



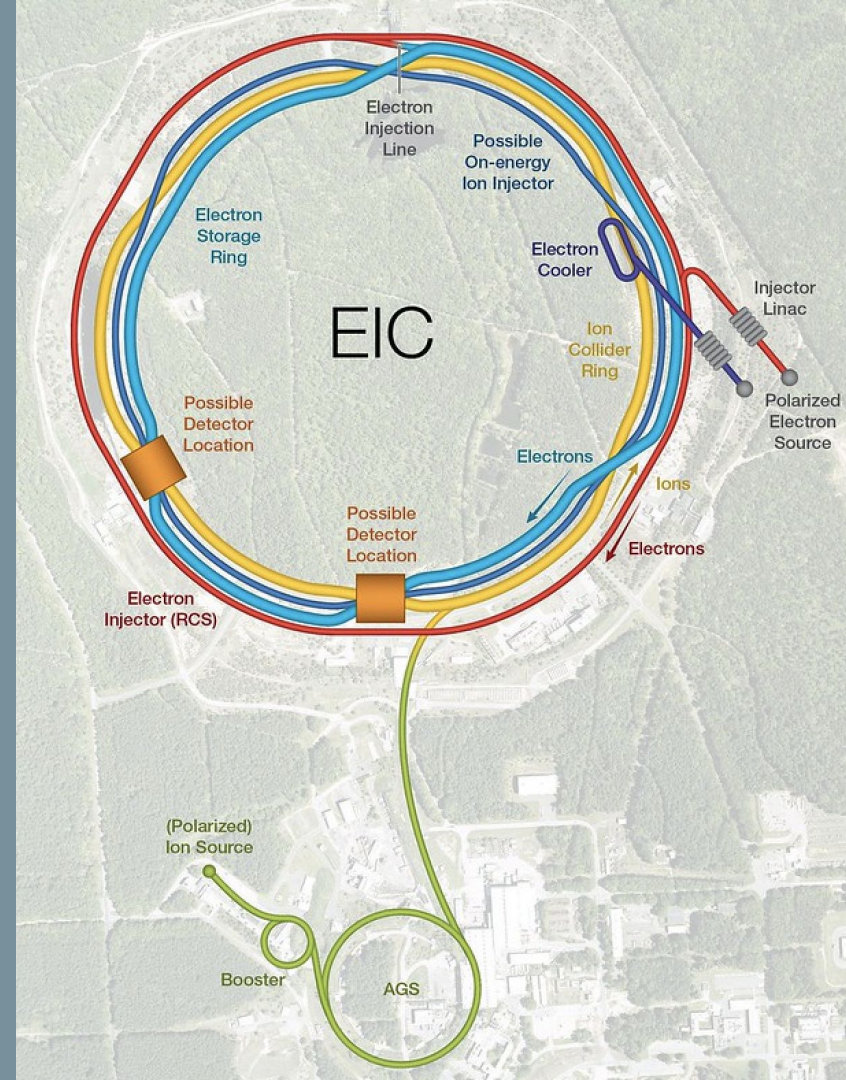
Femtосcale Imaging of Nuclei using ML and Exascale Platforms

Nobuo Sato



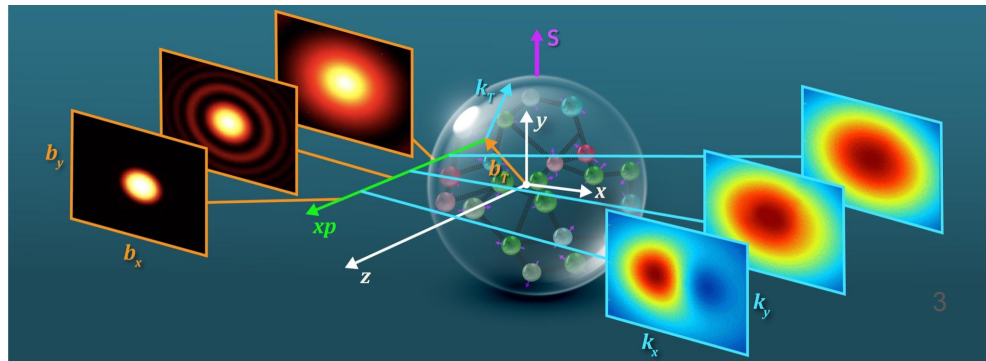
Outline

1. Motivations
2. Complexity of SIDIS
3. Integrated THY/EXP analysis
4. Summary

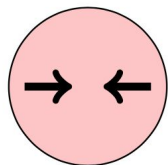


Motivations

- **WHAT?: Synthesis of 3D tomography/nuclear imaging - quantum correlation functions (QCFs)**
 - hadron structure (PDFs, TMDs, GPDs, ...)
 - hadronization (FFs, TMDFFs)
- **HOW?: Data (EXP), Factorization (THY/LQCD), Inference (CS)**
 - test of universality & theory predictive power
 - significant **computing** and data analysis
 - systematic improvements (resummation, evolution, HO calculations)
 - **synergy with lattice QCD** (Bayesian priors)
- **WHY?: Opportunities**
 - origin of proton spin
 - quark and gluon tomography
 - structure of proton sea (strangeness, antimatter asymmetry)
 - origin of nuclear EMC effect
 - small-x phenomena
 - precision EW physics (Weinberg angle)
 - ...



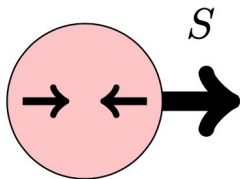
Collinear Spin structures



$$f = f_{\rightarrow} + f_{\leftarrow}$$

Parton distribution functions

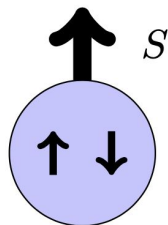
$$\langle N | \bar{\psi}_i(0, w^-, \mathbf{0}_T) \gamma^+ \psi_i(0) | N \rangle$$



$$\Delta f = f_{\rightarrow} - f_{\leftarrow}$$

Helicity distribution

$$\langle N | \bar{\psi}_i(0, w^-, \mathbf{0}_T) \gamma^+ \gamma_5 \psi_i(0) | N \rangle$$



$$\delta_T f = f_{\uparrow} - f_{\downarrow}$$

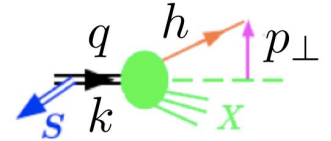
Transversity

$$\langle N | \bar{\psi}_i(0, w^-, \mathbf{0}_T) \gamma^+ \gamma_{\perp} \gamma_5 \psi_i(0) | N \rangle$$

TMD Spin structures

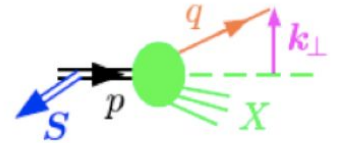
Sivers '89


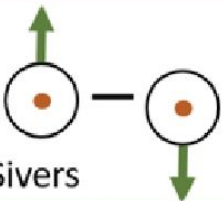
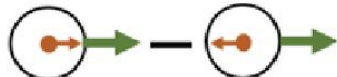
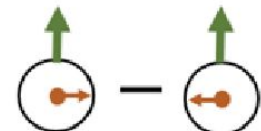



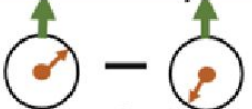
$$f_{q/h^\uparrow}(x, \vec{k}_\perp, \vec{S}) = f_{q/h}(x, k_\perp^2) - \frac{1}{M} f_{1T}^{\perp q}(x, k_\perp^2) \vec{S} \cdot (\hat{P} \times \vec{k}_\perp)$$



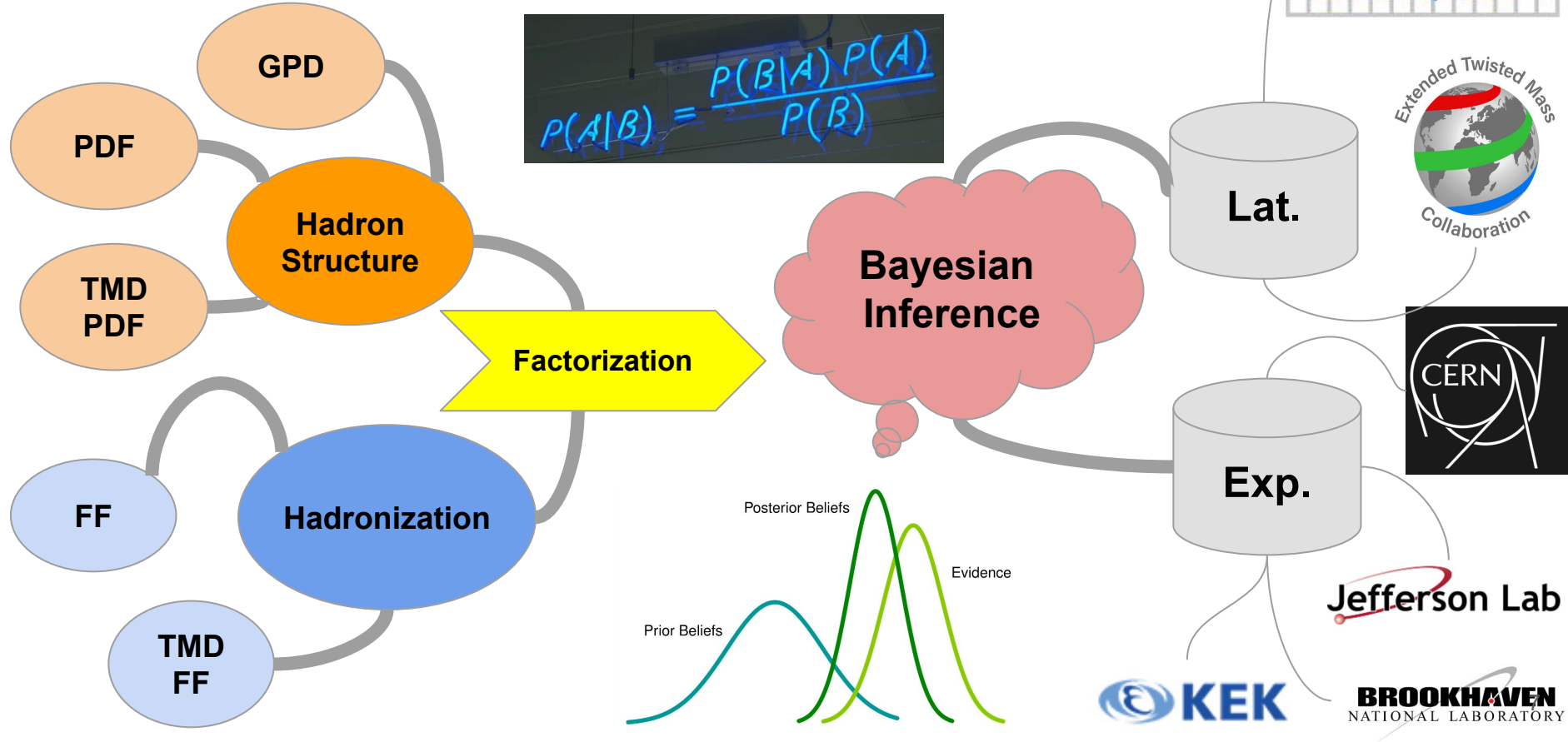
Collins '92

$$D_{q/h}(z, \vec{p}_\perp, \vec{s}_q) = D_{q/h}(z, p_\perp^2) + \frac{1}{zM_h} H_1^{\perp q}(z, p_\perp^2) \vec{s}_q \cdot (\hat{k} \times \vec{p}_\perp)$$



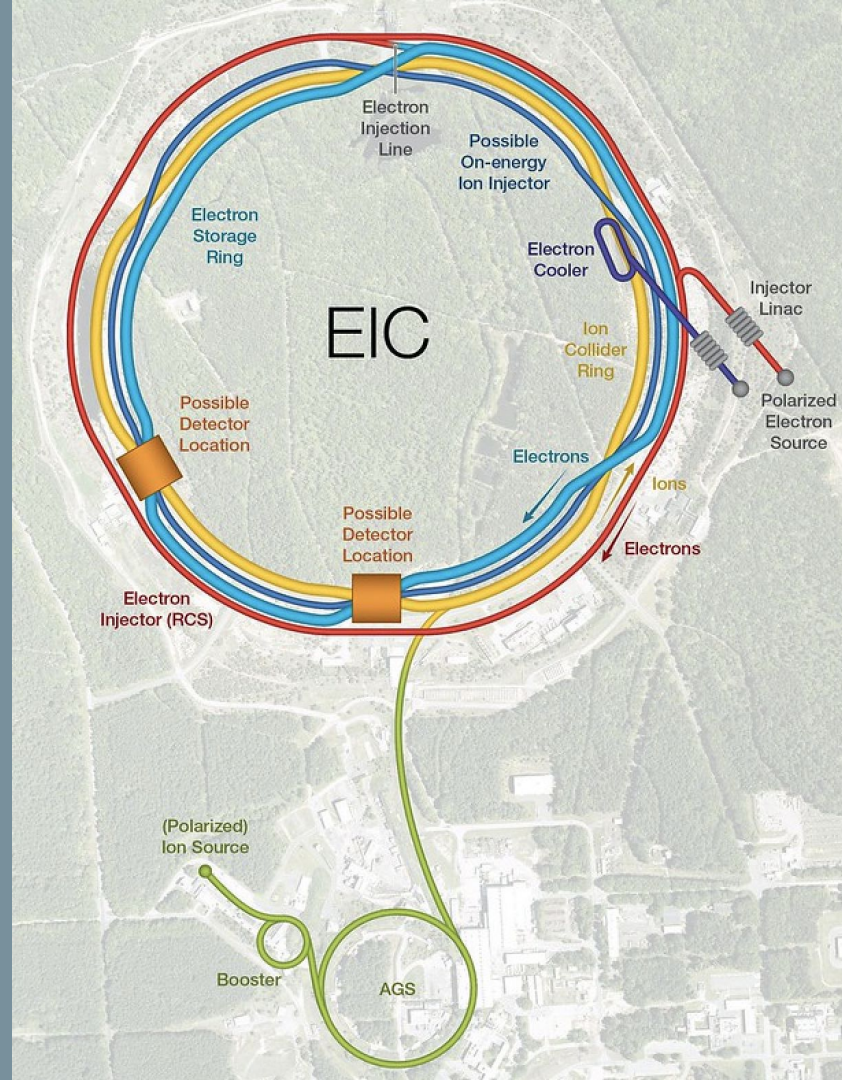
		Nucleon Polarization		
		Unpolarized	Longitudinal	Transverse
Quark Polarization	Unpolarized	f_1  Number Density		f_{1T}^\perp  Sivers
	Longitudinal		g_1  Helicity	g_{1T}^\perp  Worm-Gear T
	Transverse	h_1^\perp  Boer-Mulders	h_{1L}^\perp  Worm-Gear L	<div> h_1  Transversity </div> <div> h_{1T}^\perp  Pretzelosity </div>

A holistic approach to global analysis

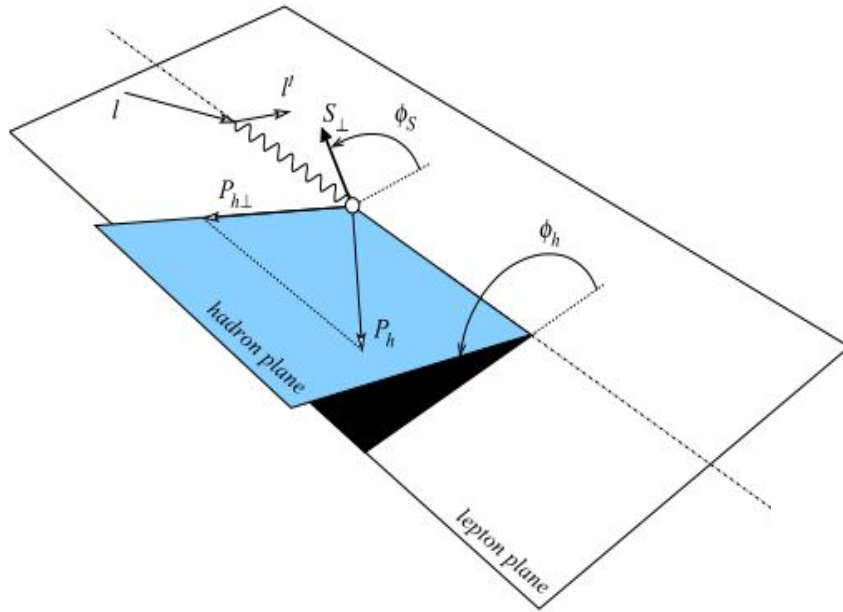


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3D hadron structure using SIDIS



A prime experiment in
existing and future
facilities



Jefferson Lab

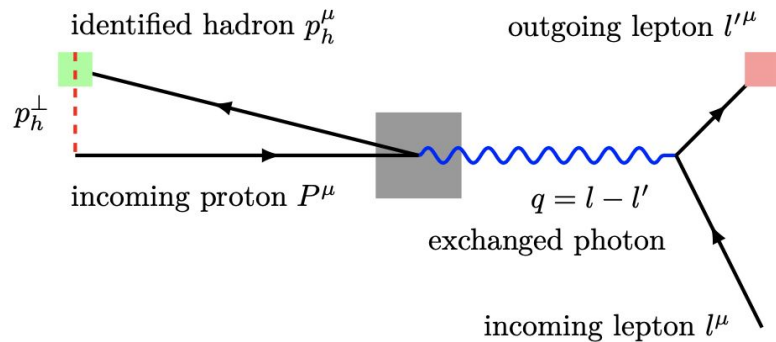
EIC²

$$\begin{aligned}
& \frac{d\sigma}{dx dy d\psi dz d\phi_h dP_{h\perp}^2} = \\
& \frac{\alpha^2}{xy Q^2} \frac{y^2}{2(1-\varepsilon)} \left(1 + \frac{\gamma^2}{2x}\right) \left\{ F_{UU,T} + \varepsilon F_{UU,L} + \sqrt{2\varepsilon(1+\varepsilon)} \cos\phi_h F_{UU}^{\cos\phi_h} \right. \\
& + \varepsilon \cos(2\phi_h) F_{UU}^{\cos 2\phi_h} + \lambda_e \sqrt{2\varepsilon(1-\varepsilon)} \sin\phi_h F_{LU}^{\sin\phi_h} \\
& + S_{\parallel} \left[\sqrt{2\varepsilon(1+\varepsilon)} \sin\phi_h F_{UL}^{\sin\phi_h} + \varepsilon \sin(2\phi_h) F_{UL}^{\sin 2\phi_h} \right] \\
& + S_{\parallel} \lambda_e \left[\sqrt{1-\varepsilon^2} F_{LL} + \sqrt{2\varepsilon(1-\varepsilon)} \cos\phi_h F_{LL}^{\cos\phi_h} \right] \\
& + |S_{\perp}| \left[\sin(\phi_h - \phi_S) \left(F_{UT,T}^{\sin(\phi_h - \phi_S)} + \varepsilon F_{UT,L}^{\sin(\phi_h - \phi_S)} \right) \right. \\
& + \varepsilon \sin(\phi_h + \phi_S) F_{UT}^{\sin(\phi_h + \phi_S)} + \varepsilon \sin(3\phi_h - \phi_S) F_{UT}^{\sin(3\phi_h - \phi_S)} \\
& + \sqrt{2\varepsilon(1+\varepsilon)} \sin\phi_S F_{UT}^{\sin\phi_S} + \left. \sqrt{2\varepsilon(1+\varepsilon)} \sin(2\phi_h - \phi_S) F_{UT}^{\sin(2\phi_h - \phi_S)} \right] \\
& + |S_{\perp}| \lambda_e \left[\sqrt{1-\varepsilon^2} \cos(\phi_h - \phi_S) F_{LT}^{\cos(\phi_h - \phi_S)} + \sqrt{2\varepsilon(1-\varepsilon)} \cos\phi_S F_{LT}^{\cos\phi_S} \right. \\
& + \left. \left. \sqrt{2\varepsilon(1-\varepsilon)} \cos(2\phi_h - \phi_S) F_{LT}^{\cos(2\phi_h - \phi_S)} \right] \right\},
\end{aligned}$$

Physics goals

Name	Symbol	meaning
upol. PDF	f_1^q	U. pol. quarks in U. pol. nucleon
pol. PDF	g_1^q	L. pol. quarks in L. pol. nucleon
Transversity	h_1^q	T. pol. quarks in T. pol. nucleon
Sivers	$f_{1T}^{\perp(1)q}$	U. pol. quarks in T. pol. nucleon
Boer-Mulders	$h_1^{\perp(1)q}$	T. pol. quarks in U. pol. nucleon
Boer-Mulders	$h_1^{\perp(1)q}$	T. pol. quarks in U. pol. nucleon
⋮	⋮	⋮
FF	D_1^q	U. pol. quarks to U. pol. hadron
Collins	$H_1^{\perp(1)q}$	T. pol. quarks to U. pol. hadron
⋮	⋮	⋮

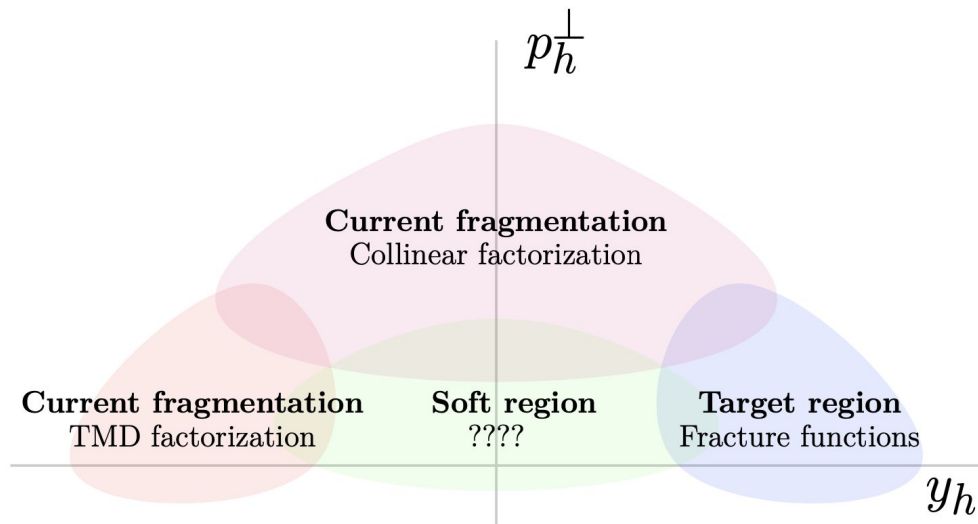
Breit frame



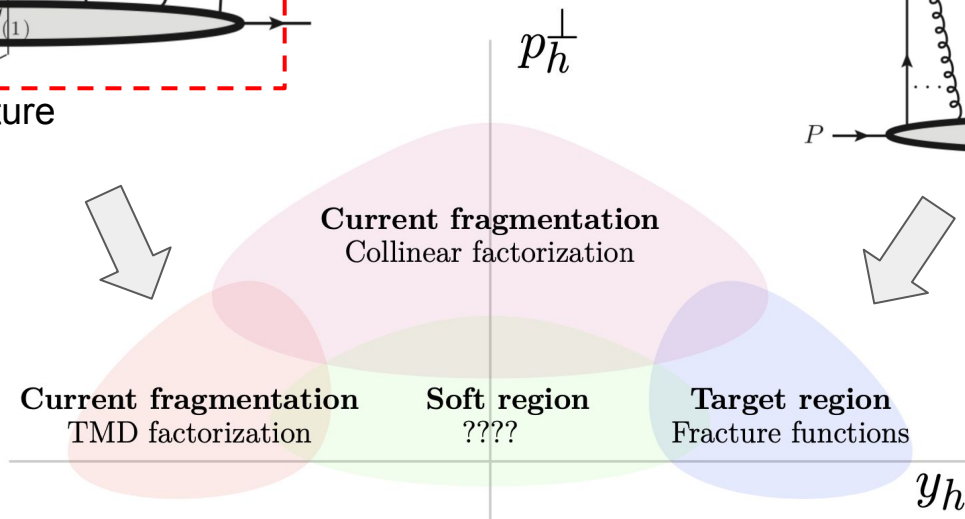
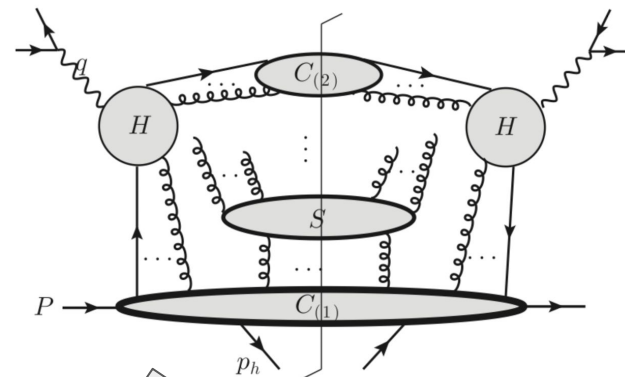
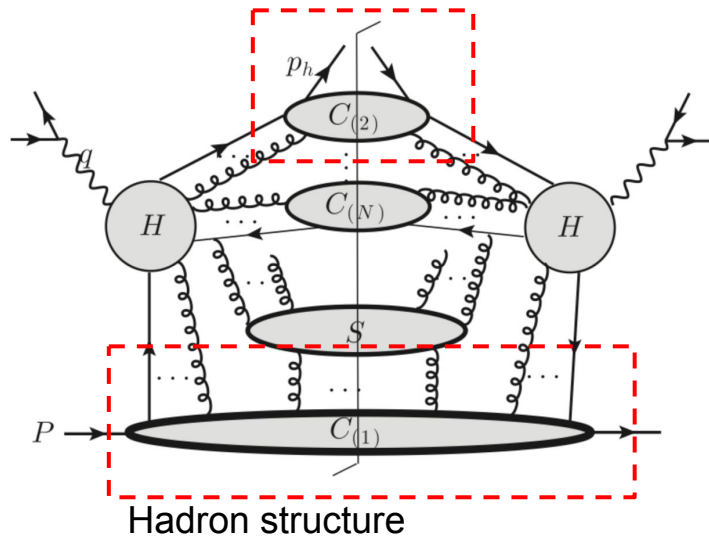
Large vs small p_T

$$q_T = p_h^\perp / z$$

$q_T/Q \Rightarrow$ The scale separation



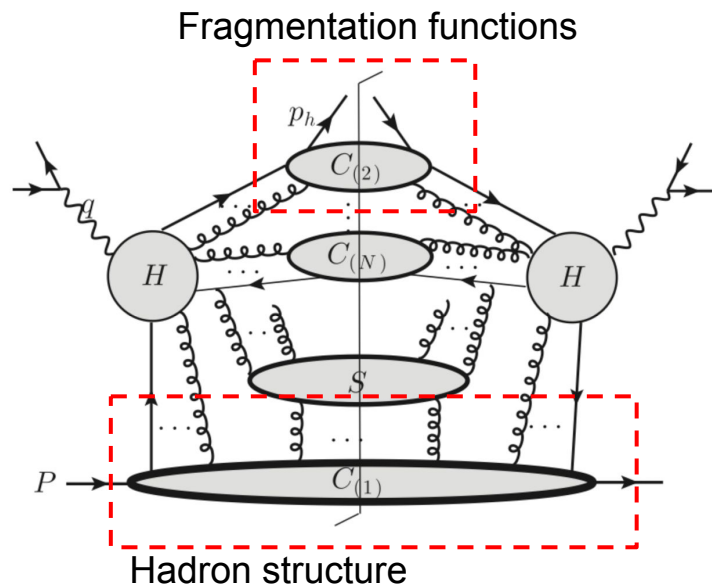
Fragmentation functions



Foundations of
Perturbative QCD

JOHN COLLINS

CAMBRIDGE MONOGRAPHS
ON PARTICLE PHYSICS, NUCLEAR PHYSICS
AND COSMOLOGY

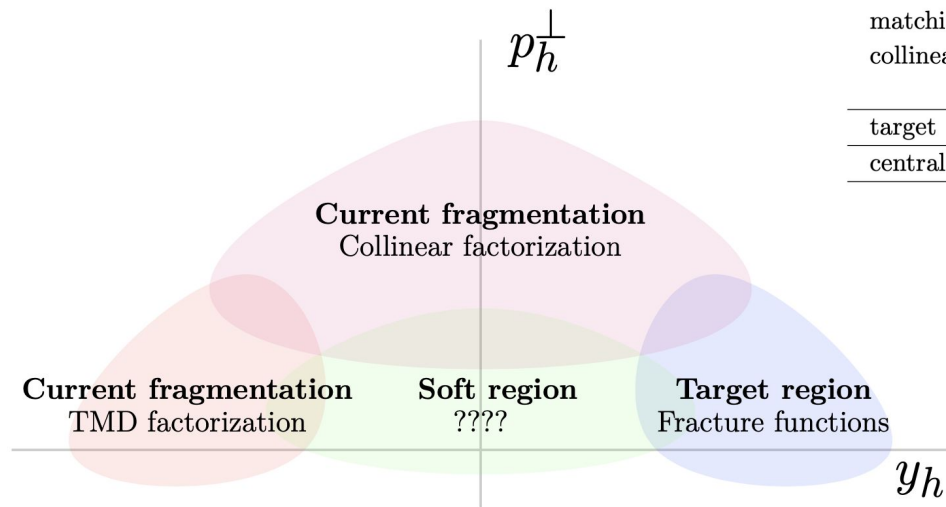


$$\begin{aligned}
 W = & \sum_f H_f(Q, \mu) \int \frac{d^2 \mathbf{b}_T}{(2\pi)^2} e^{-i \mathbf{q}_T \cdot \mathbf{b}_T} \\
 & \times e^{-g_{f/N}(x, b_T, b_{\max})} \int_x^1 \frac{d\hat{x}}{\hat{x}} \mathbf{f}_{f/N}(\hat{x}, \mu_{b_*}) \tilde{C}_{f/p}(x/\hat{x}, b_*, \mu_{b_*}^2, \alpha_S(\mu_{b_*})) \\
 & \times e^{-g_{h/f}(z, b_T, b_{\max})} \int_z^1 \frac{d\hat{z}}{\hat{z}^3} \mathbf{d}_{h/f}(\hat{z}, \mu_{b_*}) \tilde{C}_{h/f}(z/\hat{z}, b_*, \mu_{b_*}^2, \alpha_S(\mu_{b_*})) \\
 & \times \left(\frac{Q^2}{Q_0^2} \right)^{-g_K(b_T, b_{\max})} \left(\frac{Q^2}{\mu_{b_*}^2} \right)^{\tilde{K}(b_*, \mu_{b_*})} \\
 & \times \exp \left[\int_{\mu_{b_*}}^{\mu_Q} \frac{d\mu'}{\mu'} \left[2\gamma(\alpha_S(\mu'), 1) - \ln \frac{Q^2}{(\mu')^2} \gamma_K(\alpha_S(\mu')) \right] \right]
 \end{aligned}$$

Aybat, Rogers '11

Linking external kinematics with regions

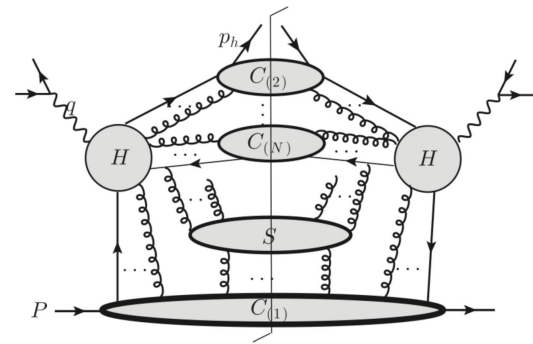
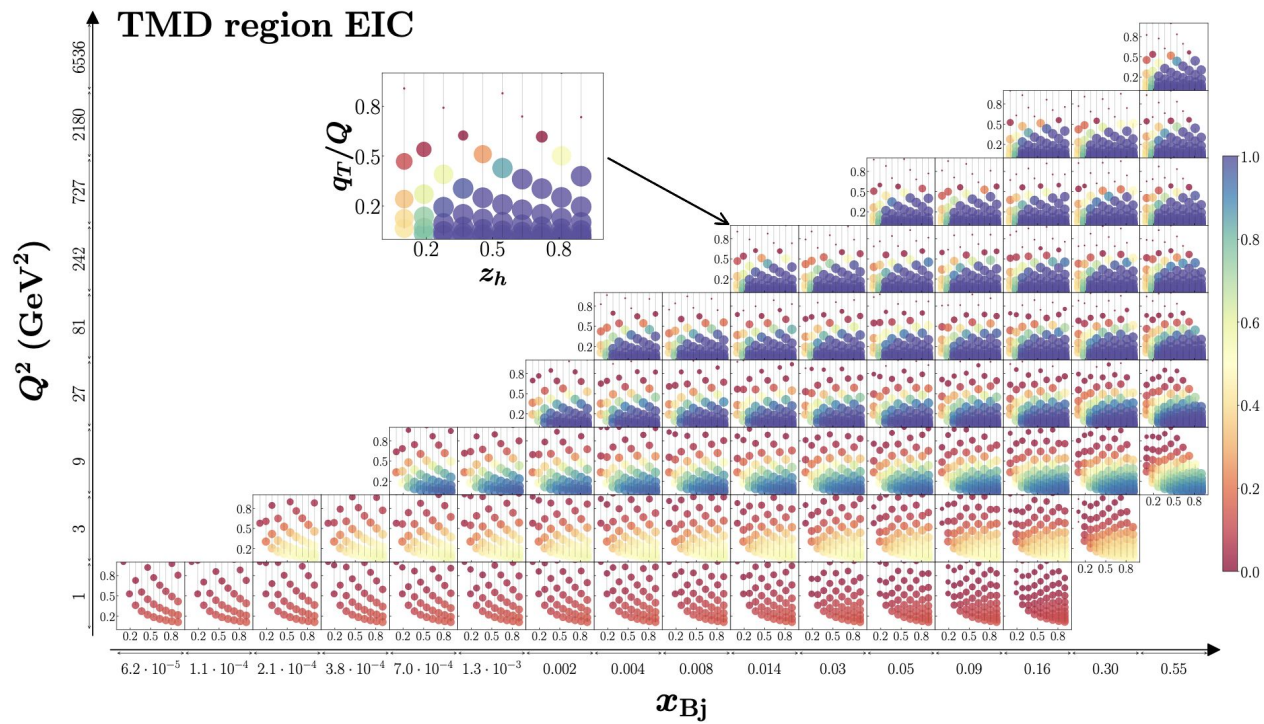
Boglione et al '22



Region	R_0	R_1	R'_1	R_2	R_3	R_4
TMD	small	small	\times	small	\times	\times
matching	small	small	\times	small	\times	\times
collinear	small	small	\times	large	small (LO pQCD) large (HO pQCD)	small
target	small	large	small	\times	\times	\times
central	small	not small	not small	small	\times	\times

Ratio		Definition
R_0	general hardness	$\max\left(\left \frac{k_i^2}{Q^2}\right , \left \frac{k_f^2}{Q^2}\right , \left \frac{\delta k_T^2}{Q^2}\right \right)$
R_1	collinearity	$\frac{P_h \cdot k_f}{P_h \cdot k_i}$
R'_1	target proximity	$\frac{P_h \cdot P}{Q^2}$
R_2	transverse hardness	$\frac{ k^2 }{Q^2}$
R_3	spectator virtuality	$\frac{ k_X^2 }{Q^2}$
R_4	large transverse momentum	$\max\left(\left \frac{k_i^2}{k^2}\right , \left \frac{k_f^2}{k^2}\right , \left \frac{\delta k_T^2}{k^2}\right , \left \frac{k_{iT}^2}{k^2}\right \right)$

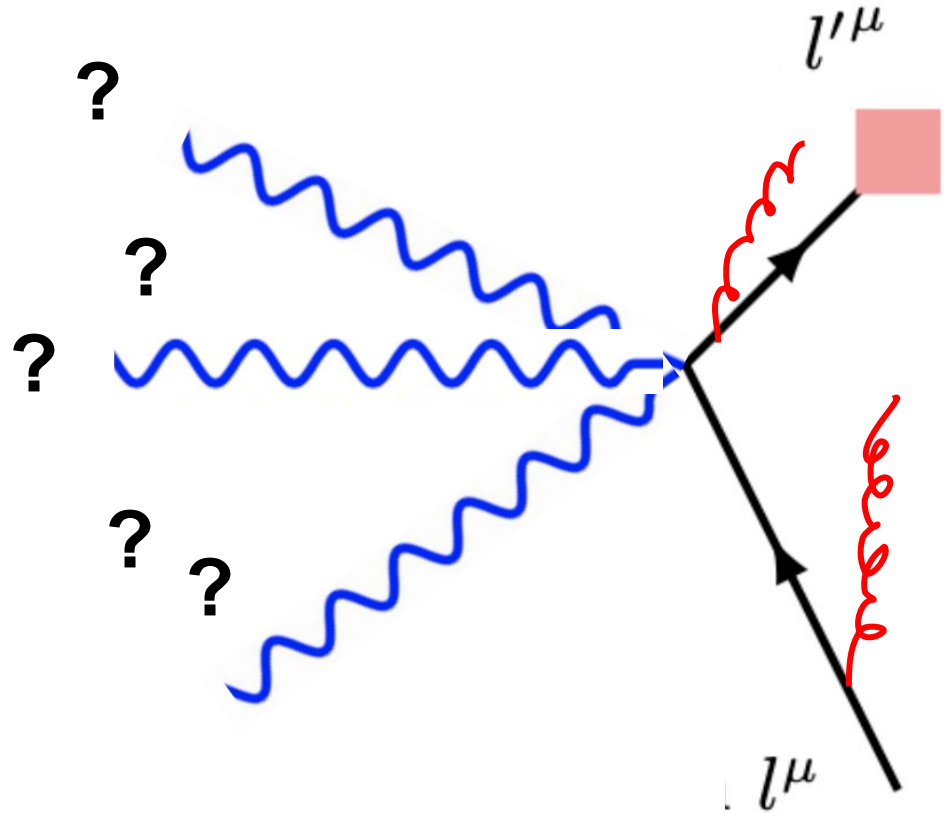
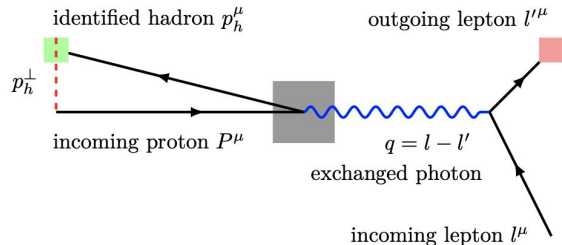
$$\begin{aligned}
 \mathcal{A}(x_{\text{Bj}}, Q^2, z_h, P_{hT} | \text{region}) &= \int d\{R_i\} \Theta(\{R_i\} | \text{region}) \\
 &\times \int d^4 k_i d^4 k_f d^4 \delta k_T \mathcal{P}(\{R_i\} | x_{\text{Bj}}, Q^2, z_h, P_{hT}; k_i, k_f, \delta k_T) \pi(k_i, k_f, \delta k_T).
 \end{aligned}$$



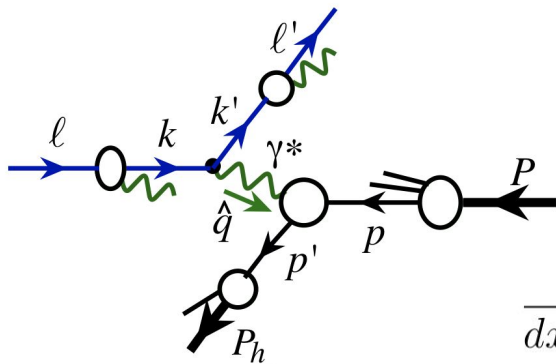
Role of QED effects

- In the presence of QED radiation, **the q direction is not fixed**
- The experimental Breit Frame **does not need to coincide with the actual Breit-frame** needed in QCD factorization

Breit frame



Hybrid QED+QCD factorization approach



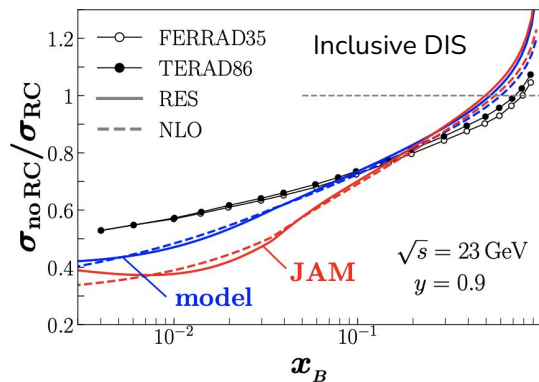
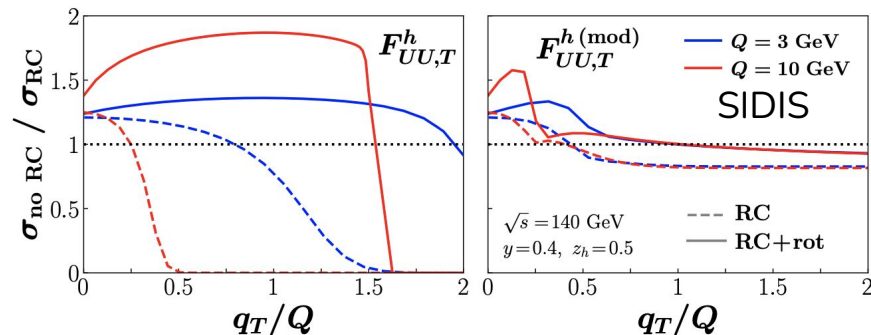
Liu, Melnitchouk, Qiu, Sato '21

$$\frac{d\sigma}{dx dy d\psi dz d\phi_h dP_{h\perp}^2} = \frac{\alpha^2}{xy Q^2} \frac{y}{2(1-\varepsilon)} \left(1 + \frac{\gamma^2}{2x}\right) \sum_i w_i F_i(x, Q^2, z, \mathbf{P}_{h\perp})$$

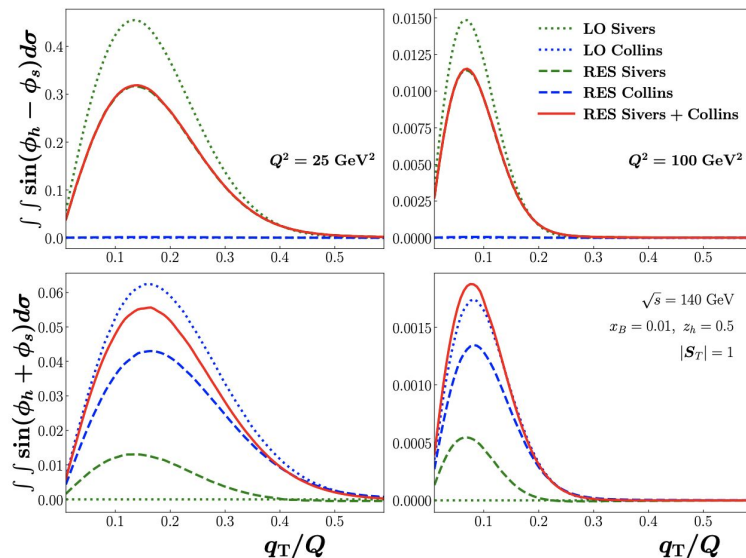


$$\begin{aligned} \frac{d\sigma}{dx dy d\psi dz d\phi_h dP_{h\perp}^2} &= \int_{\zeta_{\min}}^1 d\zeta \int_{\xi_{\min}(\zeta)}^1 d\xi f_{k/l}(\xi) d_{k'/l'}(\zeta) \\ &\times \frac{\hat{x}}{x\xi\zeta} \left[\frac{\alpha^2}{\hat{x}\hat{y}\hat{Q}^2} \frac{\hat{y}}{2(1-\hat{\varepsilon})} \left(1 + \frac{\hat{\gamma}^2}{2\hat{x}} \right) \sum_i \hat{w}_i F_i(\hat{x}, \hat{Q}^2, \hat{z}, \hat{\mathbf{P}}_{h\perp}) \right] \end{aligned}$$

QED effects in eP reactions



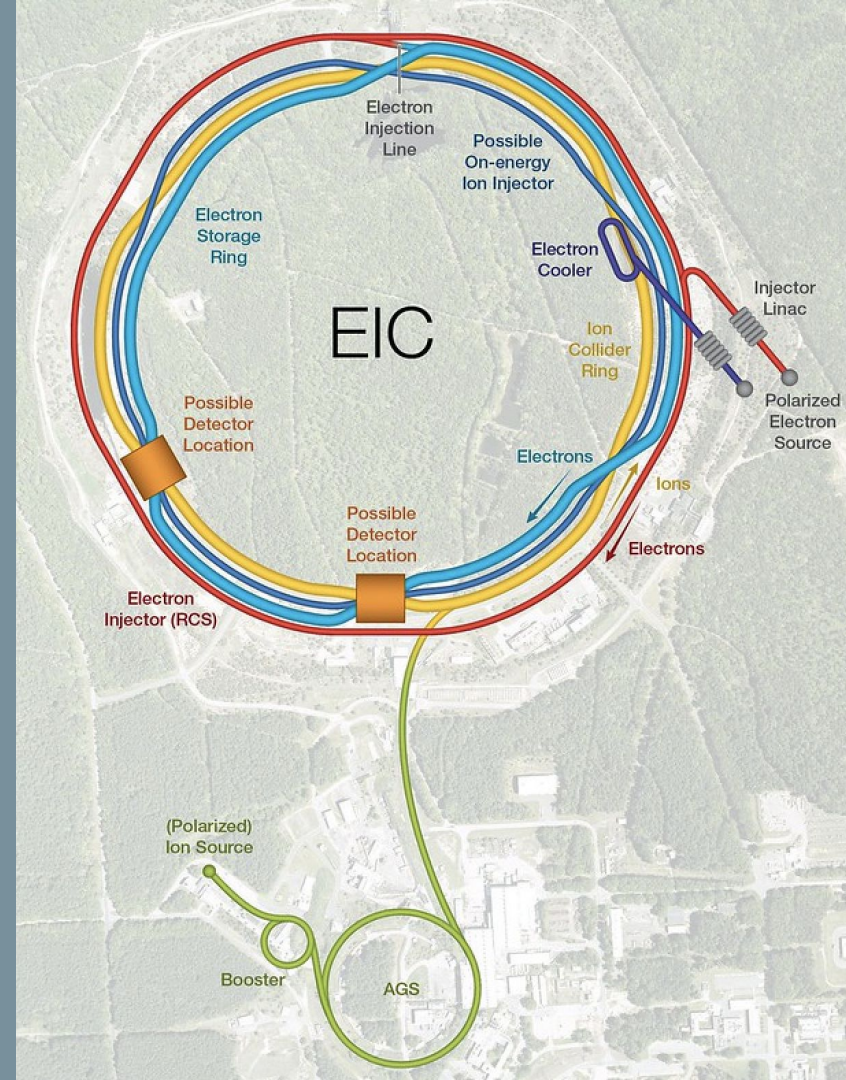
- Non-uniqueness of QED RC corrections
- Need for a combined analysis including QED and QCD effects



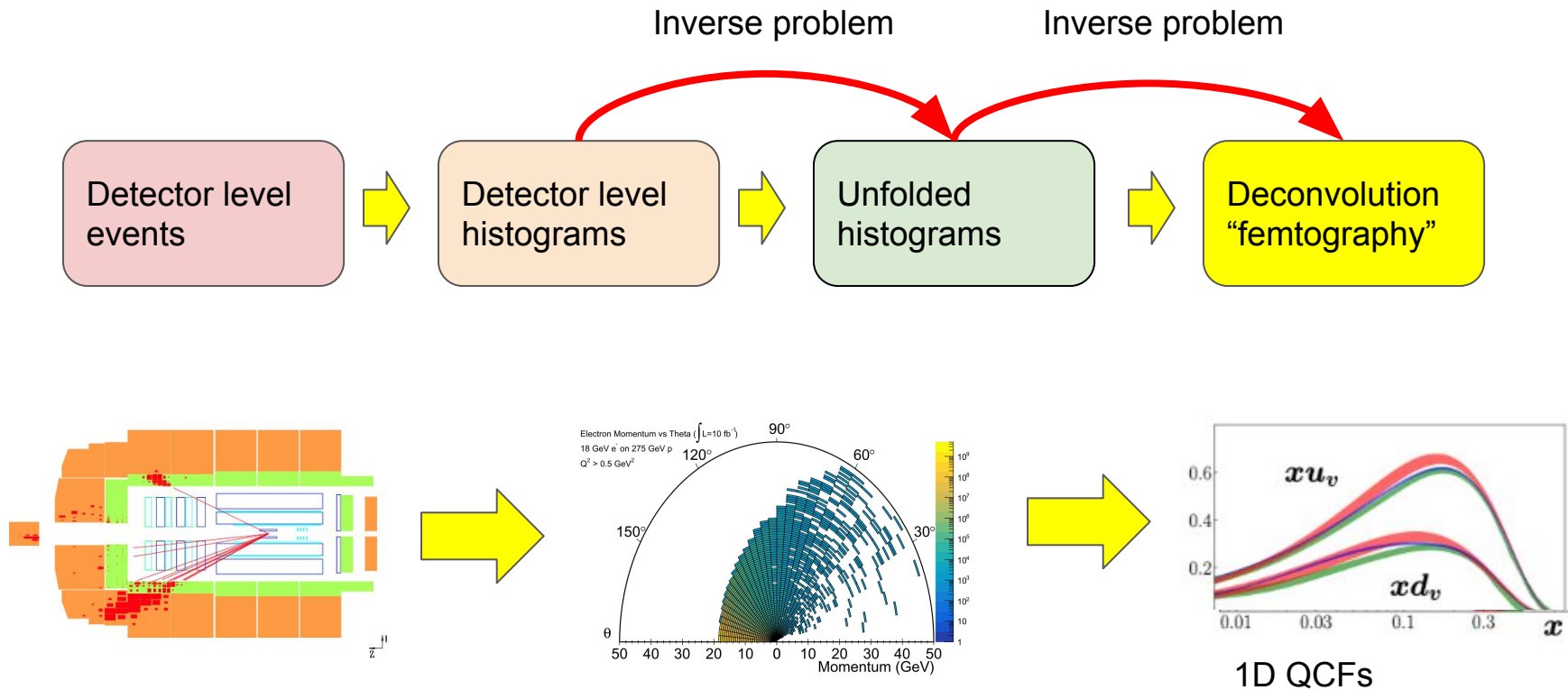
- Hybrid QED+QCD framework to study SSAs in SIDIS within global analysis
- *Crucial to control QED backgrounds in transverse spin asymmetries*

Outline

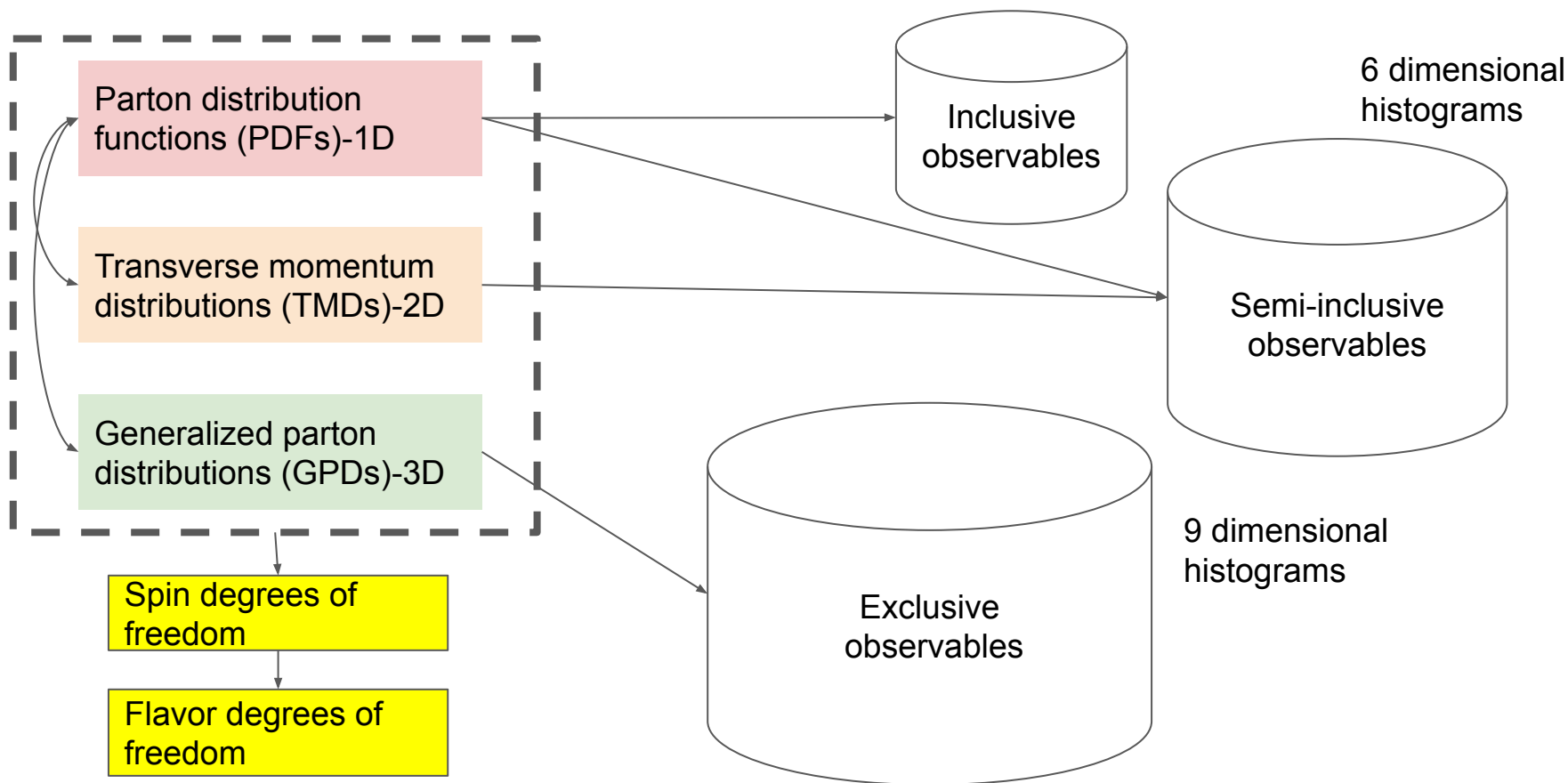
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Existing paradigm -> histogram approach



Curse of dimensionality

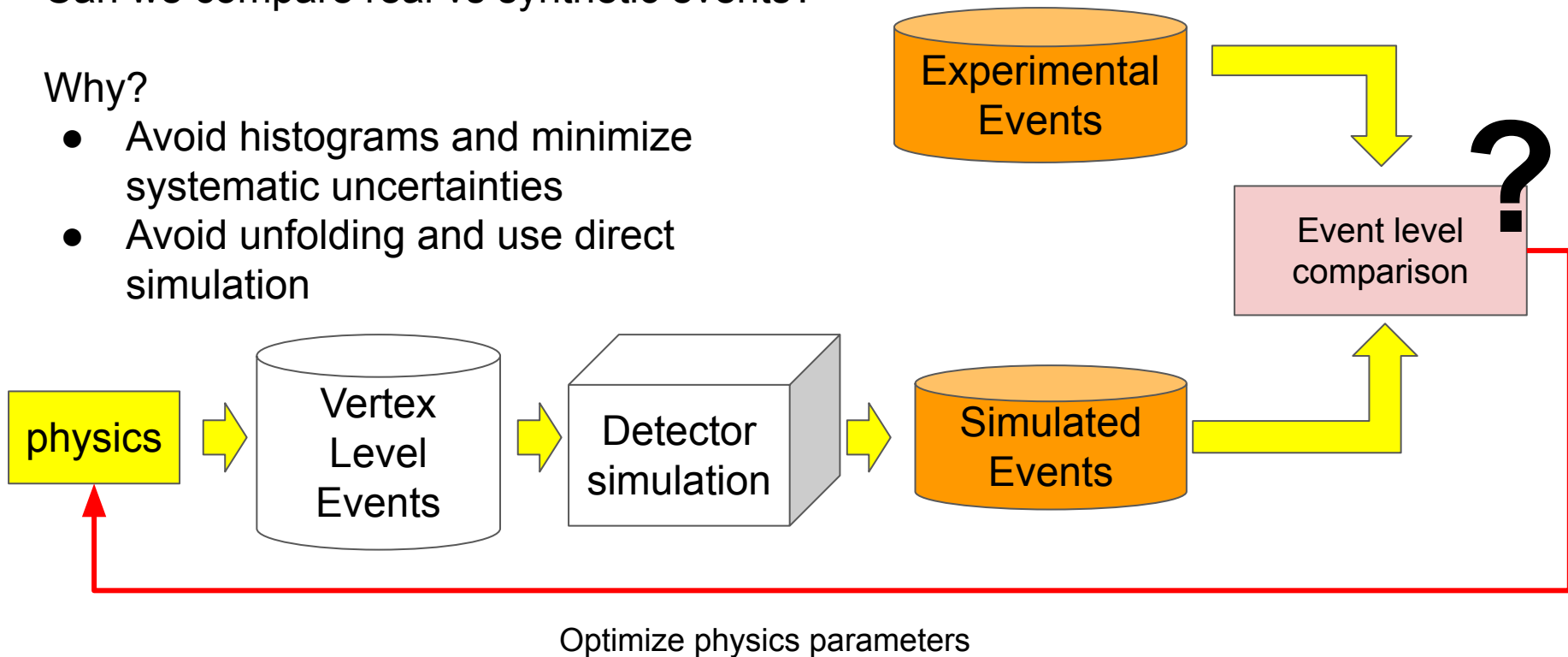


Event-based analysis?

Can we compare real vs synthetic events?

Why?

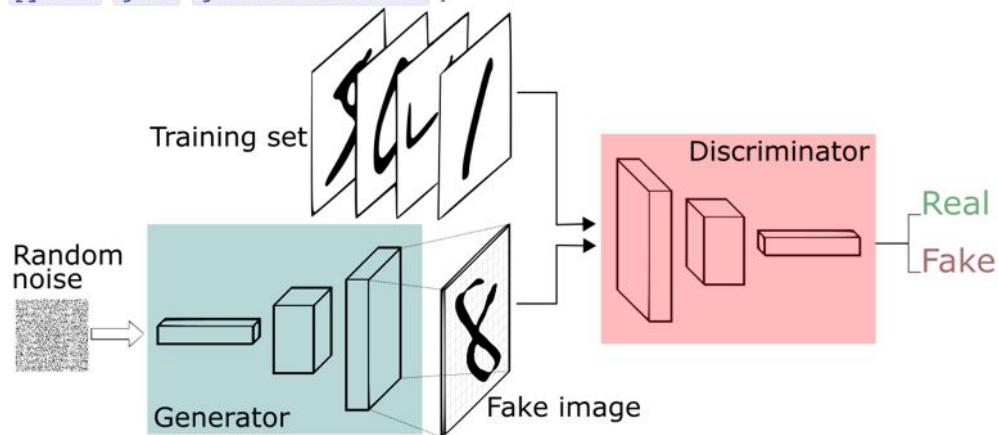
- Avoid histograms and minimize systematic uncertainties
- Avoid unfolding and use direct simulation



So, how do we compare events?

A Short Introduction to Generative Adversarial Networks

[machine-learning deep-learning representation-learning tensorflow
python gans generative-models]



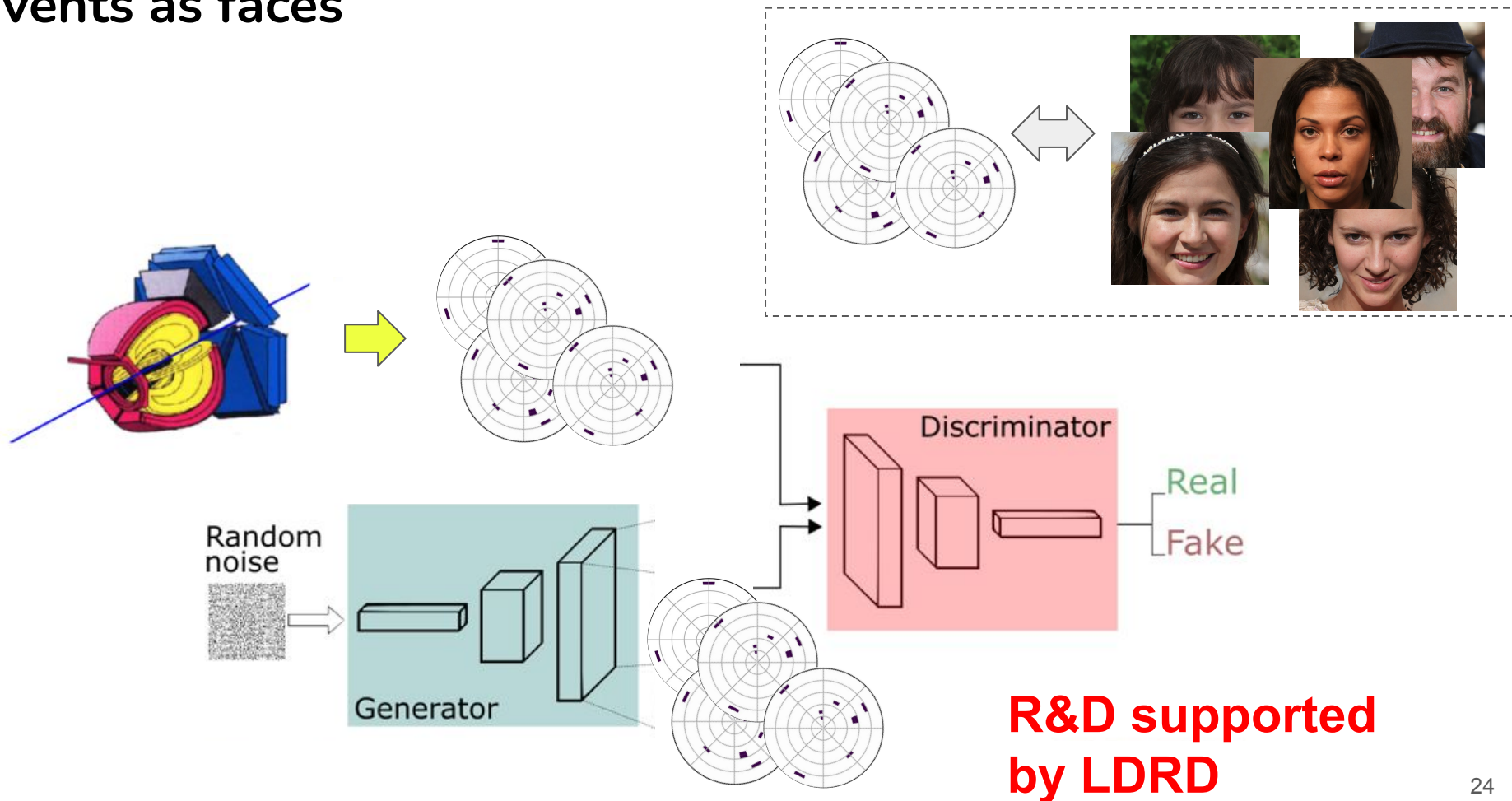
Jun 7, 2017



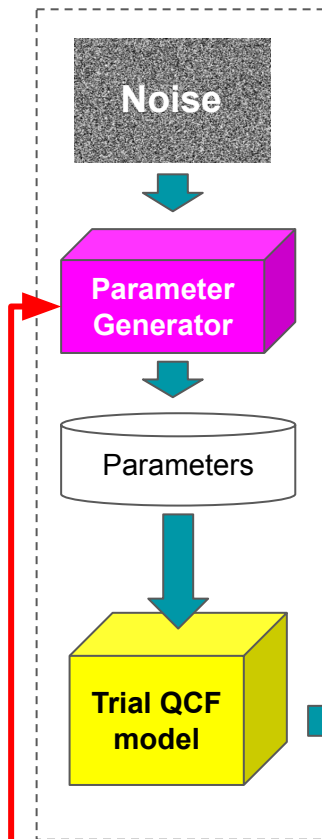
Fake people

<https://thispersondoesnotexist.com>

Events as faces



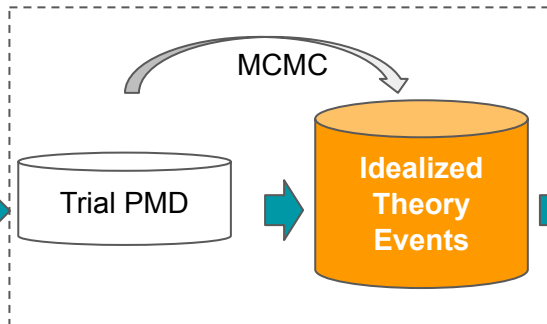
Module 1



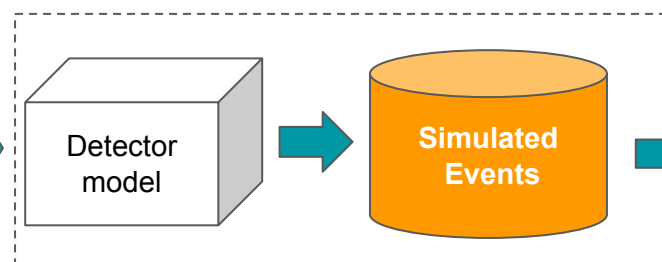
Event-level QCF inference framework



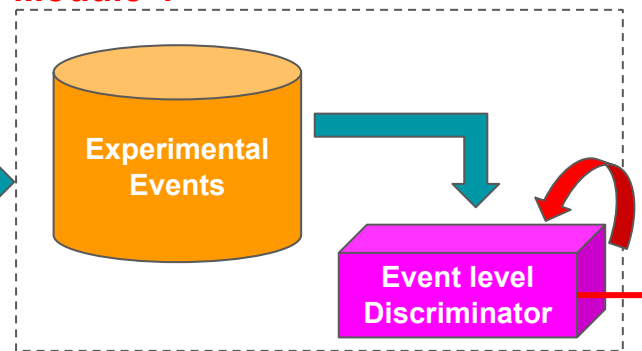
Module 2



Module 3



Module 4



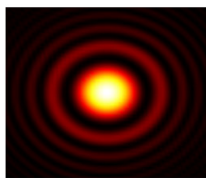
Optimize QCF parameters

Opportunities

- Unified Theory+Exp analysis framework for hadron structure -> paradigm shift
- Near real time analysis and expedite scientific discovery

Challenges

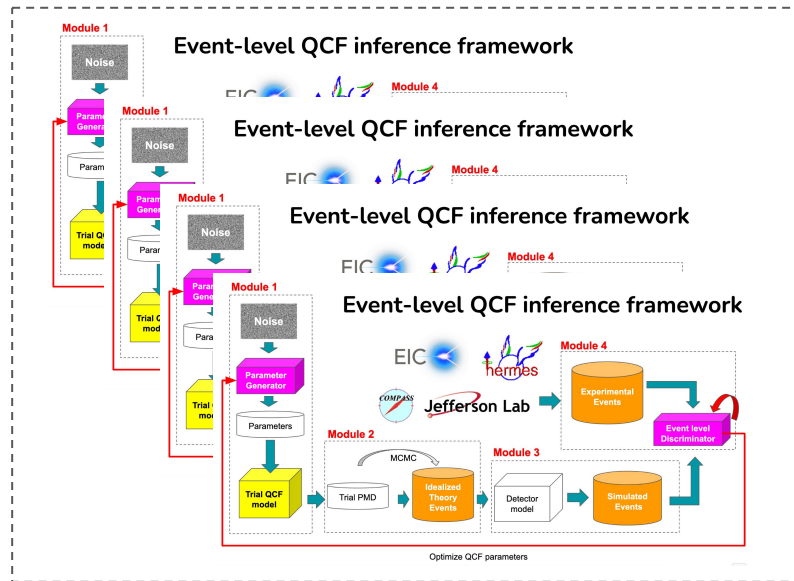
- Big event level data processing from JLab/EIC requires large scale computing -> exascale computing
- Dedicated distributed ML workflow needs to be developed



QuantOm Collaboration

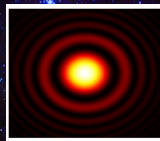


Supported by DOE SciDAC funds



Summary

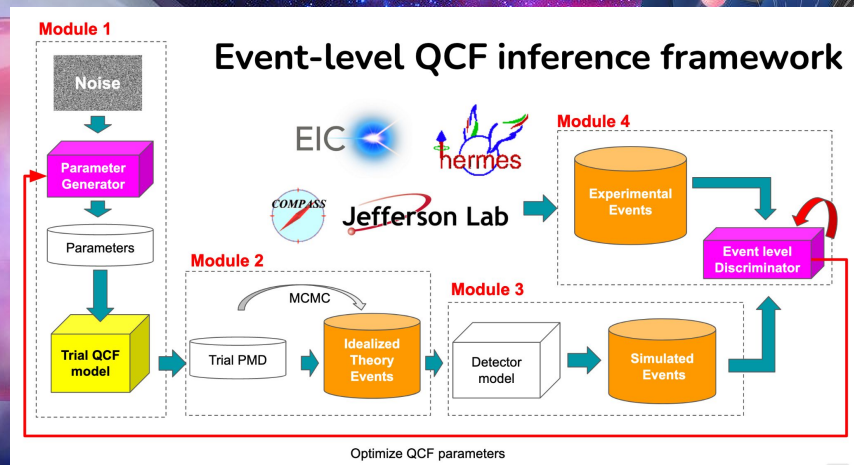
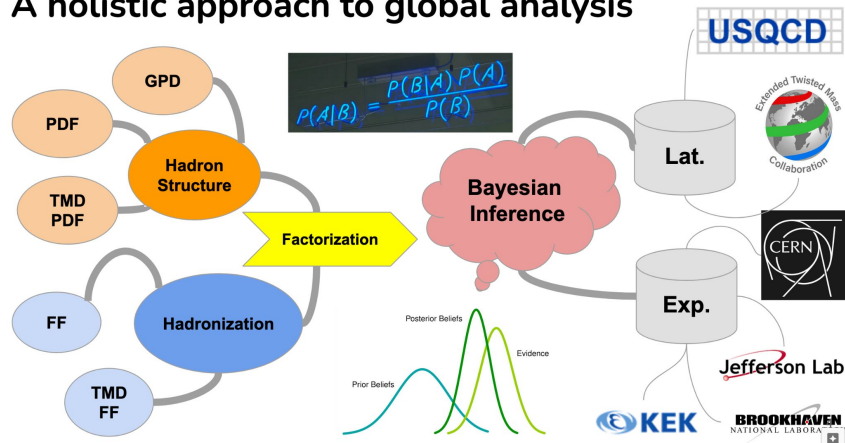
- New era of global analysis of hadron structure *unified theory & experiment* analysis
- AI/ML provides new tools/tricks to map QCFs from events and boost the discovery potential of current and future experimental facilities
- Large scale computing is needed -> opportunity to use ECP



QuantOm
Collaboration

$$\mathcal{L}_{\text{QCD}} = \sum_q \psi_q (\bar{\psi}_q \gamma_\mu D^\mu - m_q) \psi_q - \frac{1}{2} \text{Tr}[G_{\mu\nu} G^{\mu\nu}]$$

A holistic approach to global analysis



Backup

Challenges

Experimental domain

Theory domain

