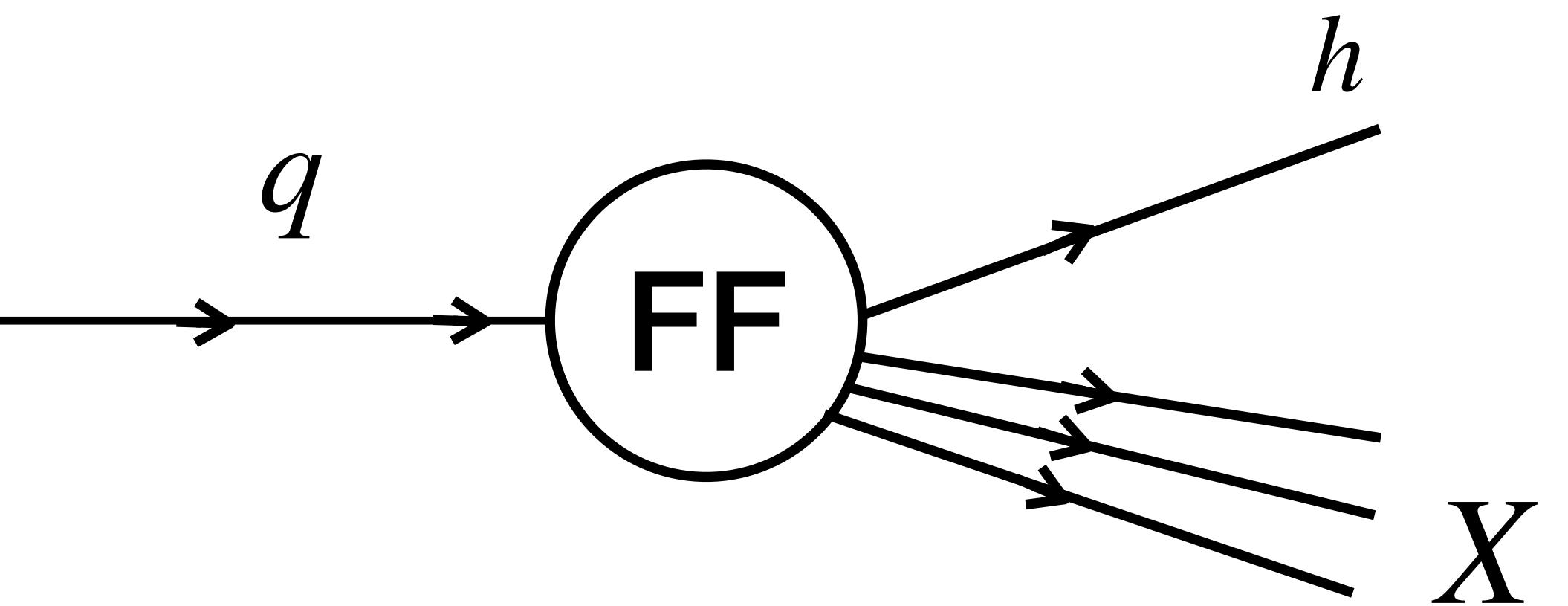


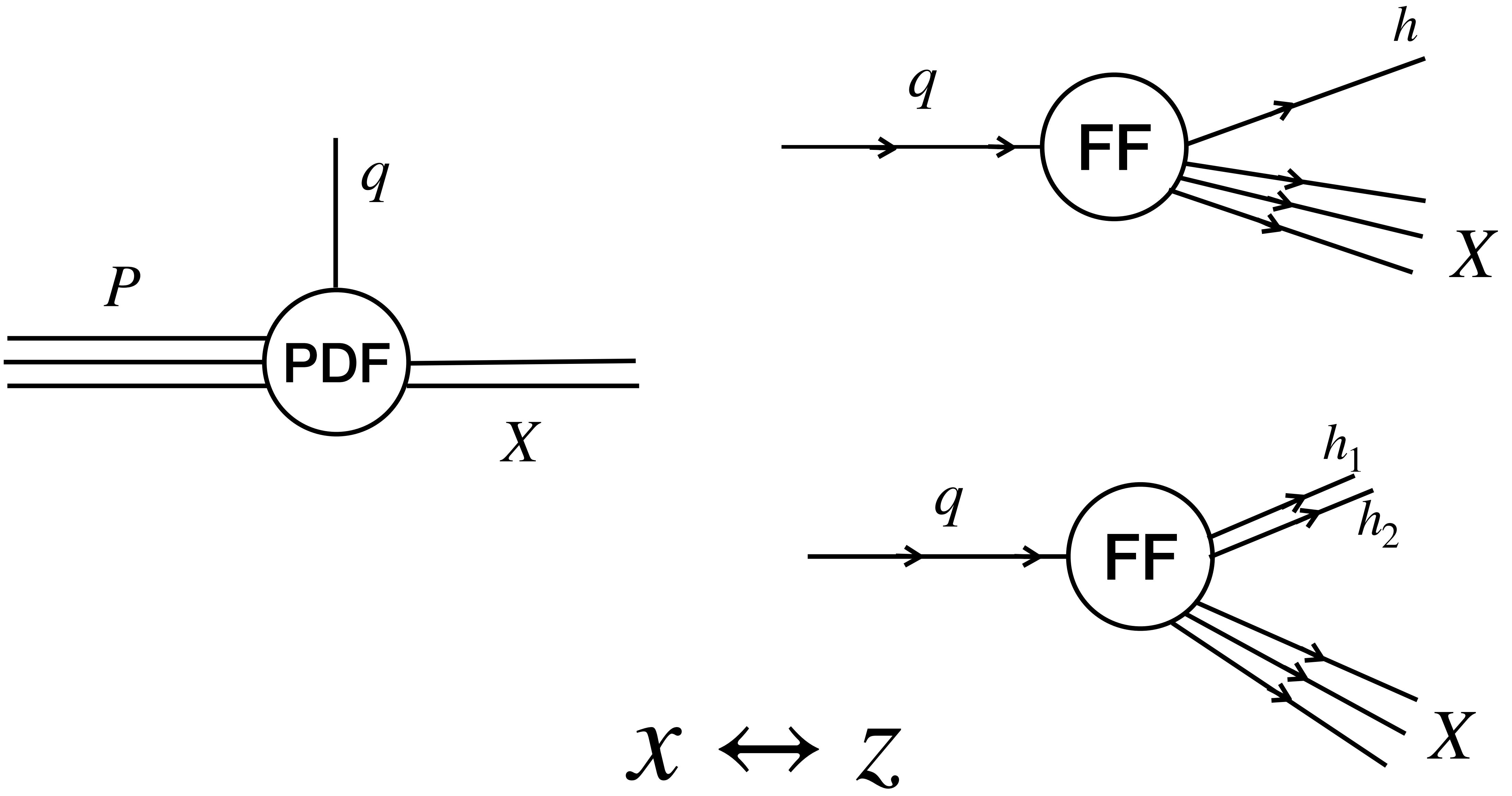


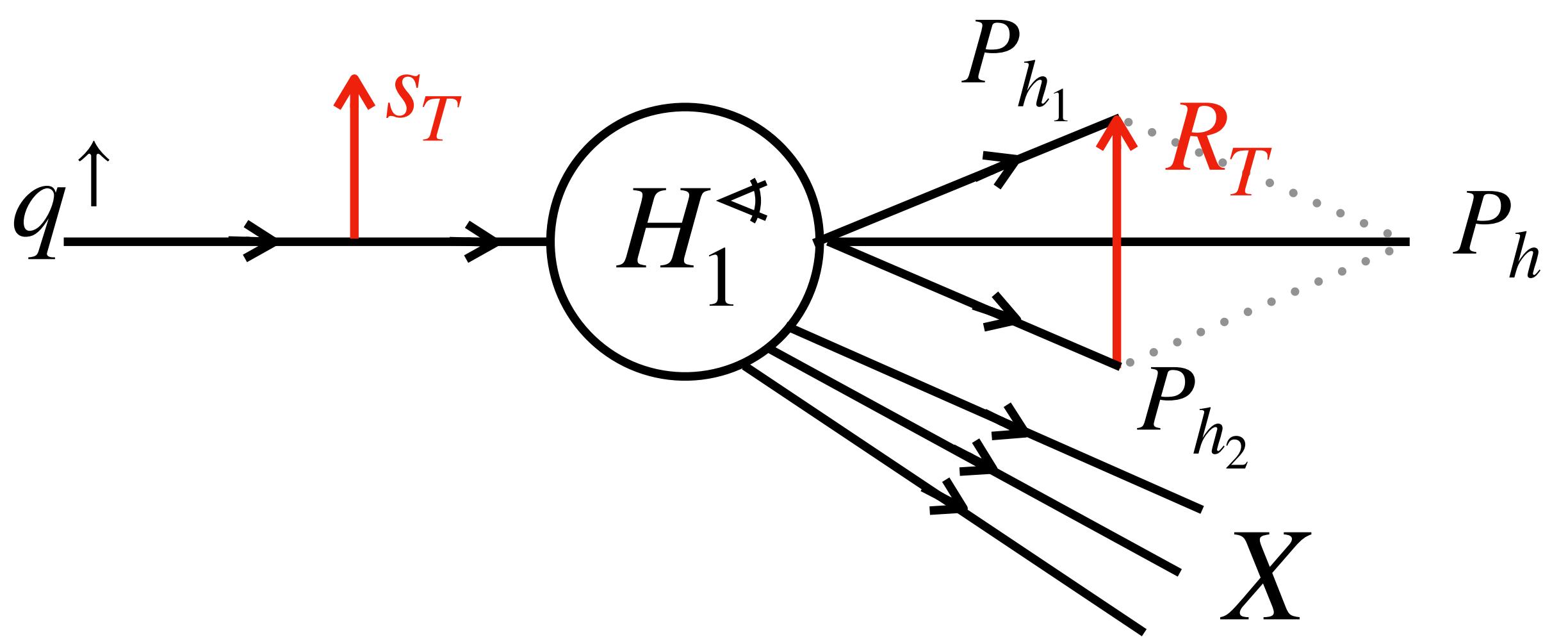
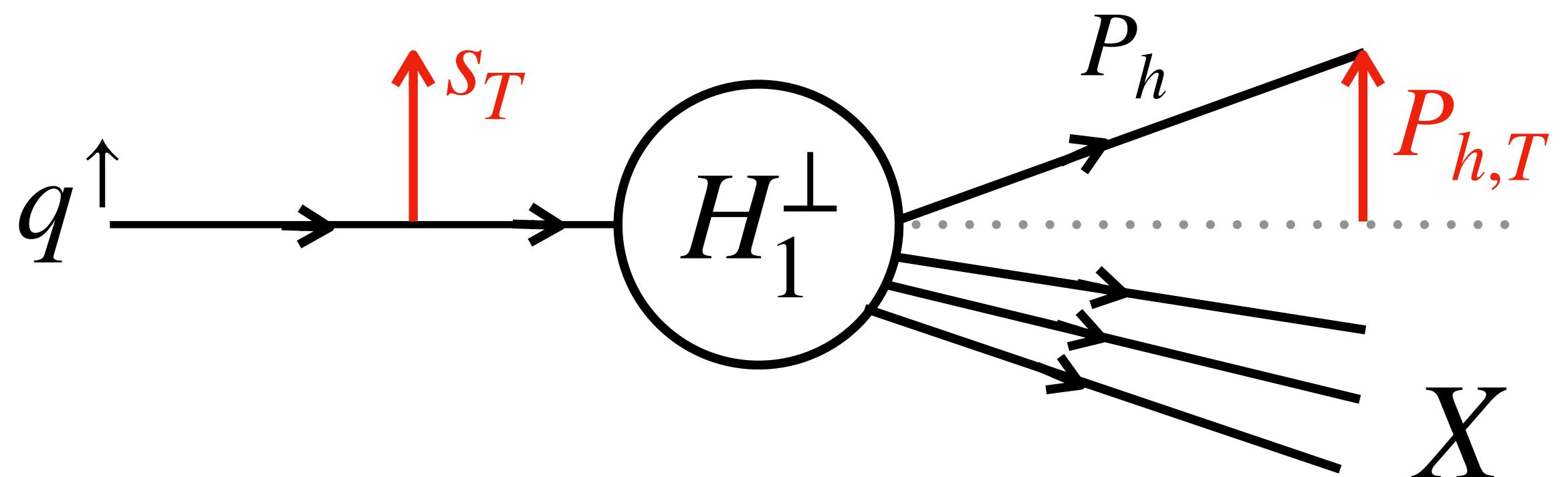
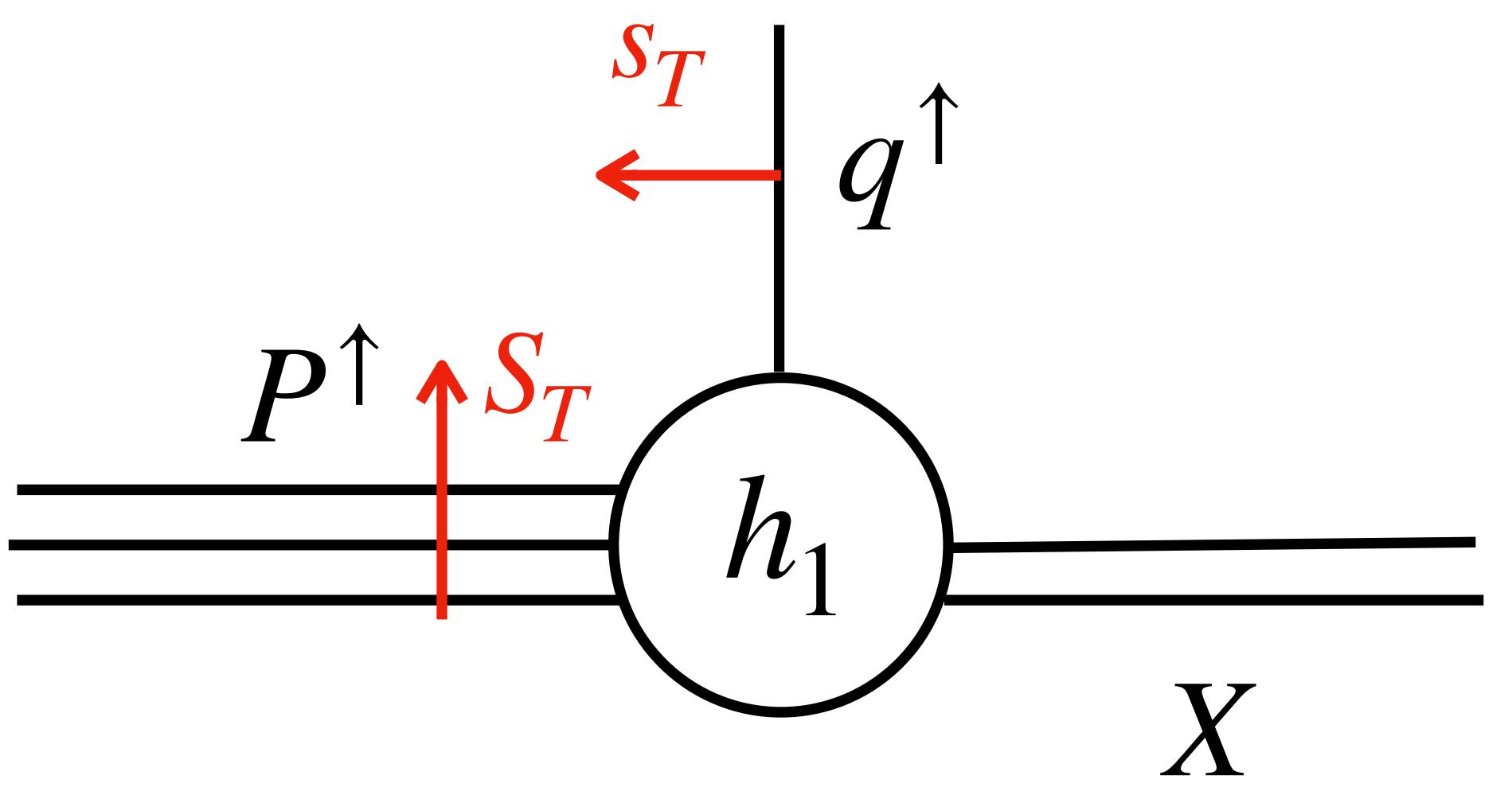




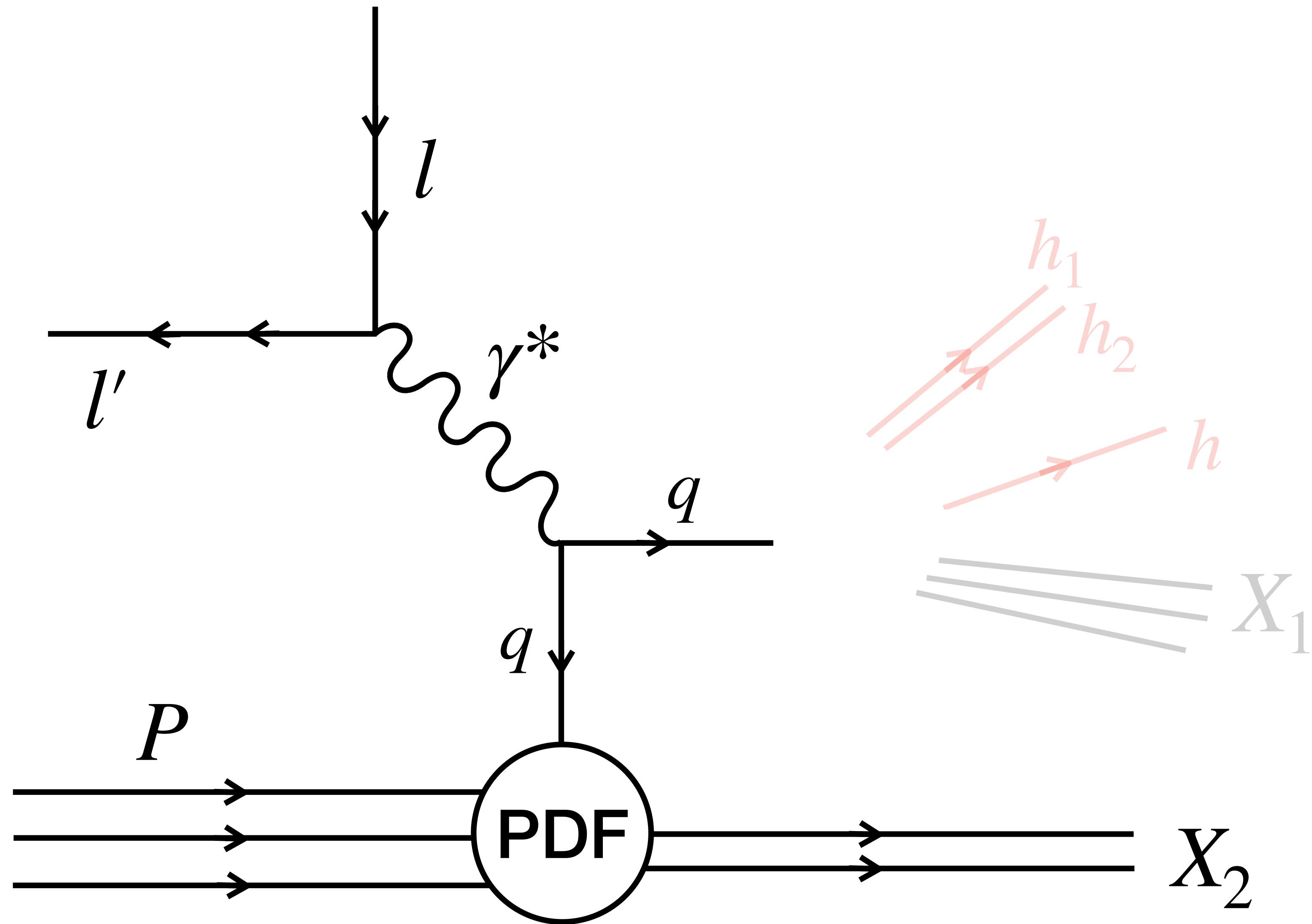




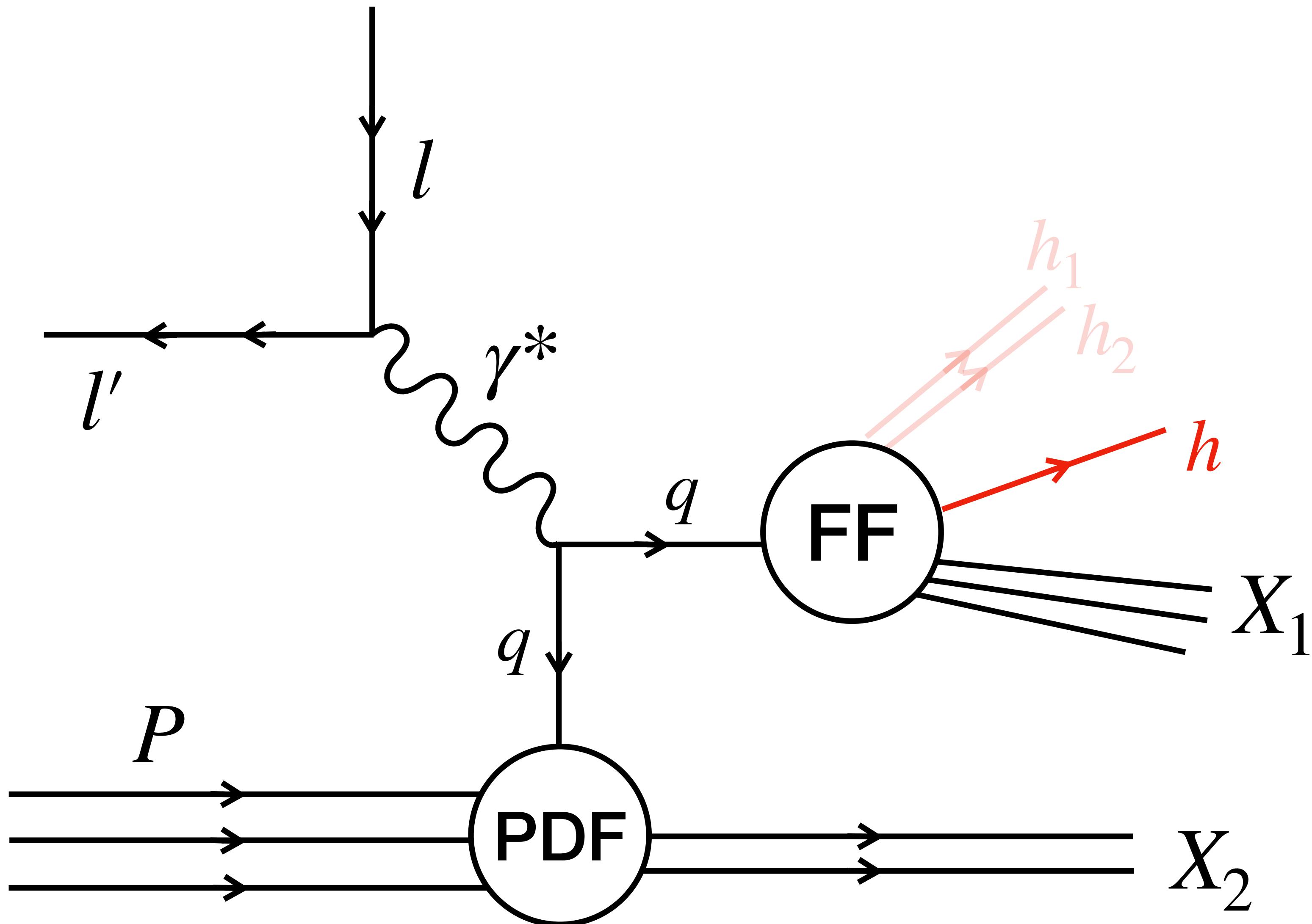




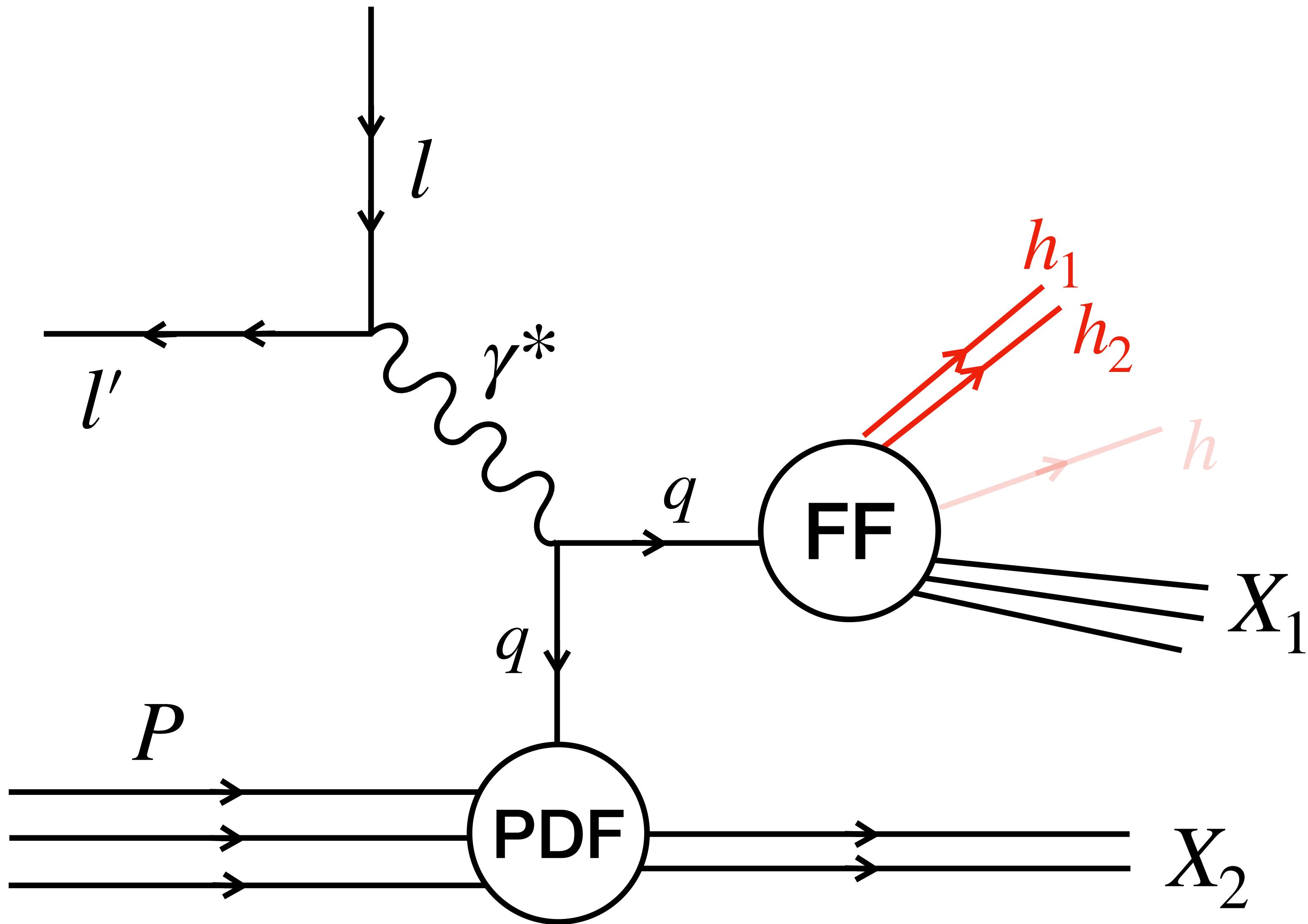
# Semi-inclusive Deep Inelastic Scattering



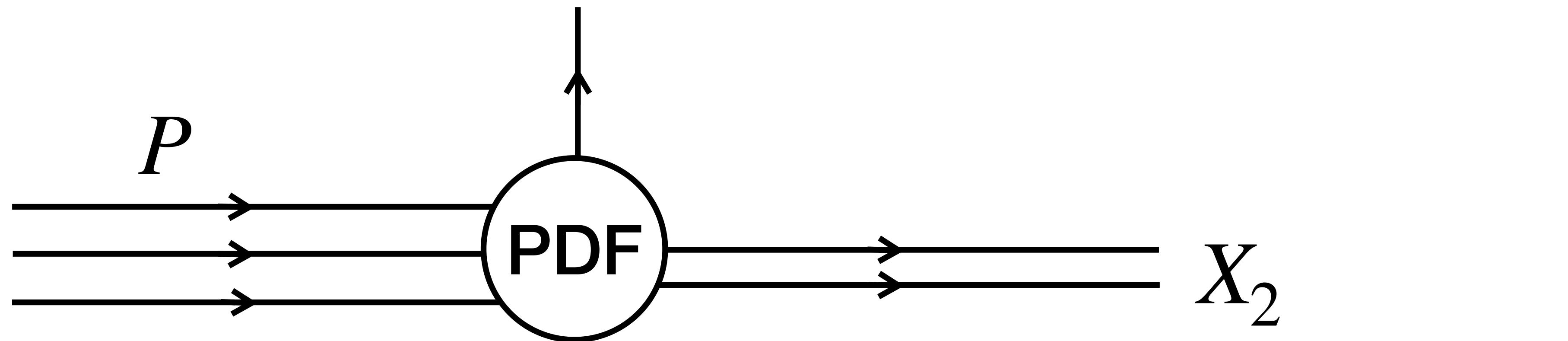
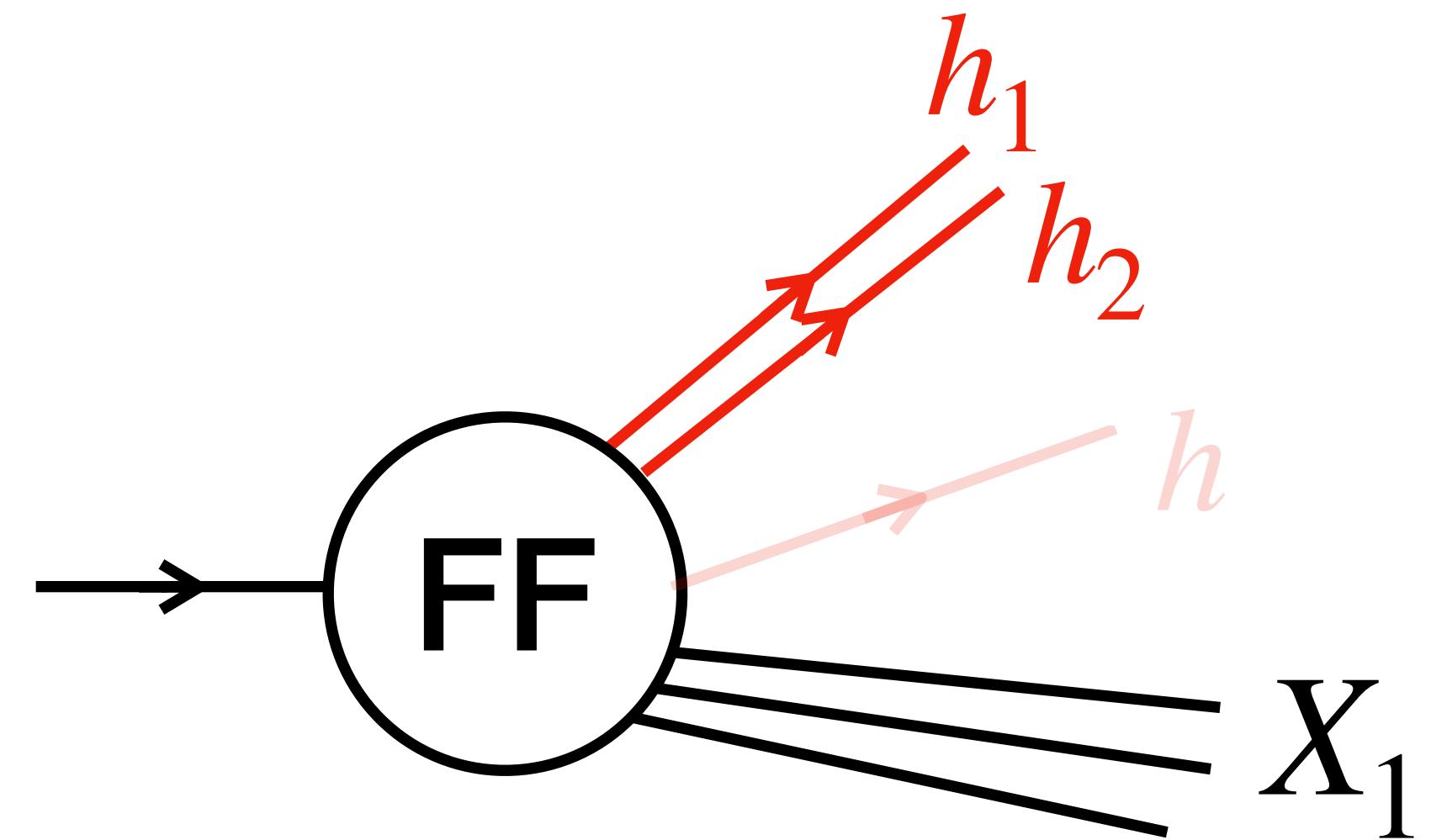
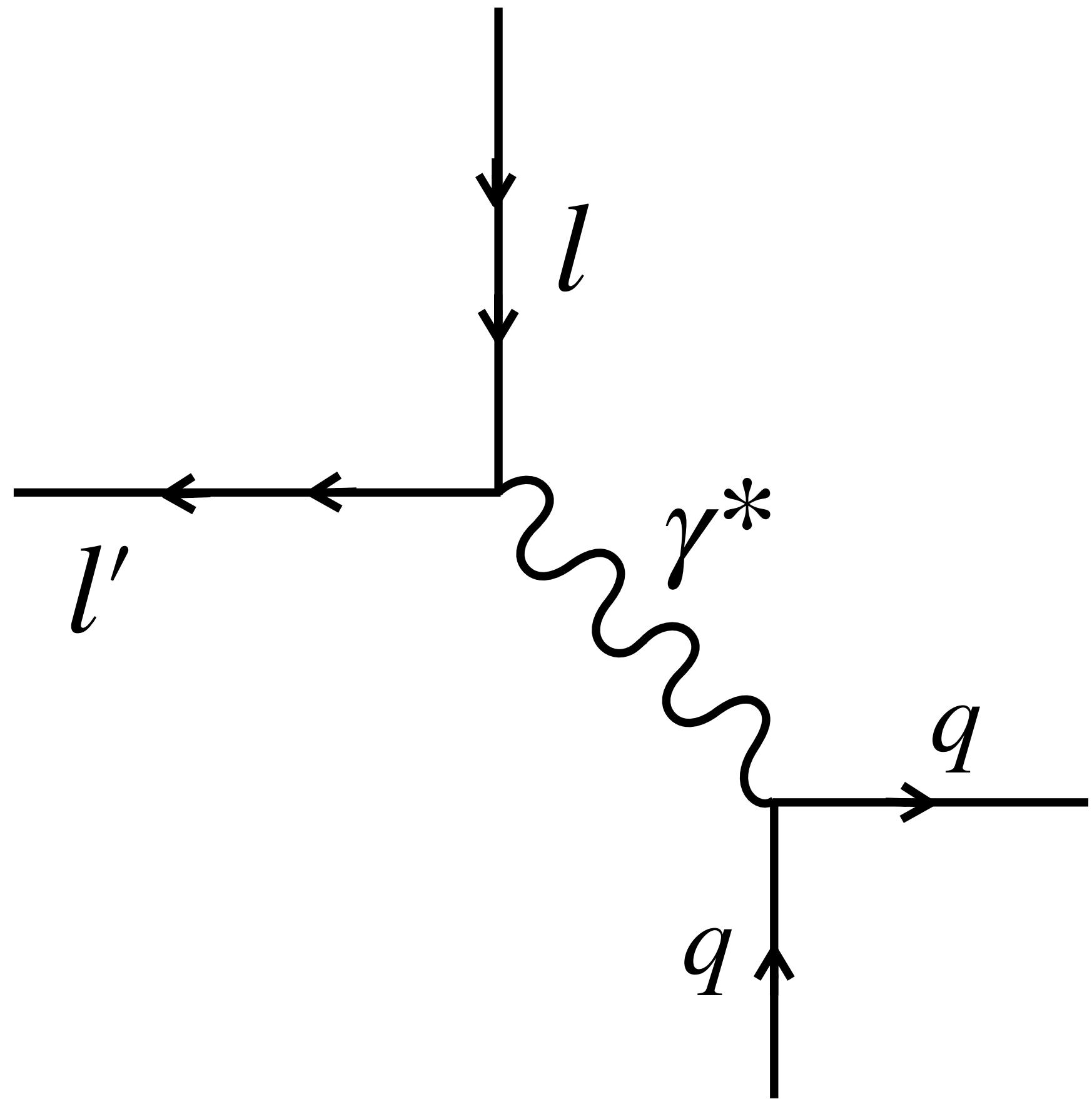
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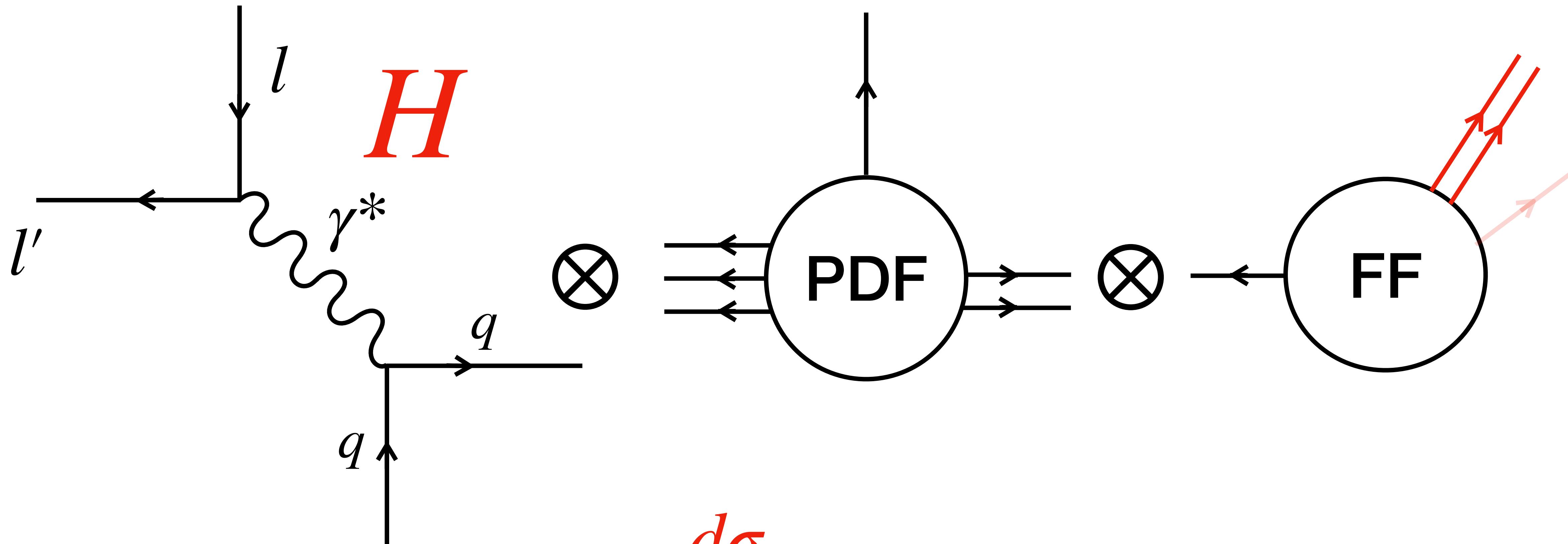
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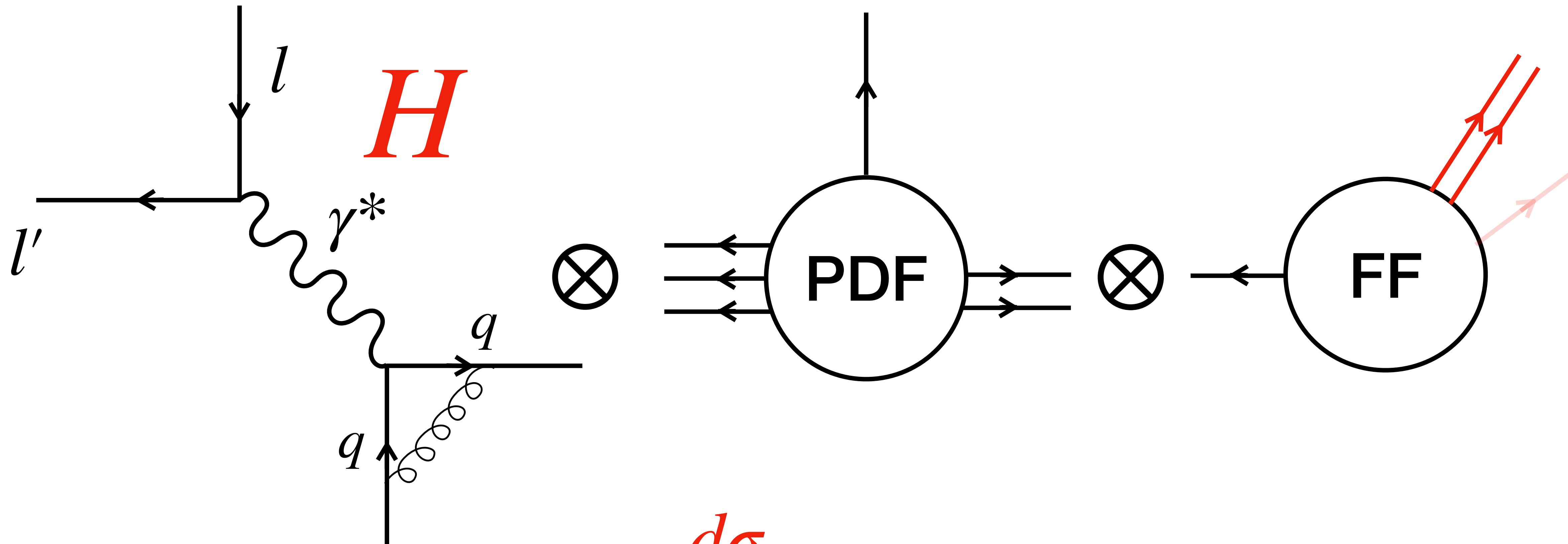


# Semi-inclusive Deep Inelastic Scattering



$$\frac{d\sigma}{dx dQ^2 \dots} = H \otimes PDF \otimes FF$$

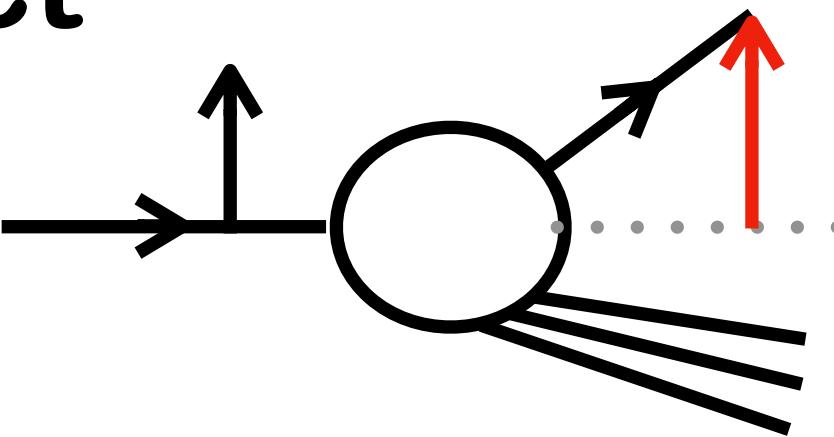
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# Alternative method to extract transversity PDF

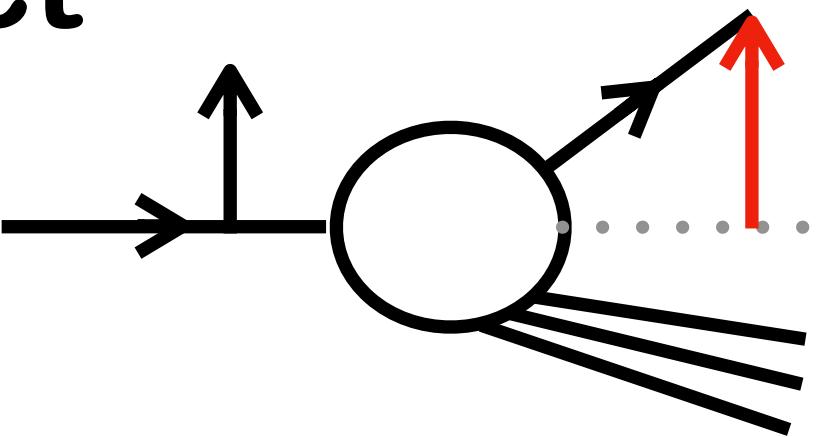
**Collins effect**



$$A_{UT}^h \sim \frac{\sum_q e_q^2 \cdot C[h_1^q(x_B, k_T) H_1^{\perp, q}(z, p_\perp)]}{\sum_q e_q^2 C[f_1^q(x_B, k_T) D_1^q(z, p_\perp)]}$$

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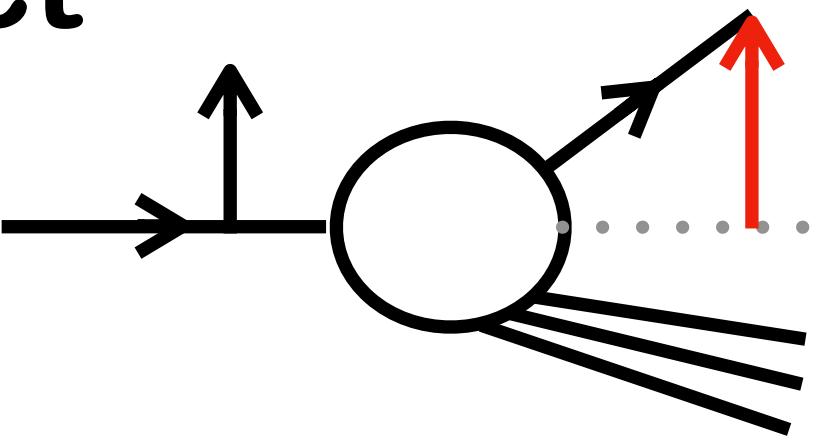
**$C[]$  convolution over**

$k_T, p_\perp$

**SIDIS only**

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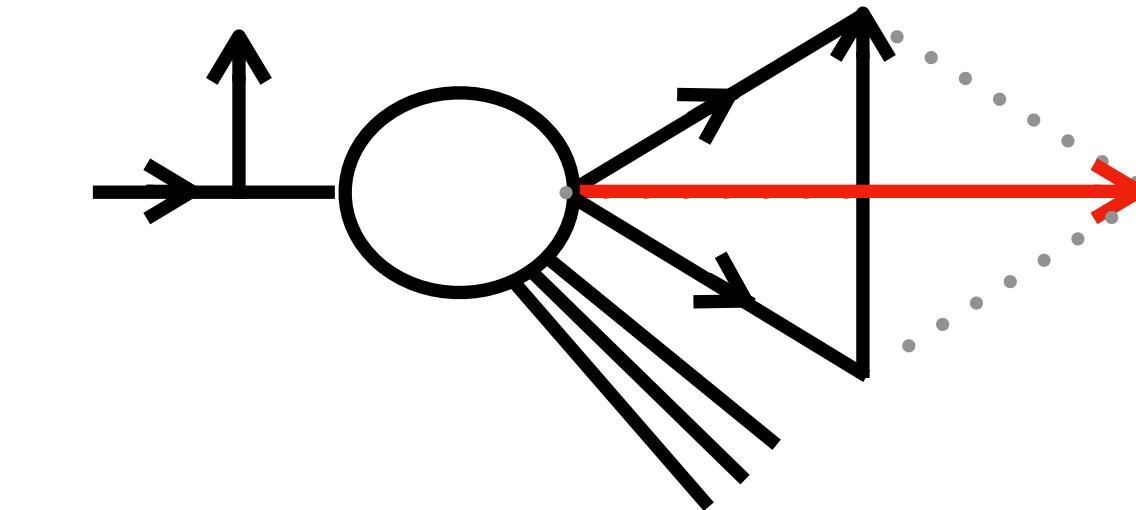
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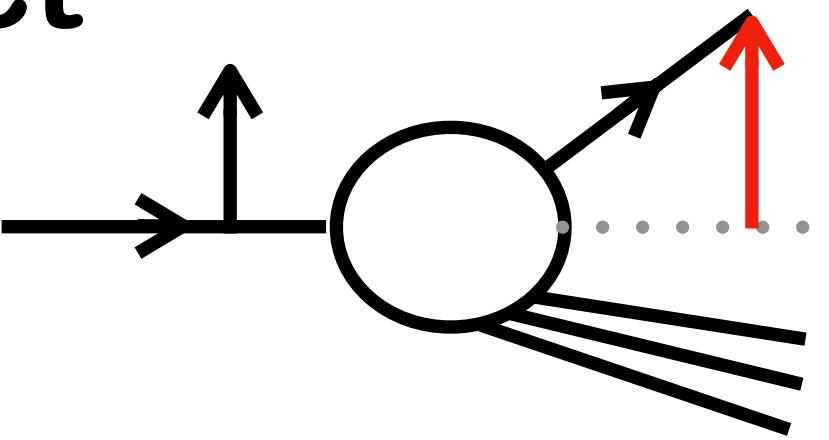
**Di-hadron**



$$A_{UT}^{hh} \sim \frac{\sum_q e_q^2 \cdot h_1^q(x_B) \cdot H_1^{<, q}(z, M_h)}{\sum_q e_q^2 f_1^q(x_B) \cdot D_1^q(z, M_h)}$$

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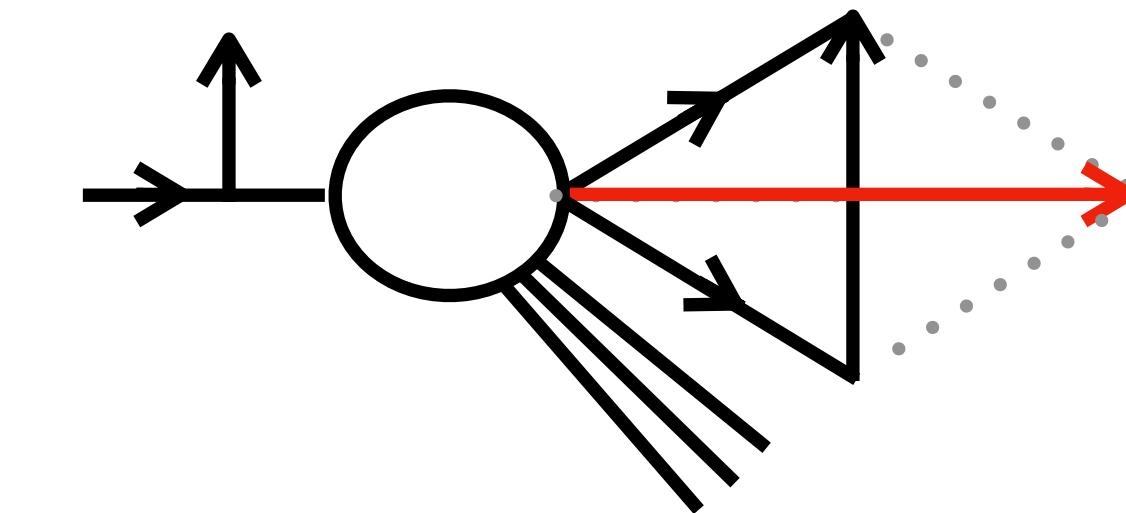
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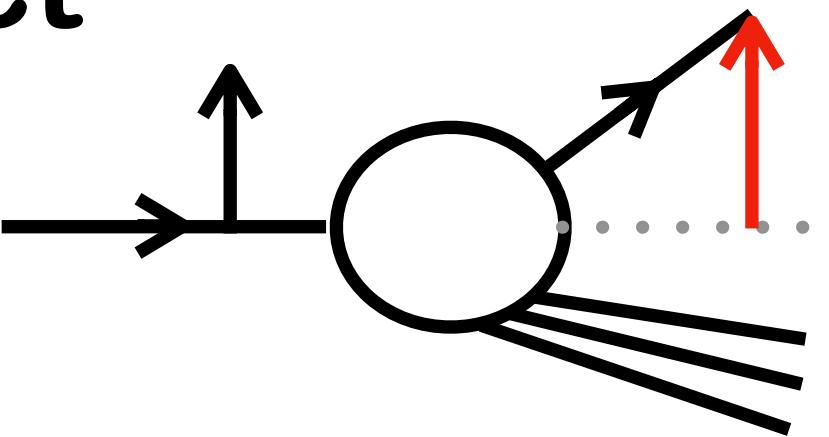


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$$M_h \ll Q^2$$

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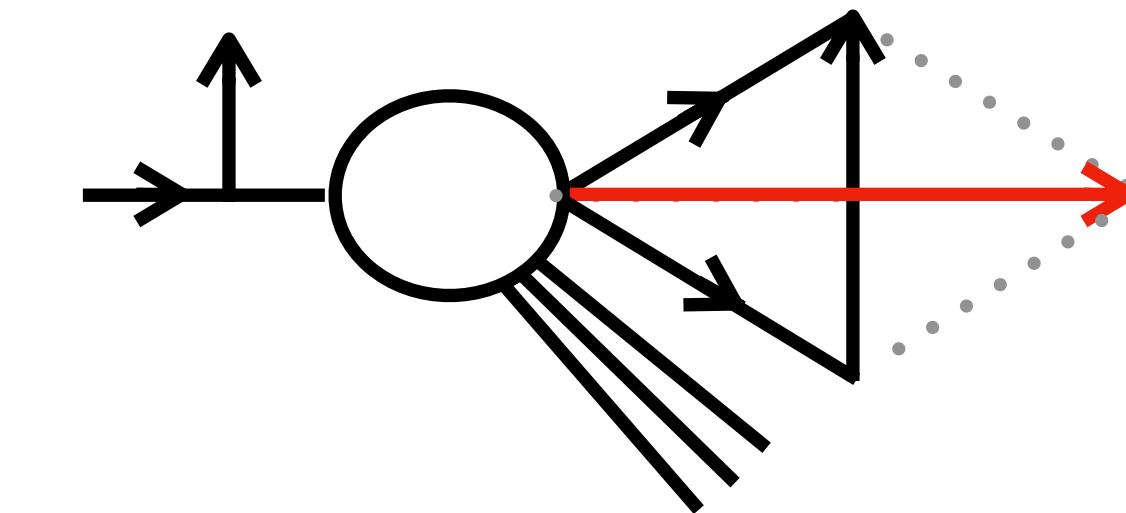
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$$M_h \ll Q^2$$

Collinear and ordinary product

$h_1 H_1^{<, q}$  also in  $pp^\uparrow$  collisions

## 2 measured hadrons + X

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2 measured hadrons + X

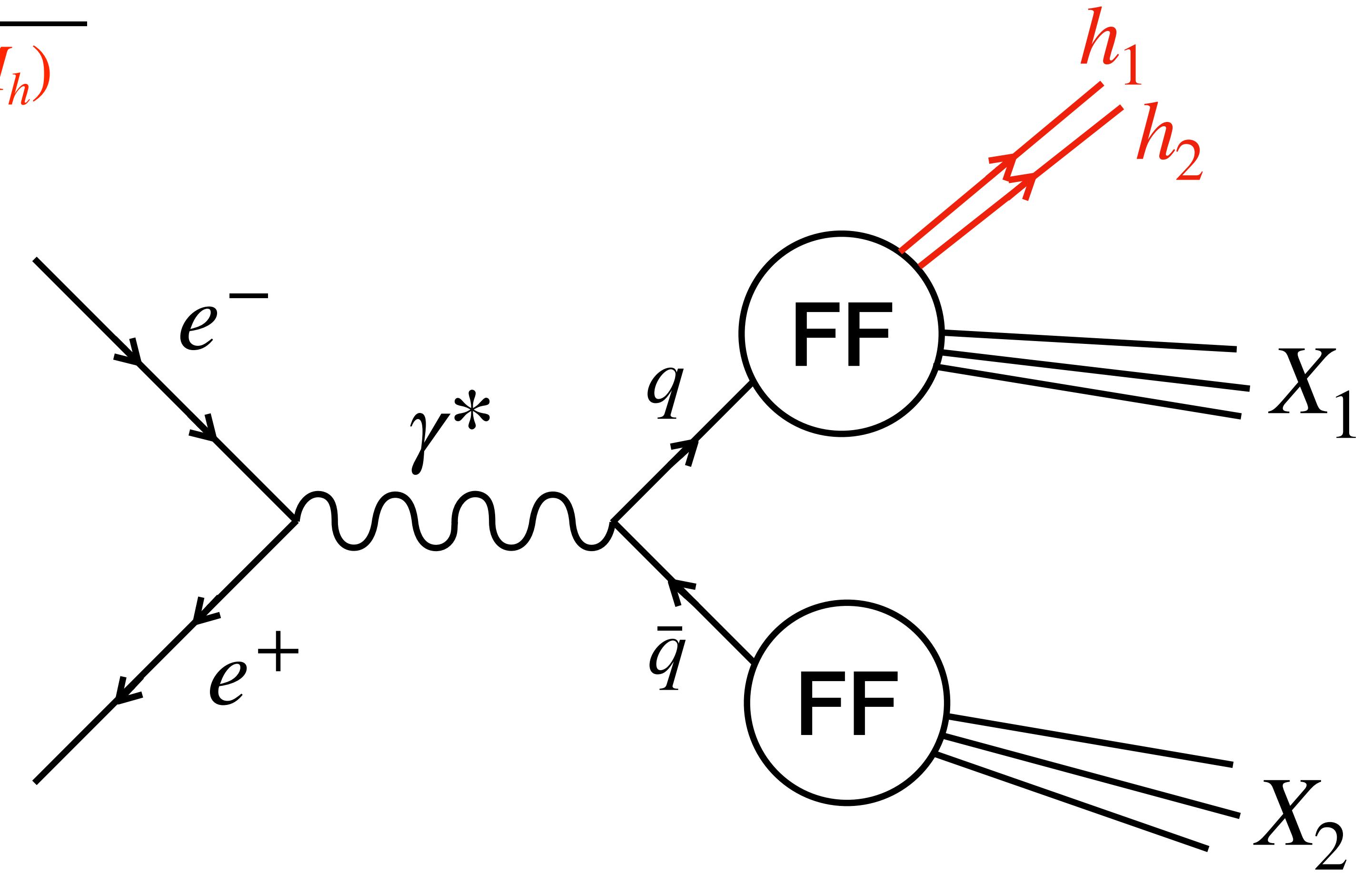
How to acces

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them?

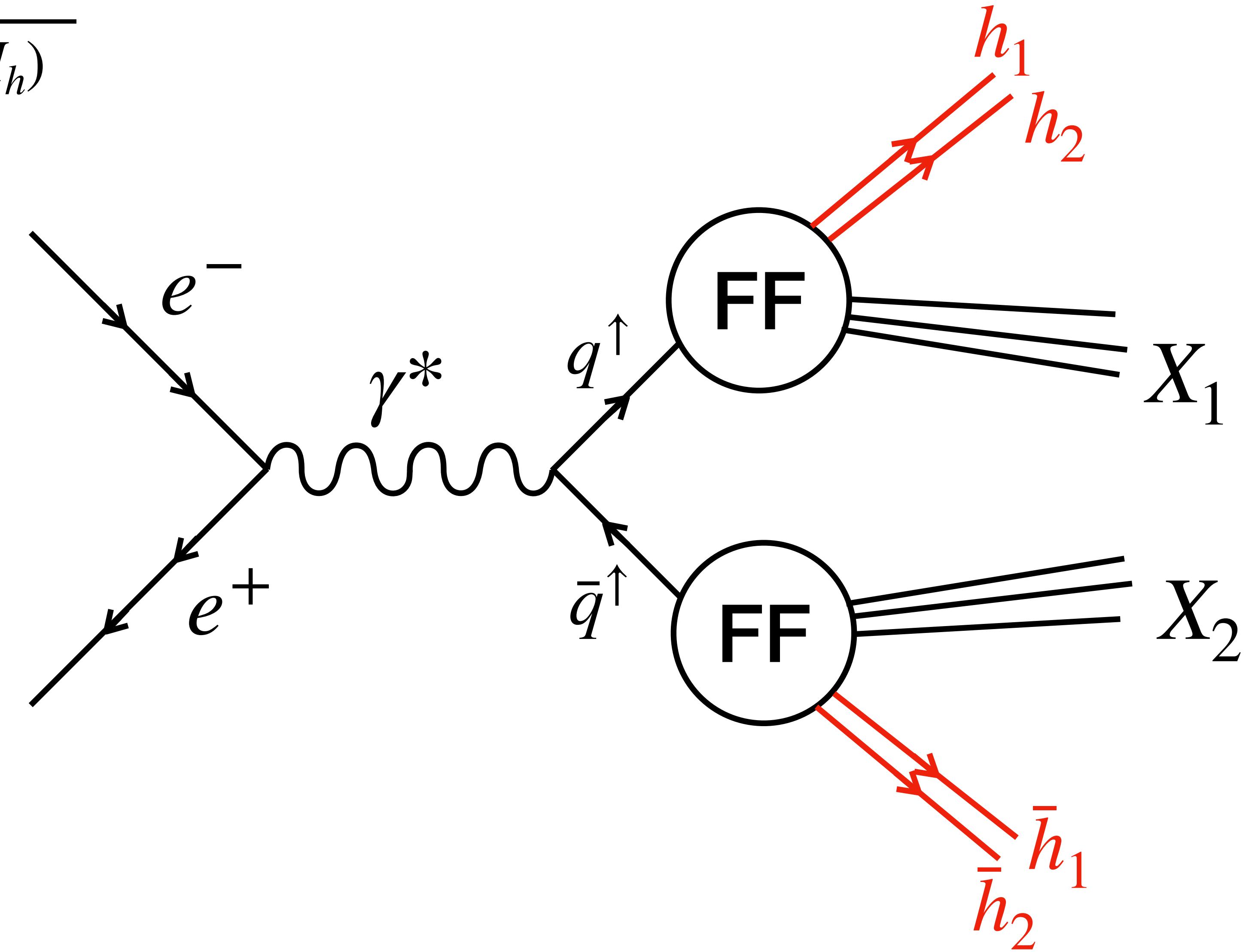
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# Extraction of the unpolarised $D_1$

## GOALS of the $D_1$ extraction

- 2017 BELLE data of  $e^+e^- \rightarrow \pi^+\pi^-X$  at  $\sqrt{S} = 10.58$  GeV

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$$\frac{d\sigma^{\textcolor{red}{q}}}{dz dM_h dQ^2} = \left. \frac{d\sigma}{dz dM_h dQ^2} \right|_{BELL} R_{MC}^q(z, M_h; Q^2)$$

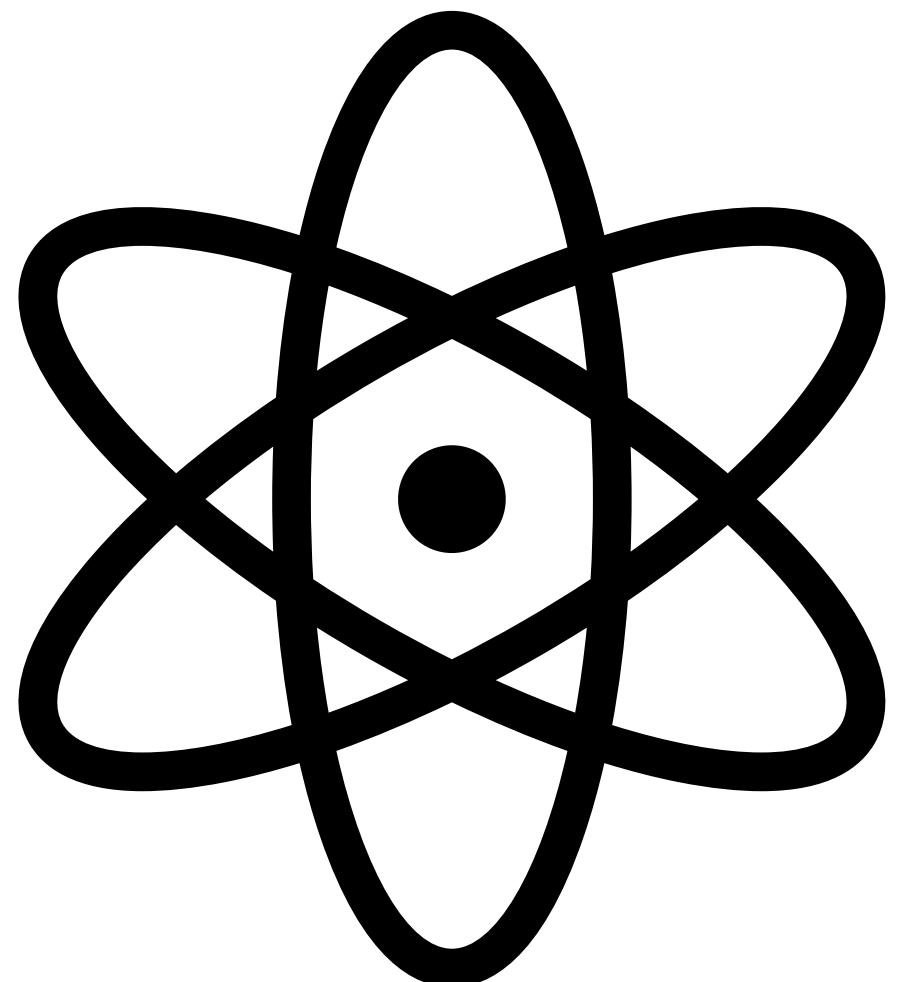
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- Extend the analysis up to NNLO
- Explore a Neural Network parameterisation

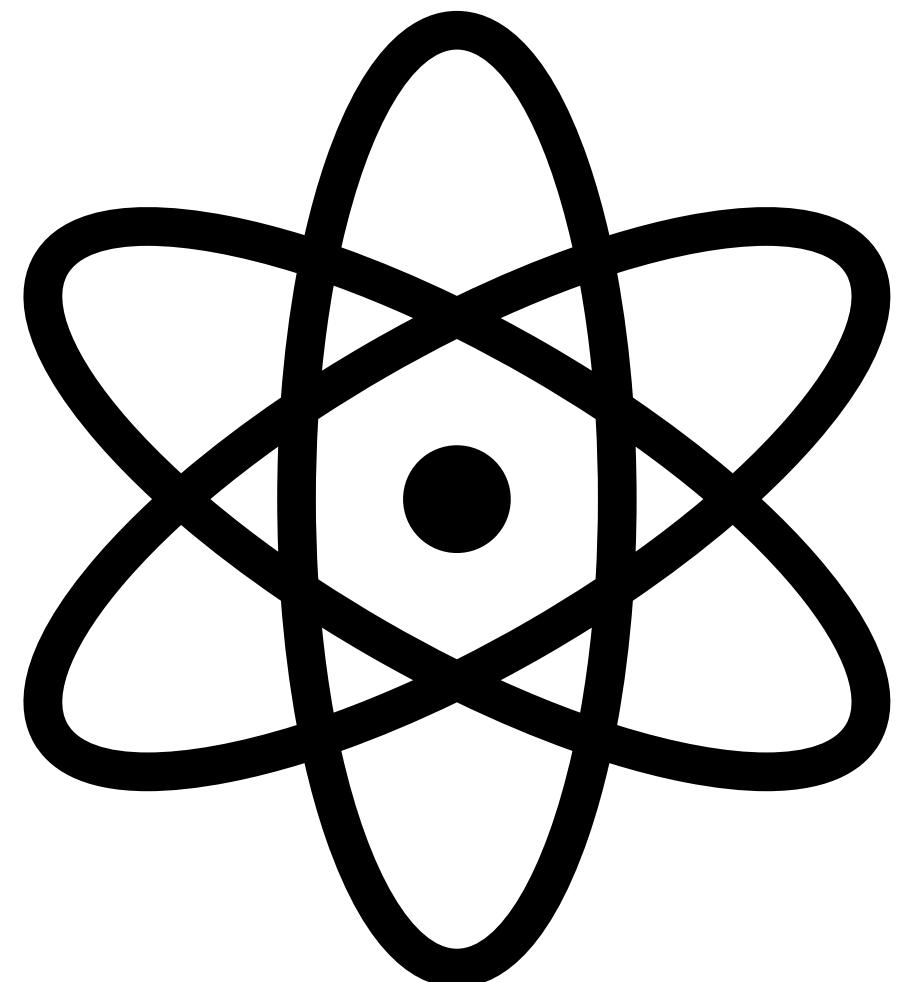
# PHYSICS INFORMED



71 par



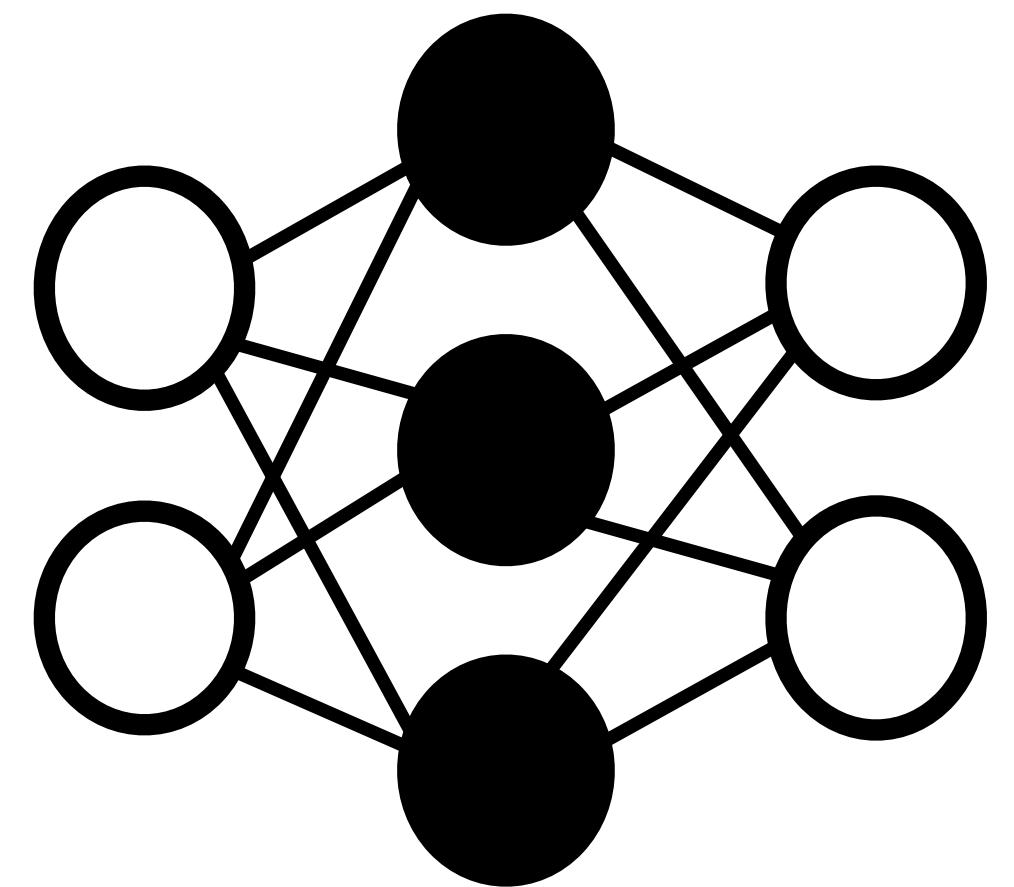
**PHYSICS  
INFORMED**



71 par

23

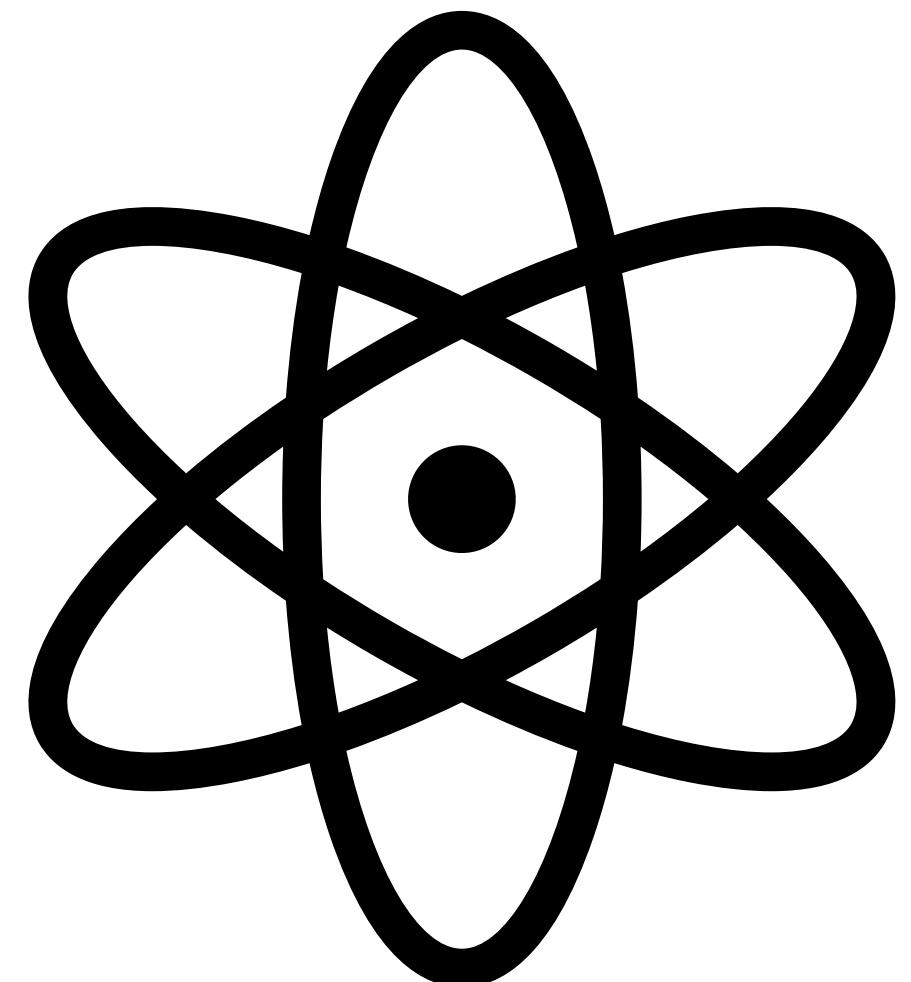
**NEURAL  
NETWORK**



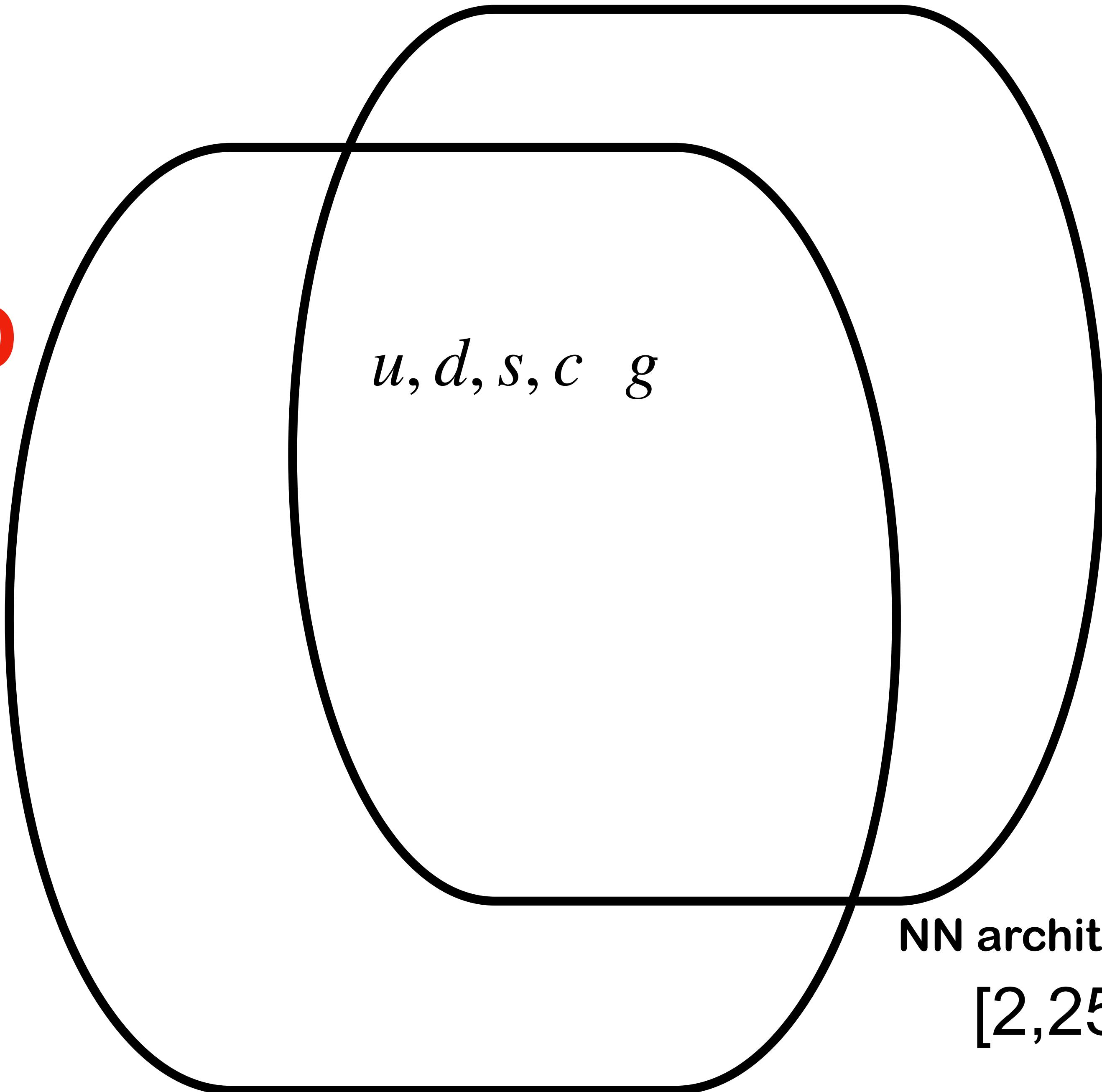
NN architecture  
 $[2, 25, 5] \leadsto 205$  par

205 par

**PHYSICS  
INFORMED**



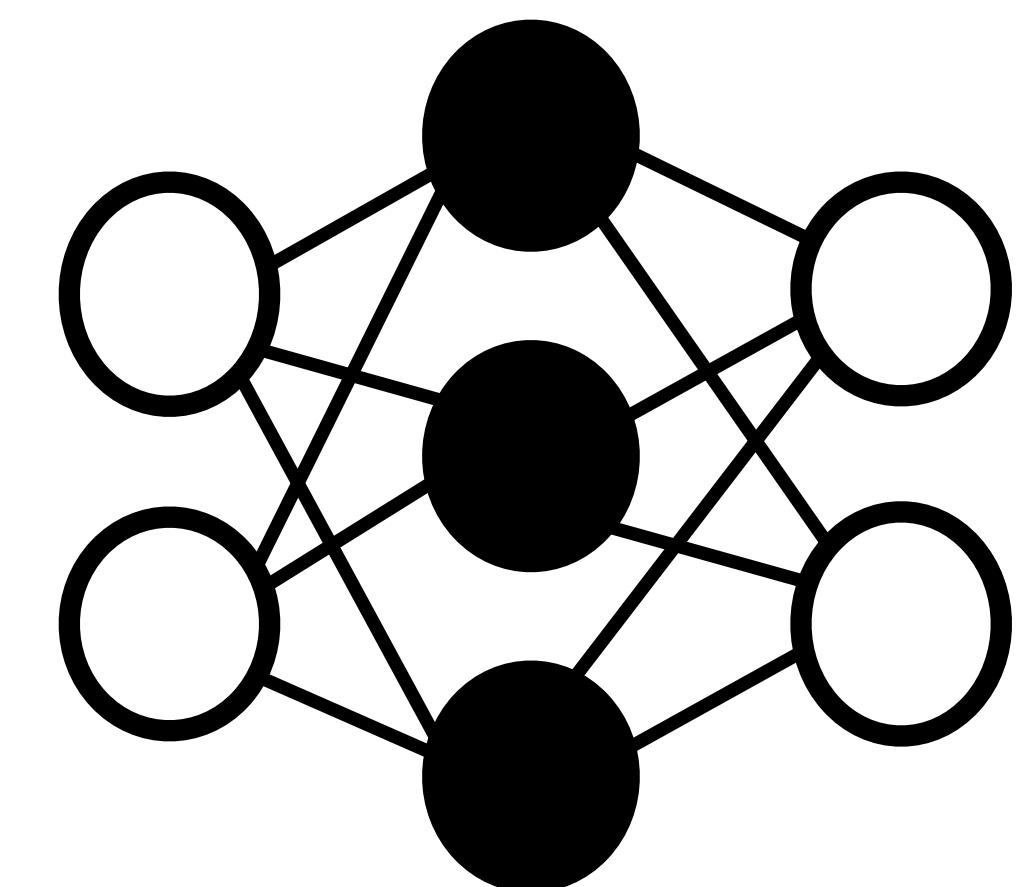
71 par



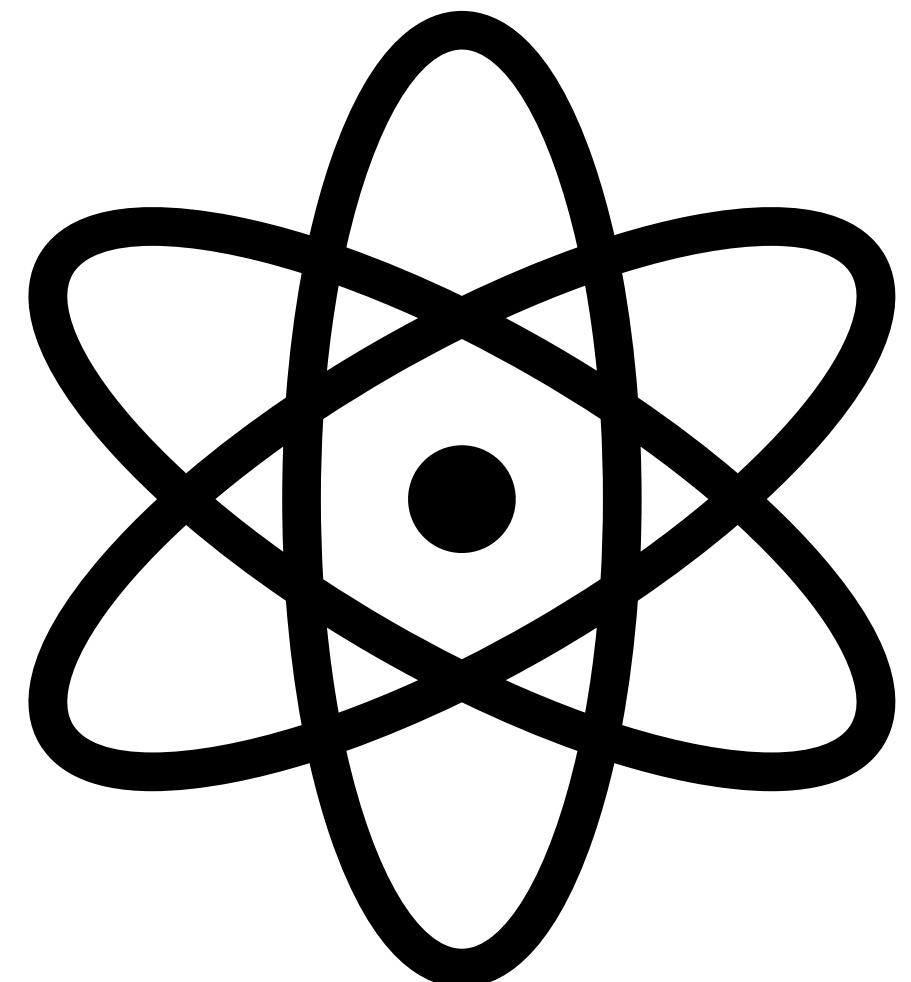
23

NN architecture

$[2, 25, 5] \sim 205$  par



# PHYSICS INFORMED



71 par

$$Q_0 = 1 \text{ GeV}$$

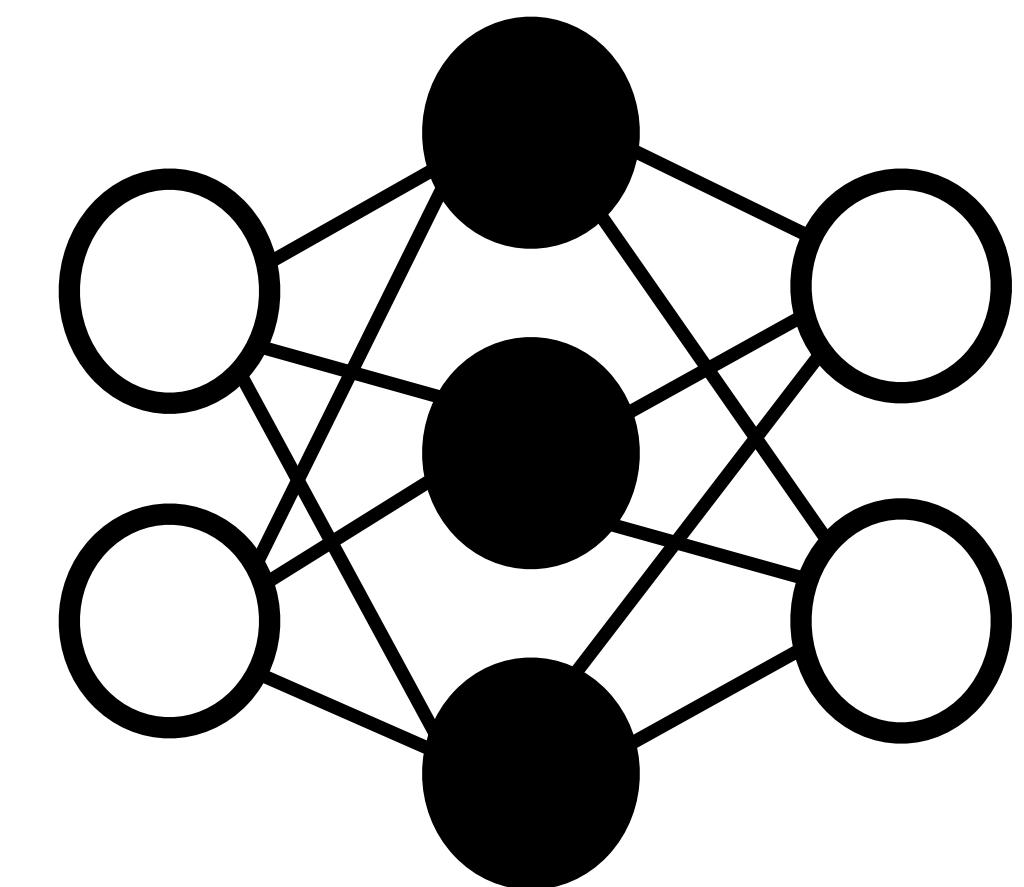
$$u, d, s, c \quad g$$

$$D_1^q = D_1^{\bar{q}}$$

$$D_1^q = 0 \text{ for } M_h < 2M_\pi$$

$$D_1^q \rightarrow 0 \text{ as } z \rightarrow 1$$

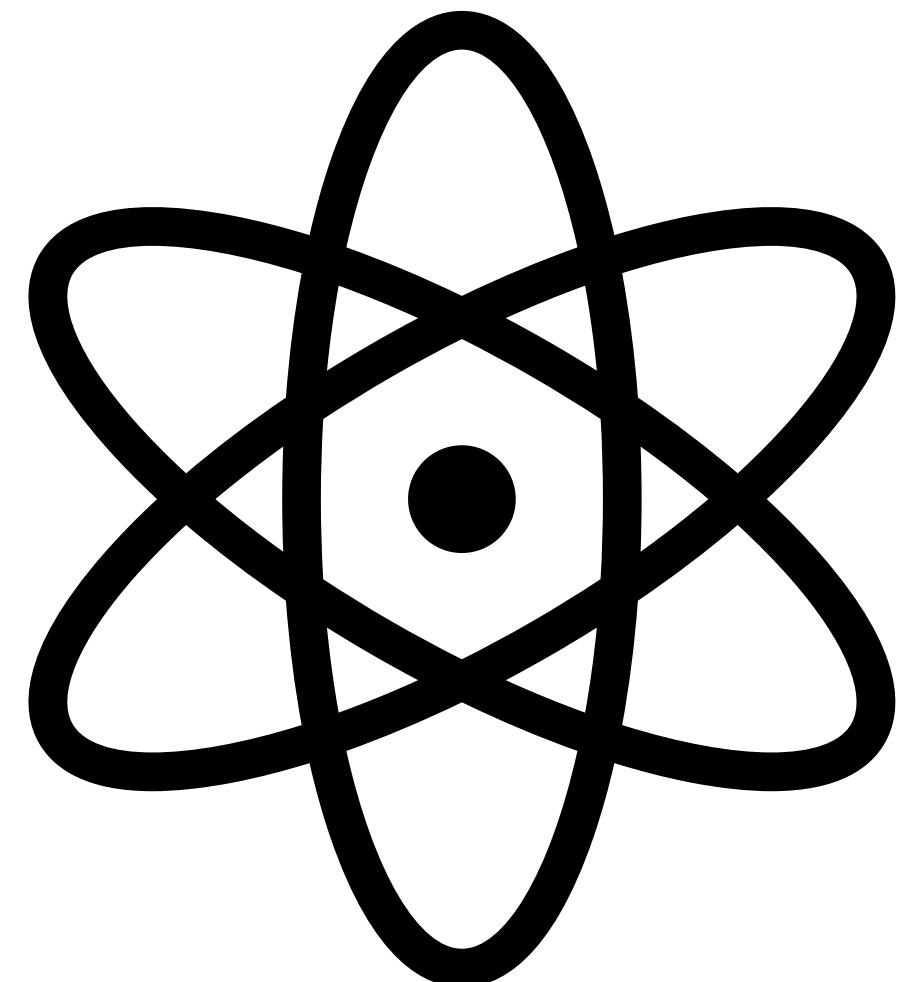
# NEURAL NETWORK



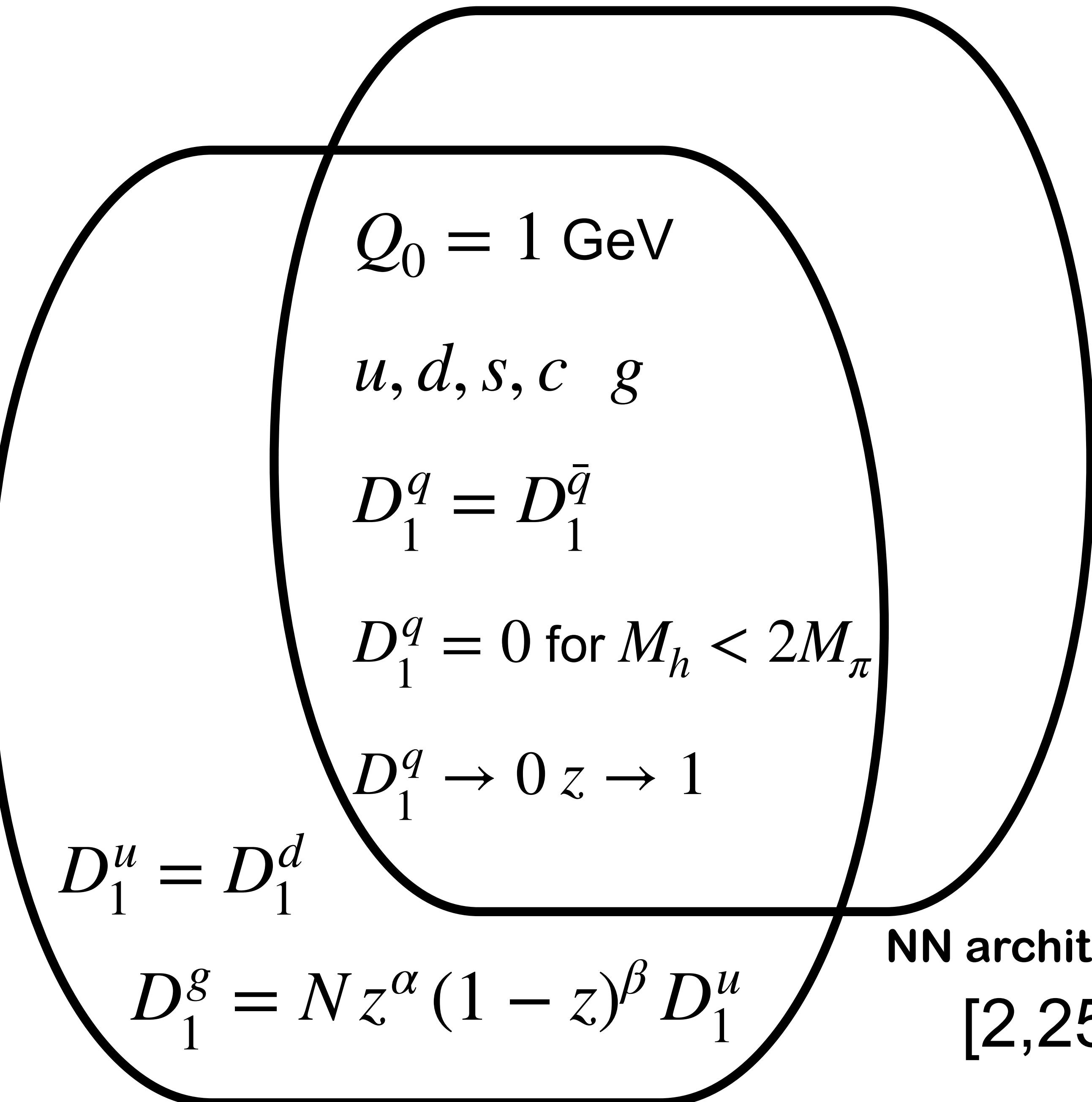
NN architecture

[2,25,5]  $\leadsto$  205 par

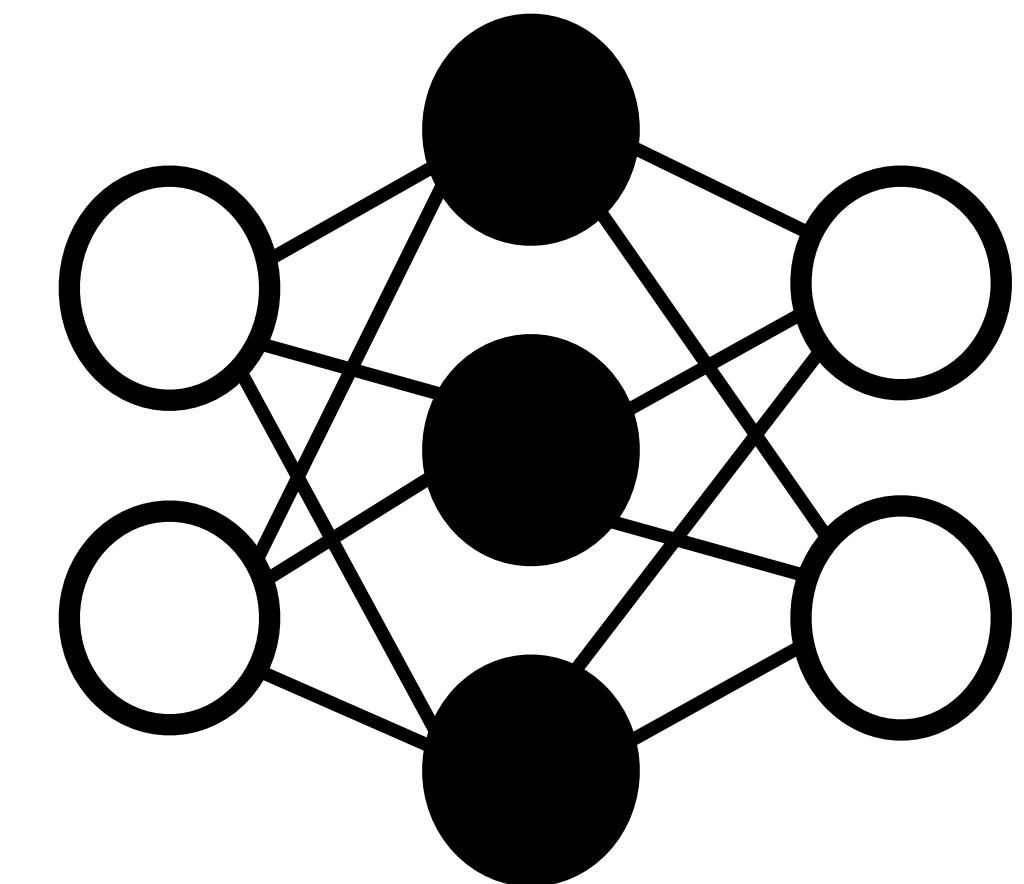
# PHYSICS INFORMED



71 par



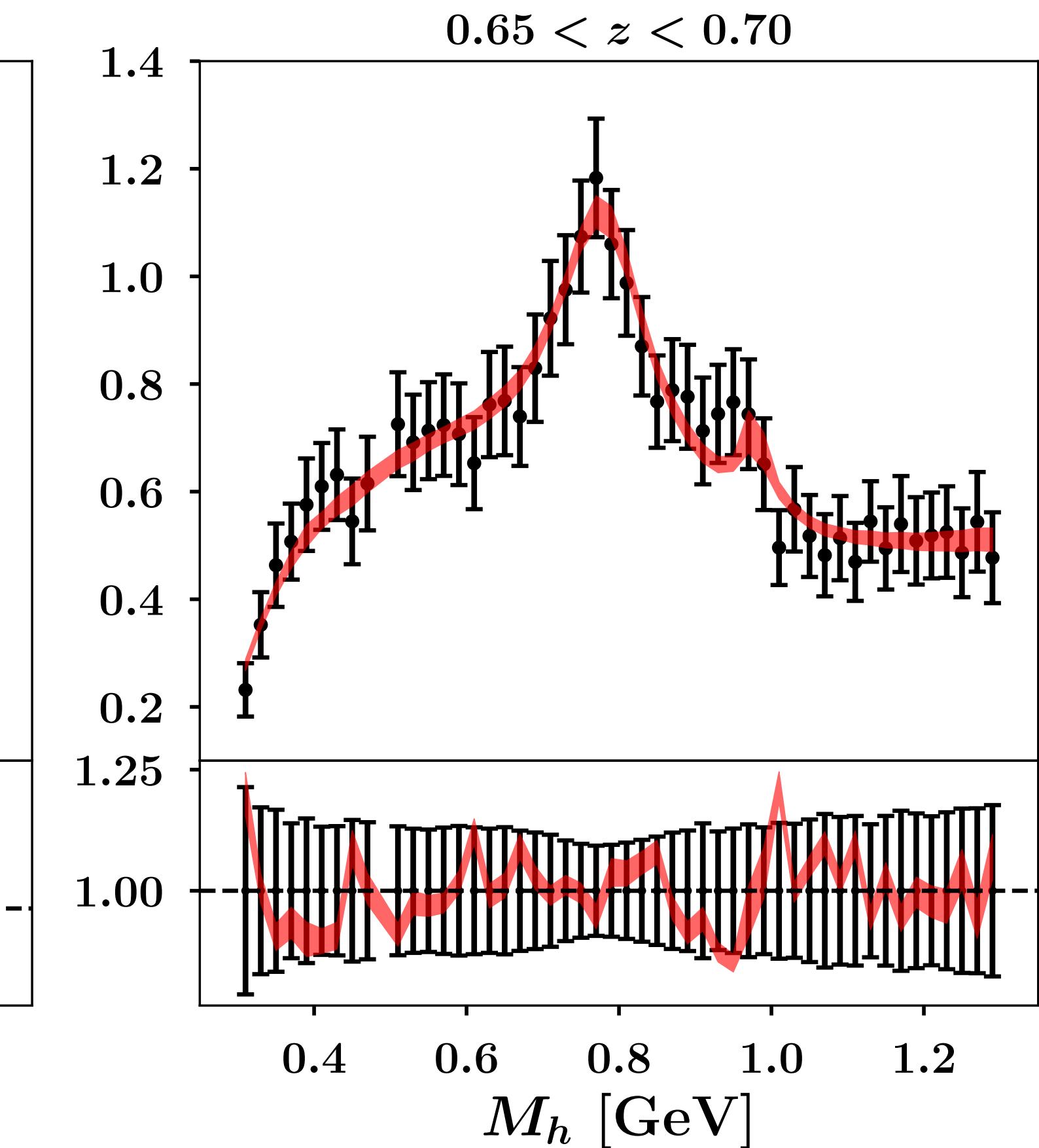
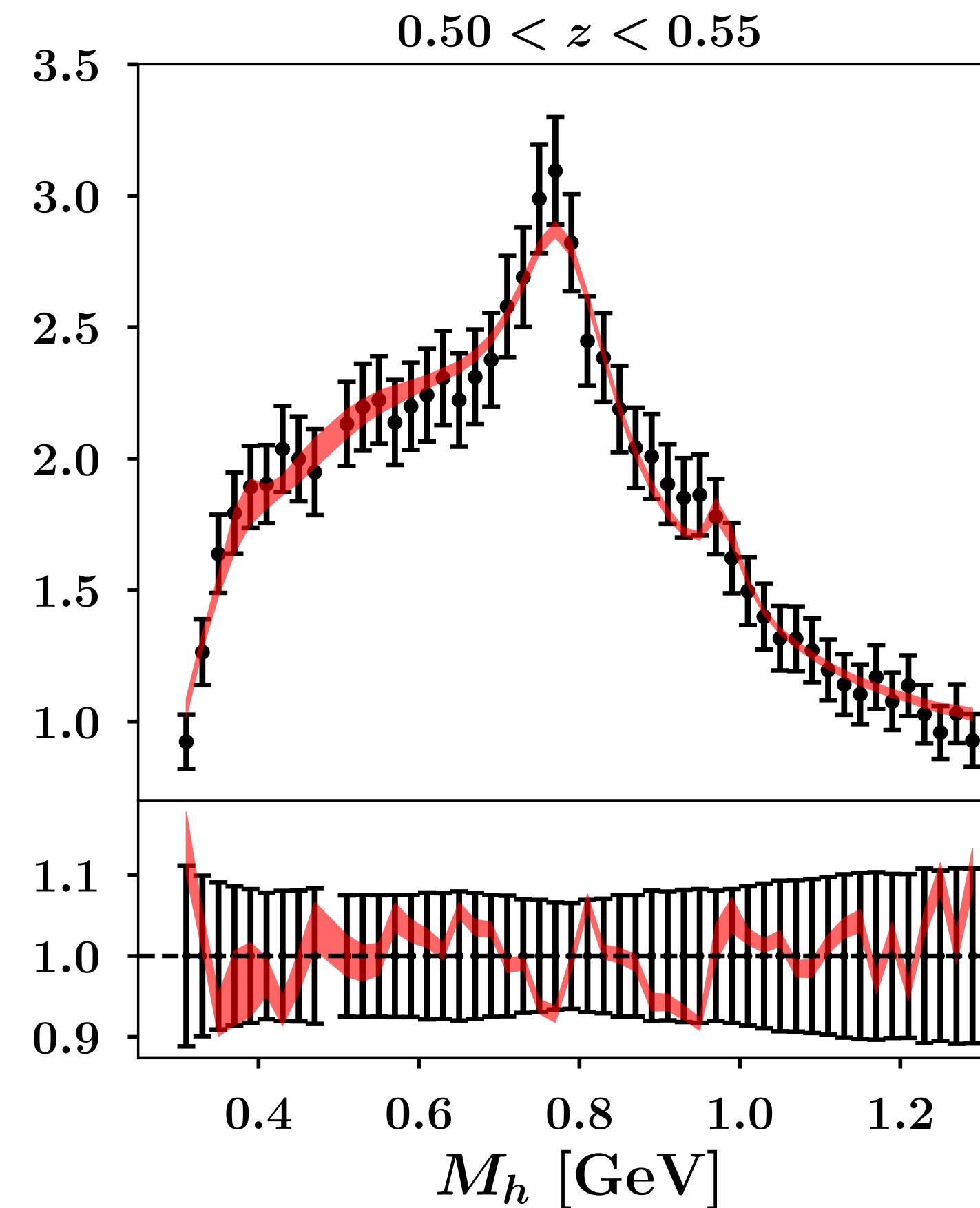
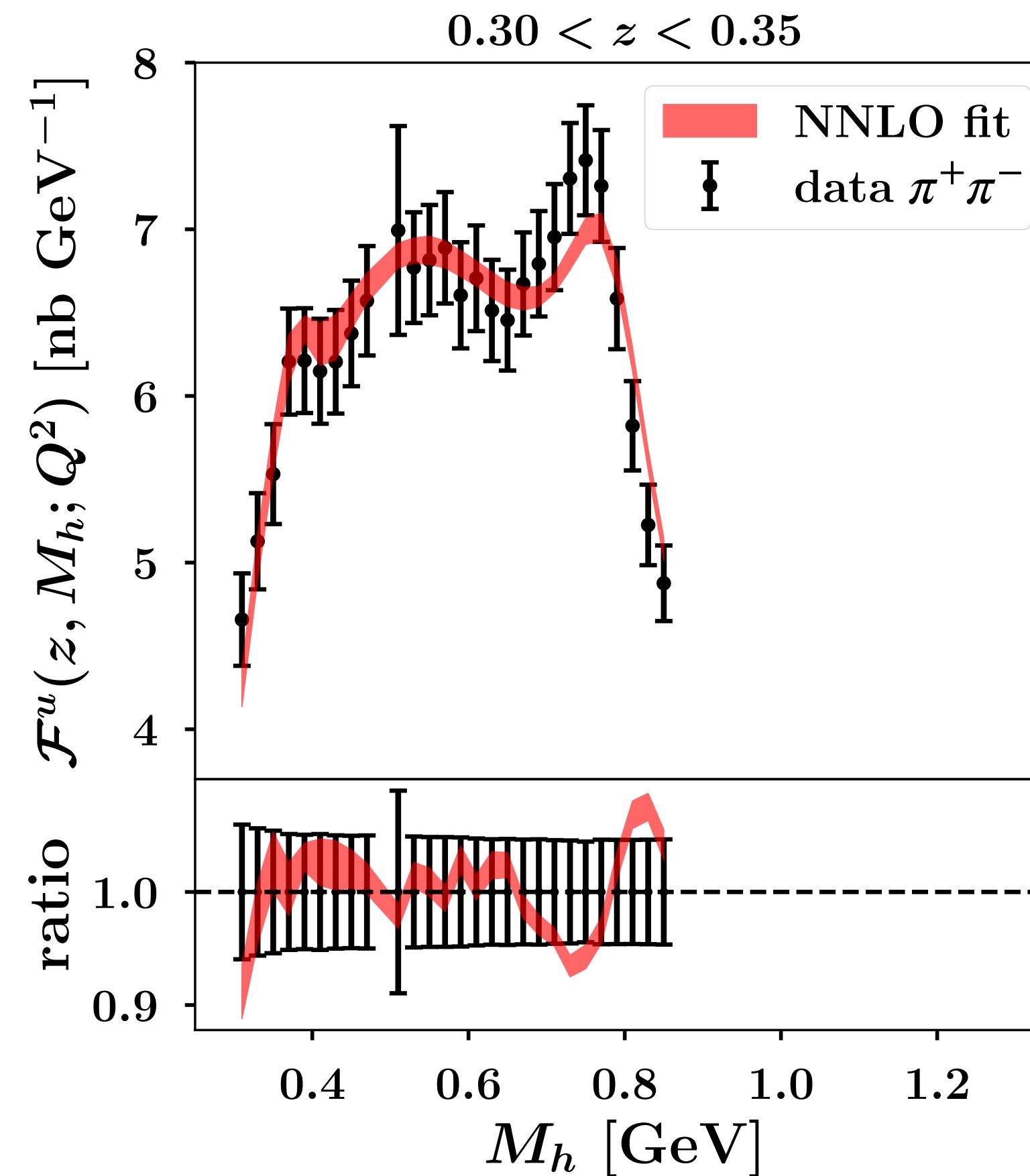
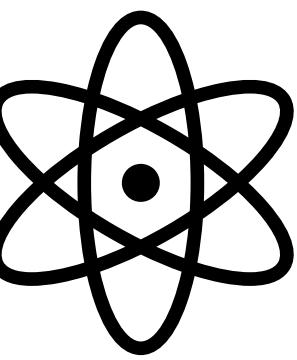
# NEURAL NETWORK



NN architecture

$[2, 25, 5] \sim 205 \text{ par}$

# Predictions: Physics informed



NNLO

100 replicas

$$\chi^2_u = 0.350$$

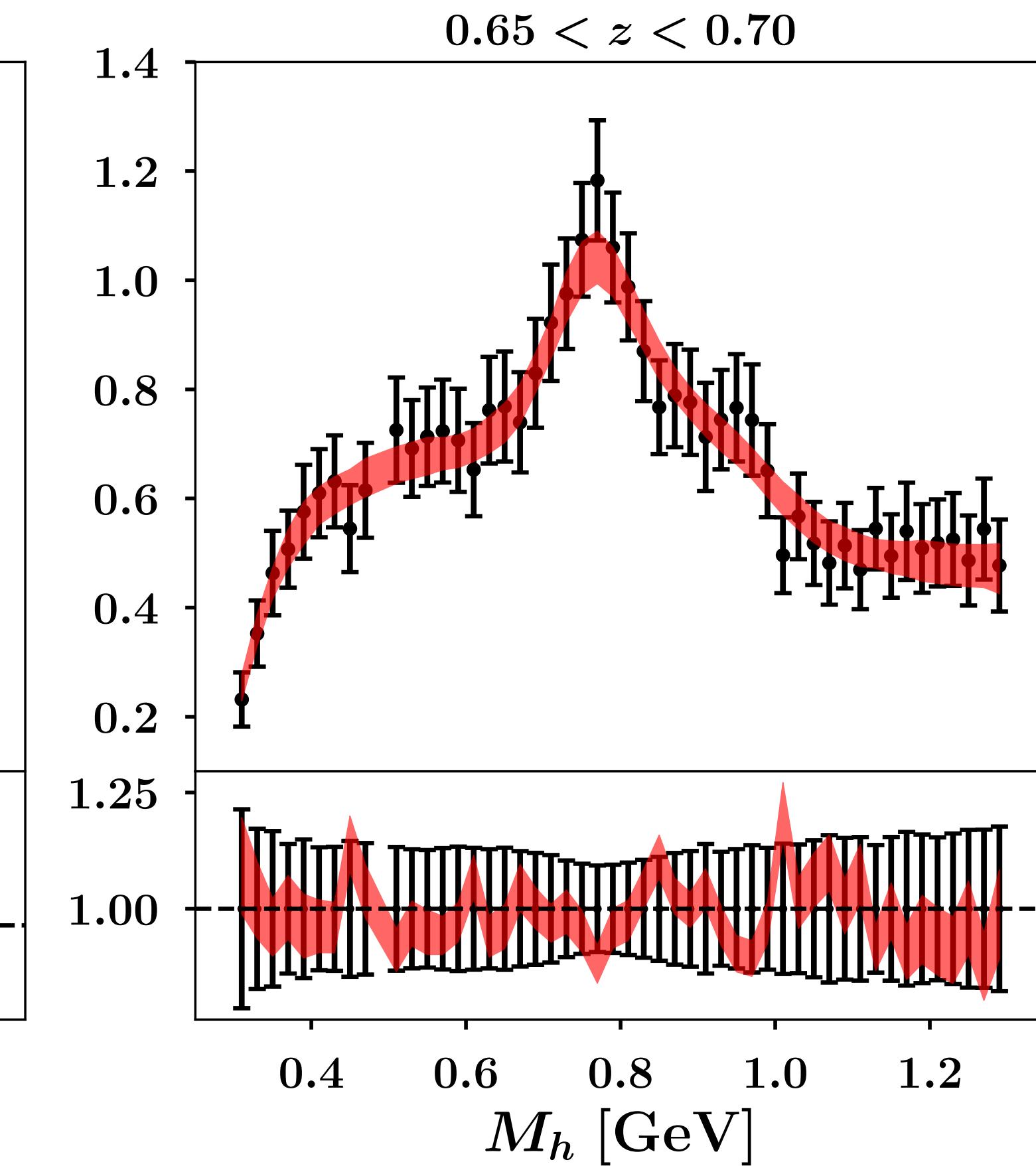
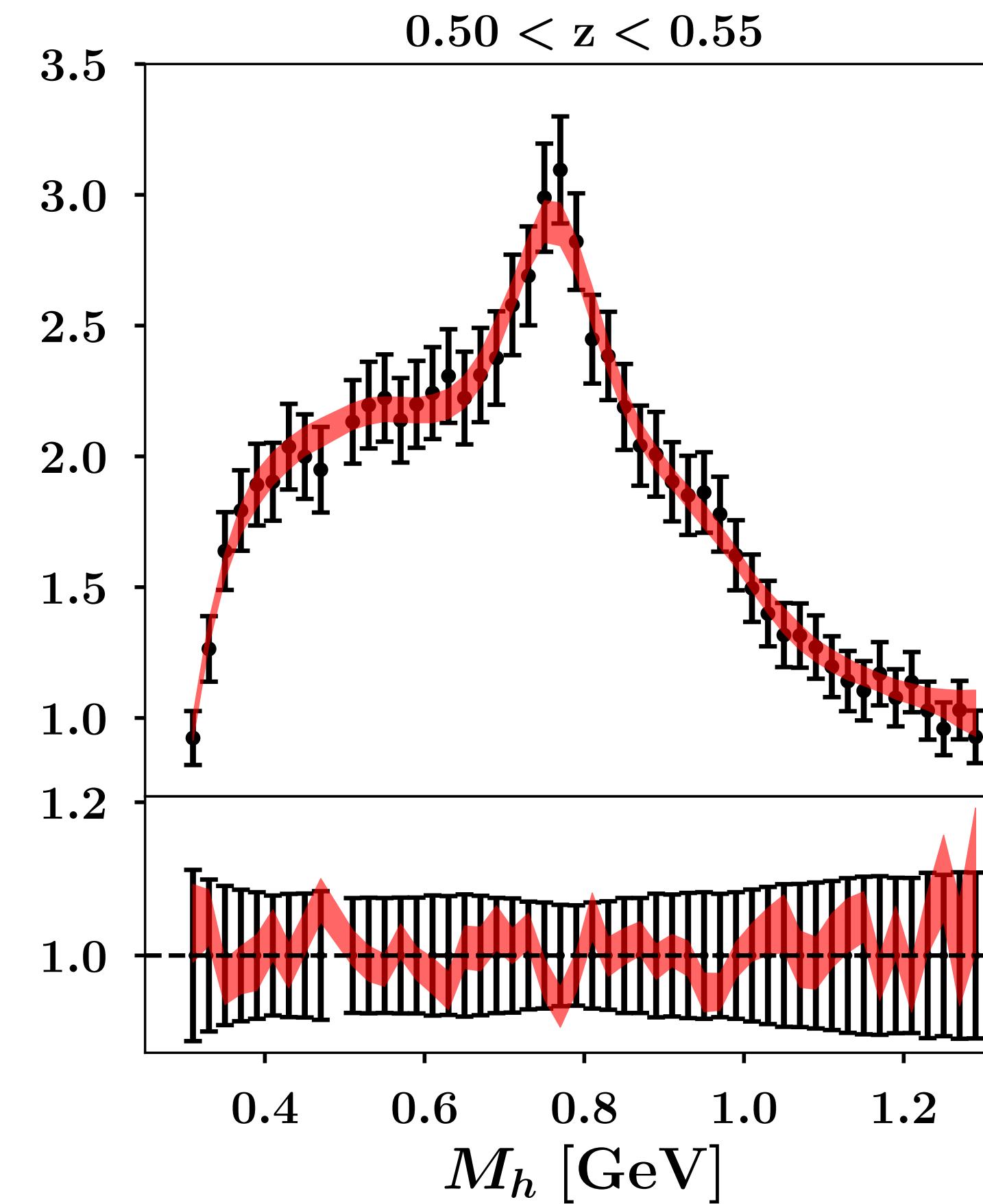
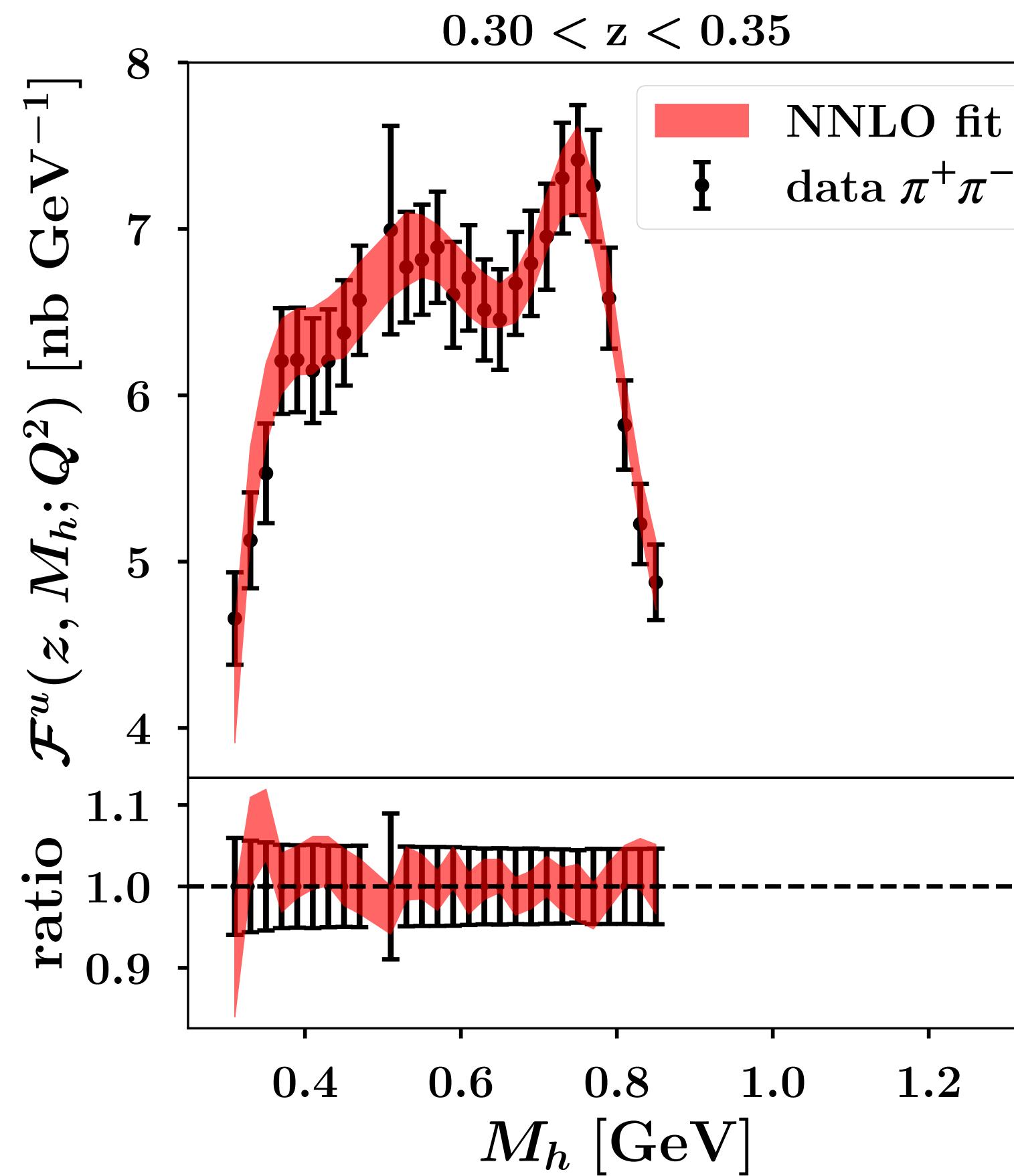
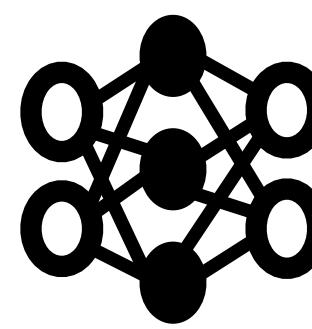
$$\chi^2_d = 0.591$$

$$\chi^2_s = 0.850$$

$$\chi^2_c = 0.802$$

$$\chi^2_{tot} = 0.648$$

# Predictions: Neural Network



NNLO

100 replicas

24

$$\chi_u^2 = 0.214$$

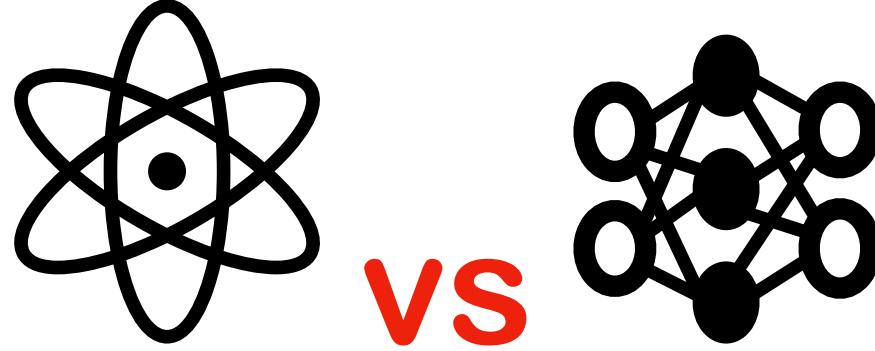
$$\chi_d^2 = 0.534$$

$$\chi_s^2 = 0.793$$

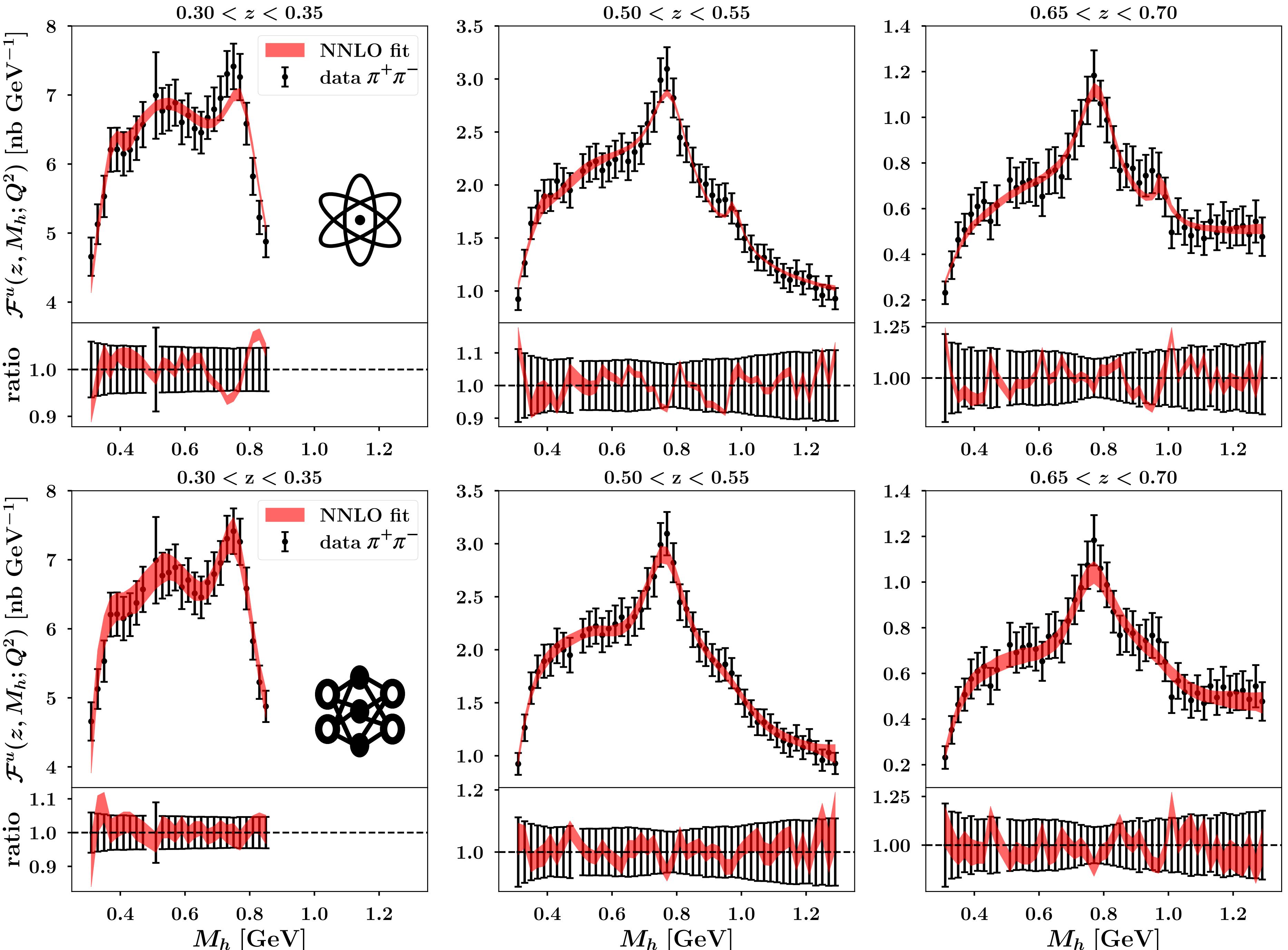
$$\chi_c^2 = 0.607$$

$$\chi_{tot}^2 = 0.537$$

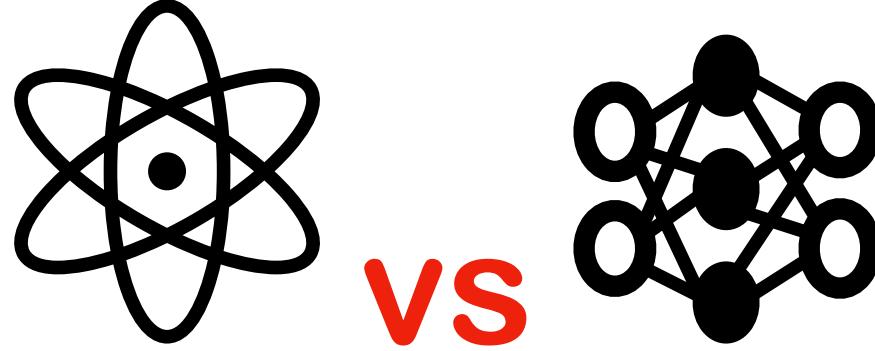
# Comparison



vs

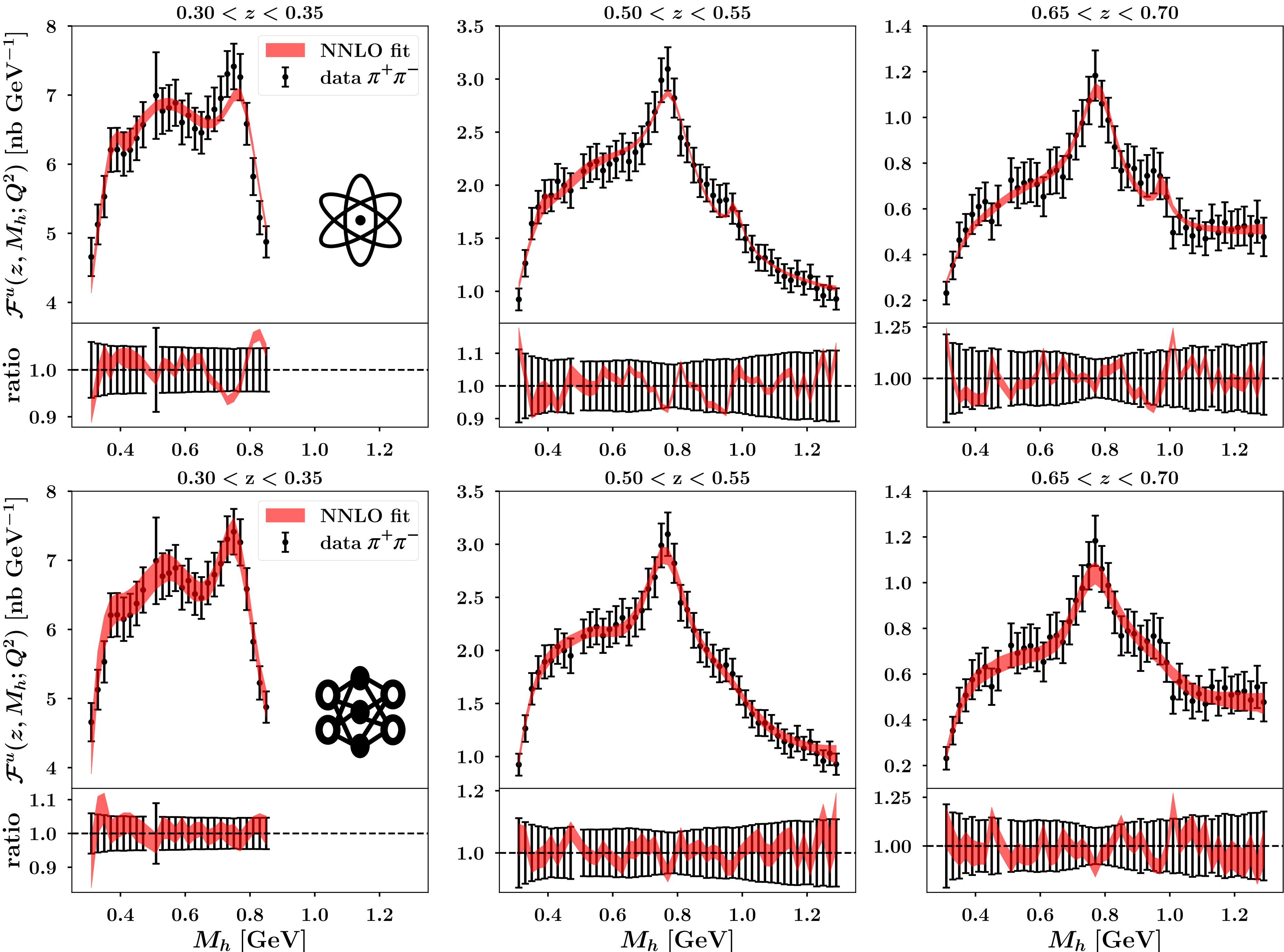


# Comparison

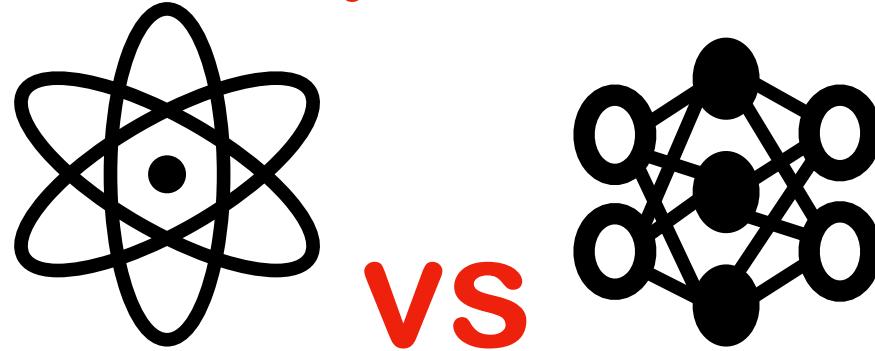


vs

- NN gives a better  $\chi^2$



# Comparison

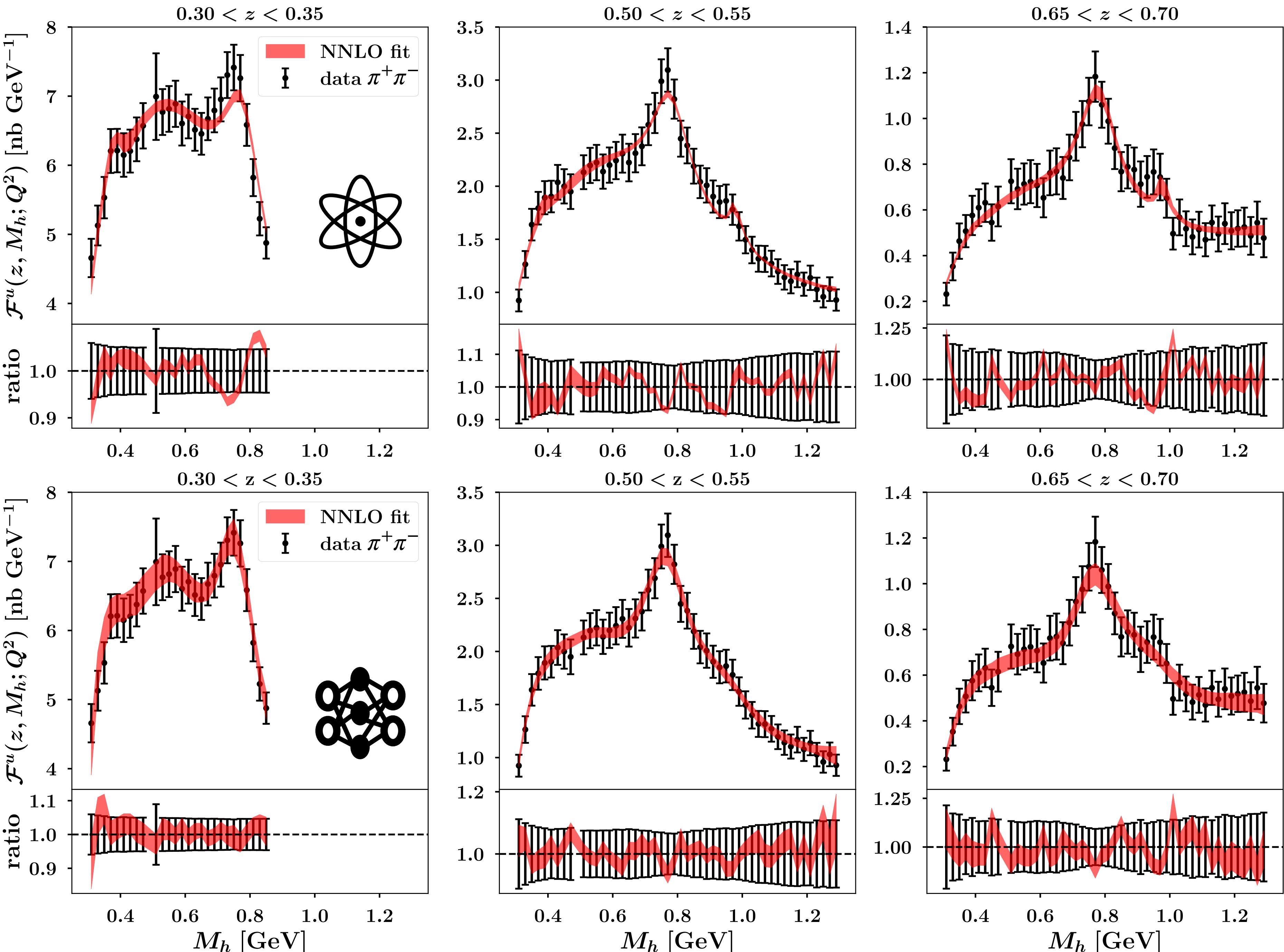


**vs**

- NN gives a better  $\chi^2$

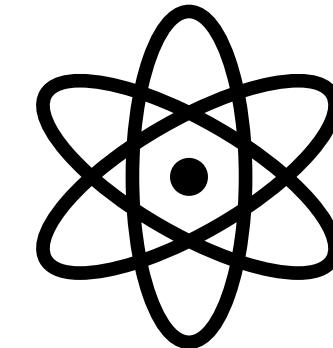
- NN has less sensitivity

on resonances



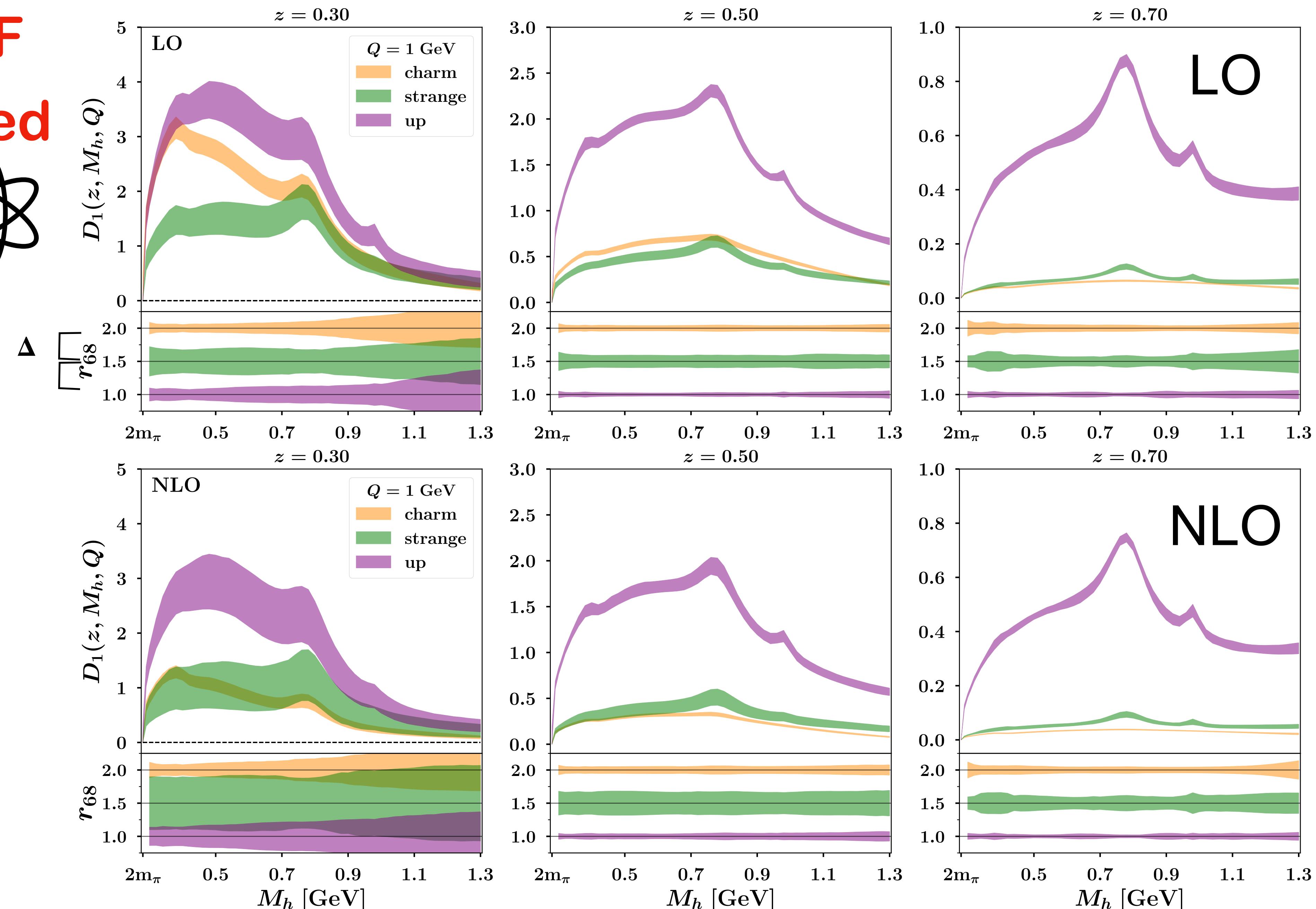
# DI-HADRON FF

## Physics informed



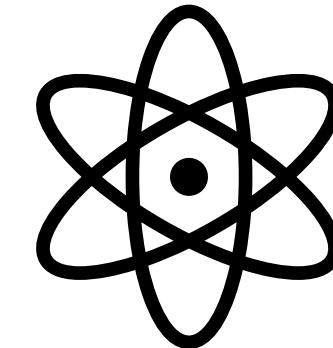
**u=d**

ratio offset  $\Delta = 0.5$



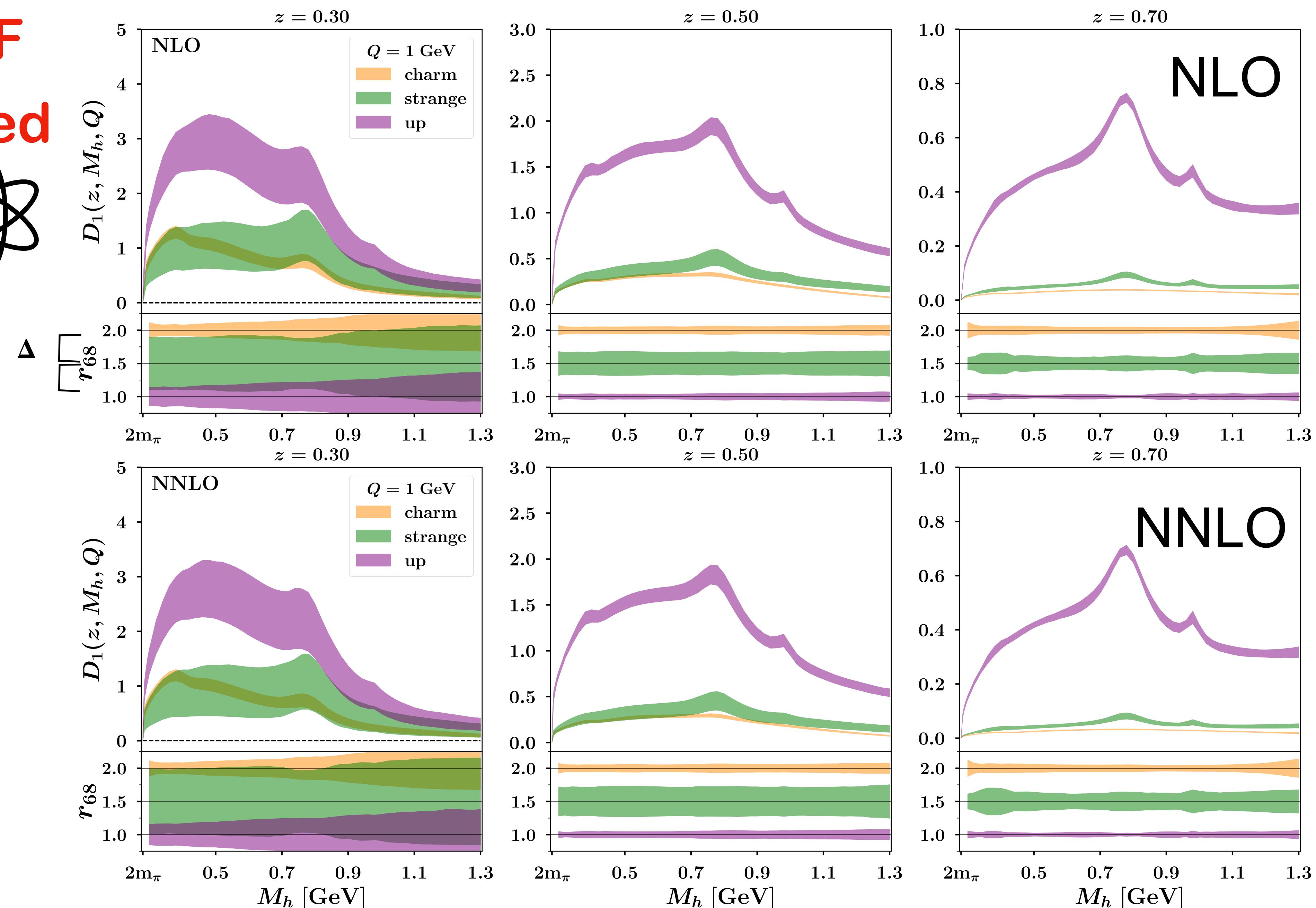
# DI-HADRON FF

## Physics informed

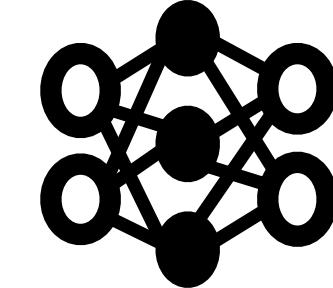


**u=d**

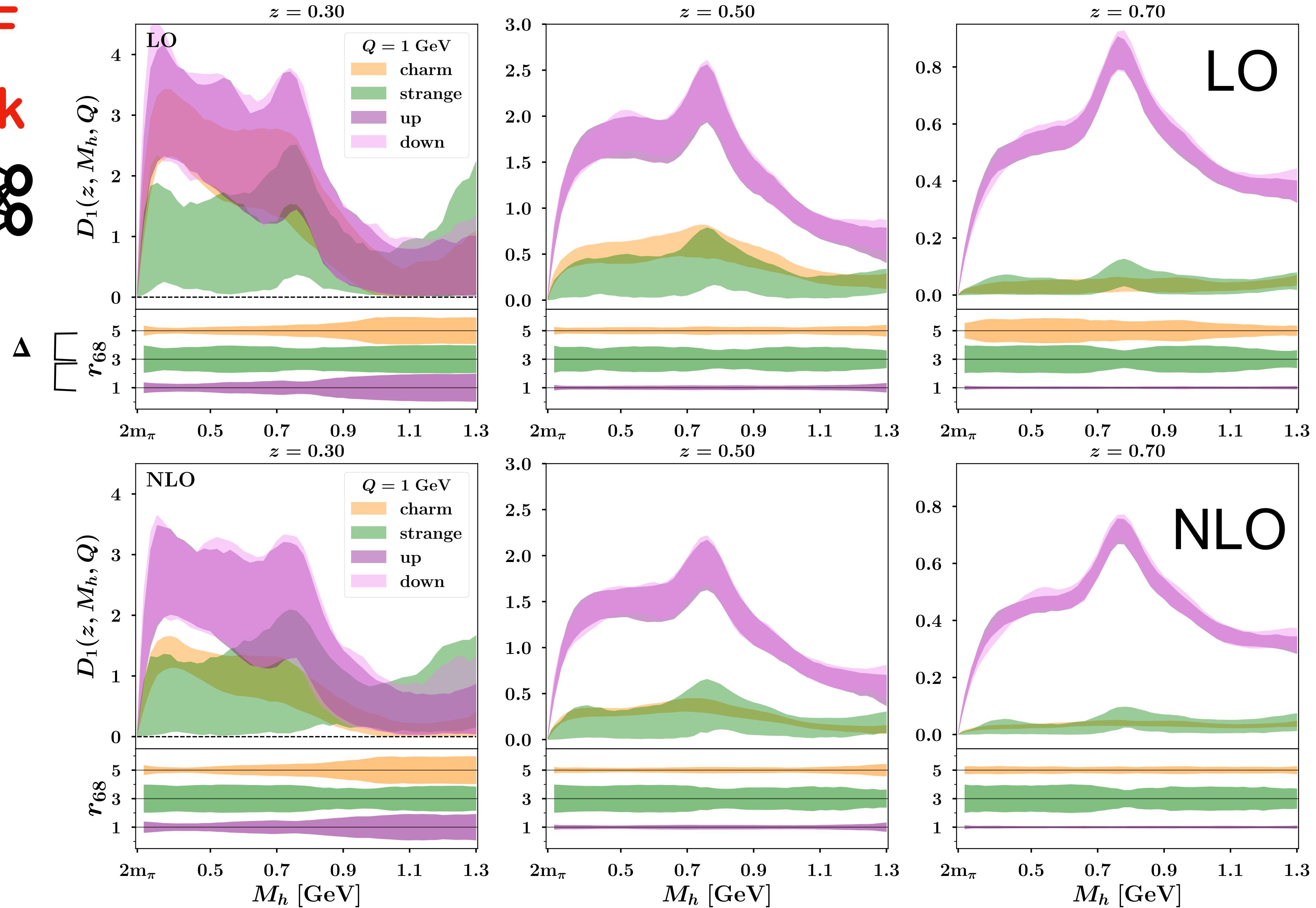
ratio offset  $\Delta = 0.5$



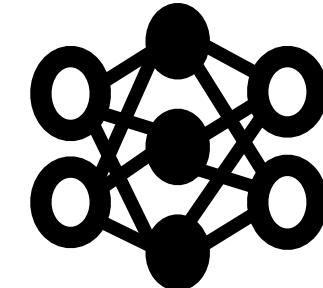
# DI-HADRON FF Neural Network



$u \neq d$   
ratio offset  $\Delta = 2.5$

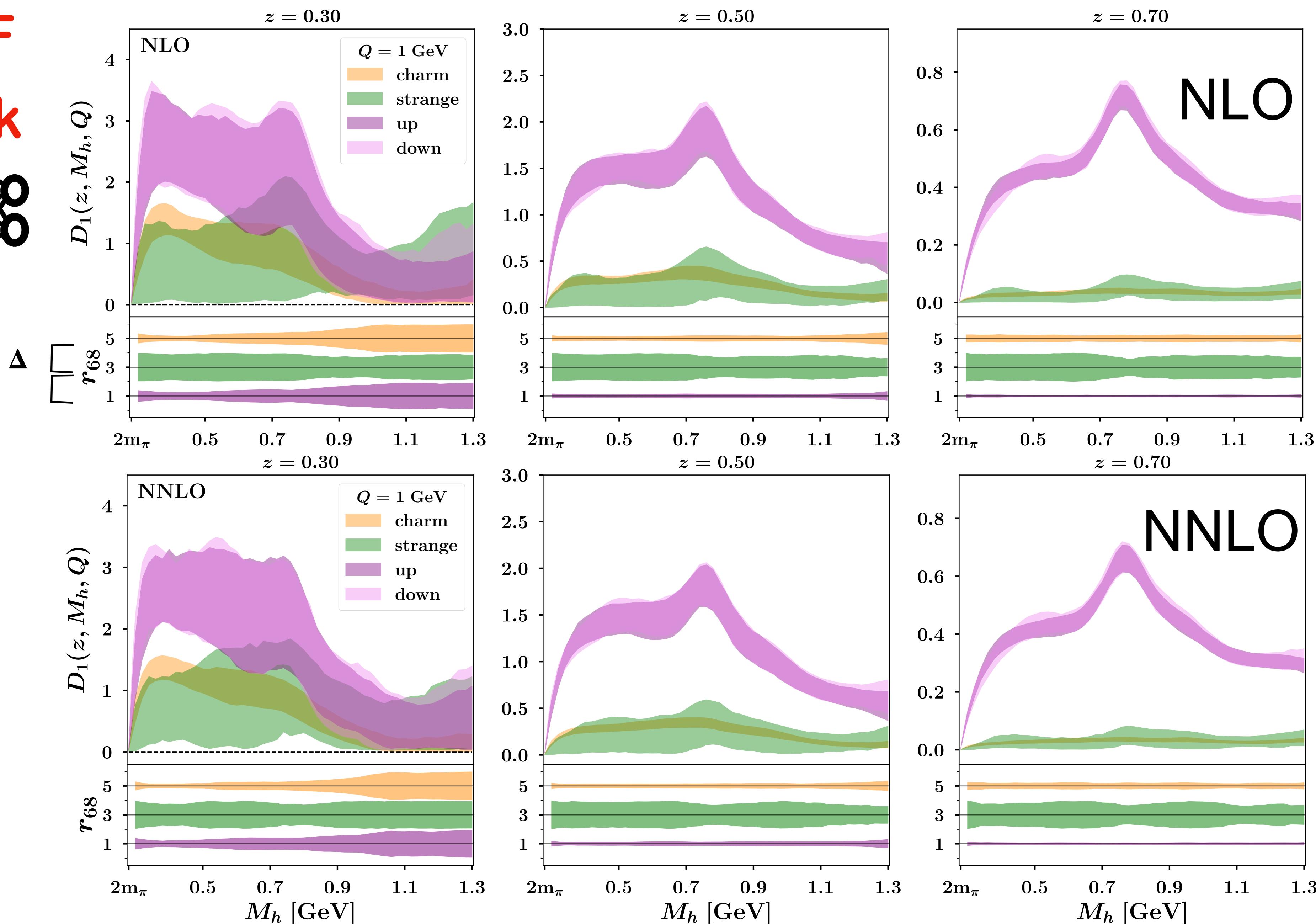


# DI-HADRON FF Neural Network

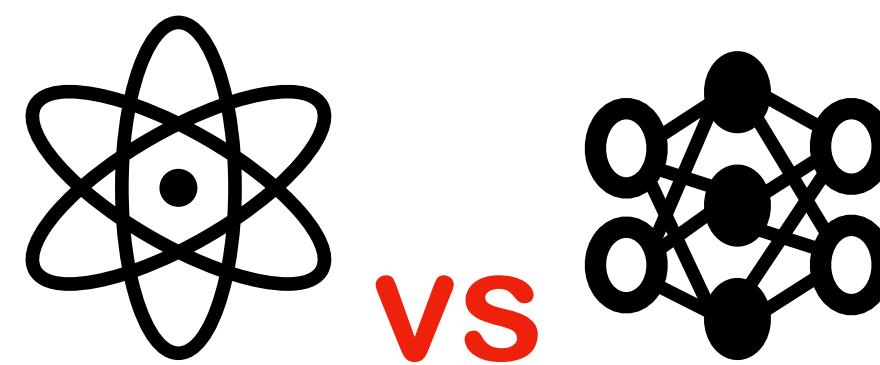


$u \neq d$

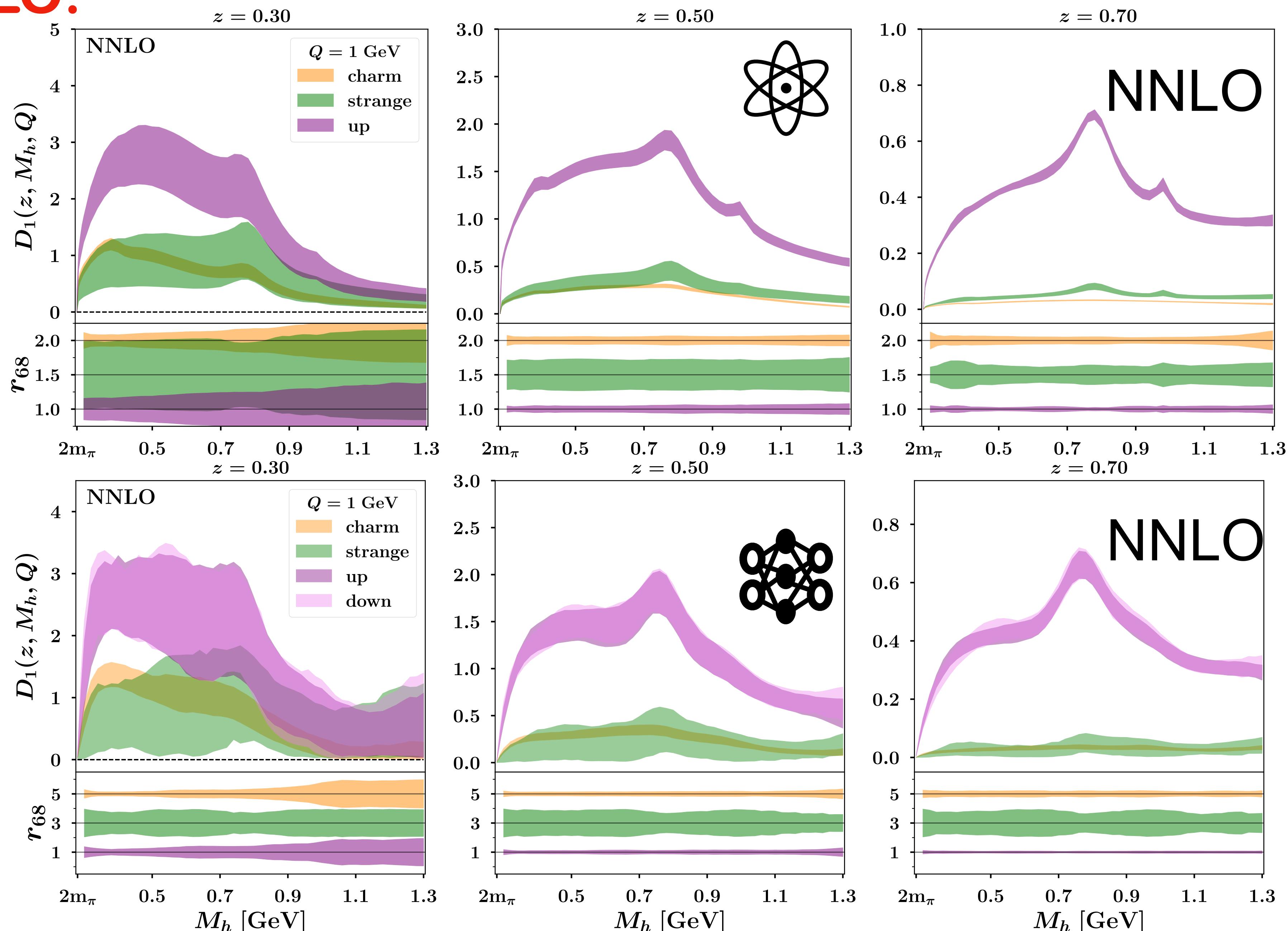
ratio offset  $\Delta = 2.5$



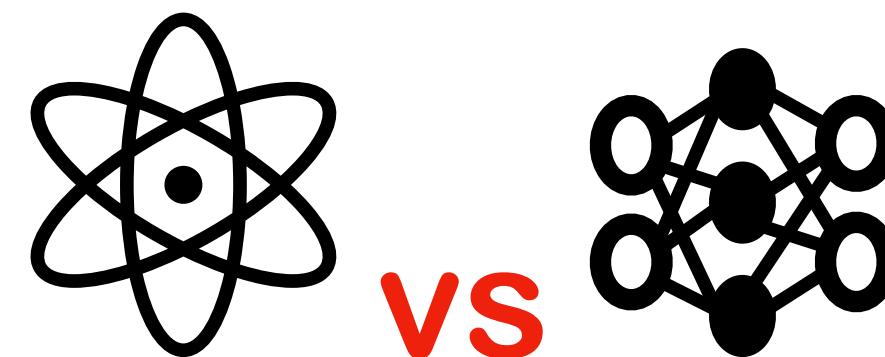
# Comparison at NNLO:



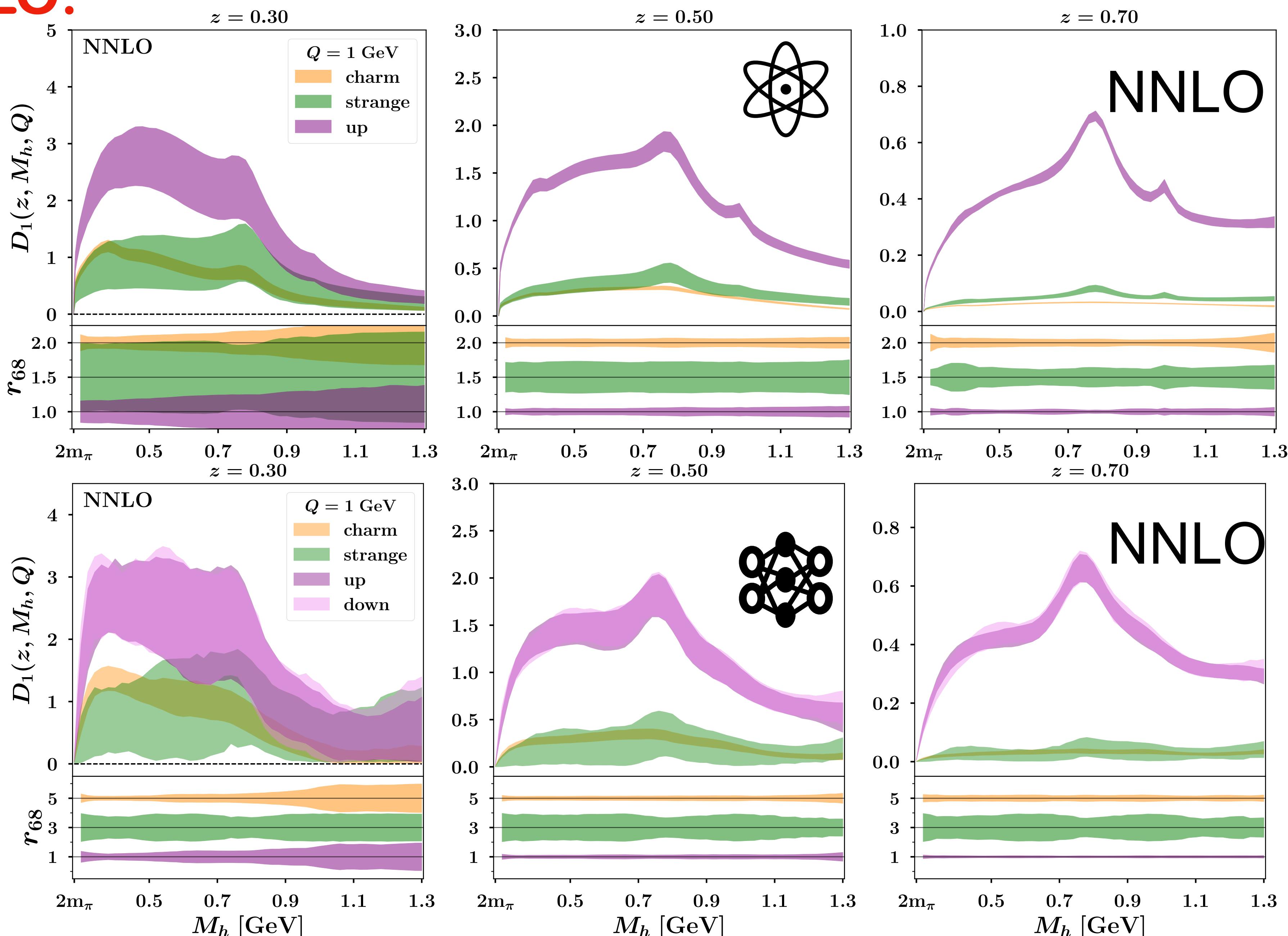
**vs**



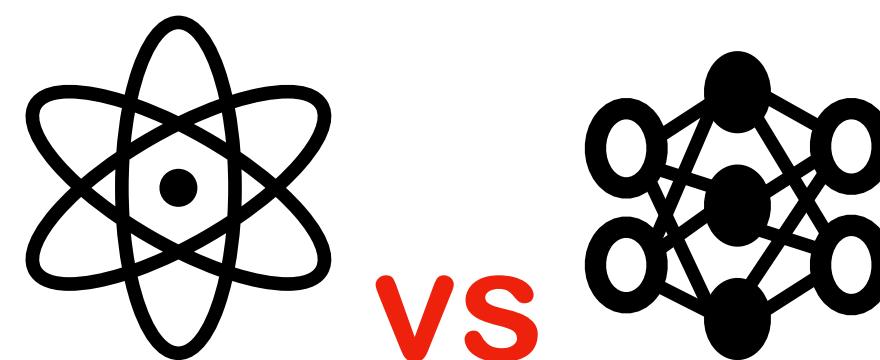
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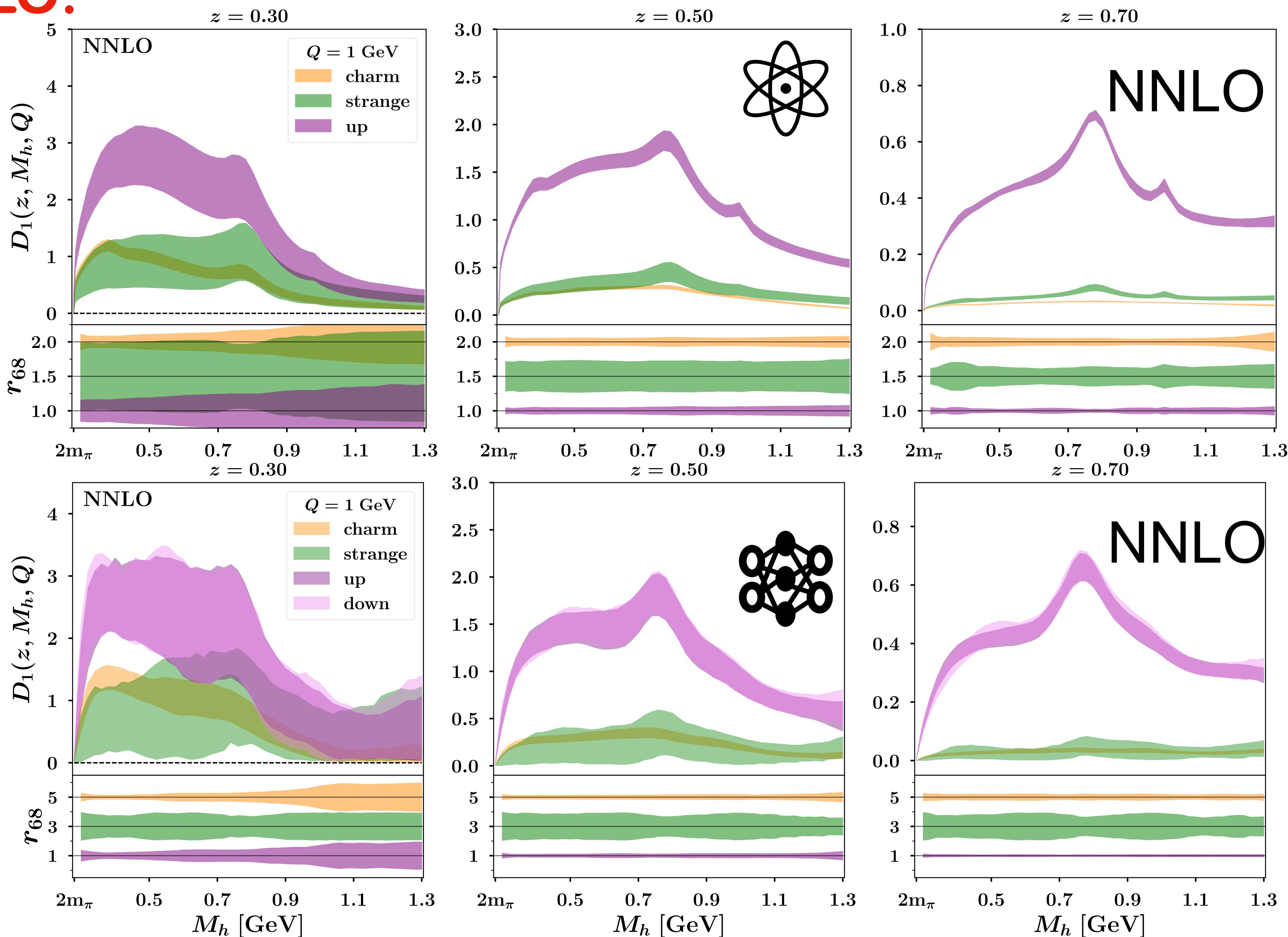
- Similar features and compatible results



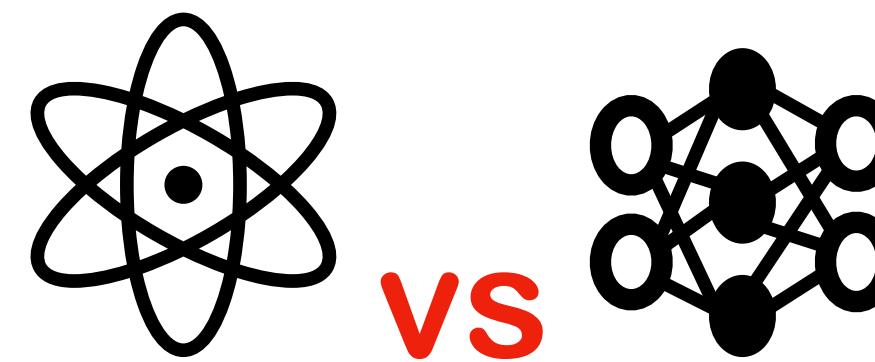
# Comparison at NNLO:



- Similar features and compatible results
- NN has wider uncertainty bands

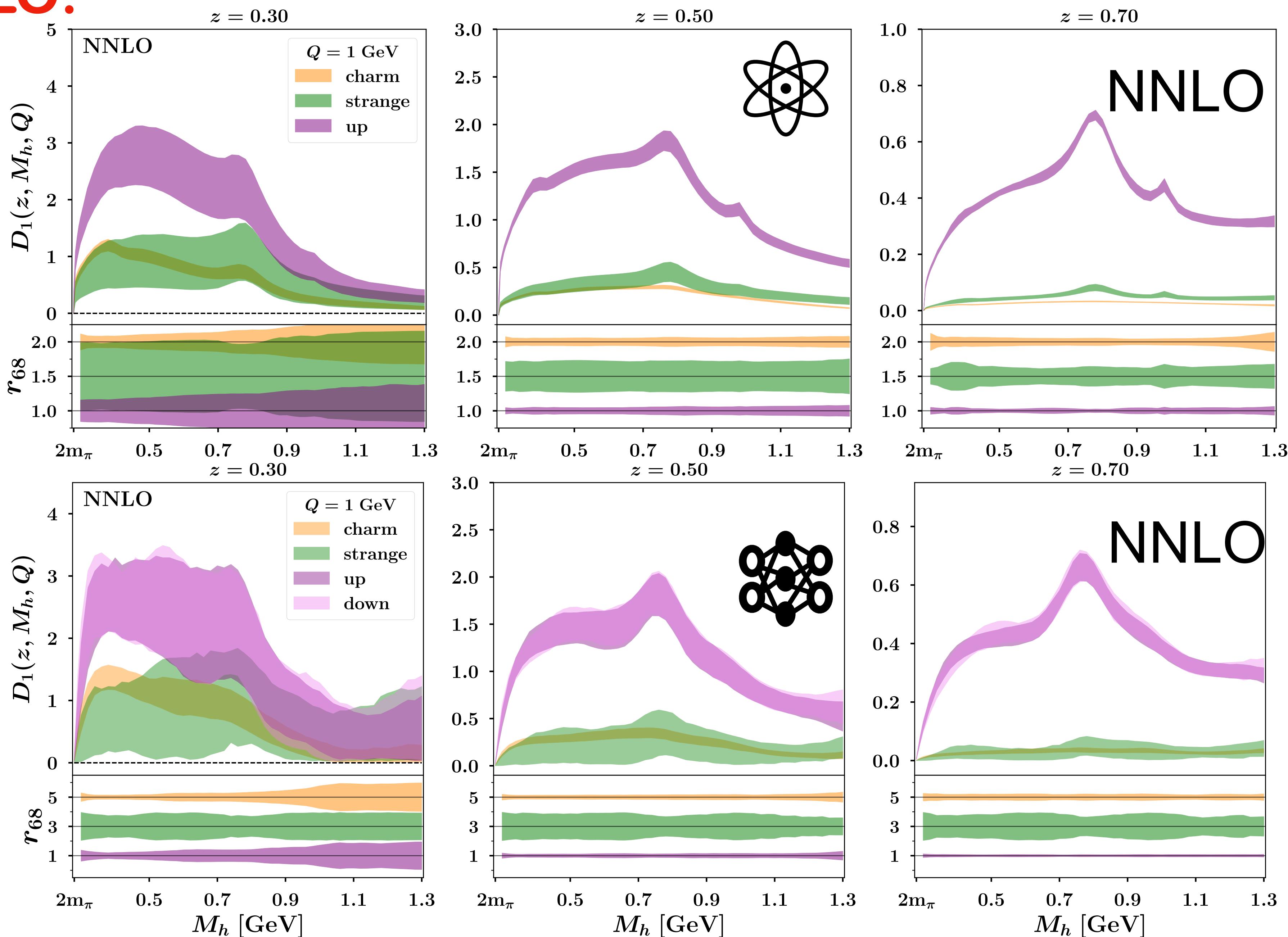


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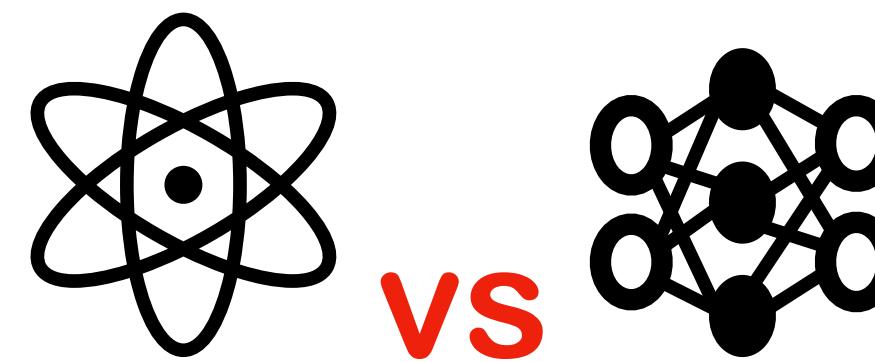


**vs**

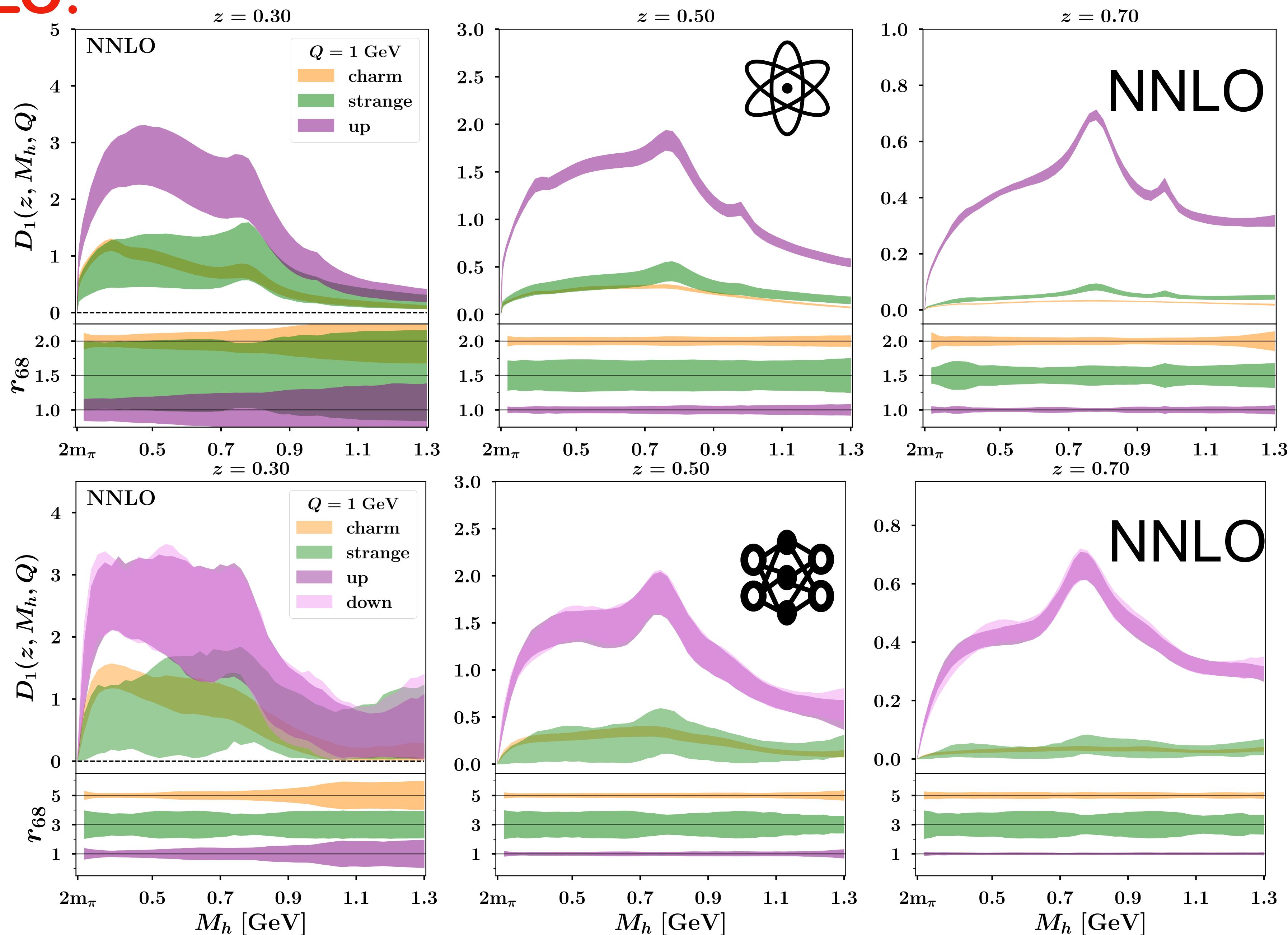
- Similar features and compatible results
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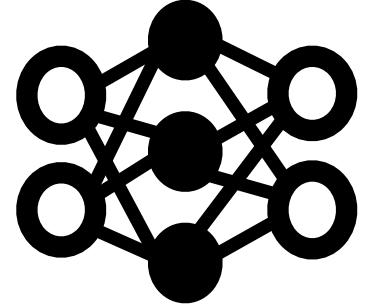
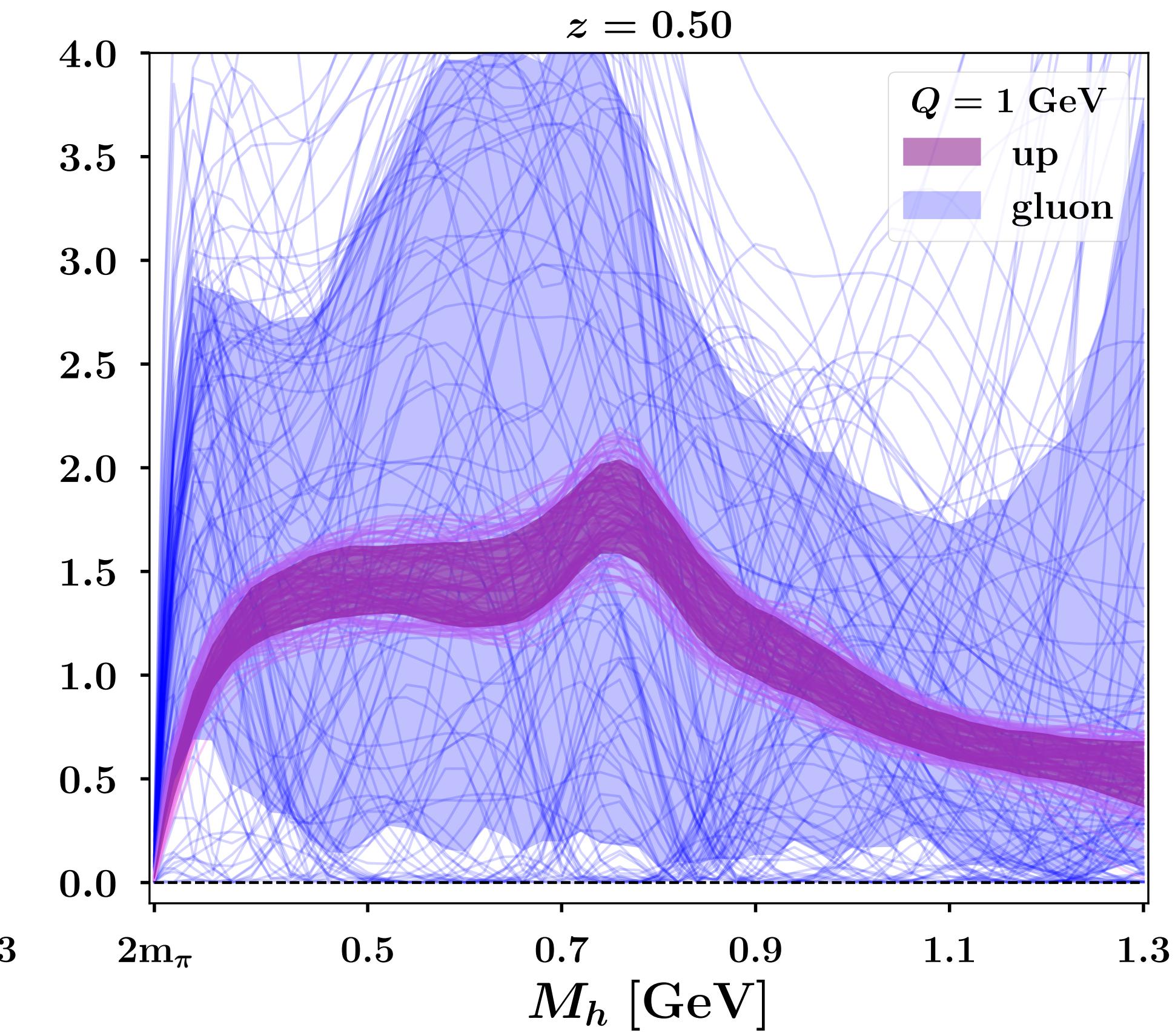
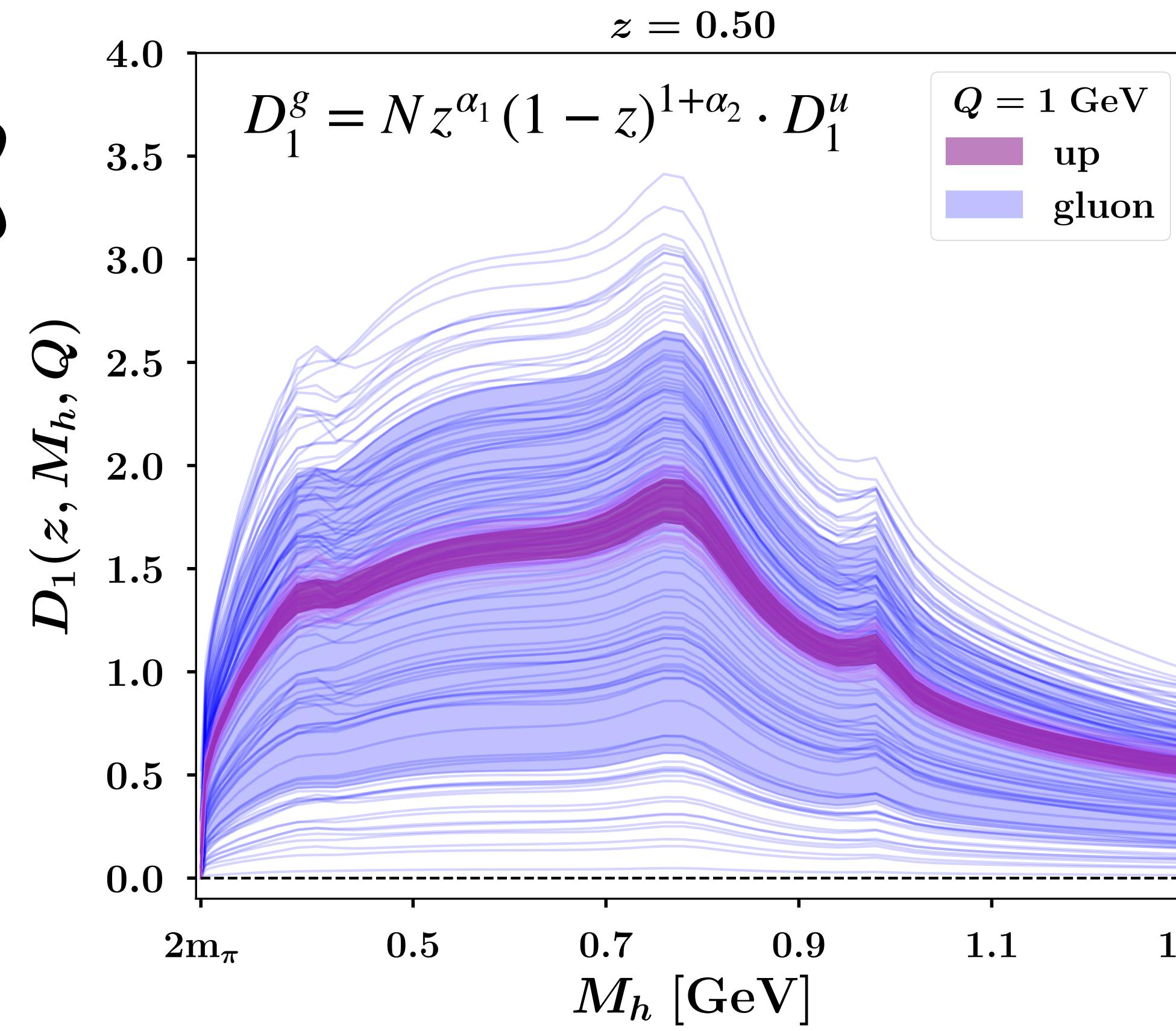
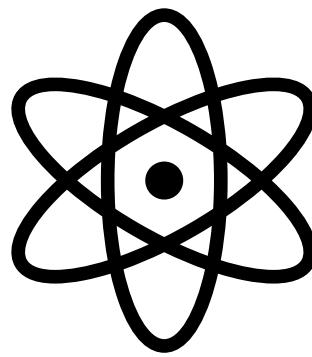
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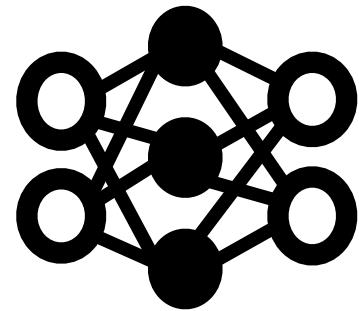
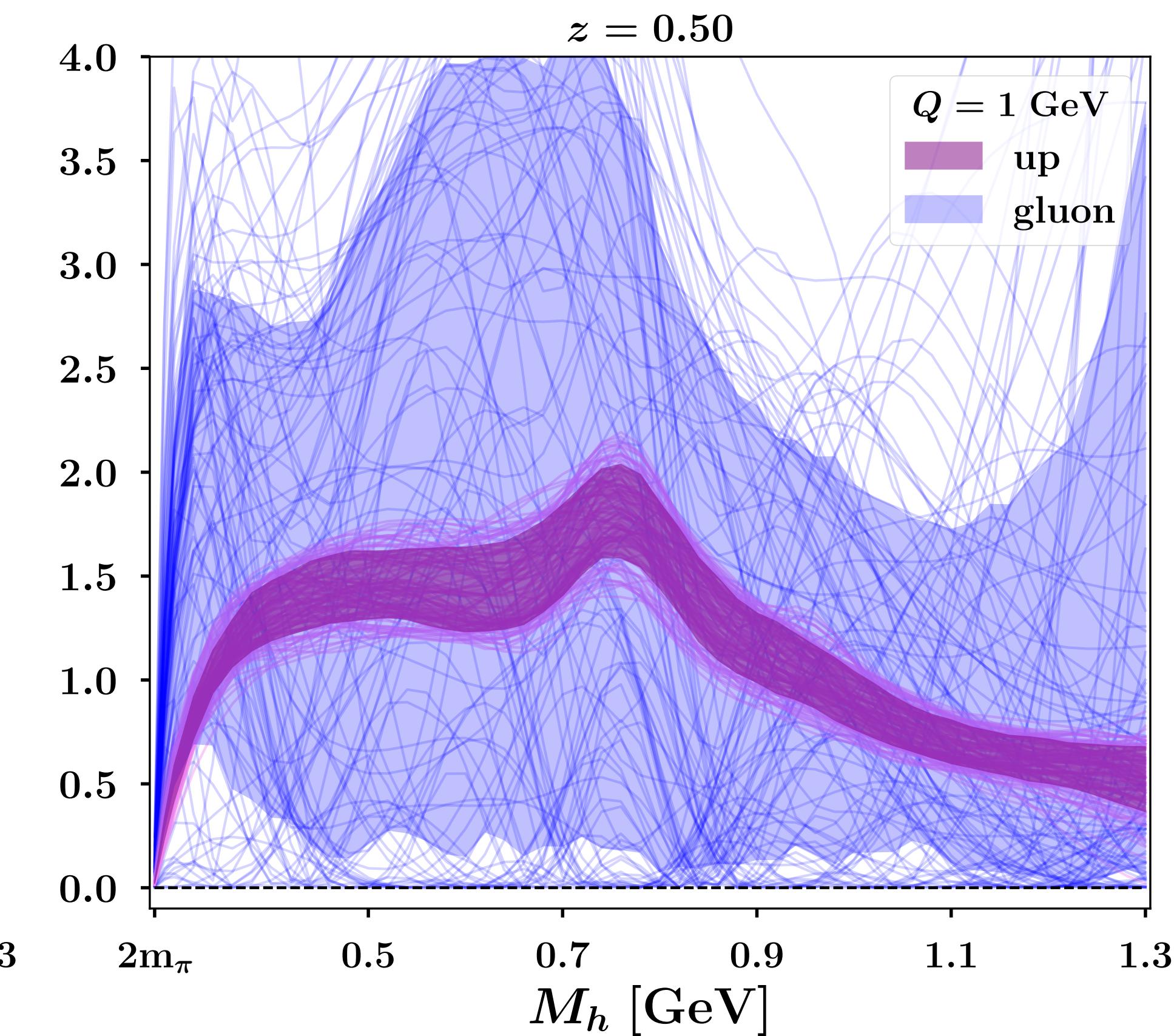
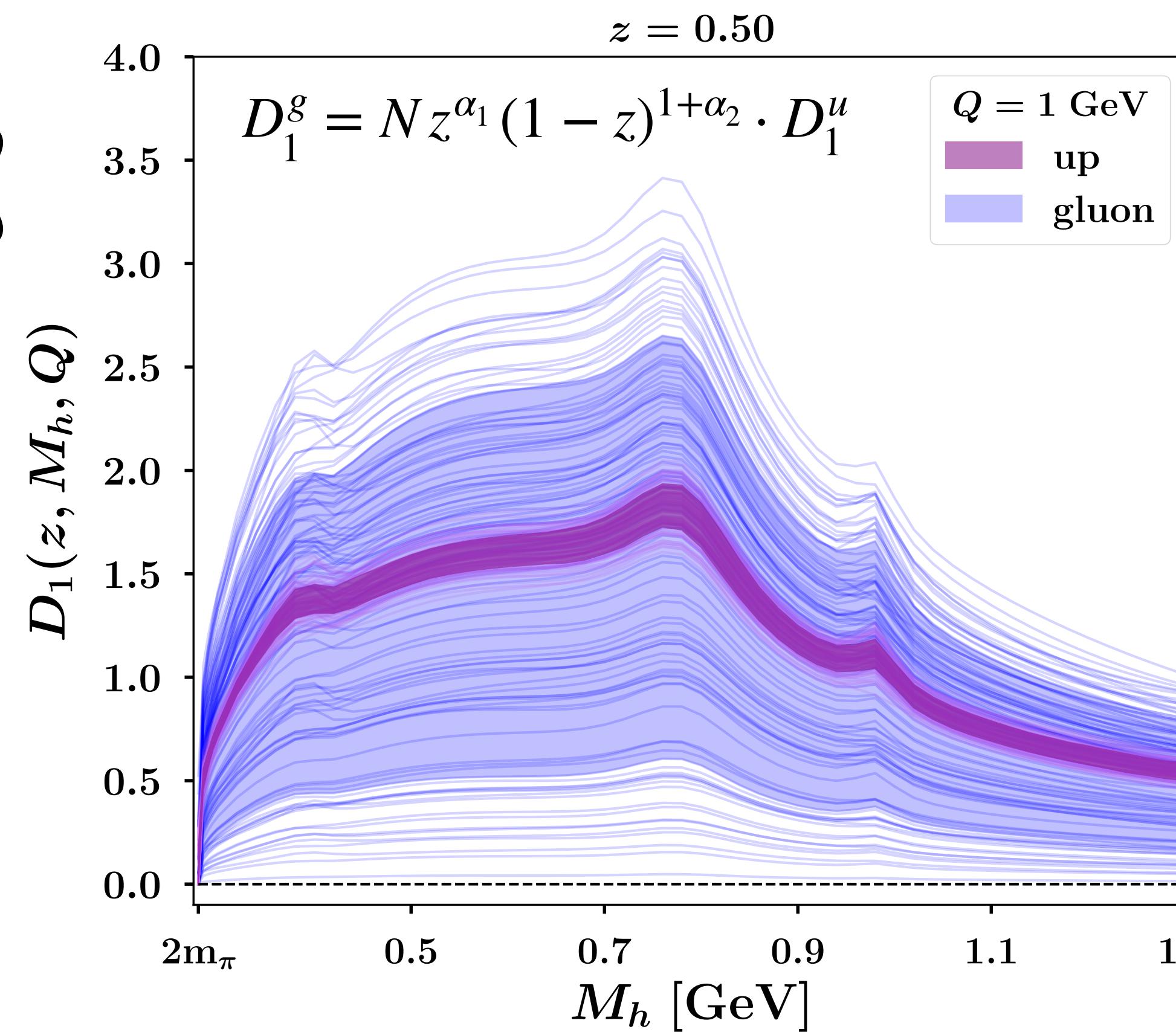
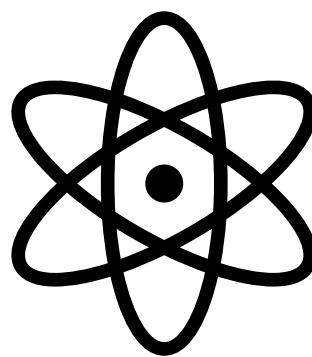
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- Gluon?



# Gluon and up bands at NNLO

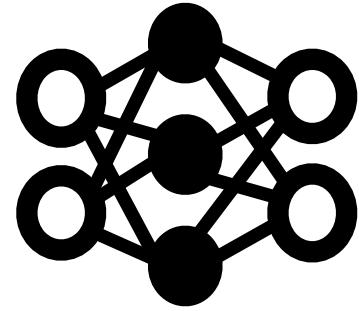
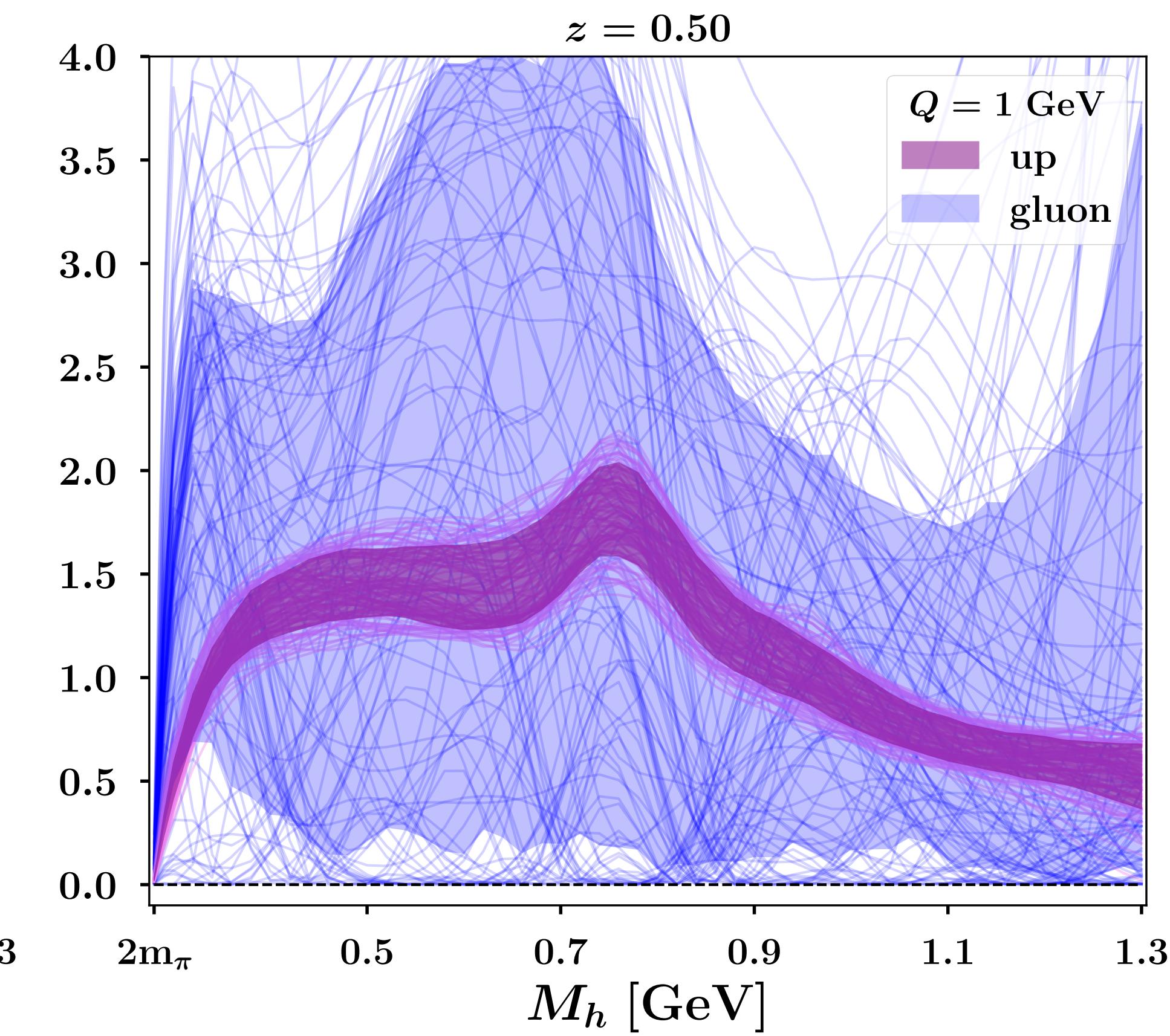
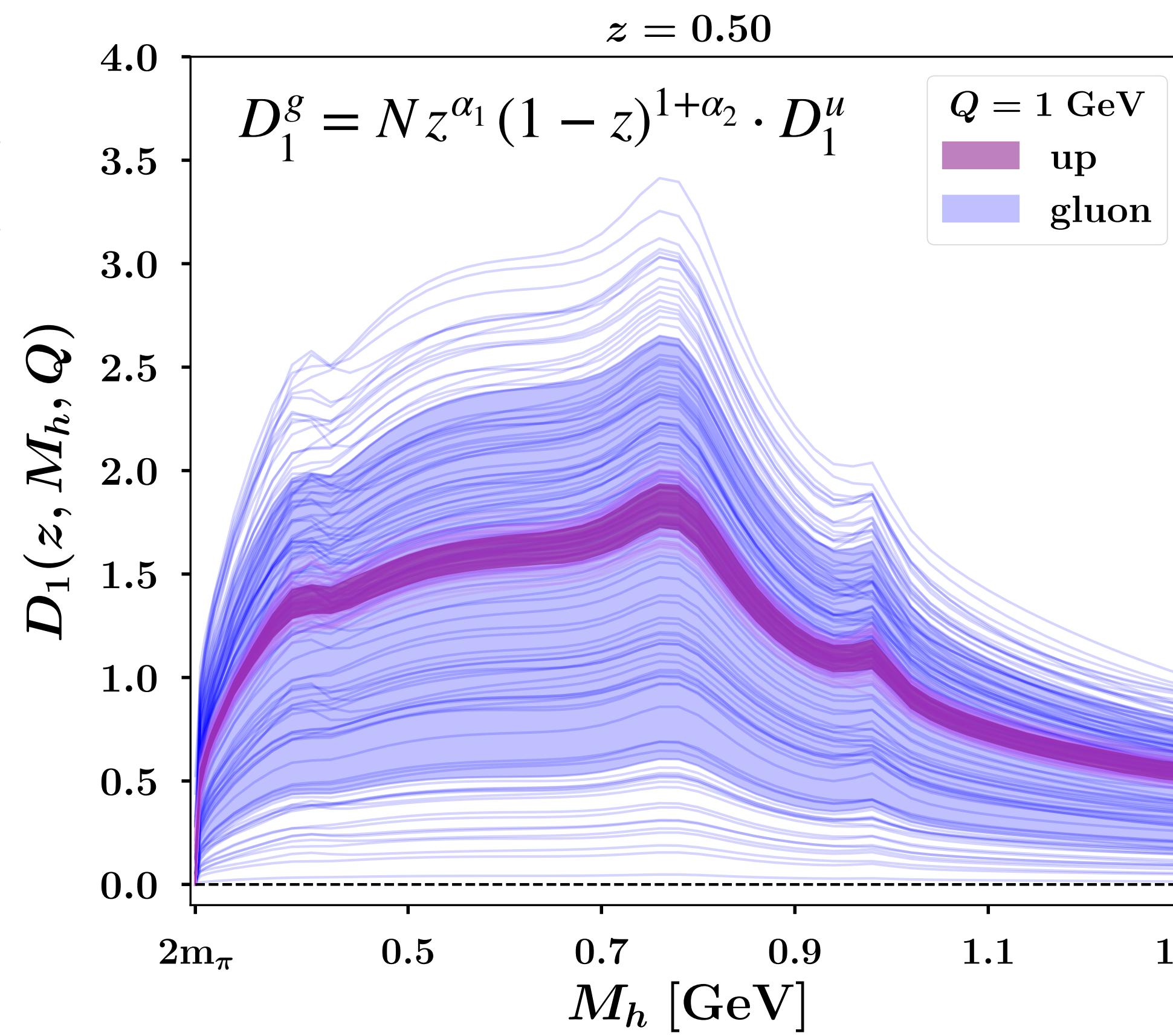
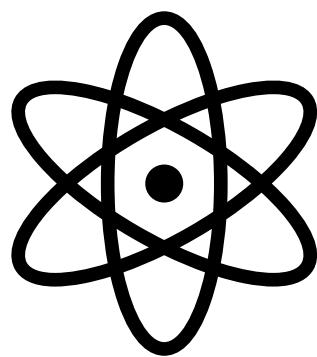


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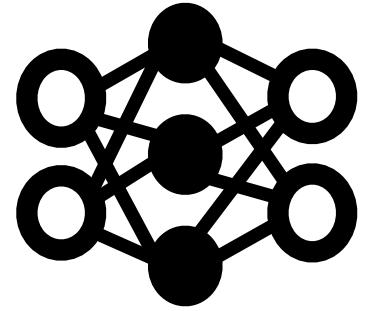
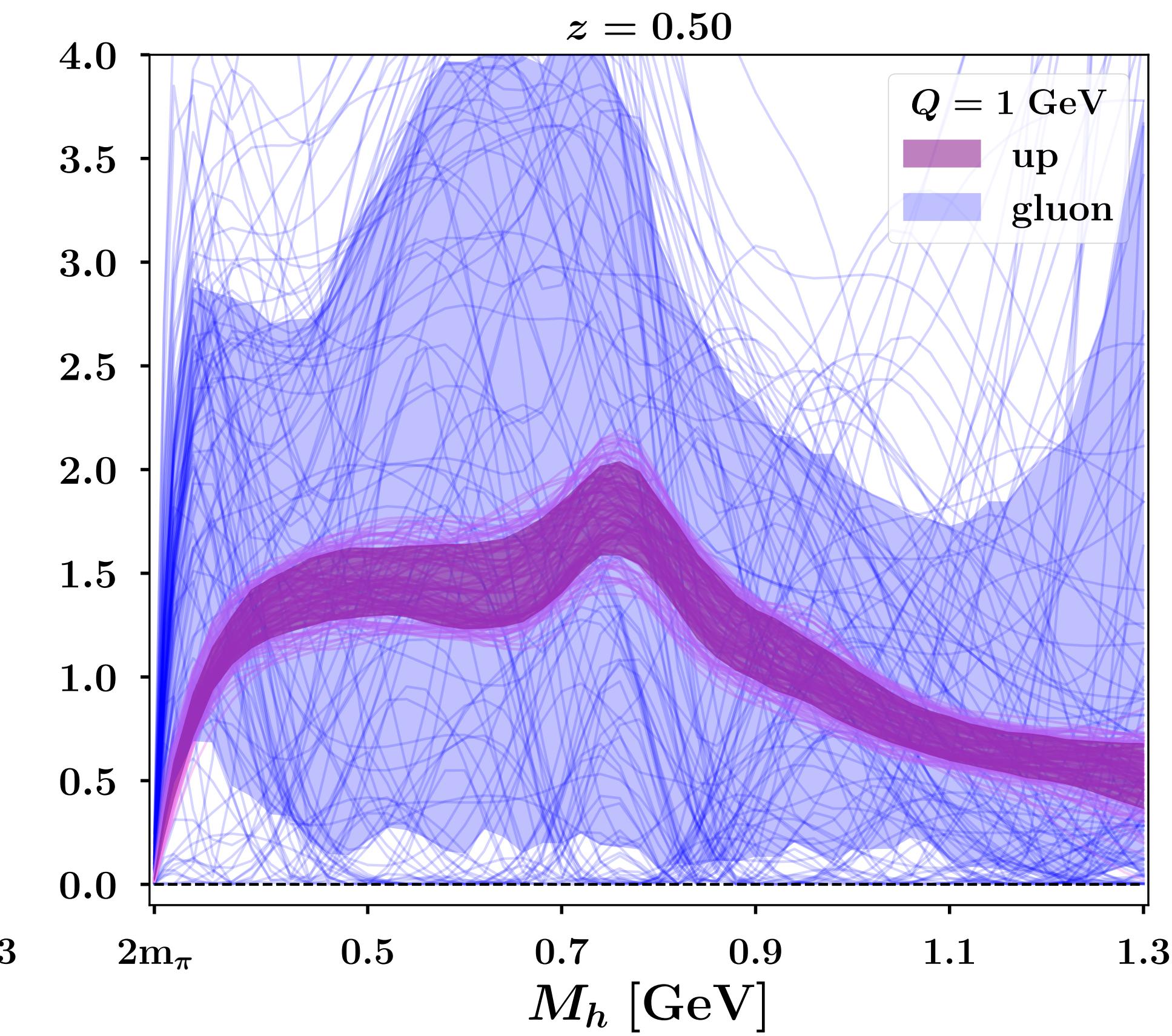
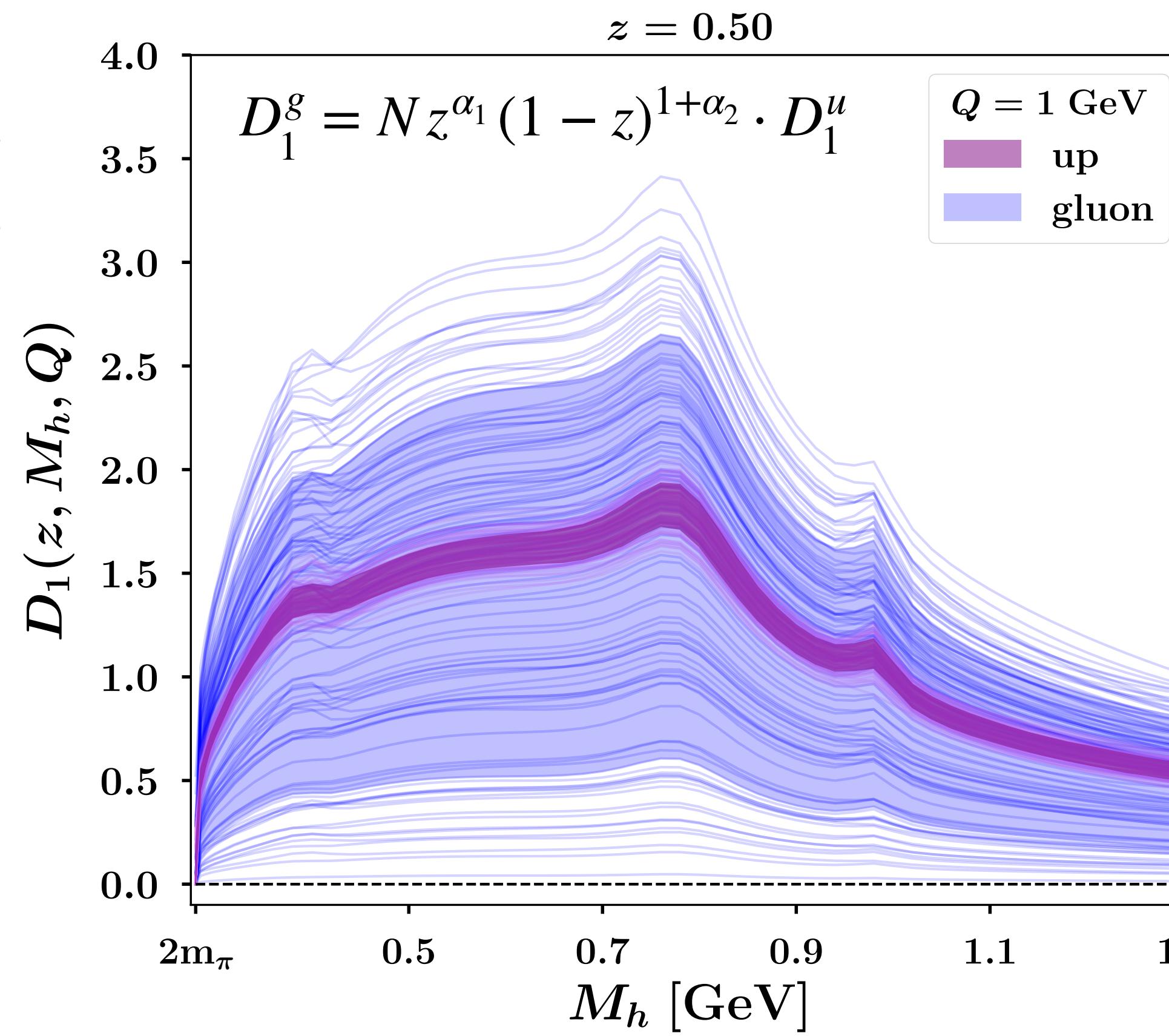
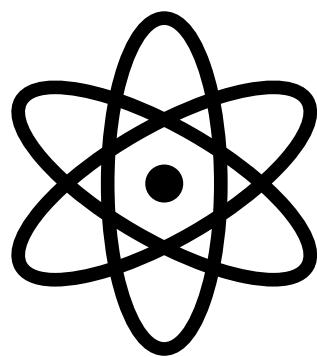
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- Physics informed description can be more realistic than the NN one

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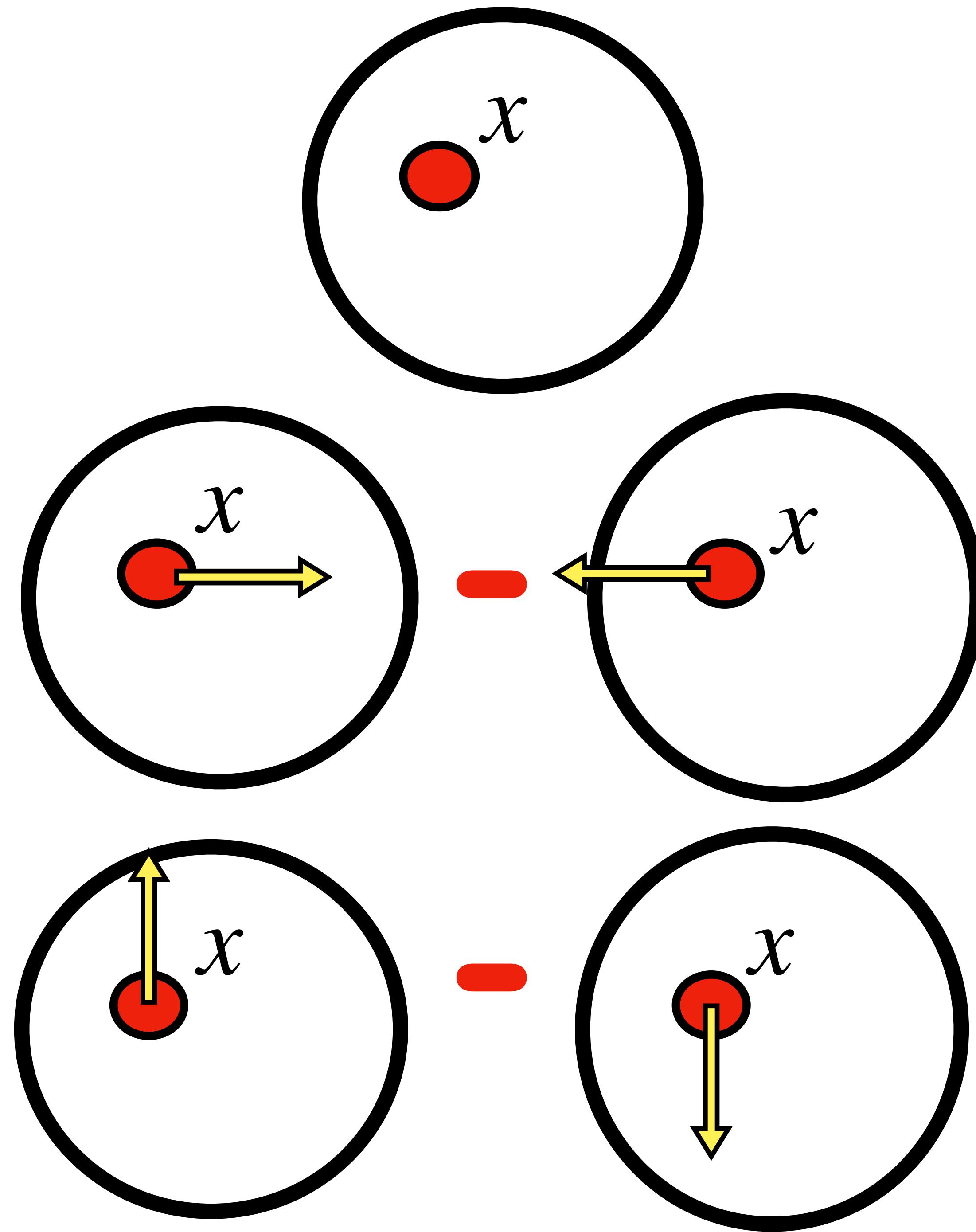
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- Use the  $D_1$  to extract  $H_1^\leftarrow$  and then  $h_1$



**PDF**

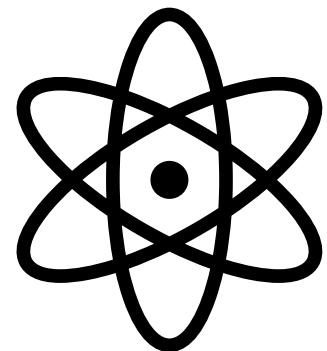


$f_1$

$g_1$

$h_1$

# PHYSICS INFORMED



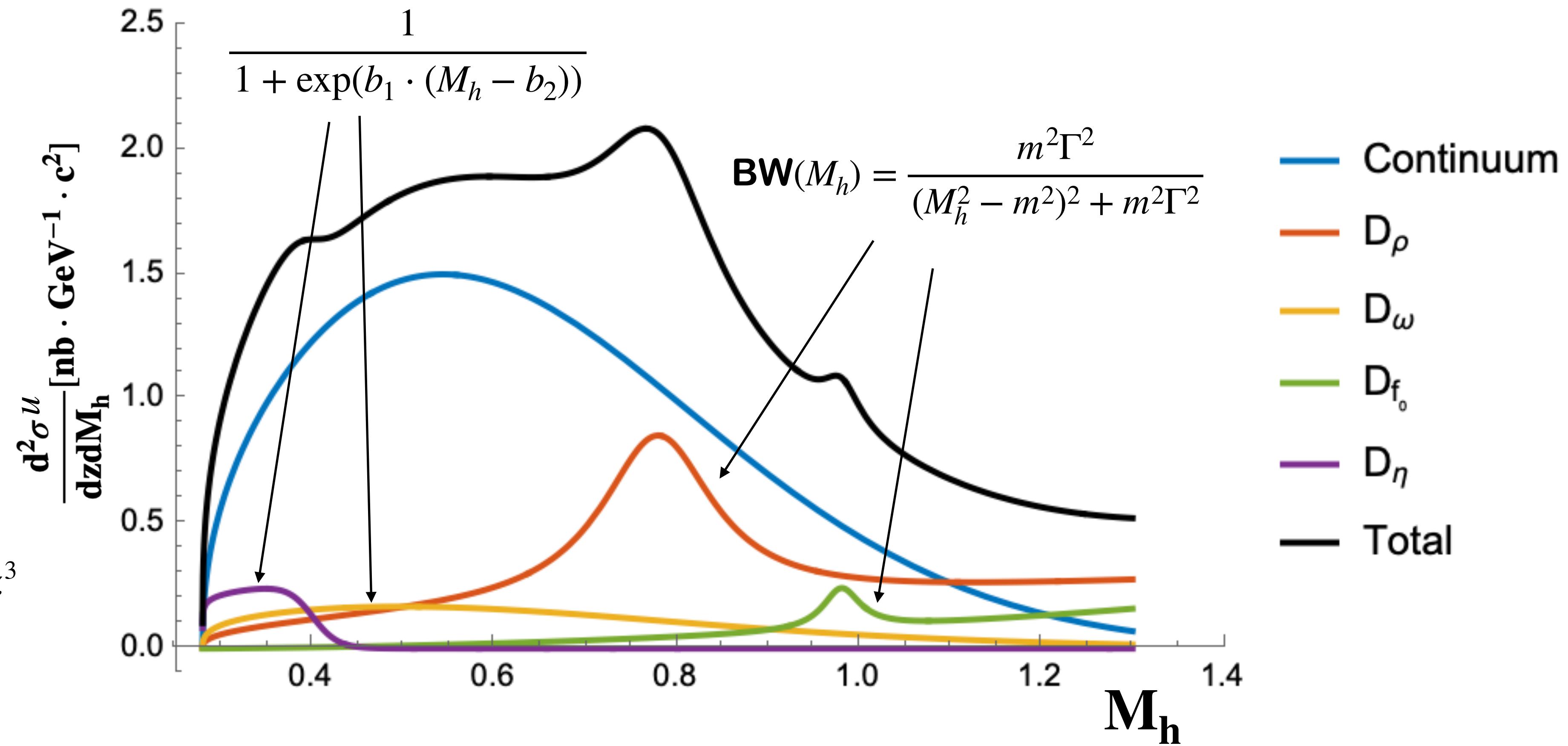
$$\mathbf{R}(M_h) = \frac{1}{2} \sqrt{M_h^2 - 4 m_\pi^2}$$

$$z^\alpha(1-z)^\beta$$

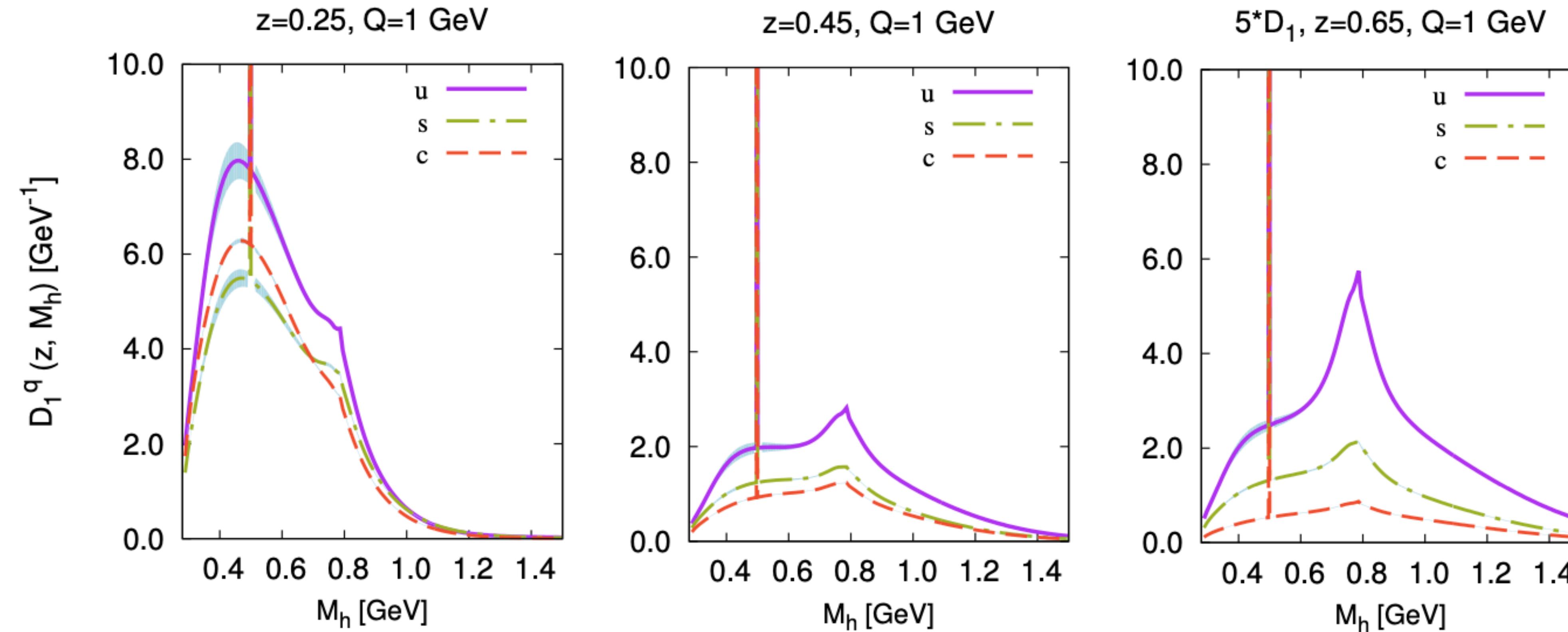
$$\mathbf{P}(a_1, a_2, a_3, a_4, a_5; z)$$

$$= \frac{a_1}{z} + a_2 + a_3 \cdot z + a_4 \cdot z^2 + a_5 \cdot z^3$$

Example for the up quark parameterisation



# 2012 extraction by Pavia group



A.Bacchetta, M.Radici, A.Bianconi, A.Courtoy, Phys. Rev. D 85, (2012) 114023

**Fit of MonteCarlo simulation**

**79 free parameters**

**LO**

2017 BELLE data of  $e^+e^- \rightarrow \pi^+\pi^-X$  at  $\sqrt{S} = 10.58$  GeV

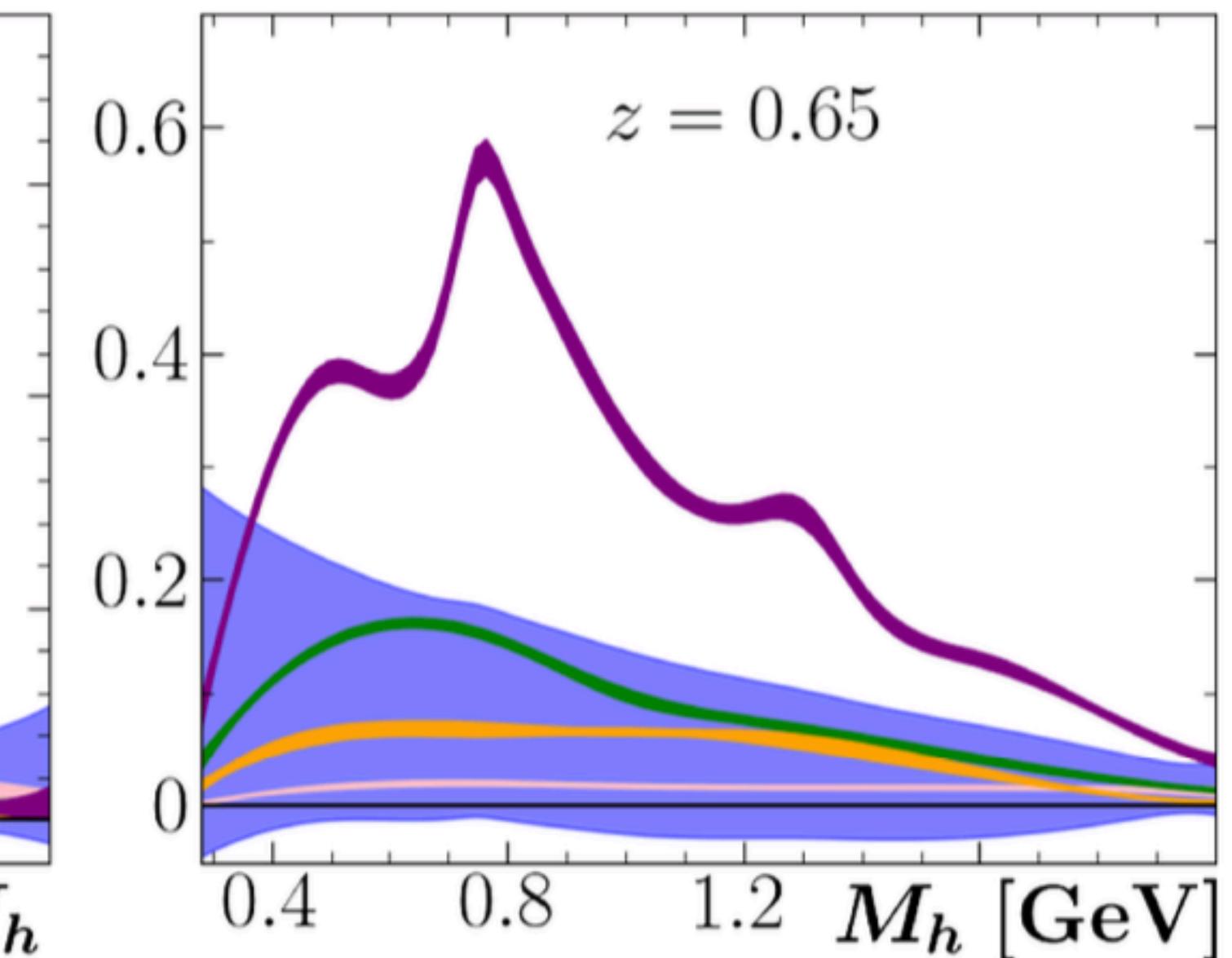
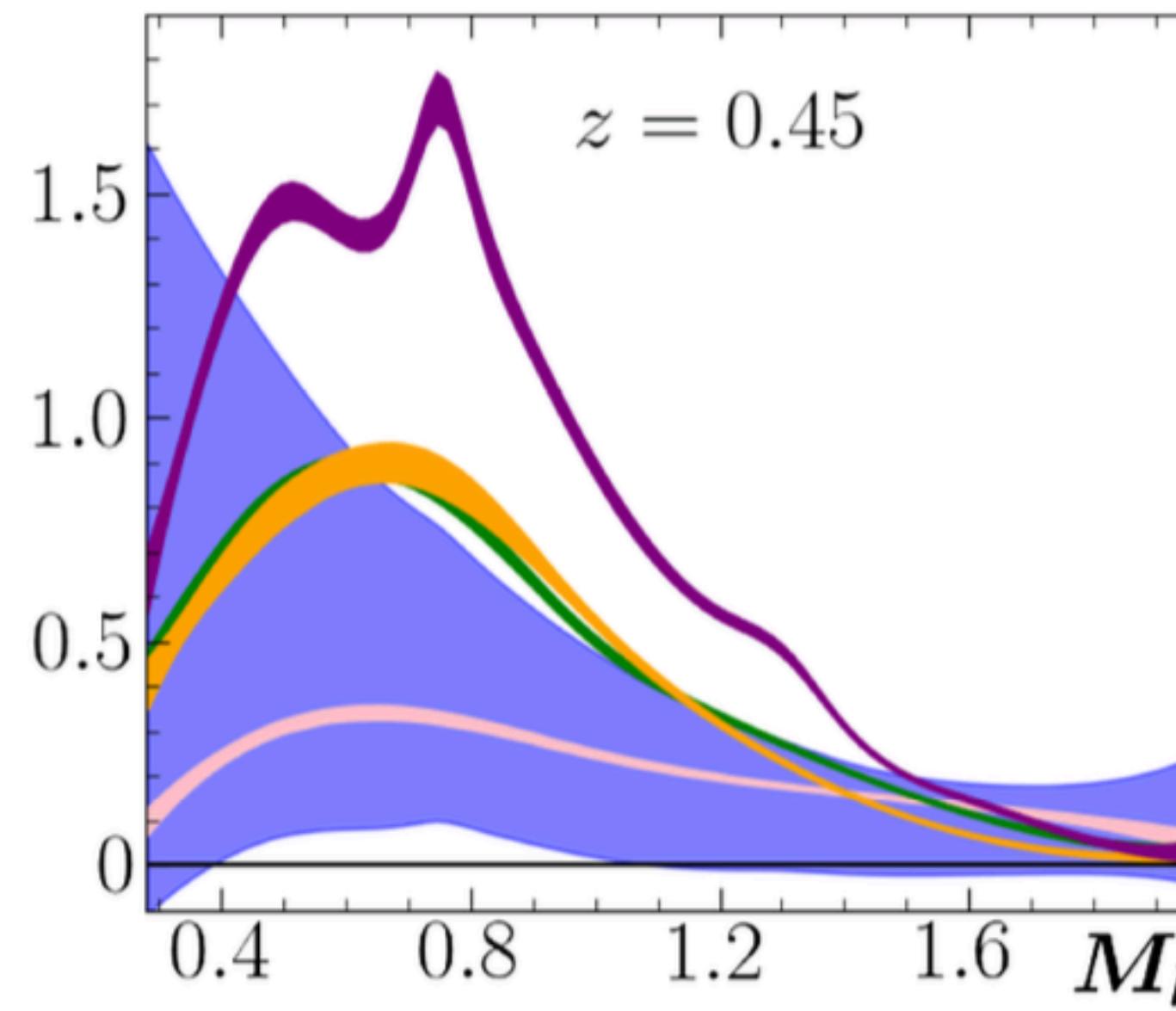
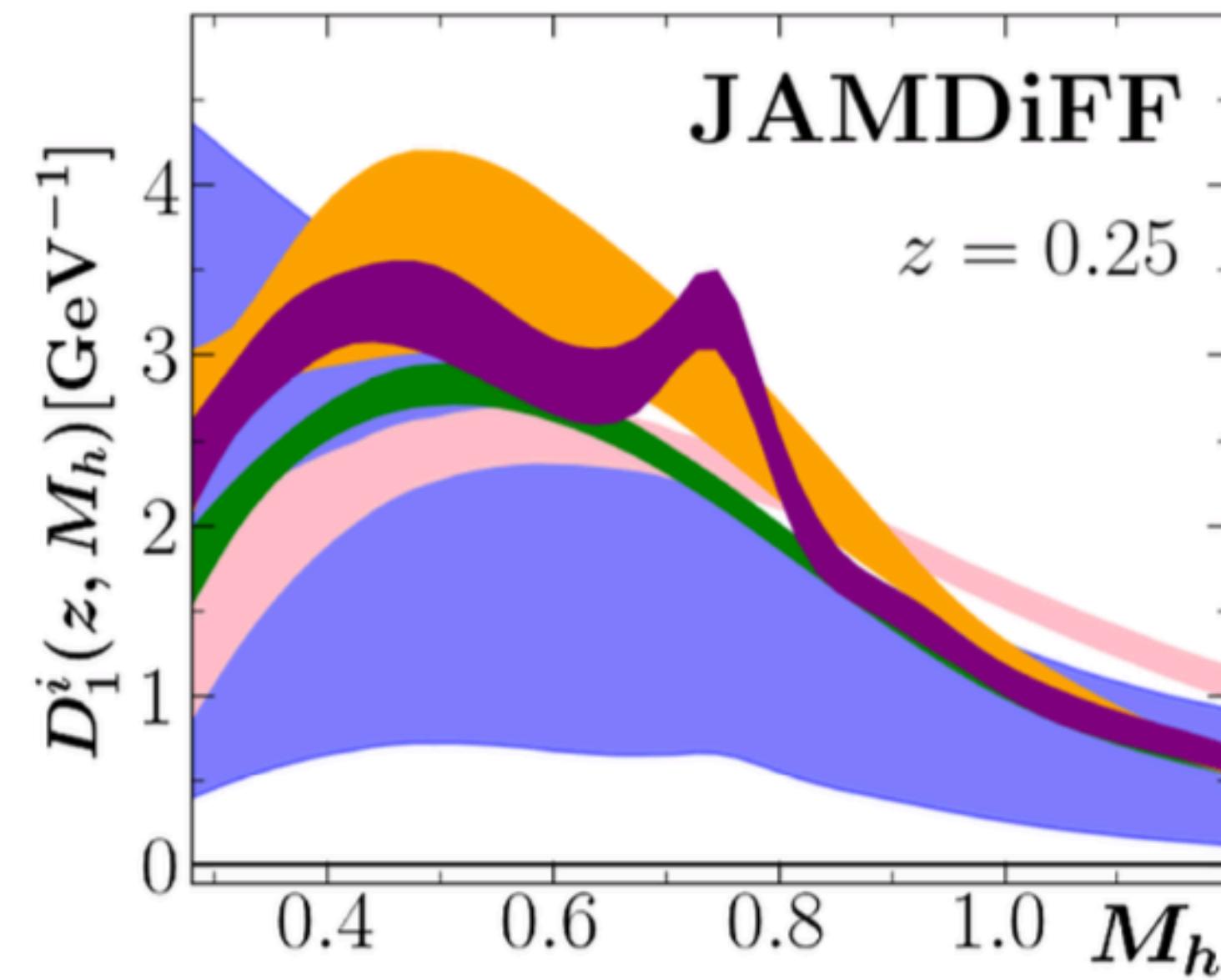
Latest extraction:

+ MonteCarlo simulation

LO

■  $u$   
■  $s$   
■  $c$   
■  $b$   
■  $g$

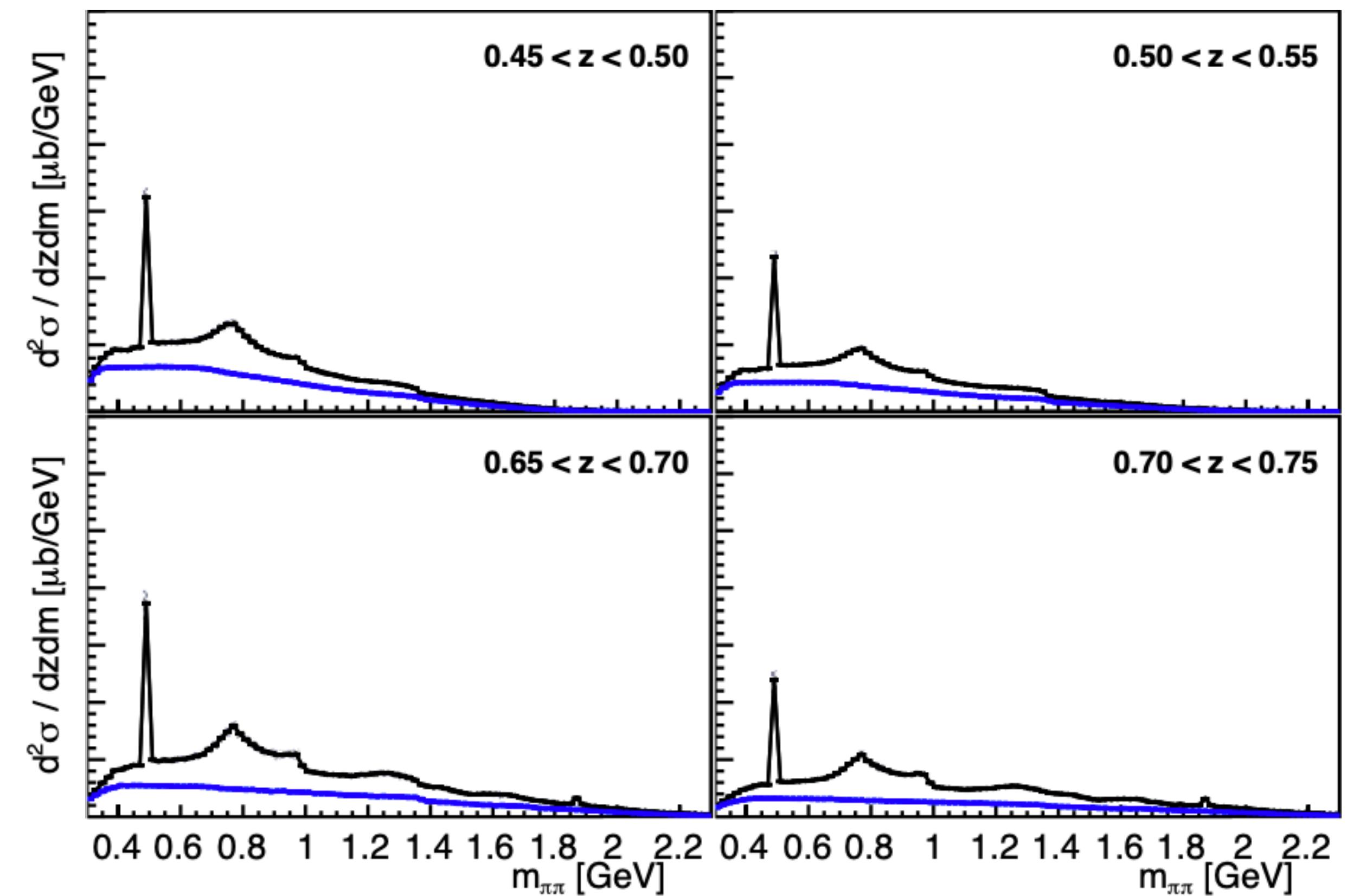
N.Sato et al, Phys. Rev. D 109, (2024) 034024



# Flavour analysis

Physical review D 96 (2017)  
R.Siedl et al

$$\frac{d\sigma}{dz dM_h dQ^2} = \frac{4\pi\alpha^2}{Q^2} \sum_q e_q^2 D_1^q(z, M_h, Q) =$$



# Flavour analysis

$$\frac{d\sigma}{dz dM_h dQ^2} = \frac{4\pi\alpha^2}{Q^2} \sum_q e_q^2 D_1^q(z, M_h, Q) = \frac{4\pi\alpha^2}{Q^2} D(z, M_h, Q)$$

Need of extra information → Monte Carlo

$$R_u^{MC} = \frac{D_{MC}^u(z, M_h, Q)}{D_{MC}(z, M_h, Q)}$$

Build 4 pseudo-dataset

$$\mathcal{F}^u(z, M_h; Q^2) = \frac{4\pi\alpha^2}{Q^2} D(z, M_h, Q) \times \frac{D_{MC}^u(z, M_h, Q)}{D_{MC}(z, M_h, Q)}$$

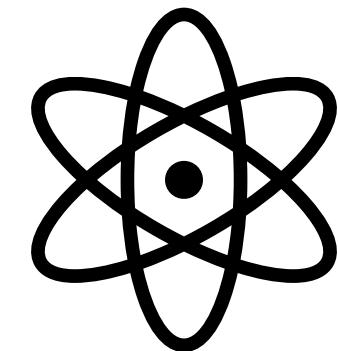
$$\mathcal{F}^q$$

$q = u, d, s, c$

# DI-HADRON FF

Physics informed

u=d



gluon assumptions

$$D_1^g(z, M_h; Q^2) = N z^{\alpha_1} (1 - z)^{1+\alpha_2} \cdot D_1^u(z, M_h; Q^2)$$

$N$  random unif. in (0,2)

$\alpha_1, \alpha_2$  random unif. in (0,1)