## Polarized PDFs from phenomenology

## Nobuo Sato

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## The big picture

## hadrons as emergent phenomena of QCD


quarks and gluons

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## hadrons as emergent phenomena of QCD


nucleon structure

quarks and gluons

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## hadrons as emergent phenomena of QCD


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hadronization

The challenge

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■ Quark and gluon d.o.f. cannot be measured directly

■ Experimental measurements can be interpreted in terms of quark and gluon d.o.f.

## The methodology

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■ Identify relevant quantum correlation functions (QCFs) $\rightarrow$ PDFs, $\triangle$ PDF, FF,...

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■ Identify and measure observables sensitive to QCFs $\rightarrow$ factorization

■ Bayesian inference $\rightarrow$ global analysis

## The community effort

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■ Adding/updating experimental/lattice observables

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■ Adding/updating experimental/lattice observables

■ Improve soft/hard separation $\rightarrow \mathrm{HO}$ corrections

■ Simultaneous extraction of QCFs

■ Improving the Bayesian regression

## Pheno overview

## Valence polarization

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## Valence polarization



Iterative Monte Carlo analysis of spin-dependent parton distributions

Nobuo Sato, W. Melnitchouk, S. E. Kuhn, J. J. Ethier, and A. Accardi (Jefferson Lab Angular Momentum Collaboration)
Phys. Rev. D 93, 074005 - Published 5 April 2016

## Valence polarization



$$
\begin{aligned}
& g_{1}=g_{1}^{\tau 2}+g_{1}^{\tau 3}+g_{1}^{\tau 4} \\
& g_{2}=g_{1}^{\tau 2}+g_{2}^{\tau 3}
\end{aligned}
$$

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"Color polarizability"


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## Strange polarization "puzzle"

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$\square \Delta \mathrm{DIS}+g_{8} \rightarrow$ negative $\Delta s^{+}$

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$\square \Delta \mathrm{DIS}+g_{8} \rightarrow$ negative $\Delta s^{+}$
$\square \Delta \mathrm{DIS}+\Delta \mathrm{SIDIS}+g_{8} \rightarrow \Delta s^{+}$with sign change

## Strange polarization "puzzle"



First Simultaneous Extraction of Spin-Dependent Parton
Distributions and Fragmentation Functions from a Global QCD Analysis
J. J. Ethier, N. Sato, and W. Melnitchouk (Jefferson Lab Angular Momentum (JAM) Collaboration)

Phys. Rev. Lett. 119, 132001 - Published 26 September 2017

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First Simultaneous Extraction of Spin-Dependent Parton
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[^0]
## Strange polarization "puzzle"



First Simultaneous Extraction of Spin-Dependent Parton
Distributions and Fragmentation Functions from a Global QCD Analysis

[^1]
## Gluon polarization



## Evidence for Polarization of Gluons in the Proton

Daniel de Florian, Rodolfo Sassot, Marco Stratmann, and Werner Vogelsang
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$$
\int_{0.001}^{1} d x \Delta g(x)=0.013+0.702-0.314
$$

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## Gluon polarization



## Gluon polarization



Inclusive jet production as a probe of polarized parton distribution functions at a future EIC

Radja Boughezal, Frank Petriello, and Hongxi Xing
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## Gluon polarization

EIC inclusive jet production



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## Light sea polarization



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Impact of Recent RHIC Data on Helicity-Dependent Parton Distribution Functions

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## Light sea polarization



Measurement of the longitudinal spin asymmetries for weak boson production in proton-proton collisions at $\sqrt{s}=510 \mathrm{GeV}$

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## Constraints from lattice QCD

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Bringewatt, Constantinou Melnitchouk, Qiu, NS, Steffens

## Constraints from lattice QCD



$\square$ Exp.
$\square$ Lat.
$\square$ Lat. $|z| \leq 10$
$\square$ Lat. $|z| \leq 5$

Bringewatt, Constantinou Melnitchouk, Qiu, NS, Steffens

CENTER for NUCLEAR FEMTOGRAPHY

## Next generation of QCD global analysis tools

## Current paradigm

■ Global analysis uses Bayesian regression

- It is done via posterior sampling
$\rho(\boldsymbol{a} \mid$ data $)=\mathcal{L}(\boldsymbol{a}$, data $) \pi(\boldsymbol{a})$
■ $\boldsymbol{a}$ are the "shape" parameters for QCF

Why do we use posterior sampling?

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$\square$ We know how to go from $a$ to cross sections e.g.

$$
\frac{d \sigma}{d x d Q^{2}}=\sum_{q} \int_{x}^{1} \frac{d \xi}{\xi} H(\xi) f_{q}\left(\frac{x}{\xi}, \mu ; \boldsymbol{a}\right)
$$

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$$

- We DON'T have the inverse function to go from cross sections to $a$


## The inverse mapper



## The inverse mapper



## Partnership with computer scientists

- M. Almaeen (ODU)

■ Y. Awadh Alanazi (ODU)
■ M. Houck (Davidson College)

- M. P. Kuchera (Davidson College)

■ Y. Li (ODU)

- W. Melnitchouk (JLab)
- R. Ramanujan (Davidson College)
- NS (JLab)

■ E. Tsitinidi (Davidson College)


## Jefferson Lab

## ML prototypes


$\square$ Tested and validated in toy DIS-like examples

- How about real QCD analysis?


## Application to unpolarized DIS



## Application to unpolarized DIS



## Application to unpolarized DIS



## Application to unpolarized DIS



- Proton DIS kinematics
- Blobs $\propto \chi^{2}$
- $\frac{\chi_{\text {JAM }}^{2}}{N_{\text {pts }}}=1.25$
- $\frac{\chi_{\mathrm{ML}}^{2}}{N_{\mathrm{pts}}}=1.36$


## Summary and outook

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■ Still long way to get $\triangle$ PDFs as precise as PDFs

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■ Critical studies beyond Bayesian reweighting are needed to estimate EIC impact

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■ Still long way to get $\triangle$ PDFs as precise as PDFs

- Awaiting to analyze JLab 12 GeV data

■ Critical studies beyond Bayesian reweighting are needed to estimate EIC impact
■ New tools for global analysis using machine learning


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