

UNIVERSITY OF CALIFORNIA
RIVERSIDE

MEASUREMENT OF THE LONGITUDINAL SINGLE SPIN ASYMMETRY,
 A_L , FOR POLARIZED PROTON-PROTON COLLISIONS IN THE $W \rightarrow \mu$
DECAY CHANNEL

A Dissertation submitted in partial satisfaction
of the requirements for the degree of

Doctor of Philosophy

in

Physics

by

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August 2016

Dissertation Committee:

Professor Kenneth Barish , Chairperson
Professor Rich Seto
Professor John Ellison

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The Dissertation of Michael J. Beaumier is approved:

Committee Chairperson

University of California, Riverside

Acknowledgments

Advisors and Mentors are some of the most important people any scientist will encounter in their professional career. Time and again, I have heard colleagues speak of "that one inspirational" person that drove them to be their best, and knew how to "grow" a researcher.

I am very grateful to my advisor, Ken Barish, whose calm, stoic and unabated support helped guide me through my research. Ken involved me in many aspects of the research group at UCR, beyond the scientific work. He insured that I was exposed to all aspects of research in particle physics, including writing grants, reviewing literature, mentoring younger students, building detectors, running a particle accelerator detector, and of course, data analysis. Ken has always had the uncanny ability to know "who to talk to" for nearly any problem I might have. Ken connected me with other excellent physicists, who helped me grow as a researcher, and he gave me the freedom I needed to pursue my interests, and move in the scientific directions I felt most fruitful, while helping to provide an overall direction for my academic career and research.

Beyond all this, the single most important thing Ken has done for me, is to give me a second chance in graduate school. When he accepted me into his group, I was an undoubtedly risky choice. I struggled mightily my first year in grad school. I earned poor grades, and even had to re-take a class. In fact, my performance was so poor, that my teaching responsibilities were reduced, and eventually, I lost my graduate division fellowship, which ultimately meant that I had no income, or means of supporting myself; I was effectively dismissed from graduate school. However, I was interested in the research carried out by Ken and Rich Seto's heavy ion group, so I talked to Ken, who graciously accepted me into the group, provided me with academic and financial support, and even flew me out to Brookhaven National Lab my first summer of graduate school. I finally got to dive into 'real' physics research. I think it was this vote of confidence from Ken, as well as the awesome physics happening at the PHENIX experiment which gave me the confidence to wholeheartedly devote myself to my studies and research. Without Ken's vote of confidence, I fear that my graduate career would have been over in short order.

While at Brookhaven National Lab, I encountered graduate students, post docs, research staff, and other amazing physicists who taught me an incredible amount, and showed both patience, kindness, friendship and mentorship to me. Richard Hollis was one of the first people I encountered in my research group at UCR - I have never met a more

patient person. Richard helped me get my bearings, and set me straight, during my early (and later) years of graduate school. Oleg Eyser was with our group at that time as well - although I recall that he was less than thrilled to have yet another green graduate student constantly asking questions, taking time away from his work. He still made time to teach me, and introduced me to the very complicated PHENIX software system. Oleg challenged me, and expected me to find answers for myself, and was unrelenting in that regard, which I am certain made me a better researcher.

Josh Perry gave me a crash course on the PHENIX data acquisition system, boiling down this incredibly complicated system into understandable pieces, and helped me learn that ultimately, persistence pays off when tackling difficult problems. Martin Leitgab took me under his wing while I worked days and nights to learn PHENIX's fast data production systems. Martin's systematic, calm, and patient approach to problem solving has been something I have tried to emulate since my work with him - I could not have asked for a better mentor for that project. On that same project was my first introduction to Chris Pinkenburg and Martin Purschke - somewhat of the yin and yang of the PHENIX online data acquisition. I benefited enormously from conversations with both about PHENIX software, and online systems. Martin Purschke's kindness and sense of humor always spurred me on, while Chris' dogged dedication to doing things 'the right way' kept me honest. I have returned to Martin with various questions many times over the years, and he has always been cheerful, supportive and wise with his answers. Probably nobody other than Ed Desmond has been woken up so many times with emergencies at the PHENIX counting house in the middle of the night, yet even when I woke him at 3 am on many occasions, would simply state, in an exceptionally dry, well practiced line: 'Martin Speaking, please state the nature of your emergency'. I don't know of many who can manage to be coy and good natured under such circumstances.

I have to acknowledge Joe Seele as well, in this regard, as he probably more than anyone else, set me on the path to learning to program well, and using a computer effectively - these skills, so often neglected in Particle Physics, have paid off for me, many, many times over.

W Analysis Crew

Ralf Seidl, Francesca Giordano, Sangwha Park, Daniel Jumper, Abraham Meles, Chong Kim,

Friends and Family

Bob Beaumier, Marian Beaumier, Joe Beaumier, David Beaumier, Emily Vance, Jackie Hubbard, Alexander Anderson-Natalie, Corey Kownacki, Chris Heidt, Pat Odenthal, Behnam Darvish Sarvestani, Oleg Martynov,

Some say that it takes a village to raise a child. The same can be said of raising a graduate student up to earning a PhD. This thesis is dedicated to the multitude who have helped me become the man I am today, and to students who struggle, and their mentors who do not give up on them.

ABSTRACT OF THE DISSERTATION

MEASUREMENT OF THE LONGITUDINAL SINGLE SPIN ASYMMETRY, A_L , FOR POLARIZED PROTON-PROTON COLLISIONS IN THE $W \rightarrow \mu$ DECAY CHANNEL

by

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University of California, Riverside, August 2016
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This thesis discusses the process of extracting information about the spin structure of protons, specifically, spin contributions from the sea of quarks and antiquarks, which are kinematically distinct from the 'valence quarks'. We have known since the 'proton-spin crisis' [4] of the 1990s that proton spin does not entirely reside in the valence quarks, so the thrust of experimental efforts since then have been designed to determine both how to probe the proton spin structure, and how to validate models for proton spin structure. Here, I discuss one particular approach to understanding the sea-quark spin contribution, which utilizes the production of real W -bosons, and the W coupling with polarized spin structure in the proton sea, as produced from polarized protons collisions. Only one of the colliding protons is longitudinally spin polarized, in this analysis, and they are collided at an energy of 500GeV . The experimental observable used is referred to as " A_L " which is expressed mathematically as a ratio of sums and differences of various helicity combinations of singly polarized interactions between two protons, i.e. $p + p^{\Rightarrow} \rightarrow W \rightarrow \mu + \nu$. Once A_L has been experimentally measured, it can then be used to determine appropriate polarizations of proton sea-quarks, within a given uncertainty, if we write the cross-sections used in the calculation of A_L in terms of polarized parton distribution functions. Finally, this thesis will also include a discussion of my work experimentally determining the absolute luminosity of collisions at RHIC, which is needed as a normalization on any cross section used in the analysis. In particular, studying the cross section of the W interaction can help to validate our models for assigning a signal-to-background ratio to the $W \rightarrow \mu$ events.

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Chapter 1

Introduction

1.1 A Brief History of the Proton

The angular momentum of the proton has been a subject of study for the last 20 years[CITATION NEEDED]. One of the challenges of particle physics is to create a framework which can accurately describe matter, as well as predict the behavior of matter at all energy scales. The proton is a baryon which makes up the majority of the mass in the visible universe, yet fully understanding the origins of its properties - such as its mass and spin, still eludes us. However, through the applicaiton of the scientific method over many generations of physicists, we have magnificently described this important particle, and understood much of its properties. However, one property which still defies our descriptions is its fundamental angular momentum, spin.

Our understanding of the proton has evolved and sharpened since the first experiments in deep inelastic scattering showed that the proton is not a fundamental particle [6]. Gell-Mann later planted the seeds of a theoretical framework which could in part describe some of the structure of baryons, a class of hadrons which we may naively describe as composed of three 'valence quarks'[CITATION NEEDED]. We can apply well known spin-sum rules to the indivdual spins of the valence quarks which compose the proton in our naive valence-model to produce a correct prediction for the protons' spin $\frac{1}{2}$. When experimenters set out to measure the contribution of these valence quarks in 1988 at the EMC experiment [4], they were flabbergasted to find that the valence quarks carry only a small fraction of the proton's spin. Although recent papers [13] suggest that this 'spin crisis' is

simple due to misattribution of spin, most literature to date has focused on understanding how to model the proton with parton distribution functions. These parton distribution functions come in many varieties, and probe different degrees of freedom within the proton, in both the case of unpolarized parton distribution functions, and polarized parton distribution functions.

1.2 Scope and Objectives of This Work

This thesis will describe the research I carried out between May of 2010 through August of 2016. I will often quote work that was carried out in active collaboration with Ralf Seidel, Francesca Giordano, Daniel Jumper, Sanghwa Park, Abraham Meles and Chong Kim. Daniel, Abraham, Ralf, Francesca, and myself all worked on the 2013 polarized proton data set taken at RHIC with PHENIX. This analysis comprises the body of work devoted to calculating A_L for the $W \rightarrow \mu$ decay. Since 2013, the five of us collaborated closely on all aspects of the work, which provided invaluable cross-checks at nearly every stage. Many of the figures in this document were produced by our collective efforts, and I will do my best to cite when possible, if one analyzer played a particularly large role in generating the data or visualization, however after several years of working together, I will certainly fail to attribute, or misattribute at times.

The other portion of this thesis will discuss the Vernier Analysis, which is instrumental for every single-cross-section calculation taken with RHIC data. The thrust of the Vernier Analysis is to determine the beam luminosity at PHENIX's interaction point, so as to normalize these cross-section calculations. This is done with a series of specialized Vernier-Scans, where beams are scanned across one-another in order to measure beam geometry. The luminosity can then be calculated from first principals, and compared to the advertised machine luminosity published by RHIC's collider-accelerator department. I began working with the Vernier Analysis under the tutelage of K. Oleg Eyser, but eventually moved to work independantly on the analysis, producing an entire software framework for handling data cleaning, analysis, visualization and simulation.

Chapter 2

Physics Background

2.1 The Phenomena of Spin

Spin is a fundamental quantity possessed by all elementary particles. We use the word 'spin' to describe the property, because particles which possess spin, behave as though they have some kind of intrinsic, hidden rotation, as if they were 'spinning'. The dimension of spin, therefore is angular momentum. What is somewhat bizarre about spin, is that we do not observe anything physically spinning - although there are some phenomena (such as orbital angular momenta) which can be naively thought of as a 'spinning system' (but this description escapes classical analogy, due to its quantum, probabilistic nature). The role of Spin in Physics is of foundational importance, and yet, we have not successfully produced a model which can accurately predict the spin of hadrons.

The presence of spin in relativistic particles creates the phenomena of chirality, which has huge implications for how elementary particles can generate structure in matter itself **[CITATION NEEDED]**. In the case of the weak interaction, the presence of spin, which creates Chiral spinors breaks the left-right symmetry of weak coupling in matter (a fact which will be exploited in this thesis to probe the spin of the proton sea).

The phenomena of spin also changes the rules for how ensembles of particles may exist in a potential. Particles with spin are fermions, and because these particles must obey fermi statistics, we can observe structure in matter in the universe **[CITATION NEEDED]**. Without spin, the world as we know would collapse on itself, making any kind of extended non-exotic structures which currently exist by virtue of the Pauli exclusion principle, impossible.

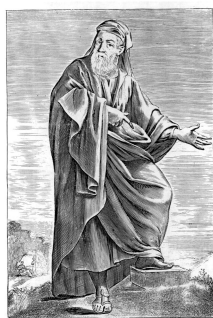
2.2 A Brief History of Proton Spin

The study of Spin is really just an outgrowth of the general study of matter. Our models for matter, and the underlying structure of matter (in the modern sense), represents over a hundred years of experimental and theoretical efforts, and thousands of years of contemplating what makes up the universe.

Although indulgent on my part, I find it interesting, and humbling, to try and map out the path that humanity and science has trodden on its way to understanding the building blocks of the universe. To find the first time that humanity had murmurings that suggested our visible world is built from invisible, fundamental building blocks, we must travel back, nearly 2,500 years into the past.

2.2.1 Ancient Foundations

Sometime around 490 - 370 BCE lived two philosophers, empedocles (Fig 2.1a), and Democritus (Fig 2.1b). Both men lived approximately at the same time, and made huge philosophical leaps in attempting to understand the nature of the visible world.



(a) Empedocles



(b) Democritus

Figure 2.1: Two greek philosophers, who made important philosophical contributions our understanding of matter. Empedocles (left), postulated the precursor to the elemental theory of matter [CITATION NEEDED] and Democritus (right), postulated the precursor to the atomic theory of matter.

Democritus was part of a movement of thought which was first to make the intellectual jump that perhaps matter was not a continuum, but instead, composed of 'atomon', small, indivisible particles which when configured together, created all that is

observable [CITATION NEEDED]. Empedocles was making equally important philosophical strides - in a manner complimentary to Democritus' opinion that matter must be made of atomon, Empedocles argued that matter is composed of elemental primitives [CITATION NEEDED].

Although Empedocles' 'periodic table' was only composed of Earth, Water, Fire, and Air, the idea that some unseen transmutation of elemental forces might generate observables in nature with quite different (but perhaps reminiscent) properties than the 'pure substances' was an important step forward. Proto-scientists were beginning to generate models which derived our complicated observations, from simpler forms.

It took centuries of cultivation, leading up to the Scientific Revolution, for the next great steps to occur, for science. Thankfully, the luminaries of the Islamic Golden Age kept the fires of inquiry burning [CITATION NEEDED].

2.2.2 The Scientific Revolution

Thanks to the mathematical foundations laid out, build, and maintained by the minds of the Islamic Golden Age, Europe was well poised to reignite the flames of scientific inquiry, during the post Renaissance Scientific Revolution [CITATION NEEDED].

This period of growth in science was unprecedented during the Scientific Revolution, thanks to the seeds of empiricism germinated during the Islamic Golden Age, fertilized by the Italian Renaissance, and helped to flourish through British Empiricism [CITATION NEEDED].

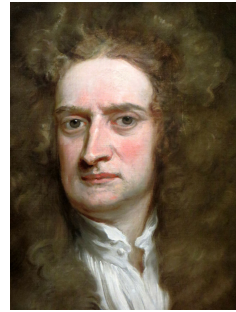
Galileo Galilei

While Galileo is best known for his work in Observational Astronomy, his importance to science extends beyond this. During his years in exile for his controversial views of the heliocentric universe, he produced some of his most important scientific work in kinematics [CITATION NEEDED]. What made this work remarkable is the care that Galileo took in merging careful mathematical modeling with well designed experimentation. This methodical approach to inquiry laid the foundation for others to slowly begin to pull back the curtains obscuring physical law.

Galileo's formalization of the scientific method inexorably set science on a course to delving deep into the nature of matter, and the laws of nature.



(a) Galileo



(b) Newton

Figure 2.2: Giants in the age of Empiricism, Newton (left) and Galileo (right) both made foundational contributions to Physics. Galileo lived in Italy, born in 1564 and dying in 1642. Newton lived in England from 1642 until his death in 1727

Isaac Newton

Fittingly born in the same year as Galileo's death, Isaac Newton would carry on Galileo's legacy of rigorous mathematical modeling mixed with experimentation. Perhaps no other scientist has touched so many different aspects of physics, from theories of propagation of light, to celestial mechanics, to mathematics, and kinematics.

Newton's *Principia* is perhaps the most important scientific work ever published. It opened the doors of the universe in a way that nobody has since duplicated. Newton's laws of motion are still taught in school today, and although they have since been shown to be inaccurate at the smallest and largest scales, they still provide startlingly accurate predictions for the regular motion of matter.

One particularly tantalizing theory of Newton's was the corpuscular theory of light. Although not his most influential theory by far, the idea that an apparently continuous medium such as a beam of light might be made of small packets of energy (corpuscles) turned out to be partially right **[CITATION NEEDED]**.

Newton's theories, and contributions to science are enormous, and have moved us deeper still into the underpinnings of matter. It would not be until roughly 200 years after his death, in the 19th century, that we finally can take the first steps into the world of the atomic, and sub-atomic: the world of the proton.

2.2.3 Atomic Theory

On the shoulders of giants such as Newton and Gallileo, science finally came to know the tool which has been indispensable to modern particle physics: scattering. Rutherford and Thompson both carried out the most important scattering experiments in modern science, and provided us with the first hints of a hidden, quantum world, though it would not be until the 20th century that these important experiments would be fully contextualized with a theory of quantum scattering.

Scattering experiments offer a very powerful method where one uses a well known initial state of matter (typically in the form of a beam), allows this beam to interact with an unknown configuration of matter, and measures the scattered beam. By carefully studying the kinematics of the scattered beam, we can create models which allow us to understand the structure of the target matter or describe the nature of the interaction between the beam and target.

John Dalton

While many had postulated the existence of atoms, the first evidence based theory which suggested the existence of atoms was produced by John Dalton in the early 19th century. Dalton made an important conceptual leap to relate the existence of stoichiometric ratios in chemistry to the presence of small, individual functional units in his experiments with chemical reactions. Dalton's realization was only made possible due to his careful accounting of reactants in his experiments.

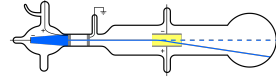
It was not until Einstein's 1905 theory on Brownian Motion was experimentally verified by Jean Perrin to place limits on the mass and size of atoms that Dalton's atomic theory was ultimately vindicated [12].

J.J. Thompson

Thomson (Figure 2.3) would discover that atoms are not the smallest, indivisible piece of matter. In his landmark experiment, he used cathode ray scattering experiments to show that cathode rays were in fact subatomic particles. He showed these cathode rays were identical to particles given off by the photoelectric effect, and that these same particles were responsible for electric current. He had discovered the electron. And, if atoms were



(a) J.J. Thomson



(b) Cathode Ray Tube

Figure 2.3: Left: J.J. Thomson, who showed that cathod ray tubes were in fact producing the first observed subatomic particle: the electron. Right: A cartoon of Thomson's cathod ray tube setup. Electrons would be deflected by a magnetic field, sent from cathode to anode.

not the smallest piece of matter, then perhaps, atoms themselves might not be 'indivisible' as previously thought [1].

Rutherford

2.2.4 Modern Quantum Physics: Quantum Electrodynamics and Quantum Chromodynamics

Gell-Mann, Zweig (8-fold way), Feynman, Wilczek, Weinberg, 't Hooft, Parisano, DGLAP. David Gross

Although Gell-Mann's simple quark model of baryons [CITATION NEEDED] predicts the correct quantity for the spin of the proton, the work of Ashman et al (1988) [CITATION NEEDED] at the European Muon Collaboration directly measured a portion of the proton structure function g_1 and found that a rather small fraction of the proton spin comes from quarks - and most of the spin is carried by the gluons (Figure 2.4).



Figure 2.4: **[FIGURE NEEDED]** **[CAPTION NEEDED]**. Results of EMC experiment showing that the structure function g_1 , tells us a thing about proton spin.

Proton Spin Crisis

2.3 How to Model Proton Spin

- structure functions
- proton spin decomposition
- unpolarized parton distribution functions
- polarized parton distribution functions
- that sweet table from Delia hasch
- discussion \bar{q} , q , L_q , g
- DSSV figures

2.4 How to Measure Proton Spin

- physics probes for proton spin

- W cross section
- derivation of Asymmetry
- kinematic extremes of Asymmetry

2.4.1 Past Experimental Efforts

- summary of data on structure functions
- fixed target experiments
- collider experiments

2.5 World Efforts to Measure Proton Spin

2.5.1 CERN

2.5.2 ZEUS

2.5.3 HERA

2.5.4 HERMES

2.5.5 COMPASS

2.5.6 EMC

2.5.7 SLAC

2.5.8 JLAB

2.6 Cross Sections and Luminosity

- vernier analysis note intro, equations
- summarize the papers on Luminosity

Chapter 3

Experimental Apparatus

3.1 The Relativistic Heavy Ion Collider

3.1.1 Overview

3.1.2 The RHIC Spin Program

3.1.3 Production of Polarized Proton Beams

3.2 The Pioneering High Energy Nuclear Interaction Experiment

3.2.1 Subsystem Overview

3.2.2 Luminosity

3.2.3 Beam Polarization

3.3 The Forward Upgrade

3.3.1 The Muon Tracker + Muon Trigger Subsystems

3.3.2 Resistive Plate Chambers

Design

Construction

Testing

Performance

3.3.3 The DAQ

2013 Data Set Triggers

Chapter 4

The Data Set

4.1 Overview

Now that we have discussed the various apparatuses provided by the PHENIX experiment, we can go into more depth with the process of engineering features. For this analysis, we consider only events which are identified by the Muon Arms subsystem as being muons. The raw data provided by PHENIX is quite complex, and at the hardware level is generally not too useful for physics analysis.

In this chapter, we will discuss the process of cleaning our data set, the goal of which is to get rid of background data, while keeping any event that could possibly contribute to the $W \rightarrow \mu$ signal. This cleaning is done in three stages. The first stage concerns applying a simple basic cut to our data set to remove events which are kinematically forbidden from having W boson parent particles, this is called the "Basic Cut".

After this, we label data with W_{ness} , which is an event's likelihood for coming from a W boson decay. Although this is part of data cleaning, since W_{ness} is an important parameter in the analysis, it is discussed in Section ??.

Finally, we must estimate the overall yield of μ resulting from the various proton helicity combinations, and the signal to background ratio characterizing that yield. Again, since this is also an important part of the physics, it is discussed in Section 5.2.6.

4.2 Analysis Variables and the Basic Cut

A brief summary of the kinematic variables used later in the analysis is given in Table 4.2. In addition four sets of RPC cluster variables exist which are being used as main RPC variables. These variables contain projections from either vertex, Station 1, 3 or the MuID road to the corresponding z positions of the RPCs based on the tracks in the PHMuoTracksOut node and are directly taken over from the RpcMuoTracks node in the dsts:

- `newsngmuons→Branch("RpcMatchVtx",0,"Rpc3dca[_RecoTracks]/F:
Rpc3time[_RecoTracks]/F:Rpc3x[_RecoTracks]/F:Rpc3y[_RecoTracks]/F:
Rpc1dca[_RecoTracks]/F:Rpc1time[_RecoTracks]/F:Rpc1x[_RecoTracks]/F:
Rpc1y[_RecoTracks]/F");`
- `newsngmuons→Branch("RpcMatchSt1",0,"Rpc3dca[_RecoTracks]/F:
Rpc3time[_RecoTracks]/F:Rpc3x[_RecoTracks]/F:Rpc3y[_RecoTracks]/F:
Rpc1dca[_RecoTracks]/F:Rpc1time[_RecoTracks]/F:Rpc1x[_RecoTracks]/F:
Rpc1y[_RecoTracks]/F");`
- `newsngmuons→Branch("RpcMatchSt3",0,"Rpc3dca[_RecoTracks]/F:
Rpc3time[_RecoTracks]/F:Rpc3x[_RecoTracks]/F:Rpc3y[_RecoTracks]/F:
Rpc1dca[_RecoTracks]/F:Rpc1time[_RecoTracks]/F:Rpc1x[_RecoTracks]/F:
Rpc1y[_RecoTracks]/F");`
- `newsngmuons→Branch("RpcMatchMuID",0,"Rpc3dca[_RecoTracks]/F:
Rpc3time[_RecoTracks]/F:Rpc3x[_RecoTracks]/F:Rpc3y[_RecoTracks]/F:
Rpc1dca[_RecoTracks]/F:Rpc1time[_RecoTracks]/F:Rpc1x[_RecoTracks]/F:
Rpc1y[_RecoTracks]/F");`

For the moment the timing and DCA distributions we use are those matching from station 1 for RPC1 and from station3 for RPC3. In addition, in order to improve the background rejection in the FVTX acceptance, for this analysis several new variables are added in relation to the FVTX-MuTr matching which were directly taken over from the corresponding methods in the PHMuoTracksOut node. Those are `fvtx_dr`, `fvtx_dφ` and `fvtx_dθ` which compare the FVTX tracklets radial position, azimuthal and polar angles with

Variable	Definition
η	Pseudorapidity, used in secondary likelihood cuts
χ^2_{track}	Standard chi2 of μ track Kalman fitter
$DG0, DDG0$	Roads generated in MUID+MuTr planes. $DG0$ is distance between first gap road and track. $DDG0$ is opening angle between road and track.
DCA_r, DCA_z	Distance of closest approach between μ track and beam axis (DCA_r). DCA_z is the distance between the track's intersection with PHENIX's z-axis and the event vertex.
$RpcDca_{1,3}$	Distance between extrapolated track at RPC 1 or 3, and hit cluster at RPC 1 or 3.
dw_{23}	Reduced azimuthal bending angle of track. $dw_{23} = p_T \sin(\theta)(\phi_2 - \phi_3)$
$fvtx_d\theta$	
$fvtx_d\phi$	FVTX matched track matching residuals for ϕ, θ, dr .
$fvtx_dr$	

Table 4.1: Summary of engineered features from the data set used in this analysis.

those of the MuTr as an extrapolated z position between the two. Another FVTX related addition is the FVTX hit multiplicity within a cone of **INPUT RANGE HERE** around the projected track. This variable will henceforth be called FVTX_cone.

The "Basic Cut" is defined:

In this W analysis one is interested in removing most lower momentum particles which originate predominantly from background processes while keeping most of the W decay muons. With the above cuts, we aim to reduce part of the fake muons background assuring a good muon track reconstruction ($DG0, DDG0$ and χ^2 cuts) and selecting tracks with momentum smaller than the maximum possible physical energy. After applying these basic cuts, the background will be further reduced via a likelihood method, described in chapter ??, where background and signal features will be studied in detailed.

The correlations between the several cut variables are shown in Fig. 5.2 for data and for the W-si. The only exception is the correlation between the vertex extrapolated variables DCA_z and DCA_r and the FVTX related matching variables. This is not entirely unexpected as both should be sensitive to the amount of multiple scattering in the central magnet yoke and initial shielding.

Variable	Lower Bound	Upper Bound
MuID lastGap	*	Gap 4
χ^2	0	20
$DG0$	0	20
$DDG0$	0	9
μ candidate	*	1

Table 4.2: The Basic Cuts used in the Run 13 analysis. lastGap refers to the last gap in the MUID which saw a μ candidate event. The fourth gap is the furthest penetration possible, therefore suggesting a high energy muon. Other parameters are described in table 4.1

4.3 Feature Engineering

4.3.1 Discriminating Kinematic Variables

4.3.2 Simulations

Chapter 5

Spin Analysis

5.1 Classification of Signal or Background Events

After producing our data set, engineering features which help us convert our experimental data into observables, we are then tasked with the problem of separating out signal events from background events. Many processes are capable of producing muons, many of which are dominant in the W boson kinematic regime (Figure 5.1).

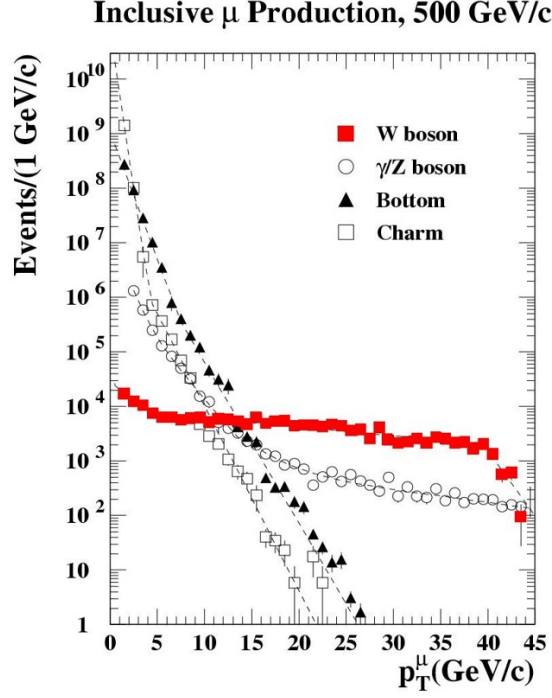


Figure 5.1: Observing the simulated production of muon as a function of p_T , we can see that in the kinematic region of W production that the dominant sources of muons come from other processes. The new PHENIX muon trigger threshold is sensitive at 10 GeV/c and above.

We can divide up the total observed muon spectrum into contributions from three sources:

- Real Muon Background
 - Z, γ^*
 - $W \rightarrow \text{had}$
 - $W \rightarrow \text{tau}$
 - onium
 - open charm
 - direct photon
- Fake Muons (Hadronic Background)

- Hadrons which are reconstructed as high p_T muons due to detector resolution.
- Signal Muons
 - Real $W \rightarrow \mu$ events.

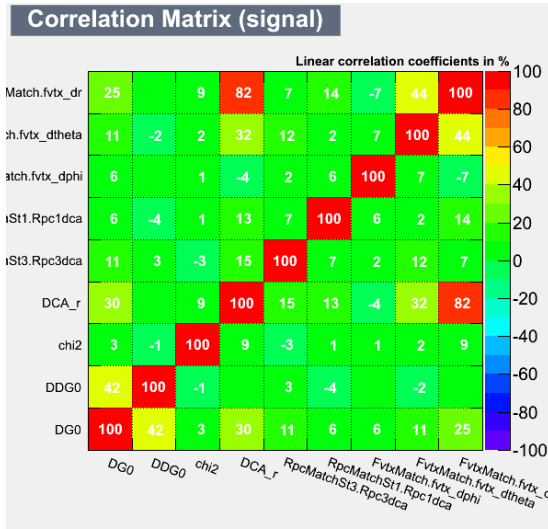
Previous analyses have attempted to separate the muon spectrum into p_T bins, to estimate the composition, however, because the $W \rightarrow \mu$ signal is so small in the forward kinematic regime, these methods are not sufficient, as there is no 'visible' cutoff in the spectrum. However, by using simulations. However, we may use other methods to split up our spectrum, with the ultimate goal of calculating A_L , and correcting for background dilution using the signal to background ratio. We must use another method to effectively describe the difference between an event which comes from a signal, vs background event.

5.1.1 Naive Bayes Classification

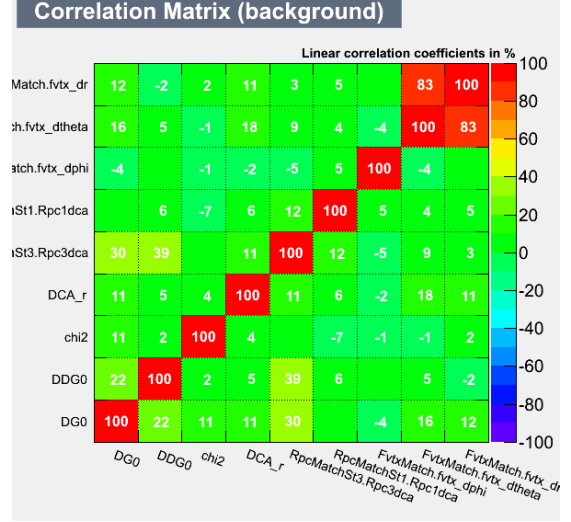
There are many techniques available for classifying a collection of variables (a feature set) into categories. Naive Bayes classification is an excellent candidate for classification, in cases where we have two classifications with distributions of featuresets which are uncorrelated. Naive Bayes even works when feature sets are slightly correlated. It is a robust, fast, scalable machine learning technique. Traditionally used for classification of text documents, Naive Bayes is also able to handle numeric features whose distributions are known [7].

In our analysis, we begin with a Naive Bayes classifier which is trained to classify two signal muons, vs background muons. We combine both Real Muon Background muons and Fake Muons (Hadronic Background Muons) in the label of "Background Muons" at this stage, though, later, we will separate out the muons further.

The descriniating variables described in 4 were chosen from the multitude of possible physical event parameters, because they were all maximally uncorrelated. Concretely, these correlations are presented in



(a) Correlations between kinematic variables, produced from simulated data.



(b) Correlations between kinematic variables, produced from the data, which is composed mostly of hadronic background

Figure 5.2: Low correlations between the signal variable distributions (from simulation), and the background variable distributions make this data set a good candidate for classification using Naive Bayes

Briefly, a Naive Bayes classifier may be constructed from the core of the familiar Bayes Theorem from probability and statistics.

In our case, we understand Naive Bayes as a conditional probability. Concretely, we consider a vector of features (i.e. our discriminating kinematic variables):

$$\mathbf{x} = (x_1, \dots, x_n) \quad (5.1)$$

and assume independence between each feature x_n . We then define the probability of a given classification, C_k given a set of features x_n :

$$p(C_k | x_1, \dots, x_n) \quad (5.2)$$

This conditional probability is defined in terms of Bayes Theorem:

$$p(C_k | \mathbf{x}) = \frac{p(C_k) p(\mathbf{x} | C_k)}{p(\mathbf{x})} \quad (5.3)$$

The terms here are defined as:

- $p(C_k) \rightarrow$ prior probability
- $p(\mathbf{x}|C_k) \rightarrow$ likelihood
- $p(\mathbf{x}) \rightarrow$ evidence

In principal, the final step in a classifier is to assign a class. This is done by computing the probability of a feature-set belonging to one class, or to another class, using Bayes Theroem. The class with the larger proability is than taken as the defacto classification of that particular feature set. However, we may instead observe these probabilities directly, and label data with this probability. This is what we ultimately call our " W_{ness} " parameter. This will be discussed in section ??.

5.1.2 Composition of Probability Distribution Functions

After we have engineered appropriate features to use in the analysis, we can proceed with composing probability density functions so we can proceed with the calculation of likelihoods, which will label our data set, allowing us to reduce our data set further from the basic cuts, without removing any signal events.

5.1.3 Labeling Data With Likelihood Ratio: W_{ness}

5.2 Extended Unbinned Maximum Likelihood Fits

5.2.1 Modeling The Hadronic Background

5.2.2 Modeling the Muon Background

5.2.3 Modeling the W-Signal

5.2.4 Overview

5.2.5 Fit Performance

5.2.6 S/BG and Muon Backgrounds

5.2.7 W_{ness} Dependence of S/BG

5.3 Calculation of A_L for $W \rightarrow \mu$

5.3.1 Overview

5.3.2 Asymmetry Calculation

5.3.3 Discussion of Work Done By Analysis Team

5.4 Data Validation

Mention Daniel's GPR, Ralf's PEPSI, Abraham's FVTX work, and Francesca's cross-checks.

- 5.4.1 Simulations and The Signal to Background Ratio
- 5.4.2 Gaussian Process Regression
- 5.4.3 Four Way Cross Validation
- 5.4.4 Asymmetry Consistency Check
- 5.4.5 Beam Polarization
- 5.4.6 Beam Luminosity
- 5.4.7 Code Cross Validation

Chapter 6

The Vernier Analysis

6.1 Overview

6.2 Analysis Note Here

6.3 W Cross Section

Chapter 7

Discussion and Conclusion

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