

**ECONOMIC EVALUATION OF THE PRUNING FREQUENCY OF PECANS**

**By**

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**STATEMENT BY AUTHOR**

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**DEDICATION**

*To my lovely family and my fiancée Hortensia Lobe*

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**ABSTRACT**

Employing a simultaneous equation model applied to panel pecan data, the study presents a model to quantify the profitability of different annual pecan pruning frequencies. Production data estimated are from The Green Valley Pecan Company (GVPC) located in Sahuarita, Arizona, which started a pruning program 9 years ago. Profit maximization is attained where the value of the marginal productivity exceeds or equals the marginal cost for discrete annual increments. The simultaneous model transposes two major variables: yield and quality. A simultaneous model was utilized to evaluate the tradeoff of pecan yield and quality by computing the marginal productivity of pruning frequency. After estimating the simultaneous design by three stages least squares (3SLS) and progressively adding covariates, we found that the tradeoff between yield-quality and the pruning frequency coefficient were all significant and appropriate to be used in the computation of marginal productivities. The marginal cost was obtained by adding both pruning and processing costs. Optimal pruning frequencies were identified for two price scenarios using the value marginal product marginal cost (VMP-MC) condition where the marginal cost equals the marginal productivity for the Wichita and Western Schley varieties. Under the low (high) price scenario, the optimal pruning frequency is every three (four) years for both varieties.



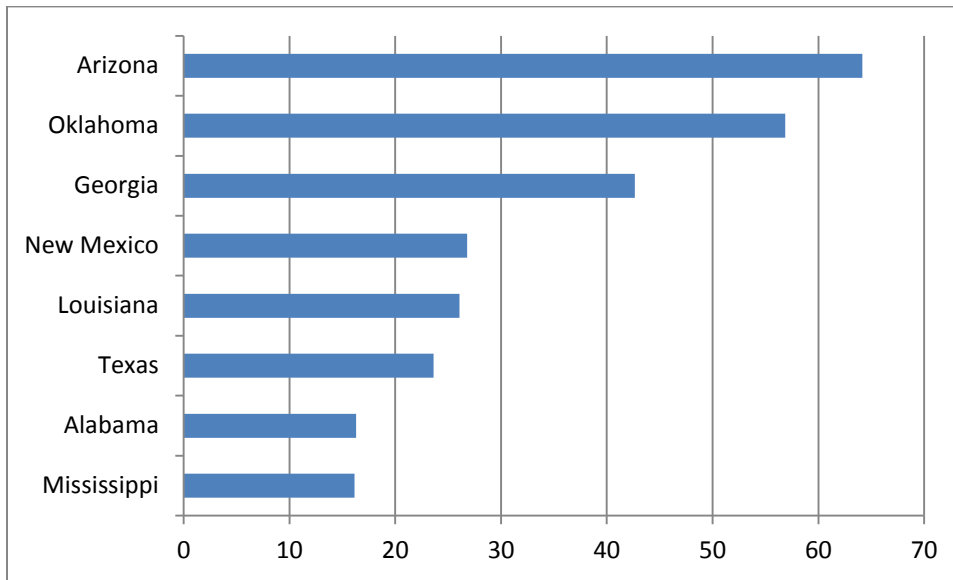
## **CHAPTER 1: INTRODUCTION**

The pecan, *Carya illinoensis*, is a member of the plant family *Juglandaceae*. This family includes walnuts and hickories. Brison (1974), in *Pecan Culture* writes that the pecan is the most important native horticultural crop to the United States. The pecan is a large tree, often growing to 100 feet in height or more and has a stately appearance. It is the state tree of Texas.

### **1.1. The pecan market in the US**

Pecans are the only tree nut native to North America. It is a significant contributor to the agricultural economy in 24 out of 50 states in the U.S. . Pecan production is typically partitioned into four production regions: southeast (Georgia, Florida South Carolina., North Carolina, Virginia, Alabama, Mississippi, Louisiana, and Arkansas), south-central (Texas and Oklahoma), northern (Tennessee, Kentucky, Indiana, Illinois, Iowa, Nebraska, Missouri, and Kansas), and southwestern (New Mexico, Arizona, California, Utah and Nevada). Pecan production practices tend to be similar among these different regions. The U.S. has an estimated 19,900 pecan farms. Most of these (62%) manage more than 15 acres of orchards. There are 905 (5.4%) farms managing more than 100 acres and 124 (0.7%) managing more than 500 acres of trees (Wood, 2000).

**Figure 1: Average pecan acreage per farm**



Worldwide pecan production generally exceeds 250 million pounds of nuts per year. The pecan has been introduced to foreign countries such as Israel, South Africa, Brazil, and Australia, as well as states on the Eastern Seaboard.

## **1.2. Characteristics of pecan production**

Pecan trees, native or improved, are cultivated subject to specific characteristics that can be different across regions or countries.

### *a. Site and soil*

Pecans grow best in alluvial (riverbed) soils that are deep and well drained. However, pecans can be grown in any soil that allows water penetration to a depth of four to five feet or more. Water should be able to move down through the soil (drainage) at a reasonable rate and the soil should not have any layers which would prevent water from draining downward (University of Georgia Pecan Team, 2005). Poor drainage will result

in poor root development which may result in tree death. The majority of pecan roots will be in the top three to four feet of soil. The root system width will be four or more times as wide as the tree canopy.

*b. Tree training*

Many consistently bearing and high yielding pecan varieties like Desirable and Cape Fear are susceptible to limb breakage, particularly during high winds, as a result of weak crotch angles. Proper training of young trees facilitates the development of a strong framework necessary to support wood growth, crop load and prevent limb breakage (University of Georgia Pecan Team, 2005).

*c. Fertilization*

Pecan production requires standard inputs such as fertilizers and pesticides. Fertilizers, including trace elements can enhance yields and compensate for deficiencies in soil productivity detected through soil and leaf analysis. Pesticides are especially important for some regions as pecan trees are attacked by several diseases and are commonly infested by insects that can inflict catastrophic damage to the crop volume and quality. Pecan trees are attacked by fungi such as scab (University of Georgia Pecan Team, 2005), so fungicide treatments must be applied on a regular basis in orchards to control fungal diseases which can interfere with the photosynthesis responsible for the enlargement and filling of nut kernels.

*d. Watering*

Irrigation is used throughout the southwest to maintain soil moisture in order to achieve optimal yield and nut quality. Poor water management can lead to several issues such as poor leaf color, summer water stress and fall stick tights.

*e. Alternative Bearing*

Alternate bearing is a major problem faced in pecan production and occurs when a large crop is followed by one or more years of low to no crop (Florkowski & Elnagheeb, 1993).

**1.3. What is Pecan Pruning?**

Unlike fruit trees, pecans do not require early pruning; in many cases the pruning is only done when the tree is more than 30 years of age.



**Figure 2: Pecan Hedger (courtesy: The Pecan Shed)**



UC Cooperative Extension / Bob Beede

**Figure 3: Pecan Hedger in action (courtesy: The Pecan Shed)**

Pruning is a horticultural tool used by commercial pecan enterprises to prevent orchard crowding and moderate alternate bearing (Wood & Stahmann, 2004). There are three types of pruning: mechanical fruit thinning, selective limb pruning, and mechanized hedge type pruning also called topping.

Mechanical pruning is a common practice to prevent crowding, in dry climate areas such as Arizona and New Mexico where trees are planted closer to each other than in other areas (Lombardini, 2006). Because mechanical pruning tends to be expensive, growers often use selective limb pruning. Selective limb pruning involves creating an imaginary box around the pecan tree with the bottom of the box at a level high enough for sprayers and equipment to pass below. The top of the box will reach 30 ft. above the bottom of the box and the sides of the box will extend half-way to the trees on all sides of the one being pruned. Any limb extending outside the box should be pruned back to an intersection with another limb within the box and removed without leaving a stub. Only one to three limbs are removed from a tree at a time. This helps distribute energy into the remaining limbs and will keep the tree within manageable dimensions for spray coverage. This is probably the most conservative method of opening up the orchard to light for those who are hesitant to remove entire trees. However, this method is very labor intensive and generally costly.

Alternate-row thinning is a common method of getting light into the orchard. This involves removing every other tree (depending on the age of the orchard) in alternating rows, usually on the diagonal. Removing every tree in alternating rows takes out one-half the trees, while leaving them in a square, although the orientation is rotated 45° (Worley, 1991). This type of thinning normally results in a loss of yield per acre for the first few

years after thinning, but the loss will normally be made up in succeeding years. Alternate-row thinning is the most aggressive manner of opening up light to the orchard; it does not take into account the yield potential of each tree and undoubtedly removes some high yielding trees.

Selective thinning is probably the most efficient method of bringing light into the orchard but it can be complicated and labor intensive, and requires knowledge of the orchard and individual trees (Worley, 1991). This method was developed by Dr. Bill Goff at Auburn University and has been used with success in many orchards. Trees are individually rated by making a visual assessment of a tree's profit potential. This is determined by yield, pest pressure, nut quality, and value.

The traditional pruning frequency and method for most growers is to arbitrarily select the rate of pruning and even the type of pruning. More often, decisions about pruning are based on the size of the orchard and the budget; the economic evaluation of this activity is often put aside due to time and budget constraints.

#### **1.4.The Pecan Industry**

The United States is the world's largest producer of pecans (National Agricultural Statistics Service, 2007). The U.S. grows about two-thirds of the world's pecans and consumes about 62% of its own crop (Economic Research Service USDA, 2012). For generations, pecan prices have fallen with bumper crops and soared with bad crops. But lately, they have experienced a solid upward trend.

Players in the pecan industry include growers, accumulators, and shellers. Growers include small-scale backyard operations and commercial orchards extending over

thousands of acres; accumulators are the middlemen between the small-scale growers and shellers. Shellers are the commercial processors of pecans; they convert in-shell to shelled pecans (Ibrahim & Florkowski, 2004) and also clean inshell pecans to marketable pecans.

In Arizona, pecan farms occupied an area of 12,365 acres in 2007 (NASS, 2007). The nuts used in this study were collected from the Green Valley Pecan Company (GVPC), located in Sahaurita in south-central Arizona. Trees were configured in three blocks (Continental-24 and Sahaurita 24 and 29). The three blocks were planted on a 33 x 33 ft square spacing and were either the Wichita or Western variety, both improved varieties.

### **1.5. Field of Study**

The Green Valley Pecan Company operates a large pecan orchard just south of Tucson, Arizona. The orchard produces a crop from which GVPC processes several million pounds a year of shelled, roasted and unroasted, whole, halved, chopped, and ground pecans. Green Valley grows the Western Schley and Wichita varieties, which are well suited to the high Sonoran Desert environment. Vertically integrated, the company raises, harvests, processes, packages, and ships its crop. Established in 1948 by the late Keith Walden on a ranch that in the early 1900s grew guayule plants for rubber, Green Valley Pecan is today owned and operated by Keith's son, Richard (Green valley Pecan Tradition, 2013).



## **History of the Pruning Program**

The pruning program at GVPC started 9 years ago. For practicality, a four year pruning cycle (Walworth, 2012) was initially adopted. In this cycle, each row is pruned once every four years.

## **Research on pecans**

Little economic research has been completed on pecans, particularly the economics of pruning pecans. Most economic research on pecans has taken a global approach, analyzing the industry from the supply or demand side. Florkowski & Elnagheeb (1993), in an attempt to model perennial crop supply (using data from Georgia's pecan industry), used two models to predict the supply of the crop. Their goal was to predict the number of new plants by improving methods for estimating the number of non-bearing trees. Onunkwo & Epperson (1999) focused on the demand side by analyzing the impact of factors such as federal promotion programs<sup>1</sup> on the demand for U.S. pecans in Asia and the European Union. The market price of pecans has experienced a high increase in the last ten years. In a recent study, Ibrahim & Florkowski (2004) provided insights on fluctuations in shelled pecan prices in response to inventories of shelled and in-shell pecans and total stored volumes of pecans, in order to improve the general understanding of the complexities of the pecan market.

Few studies have focused on farm-level management decisions. Springer (2011) developed a net present value model to determine the profitability of planting an irrigated improved pecan orchard. By using financial calculations, he analyzed how land, labor

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<sup>1</sup> These federal programs include Targeted Export Assistance Program (TEA), Market Promotion Program (MPP)

and management activities maximize the expected net return from a farm in southern Oklahoma.

Pecan pruning has received little attention in the literature. Lombardini (2006) conducted an experiment on a non-irrigated pecan orchard for three years, with the aim of comparing light interception and productivity of unpruned mature pecan trees with other trees that were mechanically pruned and selectively pruned. He found that although selective pruning and mechanical hedge pruning translated to some positive effects on light interception yield and nut quality, most of these effects were limited and had disappeared by the third day in more humid areas such as the southeast U.S. Wood (2009) performed a similar experiment for four years in the same area, this time studying the response of 25 year old pecan trees to different mechanical hedgerow type pruning strategies.

Given the general lack of studies related to pecans and nuts in general, this study aims to provide insights into how to utilize a straightforward framework to evaluate the optimal pruning frequency for pecan trees from a commercial orchard. This research is designed to analyze how the outcomes, such as quality of nuts, yield, and profit per acre can be affected by the pruning frequency chosen.

## **1.6. Research problem**

The tradeoff between quality and yield for pecans must be established. Currently, more attention is paid to pecan quality due to market conditions. However, details of the yield-quality tradeoff for pecans have not been formally researched. Understanding the yield-

quality tradeoff will help pecan growers make better decisions on how often they should prune their trees.

An optimization function was formulated to derive the optimum level of pruning frequency to maximize profit. The optimization presented consists of assessing the profit variation subject to two scenarios of relatively high and low prices. The choice or decision variable for this profit maximization problem is pruning frequency, which can take only integer values such as from 1 to 4. In addition to specifying the type of choice variable, it was necessary to determine whether the decision maker would choose from a set of constrained or unconstrained values.

In this analysis, a profit maximization framework was implemented that utilizes a simultaneous model with two equations (yield and quality), we derived the expected Value Marginal Product (VMP) and Marginal Cost (MC) which can help decision makers at GVPC in choosing the optimal pruning frequency which maximizes the profit per pound.

## **CHAPTER 2: LITERATURE REVIEW**

The analysis of dynamics in agriculture has benefited from significant refinements in analytical tools including the development of dynamic programming as well as optimal control methods.

### **2.1. Dynamic optimization in agricultural economics**

Stochastic programming is a framework for modeling optimization problems that involve uncertainty. There is a large variety of approaches for formulating or solving stochastic programming problems under uncertainty. The general stochastic problem is set to optimize (maximum or minimum) a particular objective function  $g(x) = \text{Expected Value } (G(x, w))$  subject to some constraint related to the expected value. The domain of the decision variable  $x$  can be finite (discrete programming) or continuous. Stochastic optimization with recourse is known as sequential decision problems. Bertsekas & Shreve (1996) defined sequential decision models as mathematical abstractions of situations in which decisions have to be taken in several stages while facing costs at each stage.

### **2.2. Stochastic decision solutions vs. mean variance (E-V) models**

For many years optimization was looked at using the mean-variance framework. The mean variance framework which relies on a utility framework that presents a trade-off between risk and return (Markowitz, 1952) is regarded as one of the foundational risk-return theories in financial economics

#### *a. Mean-Variance Model*

The mean-variance optimization framework called E-V was originally developed by Markowitz (1952), and is often used in farm analysis because it incorporates a risk factor in the objective function. Originally deployed in financial economics, the E-V optimization theory has a basic structure such that “an alternative A is preferred to an alternative B if  $E(A) \geq E(B)$  and  $V(A) \leq V(B)$ ” (Hardaker & Tanago, 1973). The E-V model relies on two major assumptions in order to be equivalent to expected utility theory. First, the decision maker’s utility function has to be quadratic and secondly, net returns must be normally distributed (Dillon, 1999).

The E-V optimization framework can be used in several ways and for multiple purposes. Hardaker and Tanago (1973), for example, applied both E-V analysis and the stochastic decision model to assess the results of a systems simulation model of Lucerne haymaking on irrigated farms in southwest Spain. The objective was to choose between two alternative sets of haymaking equipment. Hardaker and Tanago (1973) analyzed the first two moments of the outcomes distribution for the E-V analysis. In order to determine optimal production practices for Kentucky vegetable growers of tomatoes, bell peppers, and sweet corn, (Vassalos, Dillon, & Coolong, 2012), defined their E-V objective function as the maximization of net returns over selected costs, less the risk aversion multiplied by the variance of net returns. Shockley, Dillon, & Stombaugh (2011) developed a resource allocation E-V model in order to assess the risk and production implications of the adoption of auto-steer navigation technology. In some studies, E-V models are modified or combined with a simulation.

### **Shortcomings of the Mean Variance Model**

The mean-variance model first developed by Markowitz faces two major limitations. First, the estimation of the risk by variance is only appropriate in the case of the normality of net returns and that is not always the case. Second, the mean variance framework assumes that investors focus on a single time horizon, with no change in assets.

#### *b. Stochastic decision model in agriculture*

In agricultural economics, stochastic decision models are applied in several ways depending on the crop, the stage of production and the type of decision, such as timing for applying inputs (e.g. pesticides, irrigation, and planting), and agricultural practices (e.g. cutting and pruning frequency).

Blank et.al. (2001) employed a sequential stochastic model to predict how the cutting schedule of alfalfa in California could affect quality and yield, which could affect revenue and thus profit. The first issue dealt with by Blank et.al is the tradeoff between quality and yield, which leads to a tradeoff between yield and price as the agronomic issue of the model. Blank et.al. (2001) found that a shorter frequency of cutting resulted in higher quality but lower yield. Before designing the dynamic decision model, Blank et.al. (2001) converted the agronomic issue to economic metrics where the yield-quality tradeoff becomes a yield-price tradeoff. The objective of the decision model is to maximize the expected utility under risk subject to stochastic change in wealth. Blank et.al. (2001) identified an optimal cutting schedule based on the present value model so that the result of each cutting is a combination of price and yield. Blank et.al. (2001)

divided the decision process into three levels: the choices of 1) a particular cutting, 2) timing of each cutting, and 3) number of cuttings.

Antle et al. (1994) developed a sequential production model where the number and timing of production decisions are all endogenous. The model, applied to the usage of fungicide on Ecuadorian potatoes, considers  $N+2$  stages of production from planting to harvesting so that one can easily derive the endogenous timing variable  $\delta_i = t_i - t_{i-1}$ ,  $\delta_H = t_H - t_N$ ,  $\sum_1^H \delta_i = t_H$ . This model has two major steps. In the first step, he derives a composite production function

$$q_H = q_H[x^H, t^N, \delta^N, \varepsilon^H]$$

The farmer's objective is to maximize expected profit subject to the concavity of the profit function. Therefore, the application of dynamic programming on the farmer's object function yields the following equations:

$$x_i^* = x_i^*[E_{i-1}[p], w^i, q_{i-1}, t_{i-1}]$$

$$\delta_i^* = \delta_i^*[E_{i-1}[p], w^i, q_{i-1}, t_{i-1}]$$

$q_{i-1}$  are not observed econometrically. The composite production function is substituted into the previous equation and yields a system of equations with variables that are all observable and estimable parameters. The approach used to estimate the model was the parameterization of the production functions the first-order condition was then derived and yielded to the demand function. But there are two main issues related to this approach: first, few functional forms provide a closed-form solution to the factor demand equation and, second, the total number of inputs is a random variable. The result, after

OLS estimation, finds a good fit for the demand equation; both the demand and the timing equation are significant functions of price, while the own price elasticity of quantity and timing are significant variables.

Hatch et al. (1989) devised a first probability limit to implement a discrete stochastic farm management programming model. Specifically a sequential decision making model developed for farm-raised catfish. The main objective was to develop a methodology for assessing the economic viability of alternative sequential production strategies using chance constraints.

Larson & Mapp (1997) evaluated alternative cultivar, planting, irrigating and harvesting choices as to how they can affect the expected value for cotton production. For each information scenario (nonupdated, updated, and revised), the objective is to determine the cultivar, planting, irrigating, and harvesting decisions that maximize expected net revenue, minimum net revenue (maximin) and maximum net revenue (maximax)

*c. Discrete stochastic decisions in farm management*

The main drawback of stochastic dynamic optimization relates to the inability of the method to obtain a solution for many problems. However, discrete stochastic programming has the advantage of being more solvable with simpler algorithms that are easier to implement. Discrete stochastic programming is widely used in agricultural economics; Garoian, Conner, & Scifres (1987) used it to determine the optimal burning schedule under uncertainty for rangeland in Texas. Cocks (1968), the pioneer in discrete stochastic programming research, built the framework of discrete programming optimization, starting with the linear programming problem of maximizing an objective



function subject to a set of constraints. The introduction of probability distributions leads to two major approaches, passive and active. In the passive approach, the maximization is done under certainty and the issue is to characterize the prior distribution of outcomes. With the active approach, all resources are allocated in advance and their coefficient values are known so that the optimization is subject to these coefficients.

### **2.3. Profit maximization framework in agricultural economics**

The present study profit maximization framework involves the derivation of the value marginal product (VMP) from the stochastic production using the pruning frequency as the main input. In general according to Beattie et al (2009), the profit is at its maximum level when the VMP equals the Marginal Factor Cost (MC) in a three stage production framework (VMP MC Condition). In agricultural economics profit maximization are designed several ways and for multiple kind of input. First and foremost, the VMP is computed as a product of the Marginal Physical Product (MPP) and the price of the input. The MPP is mostly computed through production elasticity; here the estimated coefficient of the input is multiplied by the average production of that input Beattie et al (2009).

### **2.4. Tradeoff between yield and quality**

The tradeoff between yield and quality is often materialized in agriculture by the fact that farmers want to know how much yield they have to give up in order to produce a higher quality. Orloff et al, (2000), in choosing an optimal alfalfa cutting schedule, designed an equation to express the breakeven point for two cutting timings (t1 and t2), in terms of price (P) and yield (Y) as follows:  $P_{t1} \cdot Y_{t1} = P_{t2} \cdot Y_{t2}$

Manipulating this equation gives a decision rule to aid producers in deciding whether to cut at  $t_1$  (for quality) or at  $t_2$  (for yield). Expressed as a breakeven point, the relationship between price and yield is:  $(P_{t1} - P_{t2}) / P_{t2} = (Y_{t2} - Y_{t1}) / Y_{t1}$  (Yield differential). If the price differential equals the yield differential, both cutting times would result in equal revenues. However, if the price differential (relative change in price from higher quality to lower quality) is greater than the yield differential (relative change in yield between the two cutting times), it is better to cut for quality. Conversely, if the yield differential is greater than the price differential, it is better to cut for yield.

### **CHAPTER 3: MODEL SPECIFICATION AND ESTIMATION METHODS**

Stochastic programming is a mathematical method in which the parameters are replaced by distributions. In order to solve a stochastic programming problem, one needs a model and the values of the parameters.

There can be several kinds of stochastic programming methods, depending on the number of stages, the existence or lack of recourse, and the usage of simulation but three approaches are most often used to solve optimization problems. First, allowing inequality constraints, the Kuhn-Tucker theorem approach to nonlinear programming generalizes the method of Lagrange multipliers, which allows only equality constraints. Second, the maximum principle is an analytical tool widely used to study second-order linear and nonlinear elliptic and parabolic equations. Finally, dynamic programming is both a mathematical optimization method and a computer programming method. In both contexts it refers to simplifying a complicated problem by breaking it down into simpler sub-problems in a recursive manner.

During this research, the value marginal product (VMP) was evaluated as well as the Marginal Cost (MC) in currency per pound with respect to the frequency of pruning; the objective was to choose a pruning frequency which would maximize the profit by having the Value Marginal Product equal to the Marginal Cost. I will first specify the general framework supporting the decision function and, then the specifics of the model as related to the pruning of pecans.

### 3.1. Decision function

#### *a. Basics of two-stages programming with recourse*

For the theoretical model, we developed a two stage stochastic discrete programming framework. The main advantage of discrete programming is that the problem can be formulated in a linear programming framework (Garioian, Conner, & Scifres, 1987).

Two-stage stochastic programming problems derive from models where decisions are taken in two stages and the observation of some random event takes place in between. Hence the first decision must be made when the outcome of the random event is not yet known (Fabian & Szoke, 2000). For example, the first stage may represent the decision on the pruning frequency of the tree; while the second stage represents the decision whether or not to replicate the precedent decision under certain circumstances.

The objective is to maximize the expected profit per acre subject to the fact that price and yield are functions of the pruning frequency. A discount factor  $\beta$  is included in the equation because the decision occurs before the output is realized.

$V_t(pf_x) = MAX \pi^T(pf_x, P_t) + \beta E\{(TVP(hf_x)) - TC(pf_x)\}$ ,  $t=1,2$  are the stages

$$Max E(\pi(pf_x)) = \pi^T(pf_x) + \beta E\{(TVP(pf_x)) - TC(pf_x)\} \quad (3.1)$$

Where  $V_t(pf_x)$  is the present value of the profit per acre,  $pf_x$  is the pruning frequency considered here as our decision variable.  $P_t$  is the price at time  $t$ .

$\pi^T(pf_x, P_t)$  is the first stage profit value. In our case, the first stage is related to all the results and choices prior to the present moment, i.e., prior to the end of 2012.

TVP is the total value product which is equal to total revenue under the assumption of perfect competition in the US pecan market.

TC is the total cost, which takes into account the cost of pruning and the cost of processing. The cost of processing depends on each category of pecans; some of them need more sorting than others. The cost of processing will depend on the cost of one sort.

Max

$$\pi(pf_x) =$$

$$\pi^T(pf_x) + E(\text{Price}(pf_x) * \text{category}\% * \text{Yield}(pf_x)) - (\text{Cost of hedging}(pf_x) + \text{Cost of processing}(pf_x)) \quad (3.2)$$

$$pf_x \in \{1,2,3,4,5\}$$

Subject to

$$(\text{Cost of hedging}(pf_x) + \text{Cost of processing}(pf_x)) < B \text{ Budget constraint}$$

$$\text{Yield}_t = \text{Yield}_t(pf_x, \text{variety}, \text{years}, \text{Yield}_{t-1}, \text{Quality}_t)$$

$$\text{Quality}_t = \text{Quality}_t(\text{Quality}_{t-1}, \text{Yield}_t)$$

*Price* is the price per pound of processed pecan halves. The price per pound depends on the category of pecan (Mammoth halves, Jr Mammoth halves, Jumbo halves, Large and Medium Pieces). Therefore, "*category%*" represents the percentage of each category of pecan in the yield per acre depending on the overall quality (high, low, medium and no cutting). We gathered value for "*category%*" during a field interview with GVPC's

sales VP Bruce Caris and the Plant manager Brenda Lara, who supplied the possible values for " *category%*" depending also on the quality level:

Table 1: Possible values of *category%* depending on the quality

| Categories          | No cutting | Low quality | Medium quality | High quality |
|---------------------|------------|-------------|----------------|--------------|
| Jr Mammoth halves   | 55.80%     | 41.70%      | 51.20%         | 62.30%       |
| Extra large pieces  | 16.47%     | 3.85%       |                | 14.20%       |
| Large pieces        | 16.69%     | 15.64%      | 21.28%         | 15.28%       |
| Large/Medium pieces |            | 1.59%       |                |              |
| Medium pieces       | 3.85%      | 20.26%      | 18.70%         | 3.96%        |
| small/medium pieces | 1.91%      | 3.21%       |                |              |
| small pieces        | 2.71%      | 8.60%       | 4.28%          | 2.43%        |
| midget pieces       | 1.76%      | 2.91%       | 3.22%          | 0.85%        |
| granule             | 0.00%      | 0.04%       |                |              |
| meal                | 0.00%      | 0.04%       |                |              |
| mill loss           | 0.73%      | 2.16%       | 1.30%          |              |

The common way of solving for the present profit maximization consists of finding the level of  $pf_x$  which maximizes the profit function.

$$\frac{d\pi}{dh} = Price(Quality) * category\% * MPP(pf_x) - MC_h(pf_x) - MC_p(pf_x) = 0 \quad (3.3)$$

$MPP(pf_x)$  is the Marginal physical product of pruning,  $MC_h$  and  $MC_p$  are respectively the marginal cost of hedging and processing.

For profit maximization it is necessary to find the level of  $pf_x$  for which the Marginal Value Production equals Marginal Cost

The price  $Price(Quality)$  is a function of the quality of pecan. In the model we assume that each variation of quality affects the variation of the price.  $\Delta Price = \Delta Quality$ , we considered the price with two components ( $\overline{Price}, \Delta Price$ ).

### 3.2. Estimation procedure

#### a. First step: yield and quality

The first step of our specific model consists of getting MPP ( $pf_x$ ) and Quality (Yield)

The MPP is obtained by a regression of the yield on the set of input using a Cobb Douglas production function

$$Yield = A(pf_x)^\beta x^\delta \quad (3.4)$$

$x$  represents other determinants of the yield, such as the average humidity level of year  $t$ , and the levels of nitrogen and zinc applied to the tree.

The choice of Cobb Douglas function is based on the fact that the estimated coefficients are input elasticities. This function allows diminishing returns and is straight forward to estimate econometrically.

We then applied the log to both sides of the equation in order to have a linear model.

For the  $it$  farm's row at  $t$  year,

$$\begin{aligned} \text{Log}(Yield)_{it} = & \beta_0 + \beta_1 \text{log}(Quality)_{it} + \beta_2 Pfx_{it} + \beta_3 WICHITA_i + \beta_4 WESTERN_i + \\ & \beta_5 D2009 + \beta_6 D2011 + \beta_7 D2012 + \beta_8 WICHITA * \text{Log}(Pfx_{it}) + \beta_9 WESTERN * \\ & \text{Log}(Pfx_{it}) + \varepsilon_{it} \end{aligned} \quad (3.5)$$

A major assumption is the tradeoff between yield and quality; therefore, we will use the relation between price and yield of Orloff et.al. (2000) expressed as a breakeven point between price and yield where the equilibrium occurs when price differential is equal to yield differential between two types of pruning frequencies.

$$(P_1 - P_2)/ P_2 = (Y_2 - Y_1)/ Y_1$$

Where  $P_x$  is the average price for a particular  $pf_x$  pruning frequency,  $Y_x$  is the yield for each particular pruning. In a more general frame we have

$$(P_x - P_{x+1})/P_{x+1} = (Y_{x+1} - Y_x)/Y_x \quad (3.6)$$

The equation becomes  $P_{xy}\gamma = Y_{xy}\beta + \varepsilon$  where  $P_{xy}$  the price differential between  $x$  and  $y$  and  $Y_{xy}$  is the yield differential between  $x$  and  $y$ . The price differential can be replaced with a quality differential because the price is closely related to quality in the pecan industry. We can change variations into log transformation and also adapt this differential equation to a panel data structure to have the following:

$$\log(Quantity)_{it} = \alpha_0 + \alpha_1 \log(Quantity)_{it-1} + \alpha_2 \log(Yield)_{it} + \varepsilon_{it} \quad (3.7)$$

Depending on the values generated for  $Quality_{it}$ , during the second stage, we compute the corresponding quality standard (Low, medium and high) and then we will get the quantity related to each category of processed pecans.

These two equations helped predict the yield for each row and kernel percentage.

Finally, we estimate the following system of simultaneous equations:

$$(1) \log(Yield)_{it} = \beta_0 + \beta_1 \log(Quantity)_{it} + \beta_2 Pfx_{it} + \beta_3 WICHITA_i + \beta_4 WESTERN_i + \beta_8 WICHITA * \log(Pfx_{it}) + \beta_9 WESTERN * \log(Pfx_{it}) + \beta_5 D2009 + \beta_6 D2011 + \beta_7 D2012 + \varepsilon_{it1}$$

$$(2) \log(Quantity)_{it} = \alpha_0 + \alpha_1 \log(Quantity)_{it-1} + \alpha_2 \log(Yield)_{it} + \alpha_3 WICHITA_i + \alpha_4 WESTERN + \varepsilon_{it2} \quad (3.8)$$



*Estimation of a dynamic panel data with simultaneous equations*

In the literature, three major procedures are used to estimate a dynamic panel with simultaneous equation. The first consists only of two separate fixed effect (or random effect) estimations of each equation; and the predicted values of one equation will then be inserted as one of the independent variable in the other equation. The second procedure consists of performing a fixed effect transformation before a classic three stages least squares. The third and most tedious method consists of using an error component three stage least square developed by Baltagi (2005). The error component three stage least square method uses dependent variables, independent variables, and instruments corrected by an error matrix combining the within and between error from the two equations. After the estimation of these equations, it is important to compute and test the direct and indirect effects of pruning. As the path diagram shows, the pruning frequency variable has only an indirect effect on the Quality variable of pecan. After sweeping out the fixed effect, the system (3.8) is transformed to

$$\begin{aligned}
 (1) (\text{Log}(\text{Yield})_{it} - \overline{\text{Log}(\text{Yield})}_i) &= \beta_1 (\text{log}(\text{Quality})_{it} - \overline{\text{log}(\text{Quality})}_i) \\
 &+ \beta_2 \text{Pfx}_{it} \\
 &+ \beta_3 \text{WICHITA}_i + \beta_4 \text{WESTERN} + \beta_5 \text{D2009} + \beta_6 \text{D2011} + \beta_7 \text{D2012} \\
 &+ \beta_8 \text{WICHITA} * (\text{Log}(\text{Pfx}_{it}) - \overline{\text{Log}(\text{Pfx}_i)}) \\
 &+ \beta_9 \text{WESTERN} * (\text{Log}(\text{Pfx}_{it}) - \overline{\text{Log}(\text{Pfx}_i)}) + \varepsilon_{it1} \quad (3.9)
 \end{aligned}$$

$$(2) (\text{log}(\text{Quality})_{it} - \overline{\text{log}(\text{Quality})}_i) = \alpha_1 (\text{log}(\text{Quality})_{it-1} - \overline{\text{log}(\text{Quality})}_i)$$

$$+\alpha_2(\text{Log}(\text{Yield})_{it} - \overline{\text{Log}(\text{Yield})}_i)$$

$$+\alpha_3\text{WICHITA}_i + \alpha_4\text{WESTERN} + \varepsilon_{it2} \quad (3.10)$$

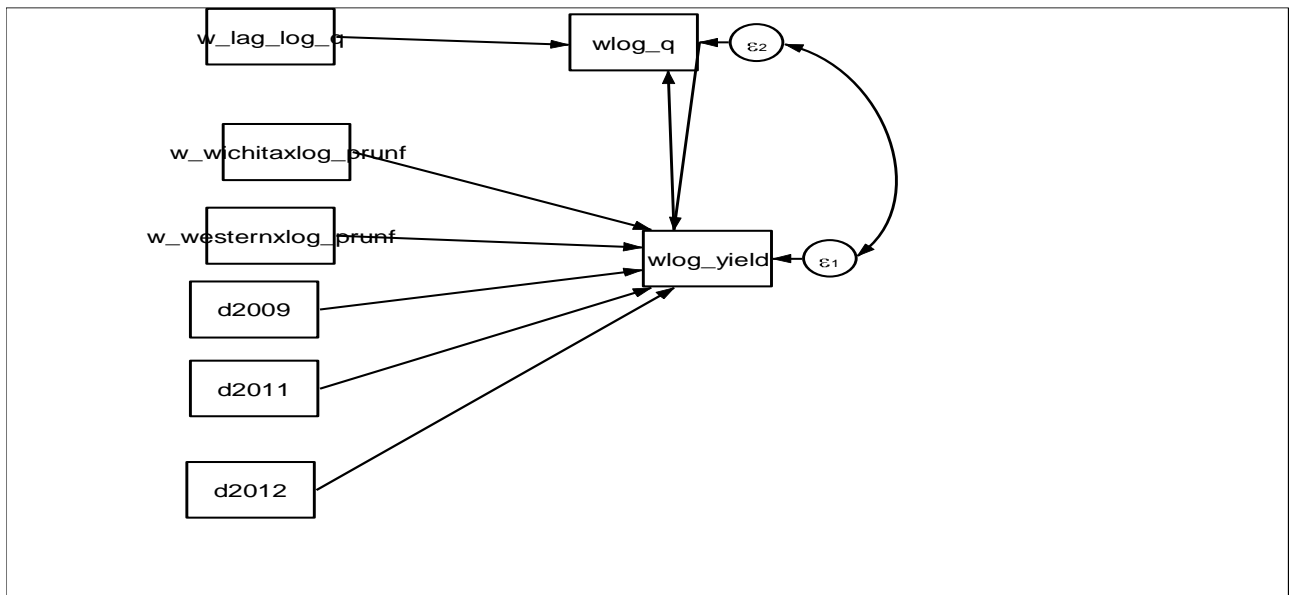


Figure 4: Path Diagram

At the end of the estimation, the MPP will be generated using (Orloff, Ackerly, & Putman, 2000) method of just subtracting the expected yield between two consecutive values  $x$  and  $y$  of the pruning frequency.  $MPP_{xy} = (\widehat{Yield}_y - \widehat{Yield}_x)$  (3.11)

For any given  $\overline{Price}$ , the Value Marginal Product (VMP) is computed as an addition of the MPP valued by  $\overline{Price}$  and the Average expected yield between two pruning frequency  $\overline{Yield}_{xy}$  valued by  $\Delta Price$  ( $\Delta Price = \Delta Quality$ ).

$$VMP_{xy} = \overline{Price} * MPP_{xy} + \Delta Price * \overline{Yield}_{xy} \quad (3.12)$$

*b. Second step: Estimation of the Marginal cost of pruning and processing*

The pruning variable cost is a function of the standard pruning cost per acre divided by the pruning frequency.

The Pruning frequency variable cost (PC) is

$$PC(Pf_x) = \frac{\text{Pruning Cost}}{Pf_x} \quad (3.13)$$

The marginal cost of the pruning (MCPruning) will then be computed the same way as the MPP by just subtracting between two consecutive frequency of pruning

$$MCPruning_{xy} = (PC_y - PC_x) \quad (3.14)$$

The processing cost of inshell pecans varies depending on the sheller because some shellers may have more processing steps than others. In this study we took into account common processing steps such as cracking, shelling, sorting and shelling plus. Each type of processing has a particular cost per pound  $c$ . The marginal cost of processing has two component. The first one is a the average cost times the MPP. The average cost is the difference between shelled and inshell price of pecans.

$$\overline{cost} = \overline{Price}_{shelled} - \overline{Price}_{inshell} \quad (3.15)$$

The first component of the marginal cost of processing  $MCP_{xy1} = \overline{cost} * MPP$  (3.16)

The second component is the cost variation times the average yield between two pruning frequencies. The cost variation here is derived by a linear interpolation from an actual cost variation provided by GVPC. According to GVPC, when the variation in quality goes from good (62.0% kernel) to poor (kernel % of 46.89) i.e.  $\Delta Quality_0 = 15.11$ ,

average processing costs go up by 8.1 cents per pound i.e.,  $\Delta Average Cost_0 = 8.11$  cents. For each  $\Delta Quality$  between pruning frequencies,  $\Delta Average Cost_{xy} = \Delta Quality_{xy} * \Delta Average Cost_0 / \Delta Quality_0$  (3.17)

The second component of the marginal cost of processing is then

$$MCP_{xy2} = \Delta Average Cost_{xy} * \overline{Yield}_{xy} \quad (3.18)$$

The Marginal Cost of Processing ( $MCP_{xy}$ ) is then generated by the summation of  $MCP_{xy1}$  and  $MCP_{xy2}$ .  $MCP_{xy} = MCP_{xy1} + MCP_{xy2}$  (3.19)

The Marginal Cost (MC) is just a summation between Marginal Cost of Pruning and Marginal Cost of Processing.

$$MC_{xy} = MCP_{pruning_{xy}} + MCP_{xy} \quad (3.20)$$

## CHAPTER 4: EMPIRICAL RESULTS

### 4.1. Data

The data were collected by a team from the department of Water and Environmental Sciences (SWES) during the 2009, 2010, 2011, 2012 and 2013 harvest seasons. They began in 2009 by monitoring pruned Wichita and Western Schley trees to evaluate the impact of pruning. In 2009 and 2010 they began monitoring Wichita trees planted in 1967 and spaced 30 feet apart in rows, and Western Schley trees planted in 1969 on 60' x 60' foot spacing.

The nuts were harvested using a Thomas bank-out runner; the runners were weighted empty and after collection to generate the net weight and yield for each row of interest. Afterwards, the researchers took samples of 100 and 50 nuts to be graded and weighed.

Starting prior to the 2006 growing season, trees had been side-hedge pruned approximately 20 feet from their trunk, with about a 5° angle. Western Schley trees are topped at 50 to 60 feet at the peak, and angled at 45°. Wichita trees are topped at 50 feet.

Each year the team separately harvested rows of trees that had been pruned 1) in the previous winter [labeled '1<sup>st</sup> leaf'], 2) two winters prior [2<sup>nd</sup> leaf], 3) three winters prior [3<sup>rd</sup> leaf], and 4) four years prior [4<sup>th</sup> leaf]. Nuts were graded to separate marketable nuts, stick-tights, and pre-germinated nuts. Marketable nuts were weighed, shelled, and graded (Walworth, 2012).

#### 4.2. Variables description (including descriptions of how each variable reacted to changes in pecan pruning)

The dataset used for this study is a panel with 248 data points representing 76 rows, of 2 varieties, Wichita and Western Schley, and located in three areas: Sahaurita 24 (Sah24), Sahaurita 29 (Sah29) and Continental 24 (Cont24). Most of the rows in Sah24 and Cont24 were monitored for 4 years, from 2009 to 2012,; data from Sah29 were collected for two years, 2011 to 2012. Thus, the panel data is unbalanced.

Table 2: Number of observations per location and variety

| location       | variety |         | Total |
|----------------|---------|---------|-------|
|                | Western | Wichita |       |
| Continental 24 | 80      | 0       | 80    |
| Sahaurita 24   | 0       | 112     | 112   |
| Sahaurita 29   | 0       | 56      | 56    |
| Total          | 80      | 168     | 248   |

In this study, three main variables were used to find the optimal value of the Value Marginal Product: pruning frequency, yield, and quality.

##### *a. Pruning frequency*

The decision variable, pruning frequency, is represented by leaf, which describes the number of seasons after the most recent pruning. The normal sequence of pruning should have an increasing pruning frequency on each row from 2009 to 2012; thus, the year 2012 should not have a 1 season pruning frequency treatment in a normal sequence. During the period of observation, pruning frequencies from 1 to 4 were equally applied to all the rows within the two locations. Sah29 did not have treatments in the years 2009 and

2010. In 2012 GVPC changed the sequence of treatment on many rows; that is why in 2012 they started to apply a pruning frequency of 1 and 2. In a few rows a pruning frequency of 5 was applied.

Table 3: Number of time each leaf treatment was evaluated

| Pruning Frequency | 2009 | 2010 | 2011 | 2012 | Total |
|-------------------|------|------|------|------|-------|
| 1                 | 12   | 12   | 19   | 19   | 62    |
| 2                 | 12   | 12   | 19   | 17   | 60    |
| 3                 | 12   | 12   | 19   | 18   | 61    |
| 4                 | 12   | 12   | 19   | 17   | 60    |
| 5                 | 0    | 0    | 0    | 5    | 5     |
| Total             | 48   | 48   | 76   | 76   | 248   |

*b. Yield*

In this study, the proxy of the yield is the quantity per acre of cleaned in-shell pecans harvested from selected rows. The alternate bearing characteristics are quite similar among varieties but more intense for the Wichita variety.

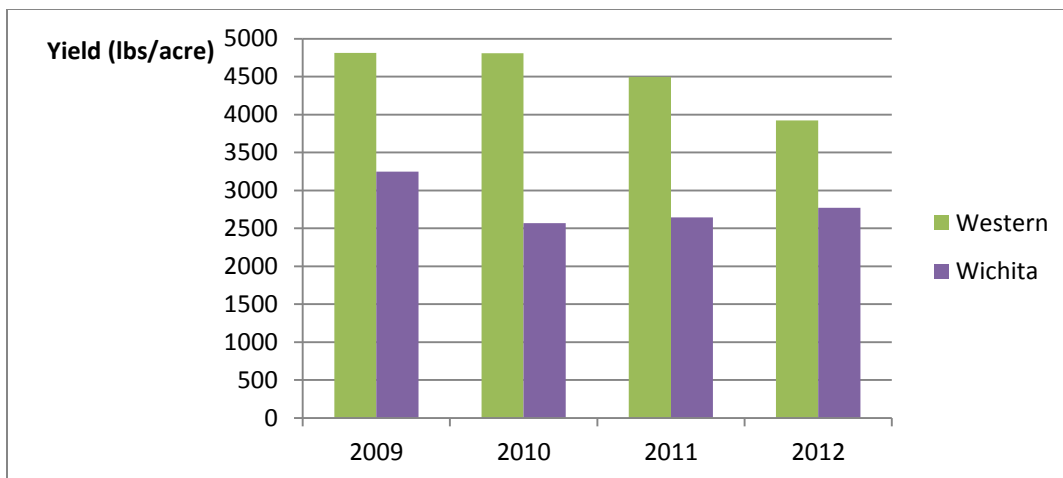
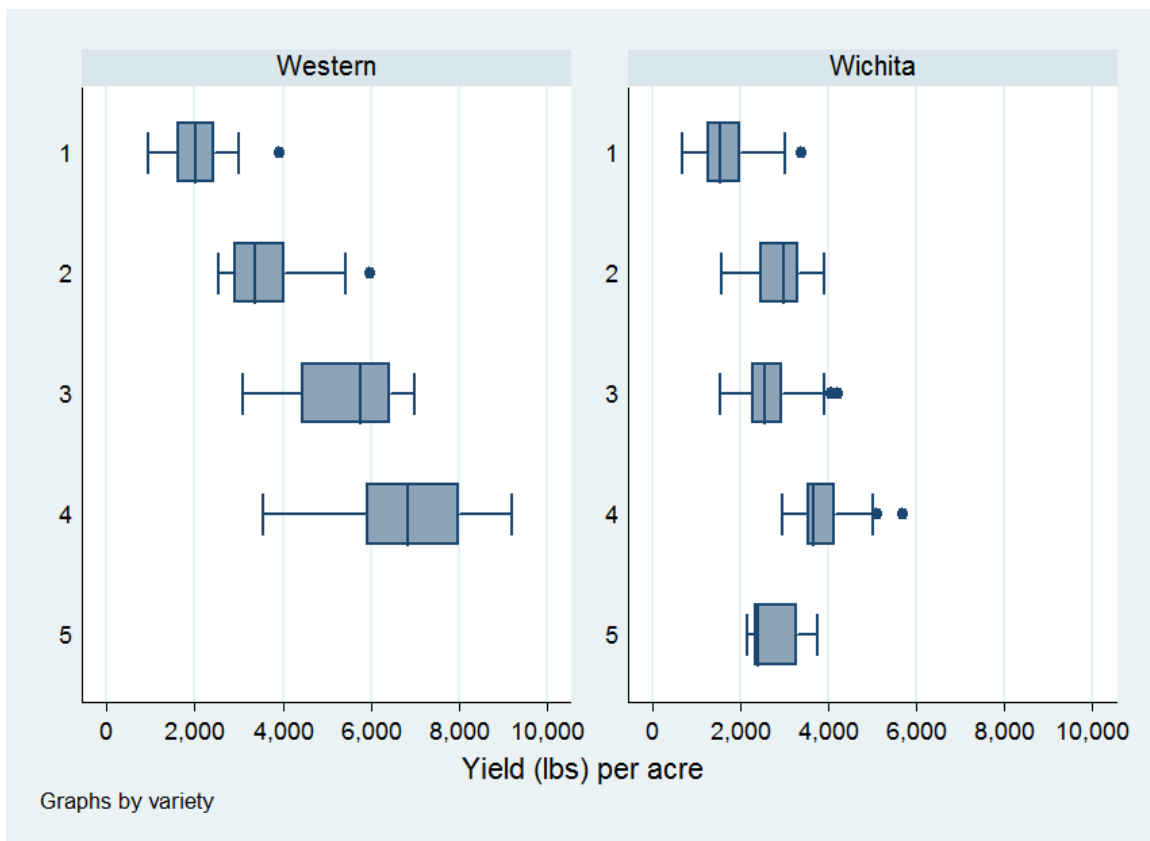


Figure 5: Variation of the average yield by year, by frequency

By including the pruning frequency, the alternative bearing assumption is highly observable for the Wichita. But, for the Western Schley the yield appears to be significantly higher and increasing as the pruning frequency decrease.

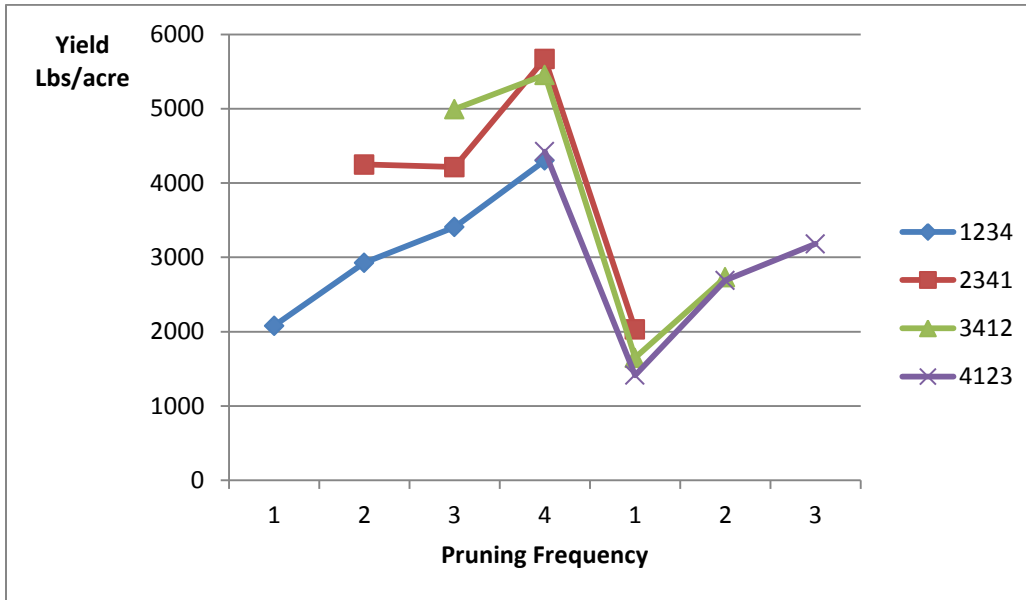


**Figure 6: Yield per acre patterns across pruning frequency values**

Depending on the pruning frequency sequence used, there is also a strong variation in yield per acre. Looking at Figure 7, for the normal constant sequence 1234, the average yield shows a constant increase between 2009 and 2012. In every case when the trees were pruned after many seasons, i.e., the pruning frequency 4 to 1, the average yield

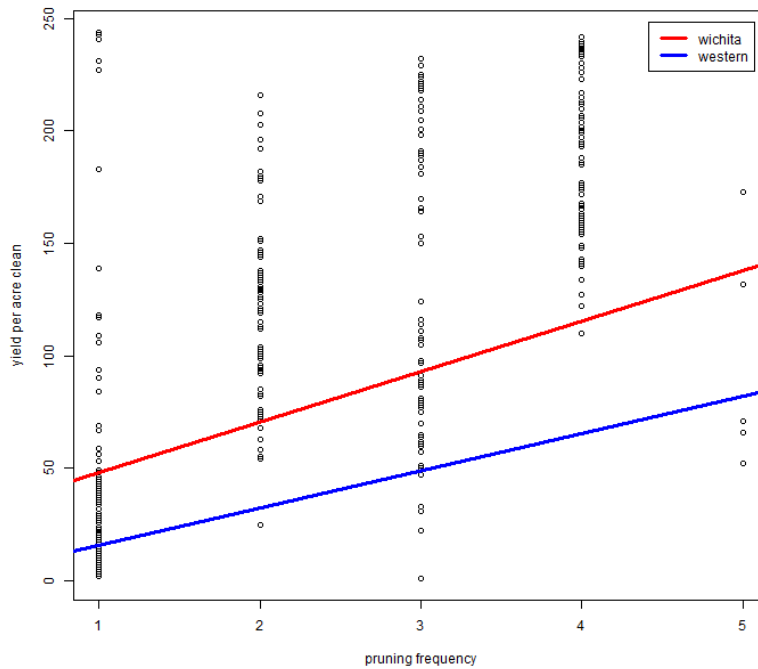


experienced a sudden and consistent drop, indicating a strong response in yield to pruning frequency variation.



**Figure 7: Variation of the yield per acre for each sequence of pruning**

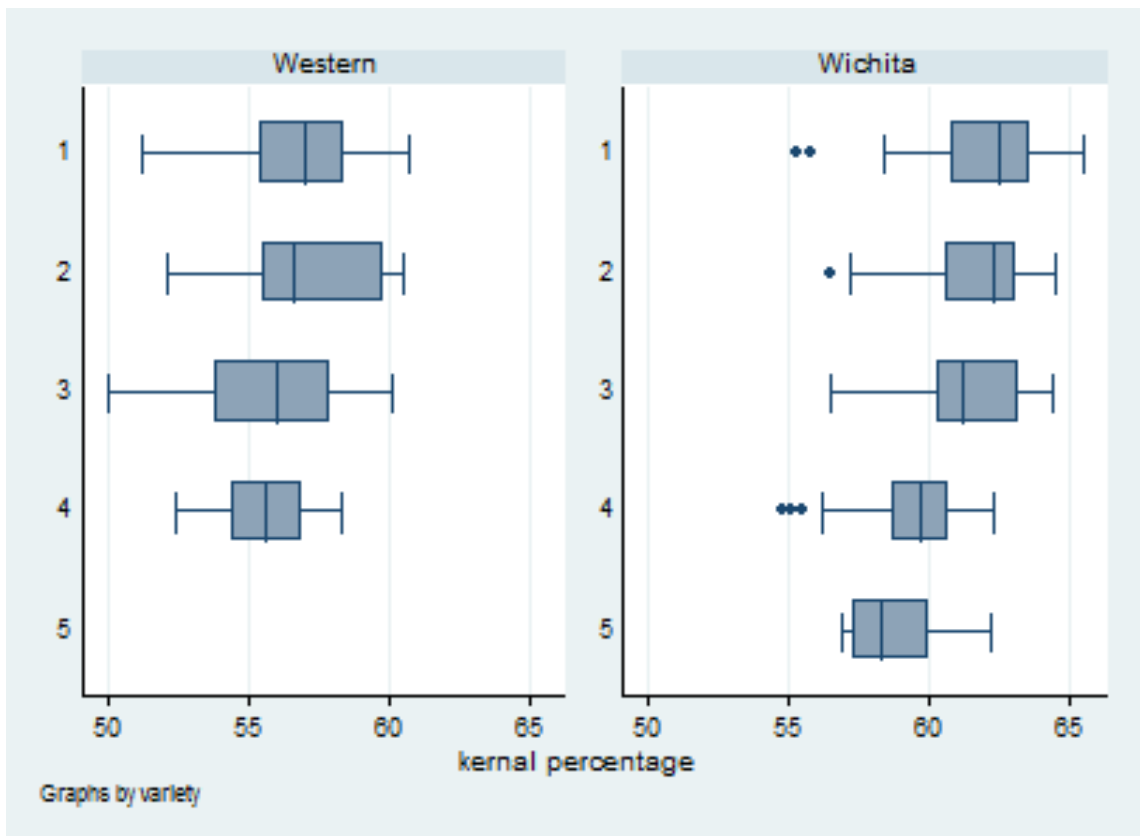
Differentiating these effects by varieties shows more divergence in the response of the yield per acre to the pruning frequency. Looking at scatter plot in Figure 8 of a basic regression of yield per acre on pruning frequency, the response shows a similar path depending on the variety, Wichita or Western Schley. In the estimation we made two variety dummies to interact with the pruning frequency to test the significance of each variety in response to the treatment.



**Figure 8: Effect of the pruning frequency on the yield for Wichita and Western Schley**

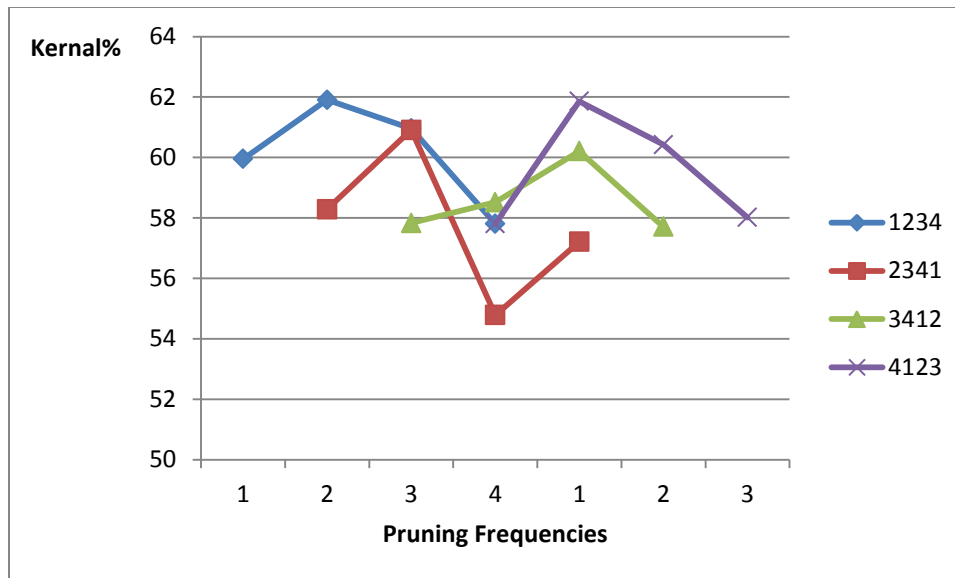
### *c. The Quality*

The main quality variable is kernel percentage, which is the percentage of nutmeat from a sample of 50 nuts. Other quality variables are also used, such as the *Blackeye* percentage, *pregerm* percentage and *insect* percentage. Kernel percentage is key in maximizing farm profitability (Wood, 2009). Kernel quality shows different patterns depending on pruning frequency; the median of the quality variable is higher for lower pruning frequencies.



**Figure 9: Distribution of the kernel quality variable**

The kernel quality variable shows an opposite response (compared with the yield's response) to each different sequence of pruning frequency. The kernel percentage, on average, decreases when the number of seasons between pruning treatments becomes higher. In addition, when pruning after a longer period (when the sequence changes from 4 to 1), quality consistently improves. Pruning also seems to have a strong effect on variations in nut quality.



**Figure 10: Kernel percentage variation for alternative pruning sequences**

The pruning frequency affects yield and quality differently; when pruning happens after many seasons there is a drop in terms of yield per acre but an amelioration of the quality, so the tradeoff between yield and quality needs to be formally quantified.

### 4.3. Estimation Results and discussion

#### *a. Hausman test for the fixed or random effect nature of the observation*

In order to remove the panel effect before estimating the simultaneous equation system, we have to know whether the effects are fixed or random. In other words, we need to perform a Hausman test. Commonly in agricultural design, effects tend to be fixed because each individual plot may experience specific other treatments such as sunlight, level of nitrogen, watering, etc.

Fixed and random effect models were estimated for each of the equations and we found that the fixed effect was the logical approach to each equation. We modeled yield and

quality as an endogenous variable with their regressors as instrument. The main difficulty consisted in dealing with an incomplete or unbalanced panel dataset. Observations from the Sah29 location were collected for only two years instead of 4.

*b. Simultaneous estimation results*

After performing a within transformation by removing each time the group mean for each row, two three-stage least squares were estimated for the simultaneous equations and the results are summarized in Table 4. Two models were specified to ascertain whether interactions between pruning frequencies and variety in the yield equation were statistically significant..

Table 4: Coefficient estimates for 3SLS<sup>2</sup>

|                                  | Model    |           | Equation2: Within Log(Quality) | Model     |           |
|----------------------------------|----------|-----------|--------------------------------|-----------|-----------|
|                                  | 1        | 2         |                                | 1         | 2         |
| Equation1: Within Log(Yield)     |          |           | Equation2: Within Log(Quality) |           |           |
| Within Log(Quality)              | -2.739** | -1.497**  | Within Log(Yield)              | -0.319**  | -0.328**  |
| Pruning Frequency                | 0.218**  | -0.0128** | Within Lag Log(Quality)        | -0.035**  | -0.03**   |
| Wichita                          | -0.56**  | 0.0131**  | Wichita                        | 0.00061   | 0.000619  |
| Western Schley                   | -0.545** | -0.010**  | Western Schley                 | -6.62E-08 | -6.68E-08 |
| Wichita X Log(Pruning Frequency) |          | 0.580**   |                                |           |           |
| Western X Log(Pruning Frequency) |          | 0.860**   |                                |           |           |
| d2009                            |          | 0.203**   |                                |           |           |
| d2011                            |          | -0.035    |                                |           |           |
| d2012                            |          | 0.00014   |                                |           |           |
| System R <sup>2</sup>            | 0.4612   | 0.708     |                                |           |           |

<sup>2</sup> (\*\*) significant at 5%, (\*) significant at 10%

Pruning frequency alone has a significant positive effect on the variation on yield. When we take the pecan variety (Wichita or Western) into account the effect does not change in sign, but the pruning treatment induces more substantial yield fluctuation for the Western variety. The more seasons there are between subsequent pruning treatments, the more the yield will increase. These results are consistent with Worley (1991), for whom yield reductions are always expected after heavy pruning. In order to improve yields, the farm manager should wait the maximum number of seasons between pruning treatments.

The yield-quality tradeoff, respectively represented by the negative sign taken by both endogenous variables in the two indicating as the literature suggesting that a higher yield leads to a lower quality. The tradeoff is consistent in the two models, and it suggests that the pruning frequency affects indirectly the quality thru the yield.

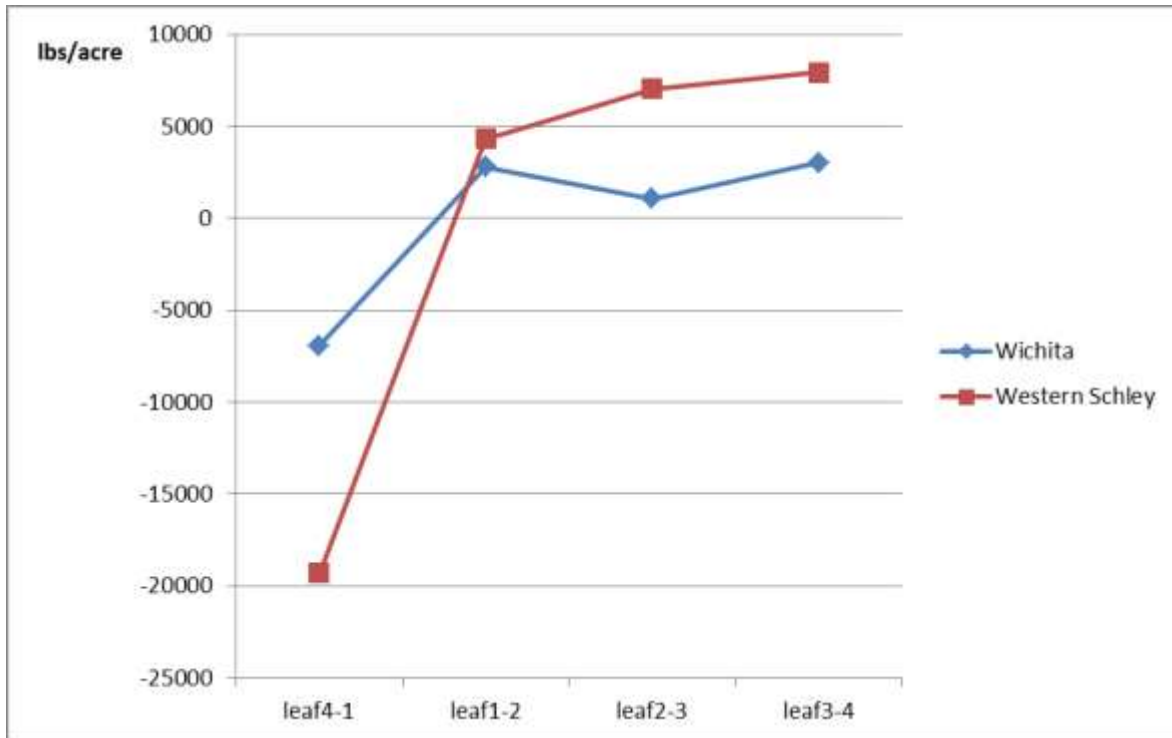
The Year dummies don't play a significant role on the yield per acre variation except for 2009. The year dummies indicate that only 2009 is substantially different from the base year of 2010. Year dummies can account for climate, humidity, and other natural effects that may vary by year.

#### **4.4. Profit per acre maximization**

##### *a. Marginal Physical Product (MPP)*

The MPP is computed as mentioned earlier in Chapter 3 in equation (3.14) and it is calculated using the differences between two consecutive pruning frequencies. The expected yield values were computed using the coefficients resulting from the second estimation. In the following Figure 14, the MPP for Wichita and Western both reach their

maximum positive variation of yield at a pruning frequency of 4 which is consistent with the descriptive statistics. Both varieties experienced a significant drop at the change of sequence from 4 to 1.



**Figure 11: MPP for Wichita and Western**

In both case, the change of sequence was done to improve the quality. Figure 15 below maps the variation of quality for the two varieties. When the pruning frequency change from 4 to 1, the quality improves significantly for both varieties, the Western Schley is more responsive to the change. The Wichita has a prior improvement of quality at a pruning frequency of 3.

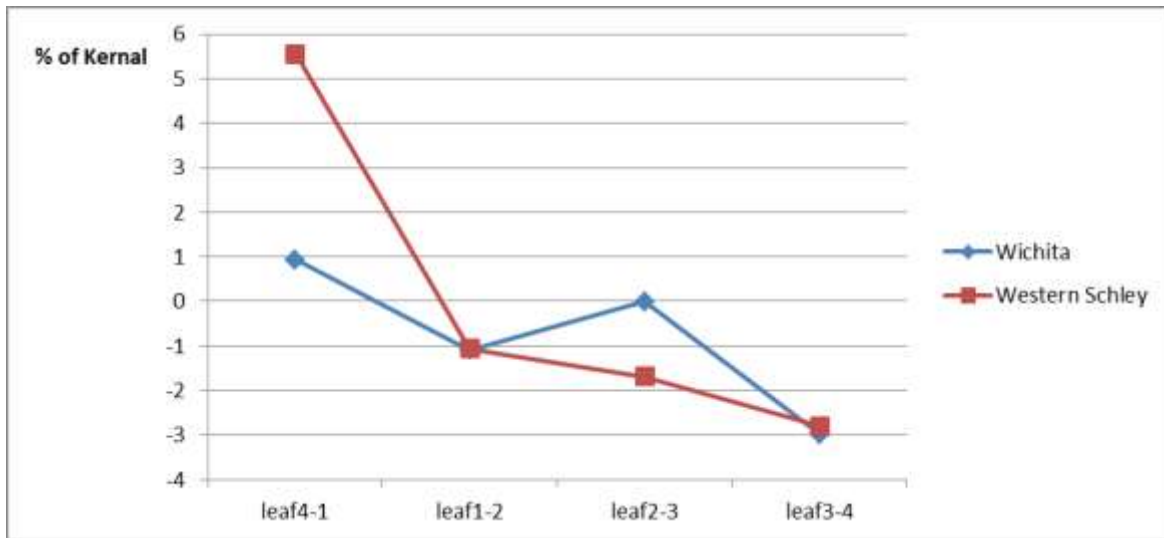


Figure 12: Marginal Quality for Wichita and Western

*b. Value Marginal Product (VMP)*

The expected VMP values as mentioned in chapter 3 are computed by multiplying Price by the MPP plus adding any price differential for quality times the average expected yield for the next pruning frequencies. We used Price values of \$ 3.5 and \$ 6 for our low and high price scenarios. These numbers represent price of one pound of processed pecan halves. In the following Figures (13 and 14), the farm's revenue per pound is decreasing as the number of season between pruning decrease in the two scenarios. The Western Schley in the first scenario is experiencing an increase because of the significant increase in yield when a change is made between the pruning frequencies of 4 and 1.



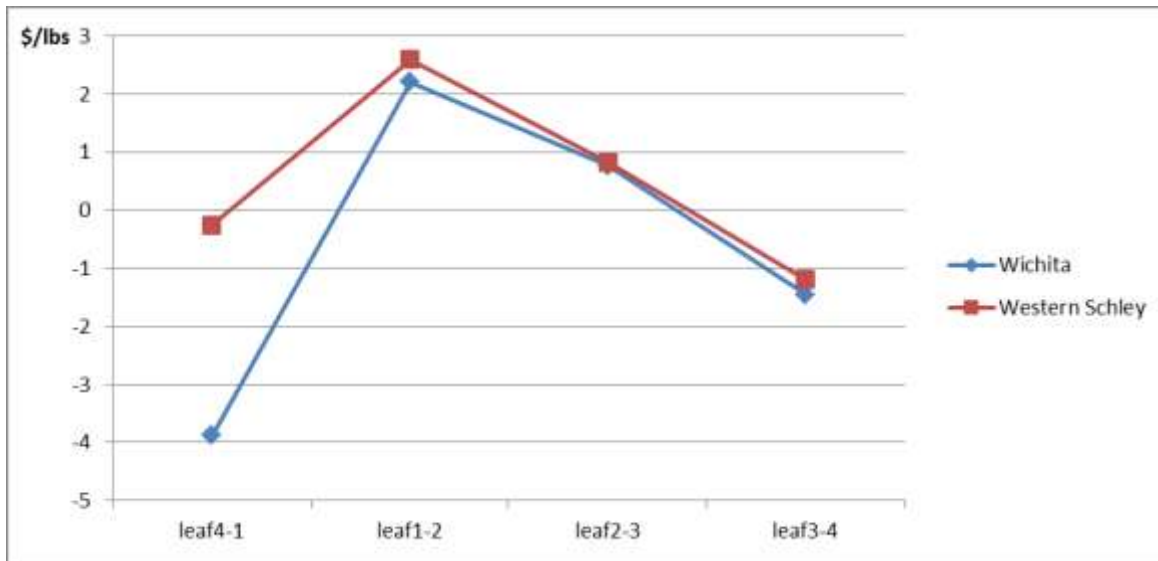


Figure 13: VMP Low Price Scenario P=\$3.5

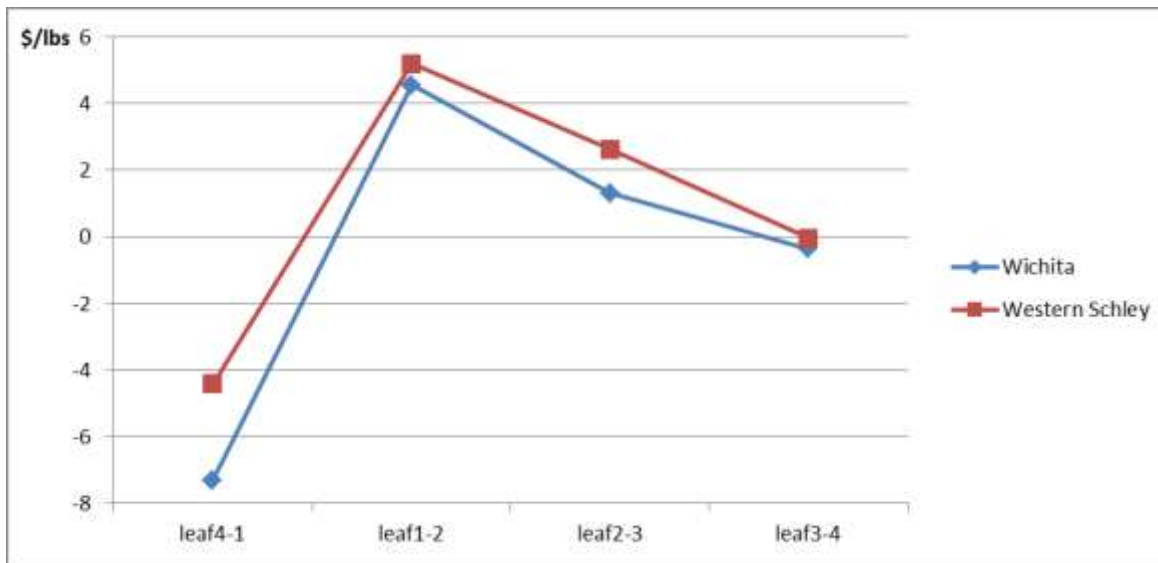


Figure 14: VMP high price Scenario P=\$6

*c. Marginal Cost*

As mentioned in the preceding chapter, the marginal cost computed the same way as the MPP using equation 3.15 to 3.19

According to an interview with one of GVPC's pruning program manager, the pruning cost is around \$290 per hour and the topping cost is around \$270 per hour. At GVPC they can hedge prune around 8 to 10 acres per hour and top 5 to 7 acres per hour. The final

cost of hedge pruning per acre will be around \$ 29 to \$ 36.25 and the cost of topping is around \$ 38.57 to \$ 54, for a total of \$ 92.57 per acre.

During the processing of pecans, as mentioned earlier in Chapter 3, pecans are given a hot water bath for disinfection and then are cracked and shelled, just the same as the small batches. After being shelled, they are sized into pecan halves and pieces and are picked clean by human eyes. There exist many types of processing, depending on the market, the consumer, and nut quality. We summarized each type of processing with its related estimated cost taken from a sheller's website (Russell's Pecan Orchards). Unfortunately, we did not have access to GVPC's estimated processing cost information.

Table 5: pecans processing costs

| step          | Description  | Estimated cost  |
|---------------|--|-----------------|
| cracking      | Nuts are processed through a cracking machine. After cracking, nuts are processed through an air cleaner to remove as much shell and unwanted debris as possible.  | 0.40 per pounds |
| shelling      | Nuts are cracked and then processed through a shelling machine set for the correct size of pecan. After shelling, nuts are processed through an air cleaner to remove as much shell and unwanted debris as possible. | 0.85 per pounds |
| Satake Sort   | Including cracking and shelling, this process uses air, infrared and near-vision sensors to remove rejects, i.e., black, or dried-up halves, along with heavy shells.  | 1.25 per pounds |
| Shelling plus | After being cracked, shelled, and sorted, nuts are then sent to a processing room where all shell material is removed.   | 1.50 per pounds |

Source: (<http://www.russellspecans.com/services.htm>)

There were sufficient insights about the type of processing used by GVPC in order to use one the previous cost of processing, we then used equation 3.8 and derived an average cost of \$2.27 by using the inshell price of 2007 for improved varieties and a shell price of

3.5 corresponding to our low price scenario. We then added the marginal cost of processing to the one of pruning using equation 3.23.

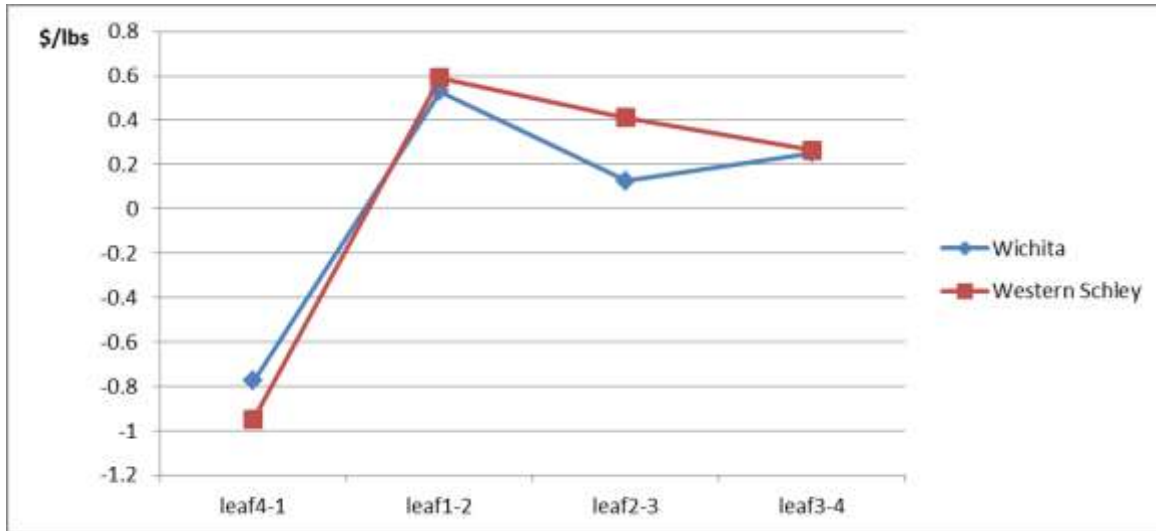


Figure 15: Marginal Cost for Wichita and Western Schley

d. *VMP-MC decision*

The decision under the scenario of low price guides us to a pruning frequency of 3 for both Wichita and Western Schley. When the price is low, the company should wait the third season after the pruning before reaching the maximum profit per pound.

For the high price scenario, the optimal value of the pruning frequency shift from 3 to 4. There a shift of optimal pruning from the low price scenario to the high price scenario because in the low price scenario profit maximization is obtained through the quality. for a pruning frequency of 3 as described in the descriptive statistics, the quality is higher for both varieties and the yield is just above average. In the pecan market, when price is low, customers are more discerning of quality of the nut and the farm management has to choose the pruning frequency improving the quality.

The yield reaches its maximum level for both varieties at a pruning frequency of 4. When the price is high, customers are demanding a high quantity of nuts and they are less concerned about quality, the farm management will then need a considerable amount of nut to satisfy the demand. They may then choose a pruning frequency which maximizes the yield with an above average overall quality.

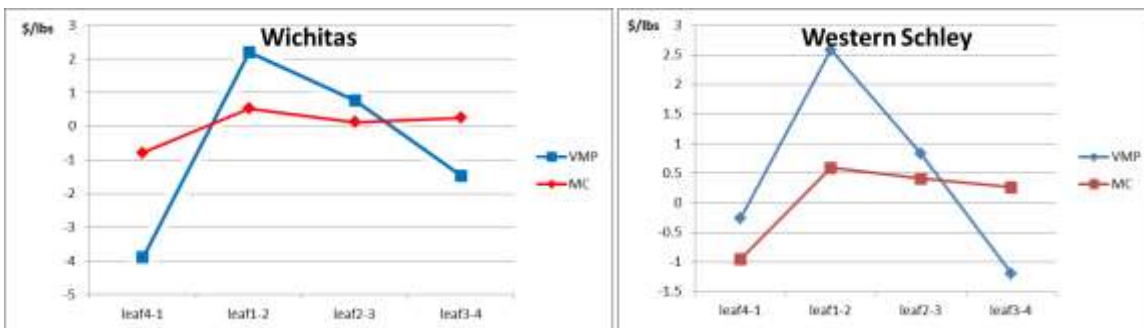


Figure 16: Profit Maximization Low Price Scenario

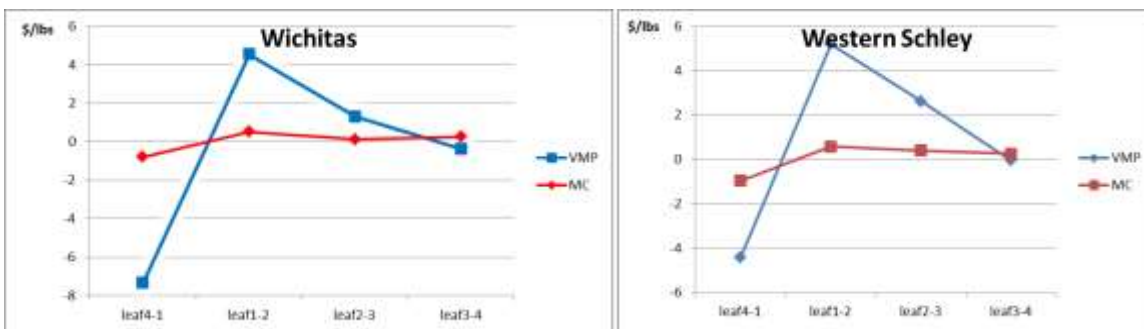


Figure 17: Profit Maximization High Price Scenario

These results give useful informations to the farm management in choosing the optimal pruning frequency. When the market has a low price, they can choose to prune pecan trees every three season to maximize the quality in order to face the competitiveness of the market because customers are more sensitive to the quality of nuts. An improved quality will also reduce the processing cost that will keep the company competitive. In another hand, when the price goes up, and customers need more nuts than the market can supply, the farm management will then move from a quality goal to a yield maximization goal

because customers are less concerned by the quality than in the preceding low price scenario. The farm management chooses an optimal pruning frequency of 4 which maintain an average quality but improve substantially the yield.

These results are affected by two situations one is market related: the Law of supply and another one more specific to the crop: the tradeoff yield-quality. GVPC with these optimal results could use the situation they have on hand to respond to any market and price fluctuation. When market prices fall, the only way to make revenues higher again is by improving the quality of nut. The quality of the nut as mentioned here is improved by choosing a pruning frequency maximizing the kernal percentage and any other techniques related to watering, fertilization. The improvement of the quality would lead to a decrease in yield. An improved quality will also mean a significant decrease of processing cost.

When market prices rise, GVPC could adjust by making some concessions on the quality in order to get higher yield. Increasing the production is the best way to increase the profit in a high price scenario.

## CHAPTER 5: CONCLUSION

In farm management, optimization implies obtaining maximum possible net benefit over time from farm system operations. For pecan growers and shellers, pruning is one of those decisions for maximizing profit. Throughout this study, we presented the specificities of the pecan industry; in Chapter one we described more precisely how the pruning of the pecan plays an essential role in reducing orchard crowding and slowing alternate bearing. Three methods of pruning are often used: mechanical fruit thinning, selective limb pruning, and mechanized hedge type pruning. The pecan industry in the U.S. is composed of three main actors, growers, accumulators, and shellers. GVPC, a sheller located in Sahuarita, Arizona, 9 years ago started a pruning program by arbitrarily selecting a frequency on alternate rows within 3 locations (Sah24, Cont24, and Sah29). After this 9-year period, enough data was available to more formally analyze the effects of the pruning frequency on nut quality and per acre yields. The model consisted of maximizing the expected profit per acre subject to major constraints restraining the expected yield and quality values to functions of other variables, such as the yield per acre and prior year's quality, pruning frequency, and the dummy variables related to varieties and years. The value marginal product and marginal cost condition (VMP-MC) was used as the optimization framework which was then summarized in a simultaneous equation model involving panel data. We used a simultaneous design because throughout the literature on pecans, most studies noticed a tradeoff between yield and quality. If growers want more yield they will lose in quality and vice versa.

This relationship between yield and quality was estimated using a simultaneous two equation model. A fixed effects model was determined most appropriate. Thus, the fixed

effects were swept out by performing a within transformation and then estimating a regular three stages least squares model of simultaneous equations with no constant terms. We did the estimation by progressively adding covariates. Results from the estimated model showed a strong positive effect on pruning frequency for yield regardless of the variety of pecan (Wichita or Western Schley). Results imply that the more seasons between pruning treatments, the better the yield. We also found that the yield-quality tradeoff represented by the negative signs in both endogenous variables of Yield and Quality was significant in all the models.

The MPP and VMP were generated from the estimated coefficients. For both varieties, the MPP reached its maximum level at a pruning frequency of 4. The VMP was computed by multiplying Price by the MPP plus adding any price differential for quality times the average expected yield under two prices levels (low: \$3.5/lb. and high: \$6/lb.) representing average low and high prices of processed pecans.

We then computed the Marginal Cost (MC), which is a sum of the marginal costs of pruning and processing. The marginal cost of pruning was computed by using a variable cost of pruning divided by the pruning frequency. Two components were used for the computation of the marginal cost of processing. The first component, is the difference between the average price of shelled and inshell pecans for 2007, or marginal processing costs for season average quality. The second component is the cost variation associated with lower quality and the labor associated with more processing for lower quality nuts.

The optimal pruning frequency was then chosen using the VMP-MC condition. Under the low price scenario, the optimal pruning frequency is nearby the third leaf which is the

leaf maximizing the quality for both varieties. The optimal leaf for the high price scenario is located around four years. These results suggest that pecan producers need to shift in how aggressively their pecan trees are pruned, depending on market price levels.

Throughout this study there are some relevant limitations. An improved analysis could be done if prices were made stochastic. However, given that a one year shift in pruning frequency results between the low and high price scenario, it is doubtful that much benefit would be derived from treating price as a stochastic variable. More detail regarding how pecan processing costs shift from having high versus low quality nuts be useful to compute more accurate marginal costs. A general cost analysis across shellers would have also helped us to understand the specificities of the costs of processing pecans.

The dataset used had 245 observations over only 4 years of data; this study could have drawn better empirical results if the sample was larger or the treatments were observed for more years. During the present research we were not able to have a control sample with rows that were not pruned at all. A control sample would have served as a validation or comparison to the optimization framework.

An instrument to explain Quality that does not directly impact Yield (e.g., possibly night temperatures) would improve the simultaneous modeling approach. The study may also be improved by adding more input covariates in the yield equation in order to sustain the effect of the pruning frequency.



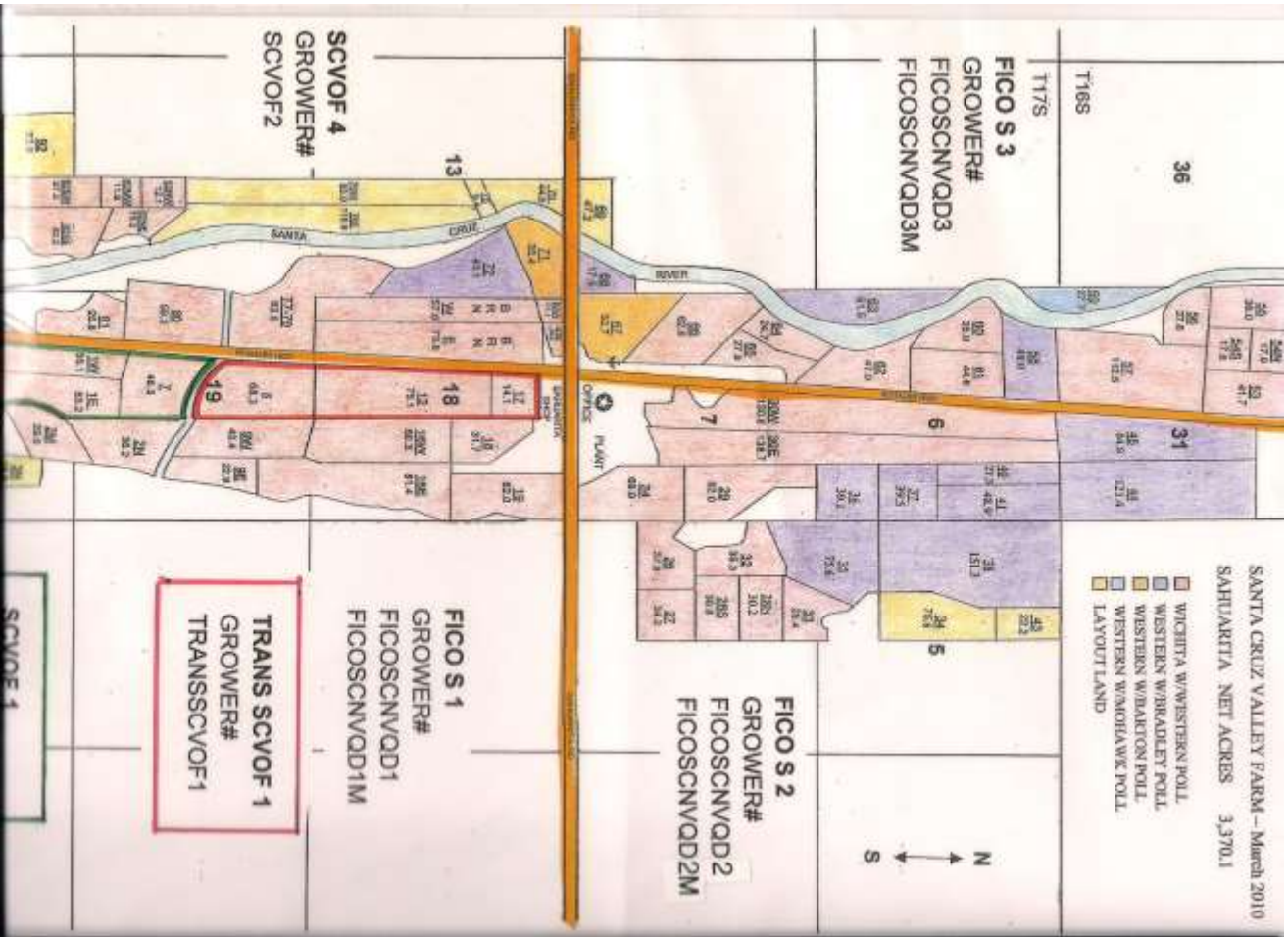
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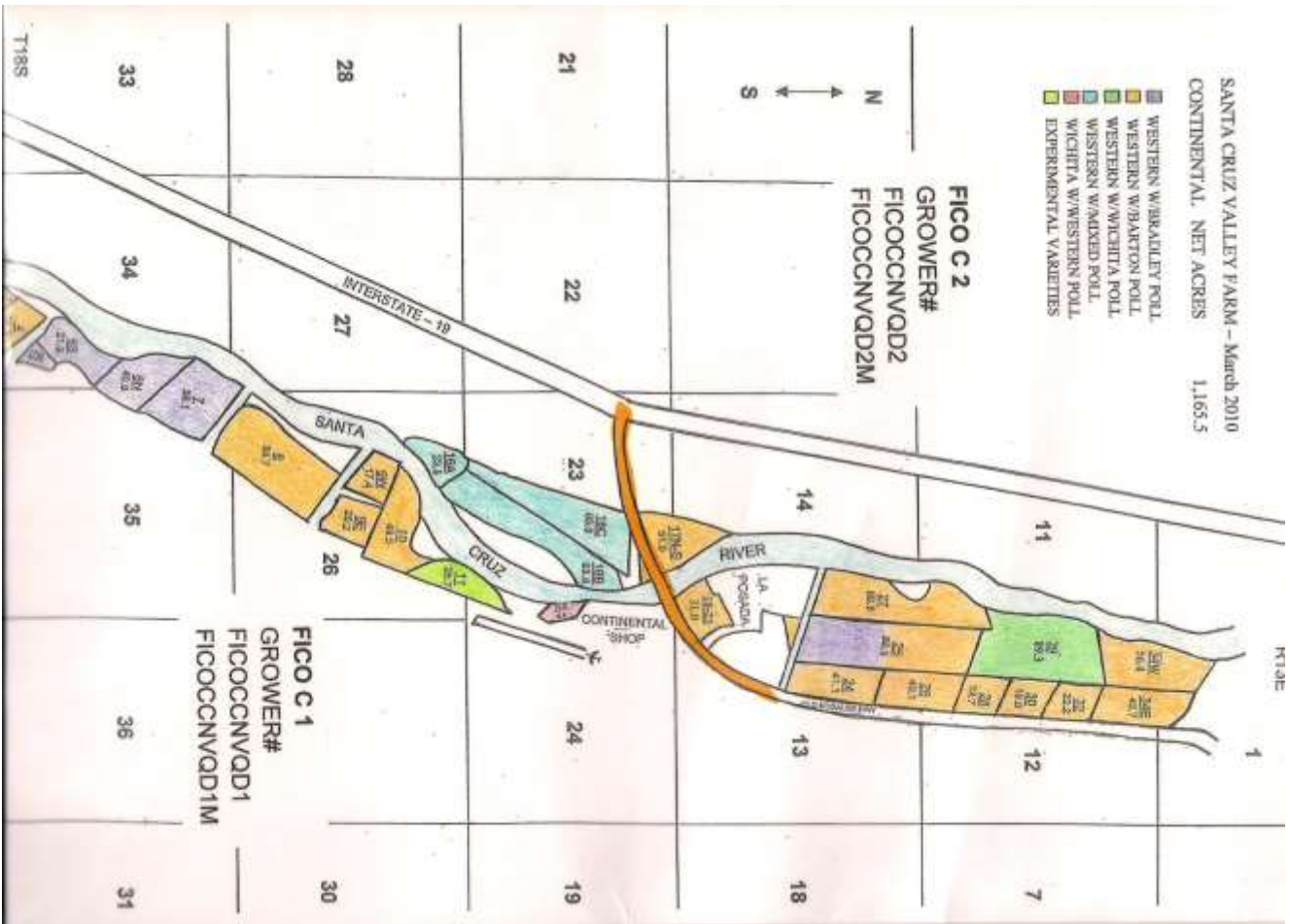
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Appendix 1A Map of the Study Area: FICO S 2, FICO S 1, FICO S 3, SCVOF 4, SCVOF 1 AND TRANS SCVOF 1

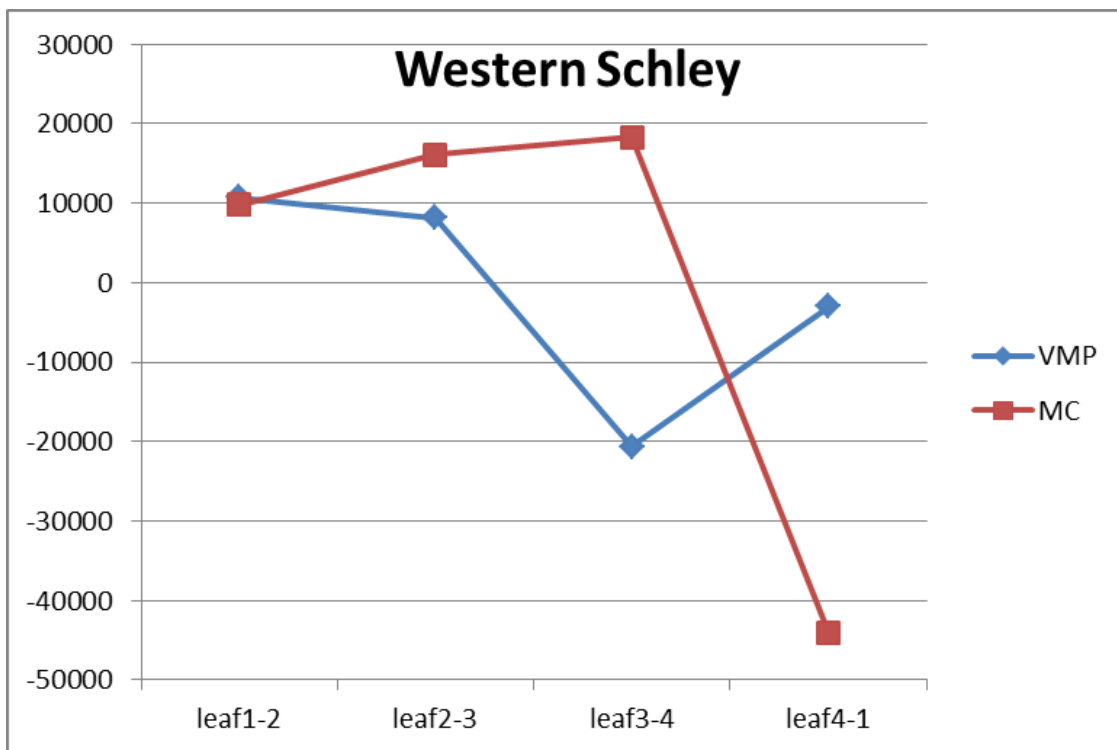
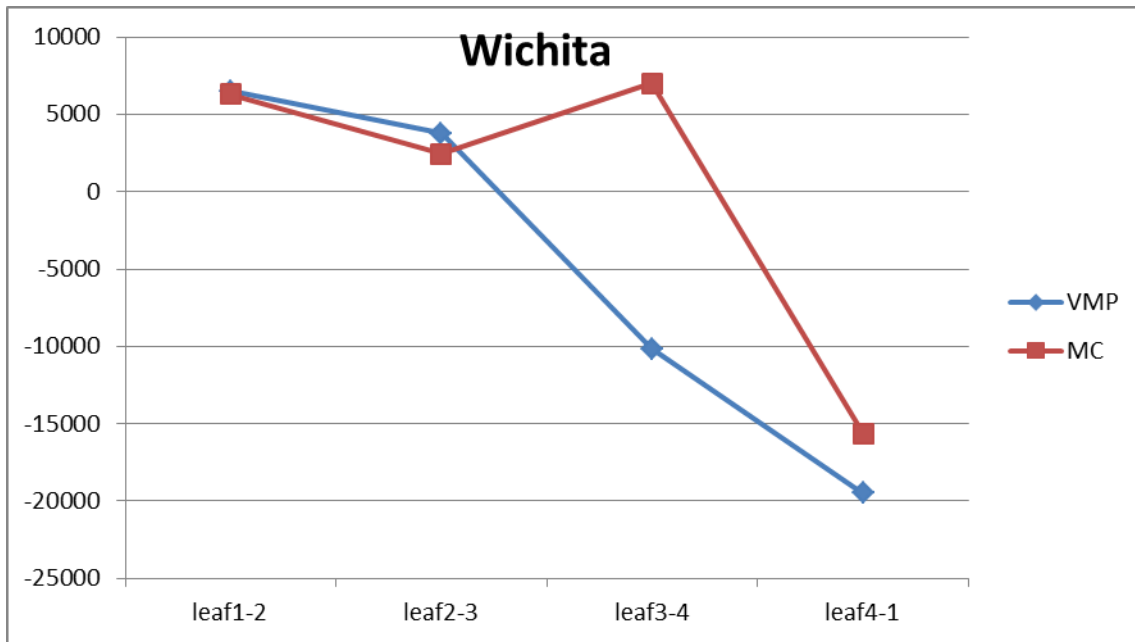


Appendix 1B: Map of the Study Area: FICO C 1 AND FICO C 2



## Appendix 2 Price and Production of Inshell pecans from 1980 to 2010

| Year | Improved varieties 1/ |             |         | Native and seedling |             |         | All pecans 2/ |             |         |
|------|-----------------------|-------------|---------|---------------------|-------------|---------|---------------|-------------|---------|
|      | Production            | Price       | Value   | Production          | Price       | Value   | Production    | Price       | Value   |
|      | 1,000 lbs             | Cents/pound | \$1,000 | 1,000 lbs           | Cents/pound | \$1,000 | 1,000 lbs     | Cents/pound | \$1,000 |
| 1980 | 128,500               | 84.8        | 109,015 | 55,000              | 62.3        | 34,254  | 183,500       | 78.1        | 143,269 |
| 1981 | 174,550               | 64.7        | 112,987 | 164,550             | 43.7        | 71,855  | 339,100       | 54.5        | 184,842 |
| 1982 | 169,000               | 72.6        | 122,776 | 49,600              | 49.8        | 24,715  | 218,600       | 67.5        | 147,491 |
| 1983 | 167,250               | 67.7        | 113,199 | 102,750             | 44.0        | 45,190  | 270,000       | 58.7        | 158,389 |
| 1984 | 169,230               | 68.2        | 115,406 | 63,170              | 46.6        | 29,424  | 232,400       | 62.3        | 144,830 |
| 1985 | 152,500               | 79.1        | 120,582 | 91,900              | 49.7        | 45,706  | 244,400       | 68.0        | 166,288 |
| 1986 | 182,650               | 79.3        | 144,765 | 90,050              | 57.6        | 51,884  | 272,700       | 72.1        | 196,649 |
| 1987 | 179,650               | 60.1        | 107,953 | 82,550              | 37.7        | 31,156  | 262,200       | 53.1        | 139,109 |
| 1988 | 185,500               | 62.6        | 116,210 | 122,700             | 41.1        | 50,448  | 308,200       | 54.1        | 166,658 |
| 1989 | 161,000               | 78.6        | 126,491 | 73,200              | 53.8        | 39,350  | 250,500       | 71.5        | 179,040 |
| 1990 | 143,500               | 128.0       | 184,135 | 41,250              | 90.2        | 37,212  | 205,000       | 121.0       | 247,590 |
| 1991 | 163,300               | 114.0       | 186,917 | 115,000             | 83.5        | 95,969  | 299,000       | 104.0       | 309,524 |
| 1992 | 104,800               | 154.0       | 164,333 | 41,100              | 112.0       | 46,794  | 166,000       | 145.0       | 240,362 |
| 1993 | 237,100               | 62.9        | 149,189 | 109,200             | 39.6        | 43,270  | 365,000       | 58.6        | 213,862 |
| 1994 | 118,900               | 115.0       | 136,945 | 59,600              | 76.4        | 45,531  | 199,000       | 104.0       | 207,345 |
| 1995 | 174,800               | 112.0       | 195,216 | 76,800              | 72.5        | 55,678  | 267,500       | 101.0       | 271,377 |
| 1996 | 165,125               | 68.9        | 113,749 | 44,375              | 46.4        | 20,606  | 209,500       | 64.1        | 134,355 |
| 1997 | 202,900               | 93.3        | 189,226 | 132,100             | 53.0        | 69,994  | 335,000       | 77.4        | 259,220 |
| 1998 | 112,000               | 135.0       | 150,908 | 34,400              | 77.2        | 26,544  | 146,400       | 121.0       | 177,452 |
| 1999 | 219,400               | 101.0       | 222,647 | 186,700             | 57.7        | 107,751 | 406,100       | 81.4        | 330,398 |
| 2000 | 160,550               | 126.0       | 201,575 | 49,300              | 75.4        | 37,193  | 209,850       | 114.0       | 238,768 |
| 2001 | 246,550               | 66.2        | 163,204 | 91,950              | 41.2        | 37,897  | 338,500       | 59.4        | 201,101 |
| 2002 | 130,720               | 107.0       | 139,597 | 42,180              | 60.3        | 25,436  | 172,900       | 95.5        | 165,033 |
| 2003 | 202,900               | 110.0       | 223,547 | 79,200              | 68.3        | 54,082  | 282,100       | 98.4        | 277,629 |
| 2004 | 138,970               | 192.0       | 267,215 | 46,830              | 128.0       | 59,709  | 185,800       | 176.0       | 326,924 |
| 2005 | 228,700               | 154.0       | 351,353 | 51,550              | 108.0       | 55,567  | 280,250       | 145.0       | 406,920 |
| 2006 | 152,130               | 173.0       | 262,544 | 55,170              | 109.0       | 59,949  | 207,300       | 156.0       | 322,493 |
| 2007 | 303,462               | 123.0       | 373,131 | 83,843              | 72.2        | 60,513  | 387,305       | 112.0       | 433,644 |
| 2008 | 173,660               | 142.0       | 246,590 | 28,420              | 88.3        | 25,097  | 202,080       | 134.0       | 271,687 |
| 2009 | 249,720               | 153.0       | 381,550 | 52,300              | 93.4        | 48,838  | 302,020       | 143.0       | 430,388 |
| 2010 | 232,560               | 249.0       | 578,149 | 61,180              | 158.0       | 96,679  | 293,740       | 230.0       | 674,828 |

**Appendix 3 VMP MC Decision in at an area level Low Price Scenario**

**Appendix 4 VMP MC Decision in at an area level High Price Scenario**