

Wheat Variety Selection: An Application of Portfolio Theory in Colorado¹

Ryan Mortenson², Jay Parsons³, Dustin L. Pendell⁴ and Scott D. Haley⁵

Introduction and Background

Each year prior to the growing season, wheat growers are faced with choices when it comes to selecting which wheat varieties to plant. Several Land Grant Universities annually publish results of wheat variety performance trials where both private and public wheat varieties are tested. From these outreach publications, wheat growers can get a reliable sense of the expected performance of the trial varieties for their location. Intuitively, growers select wheat varieties based on previous experiences and the published trial results of the previous year. The correlation between yield performances of the different varieties is largely ignored and a more thorough investigation could lead to increased yield stability.

As expected, any agricultural activity involves risk from diverse sources such as weather variation or disease. Barkley, Peterson, and Shroyer (2010) identified three major strategies to reduce risk in wheat production. The first strategy to reduce risk involves the development of new breeds with agronomic characteristics appropriate to the growing region. The traits of multiple varieties can be combined to create new cultivars that will potentially reduce the variation of yields. The second strategy is to create mixtures or blends of the seed of a few different varieties prior to planting in order to increase the genetic diversity. The third strategy is to create a portfolio by selecting multiple wheat varieties and planting them in different fields.

The number of planted acres of wheat has stayed consistent over the past 10 years in Colorado; therefore, one way to maintain and possibly increase wheat yields is through better risk management strategies. According to Bosley (2010), Colorado growers tend to plant two or three different varieties of wheat in a given year. The selection of varieties is made primarily by a combination of previous experiences, gut feelings, suggestions made by friends, family or seed distributors and an examination of the test plot yields from the previous year.

Through the examination of the year-to-year variance of a given cultivar (variety), and comparing that with the variance and covariance of other cultivars, “portfolios” of wheat varieties can be developed. The portfolios lie graphically on a single line and represent points where variation is minimized for a given level of yield. This line represents the mean-variance

¹ Address correspondence to Jay Parsons, Department of Agricultural and Resource Economics, Clark B-320, Colorado State University, Fort Collins, CO 80523. Email: jay.parsons@colostate.edu

² Former Graduate Student, Department of Agricultural and Resource Economics, Colorado State University

³ Special Assistant Professor, Department of Agricultural and Resource Economics, Colorado State University

⁴ Associate Professor, Department of Agricultural and Resource Economics, Colorado State University

⁵ Professor, Department of Soil and Crop Science, Colorado State University

efficiency frontier. Portfolios can be developed based on the producers' risk preferences, whether it is to maximize yield given a target variance or minimize variance given a target yield. The term portfolio originates from finance and refers to a group of financial instruments such as investments, holdings, and funds that are used to stabilize or reduce exposure to the risks of the financial market. The term is appropriate for wheat variety analysis in the sense that creating a portfolio of wheat varieties helps reduce wheat producers' exposure to yield risk.

There are a several recent studies that have used portfolio theory on grain crops including Nalley et al. (2009) on rice varieties grown in Arkansas; Nalley and Barkley (2010) on wheat varietal selection in Yaqui Valley of Northwestern Mexico; Barkley, Peterson, and Shroyer (2010) in Kansas wheat varietal selection; and Park et al. (2012) on wheat selection for dryland wheat producers in the Texas High Plains. This paper applies existing portfolio theory methods to wheat varietal selection to help Colorado wheat producers make more informed planting decisions. Portfolios are created for northeast and southeast Colorado. The estimated standard deviation is used as a proxy for measuring the "risk" or variation of a given wheat variety portfolio.

Although applying portfolio methods to wheat production has been done in Kansas and Texas, this is the first known study to evaluate wheat varieties in Colorado in this manner. This is important because producers in Colorado generally grow different varieties than producers in those states (USDA/NASS Kansas Field Office 2012; USDA/NASS Texas Field Office, 2012). The timing of this present study is especially important given that it includes several popular varieties recently released by the Colorado State University Wheat Breeding and Genetics Program with different trait characteristics designed to address specific Colorado growing conditions.

Methodology and Data

The model used in this study to estimate the efficiency frontier for Colorado wheat varieties is based on research by Markowitz (1952). In this research, the method of minimizing the expected variation, as measured by standard deviation, subject to a given level of expected (mean) yield, is used. The frontier is estimated by solving a sequence of quadratic programming problems.

It is assumed that a wheat producer has a given number of acres (X) and wishes to produce on the efficiency frontier of mean-variance (MV) by allocating X acres to a combination of varieties. The variable x_i represents the percentage of total acres planted of variety i where $i = 1, \dots, n$ and $\sum_i x_i = X$ or 100% of the producer's land dedicated to wheat production. This frontier is the maximization of the mean yields given a target level of variation or the minimization of variation given a target mean yield. By defining y_i as the mean yield of variety i , the total wheat yield will be the weighted mean yield, equal to: $\sum_i x_i y_i$.

The MV efficiency frontier is estimated by minimizing total farm variation (V) for each possible level of mean yields (y_i) as given in equation (1):

$$(1) \quad \min V = \sum_i \sum_j x_i x_j \sigma_{ij}, \text{ for a given level of } \lambda \\ \text{subject to } x_i \geq 0 \text{ for all } i.$$

The total wheat variety yield variation (V) is defined as:

$$(2) \quad V = \sum_i \sum_j x_i x_j \sigma_{ij}$$

where x_i is the percentage of total acres planted to variety i and x_j is the percentage of total acres planted to variety j , σ_{ij} is the covariance of yields for varieties i and j and σ_{ij} is the variance when $i = j$. Hazell and Norton (1986) explain that the intuition behind equation (2) is that by combining varieties that have negatively related covariates, a more stable yield will likely occur. Also, a variety that may appear to be risky or have a large variance can still be an option when combined with a variety that shares a negative covariate.

The constraint ensures non-negative returns after the quadratic (i.e., it is not possible to plant a negative percentage of wheat variety i). The sum of the mean yields for varieties x and y are set equal to λ , where λ is the target yield for a given portfolio:

$$(3) \quad \lambda = \sum_i x_i y_i .$$

By varying the target yield (λ) over the feasible range, the MV efficiency frontier can be estimated. The same process described above can be performed using a target variation (standard deviation) instead of a target yield. This allows a producer to maximize yield for a given target level of variation.

Data on wheat yields are obtained from the Colorado Wheat Variety Database (Colorado State University Wheat Breeding and Genetics Program). Yields from 2000 – 2011 for dryland trial locations throughout Colorado are used to carry out the analysis. The varieties selected are based on three sets of criteria: 1) the variety is tested in the CSU trials; 2) the variety appears within the National Agricultural Statistics Service (NASS) annual publication “Winter Wheat Varieties” for Colorado for the years 2009, 2010, and 2011; and 3) there are at least three years of comparable mean yields between each variety used to estimate the covariates. A total of 13 wheat varieties met the above criteria and are selected for the analysis. The resulting varietal selection can be seen in Table 1.

Table 1. Selected Colorado Wheat Varieties Source, Year of Release, and Percent Planted Acres, 2009-2011

| Variety | Source | Year | 2009 | 2010 | 2011 |
|----------------------------------|---------|-----------|-----------|-----------|-----------|
| Above | CSU | 2001 | 3.2% | 3.2% | 2.8% |
| Akron/Ankor | CSU | 1994/2002 | 2.8% | 2.6% | 1.3% |
| Bill Brown | CSU | 2007 | 0.0% | 2.5% | 5.1% |
| Bond CL | CSU | 2004 | 4.8% | 4.9% | 3.9% |
| Danby | KSU | 2005 | 1.2% | 0.0% | 0.0% |
| Hatcher | CSU | 2004 | 32.9% | 26.5% | 34.5% |
| Jagalene | Agripro | 2001 | 8.4% | 6.8% | 1.6% |
| Jagger | KSU | 1994 | 4.0% | 3.2% | 1.9% |
| Prairie Red | CSU | 1998 | 5.6% | 5.6% | 1.5% |
| Prowers 99 | CSU | 1999 | 2.0% | 1.6% | 0.0% |
| Ripper | CSU | 2006 | 6.8% | 12.5% | 12.1% |
| TAM 111 | TAMU | 2002 | 8.0% | 7.5% | 9.5% |
| Yuma | CSU | 1991 | 2.7% | 1.1% | 0.0% |
| Total Wheat Acres Planted | | | 2,630,000 | 2,478,000 | 2,345,000 |

Source: USDA/NASS Colorado Agricultural Statistics Service.

Summary statistics and the coefficients of variation are reported for the Northeast region and Southeast region of Colorado in Table 2 and Table 3, respectively. Because there are distinct differences in production levels between Northeast and Southeast Colorado, this study divides the data to develop separate wheat portfolios that are appropriate for the given region.

Table 2. Selected Variety Summary Statistics: Northeast Colorado Region, 2000-2011

| Variety | Mean Annual Yield | Standard Deviation | Coefficient of Variation | Min | Max | Observations |
|-------------|-------------------|--------------------|--------------------------|-------|--------|--------------|
| Ripper | 50.48 | 11.84 | 0.24 | 4.76 | 87.65 | 48 |
| Bill Brown | 49.61 | 11.93 | 0.24 | 12.34 | 84.31 | 40 |
| Bond CL | 49.38 | 13.33 | 0.27 | 10.91 | 97.26 | 51 |
| Hatcher | 49.09 | 13.37 | 0.27 | 2.17 | 97.61 | 56 |
| TAM 111 | 47.83 | 15.48 | 0.32 | 4.17 | 101.27 | 47 |
| Above | 47.66 | 12.52 | 0.26 | 5.31 | 93.06 | 61 |
| Jagger | 46.60 | 10.85 | 0.23 | 13.57 | 93.17 | 61 |
| Danby | 46.24 | 14.26 | 0.31 | 3.83 | 83.45 | 40 |
| Prairie Red | 46.02 | 11.17 | 0.24 | 6.02 | 88.47 | 61 |
| Jagalene | 44.88 | 12.26 | 0.27 | 4.34 | 90.57 | 42 |
| Yuma | 44.58 | 12.48 | 0.28 | 6.42 | 93.36 | 52 |
| Akron/Ankor | 41.93 | 11.78 | 0.28 | 3.94 | 89.39 | 47 |
| Prowers 99 | 40.07 | 10.09 | 0.25 | 6.71 | 83.31 | 47 |

Source: USDA/NASS Colorado Agricultural Statistics Service.

In the Northeast region of Colorado, Ripper had the highest average yield at 50.48 bu./ac. followed by Bill Brown (49.61 bu./ac.) and Bond CL (49.38 bu./ac.). Prowers 99 had the lowest yield and the lowest variation (Table 2). In the Southeast region, mean yields are slightly lower than in the Northeast region. Ripper had the highest average yield with 44.86 bu./ac. followed by Bill Brown (44.64 bu./ac.) and Hatcher (44.21 bu./ac.). Similar to the Northeastern region, Prowers99 had the lowest yield (34.04 bu./ac.). However, Akron/Ankor had the lowest variation in the Southeast region (Table 3).

Table 3. Selected Variety Summary Statistics: Southeast Colorado Region, 2000-2011

| Variety | Mean Annual Yield | Standard Deviation | Coefficient of Variation | Min | Max | Observations |
|-------------|-------------------|--------------------|--------------------------|-------|-------|--------------|
| Ripper | 44.86 | 9.30 | 0.21 | 15.03 | 75.59 | 26 |
| Bill Brown | 44.64 | 12.12 | 0.27 | 14.65 | 70.50 | 23 |
| Hatcher | 44.21 | 11.31 | 0.26 | 13.42 | 76.71 | 29 |
| Bond CL | 42.23 | 9.43 | 0.22 | 15.41 | 68.09 | 26 |
| Danby | 41.77 | 10.81 | 0.26 | 13.13 | 68.30 | 23 |
| Above | 40.91 | 8.44 | 0.21 | 13.51 | 62.80 | 32 |
| TAM 111 | 40.53 | 12.67 | 0.31 | 11.70 | 77.38 | 24 |
| Prairie Red | 39.23 | 9.10 | 0.23 | 10.37 | 59.48 | 32 |
| Akron/Ankor | 37.55 | 8.41 | 0.22 | 15.37 | 69.18 | 23 |
| Jagger | 37.01 | 10.18 | 0.28 | 9.99 | 68.80 | 32 |
| Yuma | 36.79 | 9.27 | 0.25 | 16.56 | 71.27 | 26 |
| Jagalene | 36.43 | 11.61 | 0.32 | 14.18 | 74.68 | 20 |
| Prowers 99 | 34.04 | 8.90 | 0.26 | 12.56 | 58.11 | 25 |

Source: USDA/NASS Colorado Agricultural Statistics Service.

Through the application of portfolio theory to Colorado varietal selection, wheat producers can potentially increase yield and reduce variability by combining wheat varieties that respond differently to growing environments. Through the calculation of means, standard deviations and covariates, it can be estimated as to how each variety's yield responds to different environmental factors relative to each of the other varieties. Ideally, varieties that have a negative covariate would be integrated into the planting plans to reduce risk.

Estimation Procedures and Results

Complete data on wheat variety yield means, standard deviations and covariances are used to estimate wheat portfolios along the efficiency frontier. Standard deviations are estimated across years and pairwise covariates of the selected wheat varieties are estimated. By varying the target yield, while minimizing the standard deviation for the given target yield, the optimal portfolios are established and efficiency frontiers are constructed. A Variance/Covariance matrix for the Northeast and Southeast regions can be found in Tables A1 and A2 of the Appendix, respectively.

2011 Actual Portfolio vs. 2011 Potential Portfolio

The following wheat varieties: Above, Akron/Ankor, Bill Brown, Bond CL, Hatcher, Jagalene, Jagger, Prairie Red, Ripper, and TAM 111 were listed in NASS's "Winter Wheat Varieties – 2011 Crop" and accounted for 75.2% of total acres planted statewide (USDA/NASS Colorado Field Office, 2012). The survey also provides the planted acres percentages for the Northeast and Southeast regions. By proportioning the varieties' percentage planted to equal 100%, it allows the estimation of the variation (V) and mean yield (E) for the actual portfolio in 2011 (2011 Actual Portfolio). The variation is then held constant at the 2011 Actual Portfolio level for each region and quadratic programming is used to maximize the mean yield providing an estimate of the 2011 Potential Portfolio for each region.⁶

Northeast Region Efficiency Frontier Portfolio Results

The standard deviation of the 2011 Actual Portfolio (12.91 bu./ac.) was estimated, and the expected yield was maximized using quadratic programming, allowing for the estimation of the 2011 Potential Portfolio for the Northeast region. The estimated yield difference between the two portfolios was nearly 0.5 bu./ac.

Ripper was the highest yielding variety at 50.5 bu./acre (Table 2) and constitutes the highest point on the efficiency frontier (Figure 1). Prowers 99 was the variety with the lowest variation with a standard deviation of 10.09 bu./ac. (Table 2) and is the left most and lowest point on the efficiency frontier (Figure 1). Using these two points as the extremes, an efficiency frontier was drawn between the two points by varying the target mean yield and then minimizing the portfolio variance for the given varied yield. Several portfolios were developed representing the points along the efficiency frontier between the two extremes (Table 4). The portfolios contain the percentage of each variety to be planted in order to obtain certain levels of yield and variation.

⁶ A statewide analysis was also conducted for Colorado. The statewide analysis results are not reported to here to conserve space and because of the similarities between the statewide and regional analyses (specifically Southeast region). The results for the statewide analysis are available from the authors upon request.

Three portfolios offer the lowest coefficient of variation (CV). A portfolio of 89% Jagger and 11% Ripper (CV = 0.23), a portfolio of 59.1% Jagger and 40.9% Ripper and a portfolio of 29.2% Jagger and 70.8% Ripper. These three portfolios could be suggested to those farmers looking to minimize risk while keeping expected yields relatively high. Choosing the latter portfolio would increase yield by 0.25 bushels per acre when compared to the “Actual Portfolio resulting in a \$650,100 increase in production for the Northeast Region.”⁷ Figure 1 shows the steepness of the efficiency frontier drawn by the portfolios found in Table 4.

Table 4. Portfolio Analysis of Northeast Region Wheat Varieties, 2000-2011

| Portfolio | Target Mean Yield (Bu./Acre) | Standard Deviation (Bu./Acre) | Coefficient of Variation |
|---|------------------------------|-------------------------------|--------------------------|
| 100% Prowers 99 | 40.07 | 10.09 | 0.25 |
| 17.8% Jagger 82.2% Prowers 99 | 41.23 | 10.27 | 0.25 |
| 35.5% Jagger 64.5% Prowers 99 | 42.39 | 10.44 | 0.25 |
| 53.3% Jagger 46.7% Prowers 99 | 43.55 | 10.58 | 0.24 |
| 71% Jagger 29% Prowers 99 | 44.71 | 10.69 | 0.24 |
| 87.1% Jagger 1.8% Prairie Red 11.1% Prowers 99 | 45.87 | 10.79 | 0.24 |
| 89% Jagger 11% Ripper | 47.03 | 10.94 | 0.23 |
| 59.1% Jagger 40.9 Ripper | 48.19 | 11.22 | 0.23 |
| 29.2% Jagger 70.8% Ripper | 49.35 | 11.52 | 0.23 |
| 100%Ripper | 50.48 | 11.84 | 0.24 |
| 2011 Actual Portfolio of Planted Varieties in Northeast Colorado^a | 49.10 | 12.91 | 0.26 |
| 2011 Potential Portfolio^b 82% Bond CL 17.7% Ripper | 49.58 | 12.91 | 0.26 |

^a The “2011 Actual Portfolio” defined here is based on the percentage planted from the NASS 2011 publication and those varieties found in the CSU Trials, proportioned to equal 100%.

^b The “2011 Potential Portfolio” is estimated by maximizing the target yield while holding the variance at the 2011 Actual Portfolio variance.

⁷ Estimated by multiplying 0.25 with 394,000 acres of wheat planted (NASS) and a wheat price received of \$6.60/bu for 2011 (NASS).

By moving left from the 2011 Potential Portfolio for the Northeast region towards a portfolio that lies on the efficiency frontier an estimated 11% reduction in risk, as measured by the standard deviation can be achieved without giving up potential yield. In fact, some of the estimated portfolios on the efficiency frontier would both increase expected yield and reduce the variation when compared with the 2011 Potential Portfolio for the Northeast region.

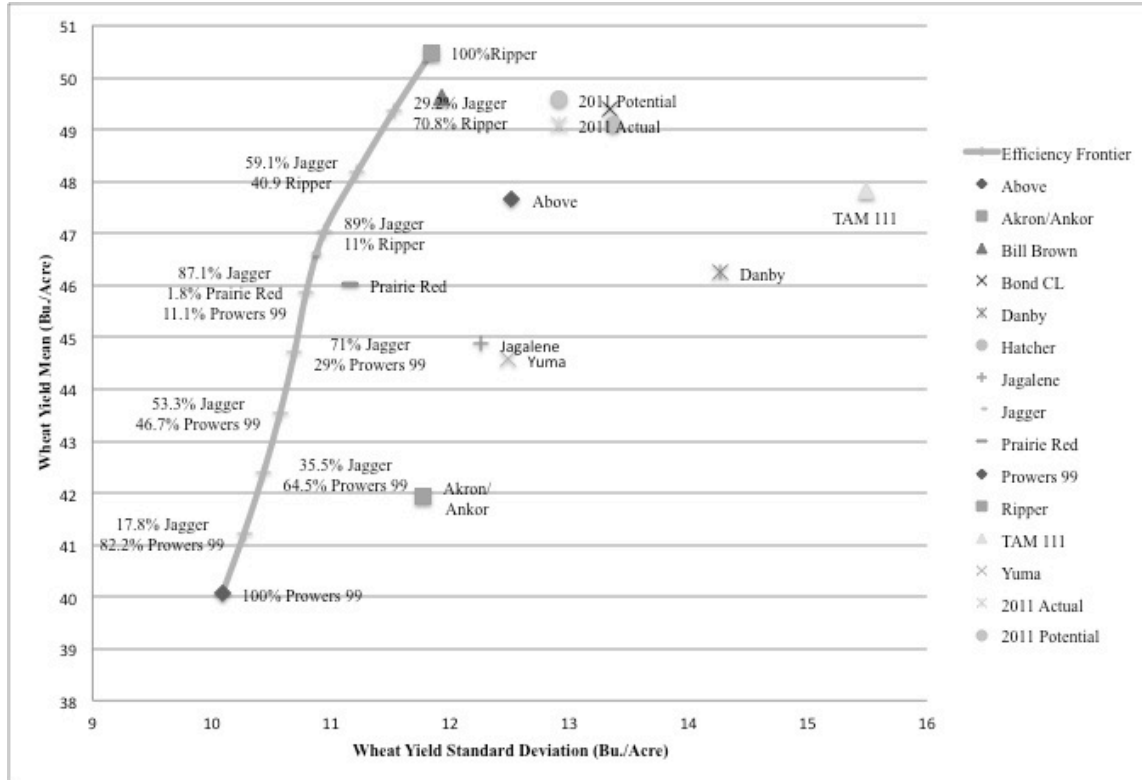


Figure 1. Northeast Colorado Region Wheat Efficiency Frontier, 2011

Southeast Region Efficiency Frontier Portfolio Results

By holding the standard deviation of the Actual Portfolio (11.24 bu./ac.) constant and maximizing the expected yield an estimate of the 2011 Potential Portfolio for the Southeast region can be calculated. The estimated yield difference between the Actual and the Potential portfolio for the Southeast region was nearly one bu./ac. (Table 5).

The Southeast region analysis offers some very interesting results. A single variety did not have the lowest variation, but rather a portfolio produced the lowest variation. This provides empirical evidence towards Hazell and Norton’s (1986) discussion that creating a portfolio of varieties that have negatively related covariates can produce a more stable yielding result. A portfolio of 43.4% Akron/Ankor, 23.9% Prairie Red and 32.9% Prowers 99 would result in a minimized standard deviation of 8.08 bu./ac. in the Southeast region (Table 4), whereas the best any one variety could do is a standard deviation of 8.41 bu./ac..

Table 5. Portfolio Analysis of Southeast Region Wheat Varieties, 2000-2011

| Portfolio | Target Mean Yield (Bu./Acre) | Standard Deviation (Bu./Acre) | Coefficient of Variation |
|---|---------------------------------|-------------------------------------|-----------------------------|
| 43.4% Akron/Ankor 23.9% Prairie Red 32.9% Prowers 99 | 36.80 | 8.08 | 0.22 |
| 22.5% Above 32.4% Akron/Ankor 18.8% Prairie Red 26.3% Prowers 99 | 37.70 | 8.11 | 0.22 |
| 48.3% Above 18.8% Akron/Ankor 11.2% Prairie Red 21.7% Prowers 99 | 38.60 | 8.17 | 0.21 |
| 74.2% Above 5.1% Akron/Ankor 3.5% Prairie Red 17.2% Prowers 99 | 39.50 | 8.25 | 0.21 |
| 92.6% Above 7.4% Prowers 99 | 40.40 | 8.36 | 0.21 |
| 90.1% Above 9.9% Ripper | 41.30 | 8.55 | 0.21 |
| 67.4% Above 32.6% Ripper | 42.20 | 8.77 | 0.21 |
| 44.6% Above 55.4% Ripper | 43.10 | 8.97 | 0.21 |
| 0.2% Above 32.4% Bond CL 67.4% Ripper | 44.00 | 9.11 | 0.21 |
| 100% Ripper | 44.86 | 9.30 | 0.21 |
| 2011 Actual Portfolio of Planted Varieties in Southeast Colorado ^a | 43.84 | 11.24 | 0.26 |
| 2011 Potential Portfolio ^b 28.1% Bill Brown 71.9% Ripper | 44.80 | 11.24 | 0.26 |

^a The "2011 Actual Portfolio" defined here is based on the percentage planted from the NASS 2011 publication and those varieties found in the CSU Trials, proportioned to equal 100%.

^b The "2011 Potential Portfolio" is estimated by maximizing the target yield while holding the variance at the 2011 Actual Portfolio variance.

Using the portfolio with the smallest variation and the variety with the highest yield, a frontier was constructed for the Southeast region that resulted in the portfolios found in Table 5 and depicted graphically in Figure 2. Three of the portfolios offer equal coefficients of variation and could be good recommendations to growers. Portfolios made up of 92.6% Above and 7.4% Prowers 99, 90.1% Above and 9.9% Ripper, or 0.2% Above, 32.4% Bond CL, and 67.4% Ripper all have the smallest CV of 0.21 for the Southeast region. The latter portfolio, when compared to the “Actual Portfolio” offers the potential of an additional 0.16 bushels per acre resulting in an additional value of \$396,000 to wheat producers in the Southwest Region.⁸

A move from the 2011 Actual Portfolio for the Southeast region to the 2011 Potential Portfolio provides a small 2% increase in expected yield while maintaining the same level of variation. However, a leftward movement from the 2011 Actual Portfolio to an estimated portfolio that lies on the efficiency frontier has the potential of reducing risk by 19% as measured by the standard deviation without reducing yield. Furthermore, there are portfolios on the efficiency frontier that offer slight increases in expected wheat yield along with a significant decrease in variation (see Figure 2).

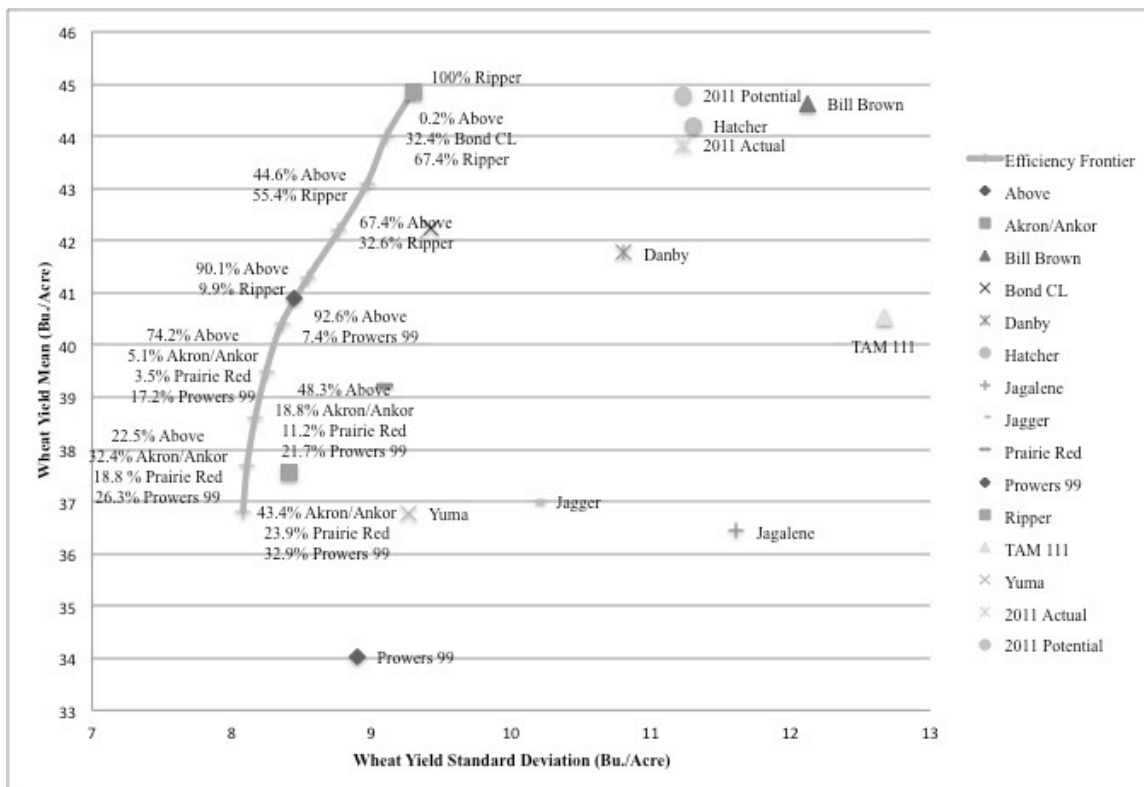


Figure 2. Southeast Colorado Region Wheat Efficiency Frontier, 2011

⁸ Estimated by multiplying 0.16 with 375,000 acres of wheat planted (NASS) and a wheat price received of \$6.60/bu for 2011 (NASS).

Conclusions and Implications

As an addition to the many tools already available to wheat growers in Colorado, the creation of variety portfolios offers a statistical method to help minimize risk and stabilize yields. This application of portfolio theory to Colorado wheat offers a quantitative look at the relationship among wheat varieties. By analyzing the covariates of wheat varieties, growers can take advantage of the ways in which the varieties react to different growing conditions.

This analysis found that double-digit percentage decreases in risk as measured by the standard deviation can be achieved by Colorado wheat producers without sacrificing potential yield. According to our analysis, this potential reduction in risk is greater in the Southeast quadrant of the state than it is in the Northeast (19% versus 11%). Furthermore, it was found that portfolios exist on the risk-return efficiency frontier in both the Northeast and the Southeast growing regions of Colorado whereby wheat producers have the potential to slightly increase expected yield and significantly decrease yield variation.

All varieties included in this study had at least three years of trial data but many had more than three years. Therefore, a couple of acknowledge limitations of this study are that some varieties may look artificially good or bad depending upon the growing conditions for the years they were included in the trial data and the very latest varieties with less than three years of data are not included in our analysis. However, the results of this analysis seem to fit with anecdotal grower experiences over the last several years. This suggests that this study and the model it contains could provide a powerful tool for helping producers make effective wheat variety planting decisions from a risk management perspective.

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Appendix

Table A1. Northeast Variance/Covariance Matrix

| | Above | Akron/Ankor | Bill Brown | Bond CL | Danby | Hatcher | Jagalene | Jagger | Prairie Red | Prowers 99 | Ripper | TAM 111 | Yuma |
|--------------------|----------|-------------|------------|----------|----------|----------|----------|----------|-------------|------------|----------|----------|----------|
| Above | 156.7337 | 145.3474 | 181.2197 | 174.2980 | 200.2007 | 170.4131 | 168.9258 | 130.2716 | 139.0155 | 133.0614 | 155.7298 | 155.7298 | 154.3097 |
| Akron/Ankor | 145.3474 | 138.6889 | 166.1552 | 176.0958 | 200.8963 | 167.5007 | 156.3714 | 125.8534 | 131.3519 | 120.7634 | 169.9424 | 198.1911 | 154.3097 |
| Bill Brown | 181.2197 | 166.1552 | 142.3727 | 154.8137 | 166.8779 | 162.4318 | 163.1433 | 136.9370 | 149.3487 | 169.4237 | 147.8465 | 147.8465 | 161.1132 |
| Bond CL | 174.2980 | 176.0958 | 154.8137 | 177.8010 | 183.4218 | 182.3091 | 164.0084 | 151.7798 | 156.0470 | 163.6424 | 143.8880 | 209.6938 | 189.3869 |
| Danby | 200.2007 | 200.8963 | 166.8779 | 183.4218 | 203.3953 | 198.5493 | 192.0854 | 167.5954 | 177.6258 | 195.6767 | 176.5349 | 256.0343 | 193.6006 |
| Hatcher | 170.4131 | 167.5007 | 162.4318 | 182.3091 | 198.5493 | 178.7384 | 170.9361 | 143.8908 | 151.3601 | 149.8616 | 155.6225 | 155.6225 | 178.0601 |
| Jagalene | 168.9258 | 156.3714 | 163.1433 | 164.0084 | 192.0854 | 170.9361 | 150.2280 | 144.1234 | 152.0757 | 143.6160 | 157.5391 | 180.3579 | 163.5015 |
| Jagger | 130.2716 | 125.8534 | 136.9370 | 151.7798 | 167.5954 | 143.8908 | 144.1234 | 117.6381 | 115.8604 | 112.9358 | 126.9766 | 184.1481 | 135.2790 |
| Prairie Red | 139.0155 | 131.3519 | 149.3487 | 156.0470 | 177.6258 | 151.3601 | 152.0757 | 115.8604 | 124.6576 | 121.2769 | 138.9878 | 191.7038 | 139.3252 |
| Prowers 99 | 133.0614 | 120.7634 | 169.4237 | 163.6424 | 195.6767 | 149.8616 | 143.6160 | 112.9358 | 121.2769 | 101.7585 | 156.9093 | 178.3648 | 129.7346 |
| Ripper | 155.7298 | 169.9424 | 147.8465 | 143.8880 | 176.5349 | 155.6225 | 157.5391 | 126.9766 | 138.9878 | 156.9093 | 140.2153 | 192.5013 | 170.5154 |
| TAM 111 | 155.7298 | 198.1911 | 147.8465 | 209.6938 | 256.0343 | 155.6225 | 180.3579 | 184.1481 | 191.7038 | 178.3648 | 192.5013 | 239.7455 | 205.1560 |
| Yuma | 154.3097 | 154.3097 | 161.1132 | 189.3869 | 193.6006 | 178.0601 | 163.5015 | 135.2790 | 139.3252 | 129.7346 | 170.5154 | 205.1560 | 155.7875 |

| | Above | Akron/Ankor | Bill Brown | Bond CL | Danby | Hatcher | Jagalene | Jagger | Prairie Red | Prowers 99 | Ripper | TAM 111 | Yuma |
|--------------------|----------|-------------|------------|----------|----------|----------|----------|----------|-------------|------------|----------|----------|----------|
| Above | 71.3174 | 67.7452 | 112.1091 | 80.2096 | 103.3449 | 92.7332 | 96.5551 | 79.5357 | 70.1884 | 60.3631 | 80.3758 | 115.6296 | 71.2686 |
| Akron/Ankor | 67.7452 | 70.7528 | 119.4692 | 79.2067 | 114.9311 | 91.6882 | 100.8925 | 82.9447 | 62.8130 | 59.9136 | 76.8059 | 116.3176 | 72.4105 |
| Bill Brown | 112.1091 | 119.4692 | 146.9181 | 123.1223 | 123.4512 | 153.3947 | 142.0586 | 125.2335 | 119.3786 | 143.4522 | 109.9223 | 169.0942 | 142.5819 |
| Bond CL | 80.2096 | 79.2067 | 123.1223 | 88.8406 | 108.2071 | 107.7546 | 89.6794 | 92.5135 | 85.9545 | 90.0164 | 77.8585 | 115.9512 | 91.2421 |
| Danby | 103.3449 | 114.9311 | 123.4512 | 108.2071 | 116.7728 | 135.5307 | 127.7653 | 110.8919 | 111.2004 | 129.9894 | 90.4854 | 155.0817 | 131.9668 |
| Hatcher | 92.7332 | 91.6882 | 153.3947 | 107.7546 | 135.5307 | 127.8755 | 125.2267 | 108.5331 | 93.8531 | 93.8531 | 97.2137 | 148.6502 | 110.1024 |
| Jagalene | 96.5551 | 100.8925 | 142.0586 | 89.6794 | 127.7653 | 125.2267 | 134.7978 | 121.9989 | 100.6282 | 82.8992 | 86.9002 | 143.2513 | 108.5611 |
| Jagger | 79.5357 | 82.9447 | 125.2335 | 92.5135 | 110.8919 | 108.5331 | 121.9989 | 103.6899 | 73.8580 | 84.4621 | 95.8871 | 140.9424 | 94.2968 |
| Prairie Red | 70.1884 | 62.8130 | 119.3786 | 85.9545 | 111.2004 | 93.8531 | 100.6282 | 73.8580 | 82.7742 | 55.8694 | 76.4002 | 122.3268 | 63.9256 |
| Prowers 99 | 60.3631 | 59.9136 | 143.4522 | 90.0164 | 129.9894 | 93.8531 | 82.8992 | 84.4621 | 55.8694 | 79.2211 | 73.9364 | 107.6801 | 72.3909 |
| Ripper | 80.3758 | 76.8059 | 109.9223 | 77.8585 | 90.4854 | 97.2137 | 86.9002 | 95.8871 | 76.4002 | 73.9364 | 86.4532 | 108.1636 | 84.3044 |
| TAM 111 | 115.6296 | 116.3176 | 169.0942 | 115.9512 | 155.0817 | 148.6502 | 143.2513 | 140.9424 | 122.3268 | 107.6801 | 108.1636 | 160.4715 | 128.8454 |
| Yuma | 71.2686 | 72.4105 | 142.5819 | 91.2421 | 131.9668 | 110.1024 | 108.5611 | 94.2968 | 63.9256 | 72.3909 | 84.3044 | 128.8454 | 85.9360 |