APPENDIX 1

1. STUDY AREA DESCRIPTION

Geographic description

The San Luis Valley of Colorado is a high-altitude desert, 7,000 feet above sea level, where a rural community of about 50,000 irrigates 400,000-500,000 acres using snowmelt from the surrounding Rocky Mountains. The valley receives little rain, just 7-10 inches annually, making irrigation necessary for agriculture. The economy of the SLV depends almost entirely on irrigated agriculture, and for many of the people there the struggle to grow crops is existential. Because the SLV is a headwaters system, because there is no major urban center to demand water in the Rio Grande basin in Colorado, and because major trans-mountain exports have been made prohibitively expensive by geography and local opposition (Cody et al., 2015), the dynamics of agricultural systems can be explored alone, without the confounding factors introduced by significant urban and industrial users of water competing with agriculture and upstream use dynamics.

Irrigation system, field, and year attributes

The study area consists of approximately 700 active self-governing irrigation systems. A stratified sample of 60 systems was collected in the Summer of 2013. Of the 60 sampled, systems irrigate anywhere from 30 to over 115,000 acres and have between 1 and over 300 irrigators. Major crops grown include alfalfa, grass pasture, small grains, potatoes, and other minor crops such as vegetables. Fields themselves range in size from less than an acre to over 750 acres. The study runs from 2011-2014, a period of well below average stream flow (Table 1). The years 2011, 2012, and 2014 are included as robustness checks; the rules being analyzed were assessed in 2013, and are assumed to have been in place in 2011, 2012, and 2014. See Table 7 for an overview of the variables included in the analysis. See Table 1 for a summary of the key independent variables used in the analysis across the years of the study broken out by the institutional configurations under consideration. See Figure 1 for a color-coded map of the irrigation systems sampled and their institutional configurations.

Table 1. Summary of independent variables of interest for each institutional configuration.							
Institutional Group	Total	Ave.	Ave.	Ave.	Ave.	Ave.	Ave.
	Sampled	Max.	AF/Acre	AF/Acre	AF/Acre	AF/Acre	AF/Acre
		Dist.	2011	2012	2013	2014	2011-
		(km)					2014
Simultaneous, Not	13	9.687	1.943	1.753	1.873	2.060	1.91
Sharing							
Simultaneous,	11	17.037	3.209	1.905	1.855	3.762	2.68
Sharing							
Rotation, Not	8	6.739	1.054	1.166	0.870	1.753	1.21
Sharing							
Rotation, Sharing	28	10.879	1.769	1.736	2.021	3.026	2.14
Overall	60	11.198	1.975	1.694	1.805	2.765	2.06



Figure 1. A simple map of the sampled irrigation systems, color-coded for their institutional configuration.

Long-term climate change in the SLV

Spring snowpack is expected to decline across Colorado due to climate change, with decreasing stream flow in the Rio Grande basin especially (Lukas et al., 2014). Indeed, there have already been observed changes in temperature, and therefore frost-free season and onset of peak stream flow that warrant an investigation in Colorado's Rio Grande Basin (Lukas et al., 2014; Mix et al., 2009; Mix et al., 2011; Mix et al., 2012). USGS streamflow data going back to the 1880s on the Rio Grande do show longer term decreases in accordance with expectations of climate change. In addition to the studies by Mix et al. (2009, 2011, 2012) on growing degree days, temperature, and runoff at the Lobatos gage on the New Mexico state line, runoff data exists going back to the 1890 on the Rio Grande in Colorado above any major diversions at the gage at Del Norte (also the gage which determines Rio Grande Compact obligations).

Because the major focus of this investigation is irrigation performance under climate change, and because the SLV is snowmelt limited, it is important to establish variability of snowpack and an overall declining trend.





To establish the validity of the recent past as analogous to expectations under climate change, Figure 2 depicts the annual variability of snowpack and temperature in the study area with regression trend lines. Because the slopes in these figures depend on when the time-series starts and stops, they should not be interpreted as indicating climate change per se, but as evidence that the recent past is analogous to expected climate change. During the study period, 2011-2014, snowpack has been well below normal, as illustrated by Figure 3 and Table 2.

Figure 3. Snowpack in the SLV from 2011-2014, showing below normal volume, earlier peak, and earlier melt. From:

https://www.nrcs.usda.gov/wps/portal/nrcs/detail/co/snow/products/?cid=nrcs144p2_063323



Data from the 1880s to the present show a decrease in streamflow on the Rio Grande. Changes in temperature, frost-free season, growing degree days, and onset of peak stream flow have already been observed in the SLV (Mix et al., 2011; Mix et al., 2012), These changes call for an investigation into the effects of climate change on irrigated agriculture in the SLV. Important for this analysis, streamflow at the nearest upstream gages of the self-governing irrigation systems that were sampled was well below average in the years 2011-2013, with 2014 being slightly below average.

Table 2. Summary of the irrigation seasons analyzed, showing that snowpack, streamflow, and percentage of acreage irrigated were below average in each year.

percentage of aereage inigated were below a		2012	2012	0014	
Y ear	2011	2012	2013	2014	
Irrigation Conditions and Outcomes					
Percent of Average Snow Water Equivalent	96.5	67.5	62.2	84.5	
Average of Upstream Gages Percent of Average	66.1	56.6	48.5	83.9	
Average Months of Active Diversion	4.13	4.08	4.47	4.88	
Average Percent Maximum Diversion	39.5	35.5	35.8	52.3	
Average Acre-feet Diverted per Acre	1.98	1.69	1.80	2.77	
Average Percent Acres Irrigated	62.3	57.2	62.2	74.1	

2. WATER RIGHTS, RULES IN USE, AND CLIMTE CHANGE ADAPTATION

Adapting irrigated agriculture to climate change in the SLV and elsewhere will be contextually dependent on the incumbent water rights regime. In the SLV, this regime is known as Prior Appropriation (PA) (Adler, 2010; Kenney, 2005). PA is the dominant or exclusive regime of water allocation in Colorado, the rest of the Western United States, Australia, and Western Canada. It is generally inflexible during shortage (Howe et al., 1982), with the exception that it is possible (though costly and slow) to sell or lease water rights. Under Colorado's version of this system, water right holders are ranked on a priority list determined by the order in which their water rights were adjudicated by the state's Water Court; this is often summarized as "first in time, first in right". When there is not enough water available to satisfy all water right holders, entities with the most recent ("junior") rights, are curtailed or denied water entirely so that those with the oldest and therefore most "senior" rights can divert their full allocation. In practice, this means that senior users are able to divert their full right for longer periods of time than junior users, who may be limited to a matter of days or weeks or receive no water at all. This poses significant challenges for all except the most senior water rights holders during drought. Thus, in the SLV, although the weather-induced shortage that different irrigation systems experience may be similar in a given year, they experience different levels of legal water shortage.

Prior Appropriation creates persistent inequalities between irrigation systems. Over time PA leads to the failure of farms on junior systems and consolidation of ownership, where farmers on senior ditch systems buy land and water rights on junior ones. And while this is a profitable system for seniors, it discourages efficiency by senior users who are guaranteed their full allocation, leading to lost potential profits throughout the system. A strict application of the PA system also discourages the highest marginal return on water use by depriving juniors of the ability to farm entirely so that seniors can improve crop vigor (Howe et al., 1982). Unique return flow dynamics can lead to externalities when transfers occur in water markets (Howe et al., 1982). In addition, PA has no inherent place for environmental uses of water, posing challenges for ecosystem integrity under a water constrained future; only in the past 40 to 20 years have in stream flows and non-consumptive recreational uses been incorporated into Colorado water law. Prior Appropriation may therefore be working against risk mitigation and may exacerbate inequalities and vulnerabilities in the overall agricultural sector. However, because of the strong vested interests and legal framework surrounding PA, it is unlikely to be meaningfully altered.

The unique features of PA aside, other water rights regimes in operation around the world also produce differential outcomes (Dinar, et al., 1997). In drought, some if not all irrigation systems inevitably divert less water than they normally would. Climate change will exacerbate this by challenging established institutional arrangements. Existing centralized adaptive management regimes may be too slow to respond to the pace of change and increase in variability. New institutional arrangements may be needed in order to imbed more rapid adaptations at local and regional levels that respond to change independent from central governing authorities. Even in a developed economy in a state with secure property rights to water, self-governed irrigation systems are challenged to adapt to their changing environments (Cox, 2014; Fernald et al., 2012), and these challenges result in varying irrigation performance (Cox & Ross, 2011; Janssen & Anderies, 2013). Are there micro-level institutions, i.e. rules in use adopted by irrigators which limit behavior under threat of sanction (Ostrom, 1990), that irrigators can design among themselves that may mitigate against the risks associated with climate change and an externally enforced, relatively inflexible, and harsh private property rights regime? Put another way, how

do different institutional configurations adopted by self-governing irrigation systems influence irrigation performance in drought?

This paper argues that self-governance can be used to improve irrigation performance during drought. Micro-institutions are some of the few things irrigators can control beyond their land, and so they are vital as a first response to drought. Other potential changes are more expensive and disruptive to implement. Cultural norms are resistant to change and evolve slowly (Poteete et al., 2010). Technological and infrastructural changes are expensive and can have unintended consequences (Lam, 1998). Legislative changes, such as those to an incumbent water rights regime, usually challenge powerful vested interests, may be too general, and often have effects that go beyond what is intended (Ostrom, 2005). In contrast, user-originated rules in use are less expensive to change, voluntarily adopted, tailored to local conditions and norms, and relatively reversible. These rules in use affect users' economic incentives and signal to users the relative social costs and benefits of certain behaviors (Ostrom, 2005). In doing so, they make some outcomes more likely and others less likely.

3. SHORTAGE SHARING, ROTATIONAL DELIVERY AS ADAPTATIONS TO SCARCITY

Two universal micro-institutional features of self-governing irrigation systems – water allocation rules and water distribution rules – are especially worthy of study due to their direct and fundamental influence on water use (Ostrom, 1992). Water allocation rules pertain to how much water each farmer within an irrigation system gets, and distribution rules determine how that water reaches the farmer. Table 3 summarizes the rules which are the focus of this study: whether water allocations can be changed between individual irrigators on the same irrigation system ("shortage sharing"), and whether water is distributed to individual irrigators on the same irrigation system in a rotation or simultaneously. Important for the SLV is the fact that water rights are administered by the state at the point where water is diverted from the natural water source through a human-made diversion structure and into the human-made irrigation system. Beyond the diversion structure, the state does not interfere with how water is administered on the irrigation system except to enforce contracts.

Rules in Use	Description
Simultaneous Delivery	After the diversion structure is opened, water flows down the main canal and both into
	and past individual farmer's headgates. Each individual receives water by a unit of
	volume per unit time (e.g. cubic feet per second [cfs]). Those with rights to divert
	water into their farm and field level distribution system do so at the same time.
Rotational Delivery	After the diversion structure is opened, water flows down the main canal and into only
	one or a defined group of individual farmer's headgates. Each individual or group
	receives water by a unit in time (e.g. days). After the de facto water right is exhausted,
	another individual or group receives water for their turn in a predefined order.
No Shortage Sharing	There is no mechanism to change how water is allocated to users, and de facto water
	rights are not changed in scarcity.
Shortage Sharing	There is a mechanism to change how water is allocated to users, and de facto water
	rights do change in scarcity.

Table 3. The four rules in use under investigation are defined.

There are many criteria used to allocate water in the SLV and globally, including: underlying private water rights, shares of ownership in an irrigation company, amount of land owned, crop

water demand, the need to water animals, user contributions to maintenance and fees, and need based on family size, among other criteria (Dinar et al., 1997). In response to drought, the amount of water allocated to irrigators that derives from the above criteria can be changed to share the burden of shortage. Sharing shortage in this study is defined as "changed water allocations" between members of a given irrigation system, which means that de facto property rights are flexible on that system. This corresponds to exchanges within System A and within System B in Figure 4. This is in contrast to the sort of shortage sharing conducted by irrigation systems studied by Smith (2016) and Cox (2010) in New Mexico where irrigation systems change allocations between each other in an inter-system arrangement (i.e. between System 1 and System 2 in Figure 4). The intra-system shortage sharing that is the focus of this study can range in complexity from bilateral agreements between irrigators (e.g. between A and C on System 1 from Figure 4), to multilateral agreements between several irrigators (e.g. between A, B, and D on System 1 from Figure 4), and to agreements with all irrigators on the irrigation system involved (e.g. between A, B, C, and D on System 1 from Figure 4). These agreements range from ad hoc and temporary to planned in advance and long-term, and from informal handshakes to formal, written exchanges. Potential benefits of shortage sharing include allocating water to the most productive land, providing farmers with water when crops are stressed, ensuring continued cooperation of farmers, and giving farmers flexibility with their assets. Some potential drawbacks include altered hydraulic head within the canal system, modified seepage losses, modified return flows, unclear allocations among irrigators, increased monitoring costs, and negotiation costs to establish and alter the shortage sharing arrangements.

Figure 4. Diagram of two simplified irrigation systems. System 1 is upstream of System 2, as the water flows left to right. Two diversion dams of different sizes and quality allow water into the main canal or ditch. Water is then either delivered simultaneously to all users' laterals or delivered in a rotation to groups of users (e.g. lateral canals) or individuals, suffering seepage losses along the way. This water is allocated based on some de facto property right. But, if property rights are flexible, then this is deemed "shortage sharing", and users may change allocations between each other. After water has been allocated, delivered, and applied, it may run off the field onto another field or back into the ditch, seep into the ground, or enter a drain that takes the runoff into a river or another ditch.



In addition to allocation rules in use, distribution rules in use are also fundamental. Irrigation systems must have some rule for delivering water once the available water is allocated. Distribution rules can also be adapted to drought conditions. Globally and in the SLV, distribution tends to occur in one of two ways (Dinar, et al., 1997). In one, simultaneous delivery, water is delivered the full length of canal system to be divided among users at the same time. In Figure 4, it would be as if A, B, C, and D on System 1 could remove their rightful rate of flow from the ditch as the water flowed past their headgates. In the other form of delivery, rotational delivery, the full flow is sent to individual farmers or groups of individuals. This would be as if water were sent, in turns of hours or days or even weeks, in some order, to the numbered laterals on System 2 from Figure 4. Some self-governing irrigation systems always rotate, regardless of hydrologic conditions, and in shortage those systems may change the rotation or not.¹ In shortage, if any change in the form of delivery takes place at all, systems tend to switch from simultaneous delivery to a rotation. Potential benefits of rotation are that it may generate the necessary hydraulic head to push water the length of the ditch system, minimize seepage losses, ease monitoring of water use, affirmatively require delivery to all users, and ensure that enough water is delivered to saturate the root zone of crops. The potential drawbacks of rotation are that it can be costly to negotiate, requires more work and infrastructure investment to operate than simultaneous delivery, can deliver unequal amounts of water over equal amounts of time, and may be wasteful if individual farmers receive more water than they can use efficiently during their turn in the rotation.

¹ In this study, sampled irrigation systems had the opportunity to indicate whether the rotation itself changed as well as whether water allocations could be changed. Only those who answered that allocations did change were counted as sharing shortage.

Indeed, rotation (with or without) shortage sharing has the problem of potentially having too few or too many turns during very dry years. Sending water the full length of the ditch first, as many do in order to assure the most tail-end farmer that their best chance to receive water, may prove futile and thus waste quite a bit of water. Any turn taking that does not proceed from the top to the bottom of the ditch will cause inefficient wetting of the ditch bed. Also, for some crops, it may be better to get water continuously for 30 days than just two or three times, even though pulses of flow from rotation are more efficient over a given area for a given amount of water. When pulsing with low flows and a long time between pulses, soil may lose a great deal of water in the time between turns, stressing the crops and limiting growth. Finally, if a farmer anticipates three turns but is somehow only able to get two turns in the rotation, this may be devastating. Delivering water continuously may not be optimal hydrologically, but if it is lower risk, farmers may still use it and implement other adaptations such as on-farm storage to generate pulse flows, crop changes, groundwater wells, or more efficient irrigation.

To further illustrate the connection between these rules, consider the case where delivery is normally simultaneous and shortage sharing is taking place: the user taking a cut is in fact delivering a "pulse", or increased flow rate, of water for however long the shortage sharing arrangement is in effect – be that days, weeks, or the entire season. If the arrangement takes place more than once in a season, or at a defined interval, this amounts to the rotation of the pulse. At the extreme, this pulse becomes the full flow of the ditch, which is rotated between users or groups of users. Under such a full rotation, all users but one or a few take no water for a given period, which can be seen as the result of extreme, temporary, mutual, and repeated changes in allocation (i.e. shortage sharing). And while some systems follow a full rotation at all times, and on its own this may have effects on performance that differ from simultaneous delivery, if shortage sharing is also taking place this necessarily changes the rotation itself; to allow for different final allocations of water, the delivery schedules must be altered (e.g. for irrigator X to receive more water than would otherwise be the case, irrigator X would have to start their turn in the rotation earlier). All this is to say that it is better to evaluate the effect of shortage sharing while considering its interaction with delivery.

The four institutional configurations that are possible by combining the shortage sharing and delivery rules have different implications for return flows, seepage, hydraulic head, transaction and monitoring costs, and equity, among other factors. Table 4 gives a summary of some of the implications of the four combinations of allocation and delivery rules in shortage. These implications could lead to divergent irrigation performance, measured in this study at the level of the individual irrigated field by three variables: a binary variable that measures whether a field was irrigated or not (i.e. fallowed), the percentage of a field's area that was irrigated, and the Normalized Difference Vegetation Index (NDVI) of a field (a proxy for photosynthesis and therefore intensity of crop growth).

Table 4. The projected hydrological, operational, and negotiation implications of four different institutional configurations. The degree to which these hydrological, operational, and negotiation impacts actually affect irrigation performance is unclear, and will likely depend on contextual factors such as the size of the irrigation system, its soils, its average slope, the degree of formal organization, the skill of individual irrigators, how water is normally allocated, the quality of infrastructure, and the cultural norms of irrigators, among others.

Implications for System	Hydrology	Monitoring and Operations	Negotiations
Rules in Use			
Simultaneous, No Shortage Sharing	1) Divided hydraulic head, 2) higher seepage loss, 3) unlikely to deliver more water than can be used, 4) return flows, hydraulic head, and seepage unaltered by shortage sharing	1) No affirmative delivery requirement, 2) difficult to monitor all users at once, 3) cheap to operate, 4) easy to know who is owed what, 5) crops cannot be salvaged	None
Simultaneous, Shortage Sharing	1) Divided hydraulic head, 2) higher seepage loss, 3) unlikely to deliver more water than can be used, 4) shortage sharing may alter return flows, hydraulic head, and seepage	1) No affirmative delivery requirement, 2) difficult to monitor all users at once, 3) cheap to operate, 4) potentially difficult to know who is owed what, 5) transfers straightforward to execute, 6) crops can be salvaged	Bilateral to whole ditch
Rotation, No Shortage Sharing	1) Concentrated hydraulic head, 2) lower seepage loss, 3) potentially delivers more water than can be used, 4) return flows, hydraulic head, and seepage unaltered by shortage sharing	 Affirmative delivery requirement, easy to monitor one user at a time, costly to operate, 4) easy to know who is owed what, 5) crops cannot be salvaged 	None to whole ditch
Rotation, Shortage Sharing	1) Concentrated hydraulic head, 2) lower seepage loss, 3) sharing improves efficiency of rotation, reducing waste, 4) shortage sharing may alter return flows, hydraulic head, and seepage	 Affirmative delivery requirement, easy to monitor one user at a time, costly to operate, 4) potentially difficult to know who is owed what, 5) taking turns complicates transfers, 6) crops can be salvaged 	Bilateral to whole ditch

This study advances the literature by considering the combined effects on irrigation performance of shortage sharing and delivery method. There are numerous studies that separately investigate shortage sharing (D'Exelle et al., 2013; He et al., 2012; Torell & Ward, 2010; Ward et al., 2013) and rotation (Abdullaev et al., 2006; Janssen et al., 2012; Turral et al., 2002). Further complicating this literature, there is not agreement as to what constitutes shortage sharing. D'Exelle et al. (2013) investigated instances where head-enders forego diversions with the intention of enabling tail-enders to irrigate (thus reducing the head-ender diversions disproportionately), finding that while this reduced efficiency, it improved equity. Ward et al. (2013) and Torell & Ward (2010) assessed various shortage sharing arrangements, finding that an equal percentage reduction in diversions by all irrigators was flexible, easily understood, and enhanced crop production as compared to shortage arrangements that applied unequal risk burdens. He et al. (2012) also studies several mechanisms of shortage sharing under PA in Alberta, Canada where changes to water allocations were made through various inflexible rules as well as markets. They found that all modes of shortage sharing were efficiency improvements over PA, with market exchanges being the most efficient. The overall message from the literature regarding shortage sharing is that it is beneficial, especially when it is congruent with contributions to system maintenance, allocates shortage risk equitably, and is agreed upon in a transparent manner between all members of the irrigation system (Bernard et al., 2013; Dayton-Johnson, 2000; Torell & Ward, 2010; Ward et al., 2013).

The results of rotation are similar, in that it accomplishes the goals it is implemented to achieve: rotational delivery has been found to improve equity between the head-end and tail-end (Abdullaev et al., 2006; Turral et al., 2002). Indeed, irrigators in the SLV directly stated in interviews that this was the intention of rotation. While Janssen et al. (2012) does not make this finding in an experimental setting, the rotational delivery mechanism was not accompanied by enforcement of any maximum diversion duration or amount, was not negotiated by the irrigators, and the effect of rotation was not the focus of the study. Additionally, rotation was selected by 2/3 of the experimental groups of real-world irrigators in Janssen et al. (2012), possibly because irrigators understand that rotation is an effective, equitable, or at least familiar mechanism of water delivery. This does not mean that rotation is necessarily efficiency enhancing or improves crop production in the short term in aggregate, only that, under a well-functioning rotational system, the most vulnerable irrigators seem to be spared from the worse consequences of drought, in part because there is at least a de jure affirmative requirement to deliver water to every rightful irrigator for at least some duration of time – farmers in the SLV have been known to stay up all night just to be sure they get their full turn, especially if that turn lasts only hours.

While these findings are important and meaningful, the state of the literature is problematic because these two rules-in-use – allocation and distribution – are at work simultaneously and jointly influence how water moves through the physical ditch system. The effect on irrigation performance of shortage sharing likely depends on whether rotation is taking place, and the effect on irrigation performance of rotation also likely depends on whether shortage sharing is taking place. Hydrologically, shortage sharing necessarily alters how delivery takes place, and delivery necessarily alters what shortage sharing arrangements are possible (the use of turns complicates transfers); for a changed allocation to take effect, the water must be delivered in a way that changes water flow in the ditch from the pre-sharing agreement state.

Compounding the difficulty of assessing the influence of these rules-in-use is that their influence should be impacted by the degree of water scarcity and the distance a field is from the diversion structure of the irrigation system. In extreme shortage, tail-enders should be the most stressed due to seepage losses, depressed hydraulic head, and decreased return flows (Lam, 1998). Furthermore, the lack of an affirmative delivery requirement under a simultaneous delivery system can lead to "stationary bandit" behavior of head-enders (Janssen et al., 2011; Janssen et al., 2012) who use their position as the "first in line" to over-extract from the commons. However, because irrigators require ongoing collective action to maintain and operate their canal systems, it is unlikely that tail-enders would be fully deprived of water even in extreme scarcity. Depriving tail-enders of water entirely could result in damaging retaliation (gossip, sabotage, physical confrontation, etc.) and a costly decline in cooperation over time (e.g. refusal to pay fees, monitor water use, contribute labor, etc.) (Dayton-Johnson, 2000; Janssen et al., 2012; Pérez, et al., 2016). As shortage worsens, the importance of these physical heterogeneities and the differences between of rules-in-use on irrigation performance should become more pronounced (Torell & Ward, 2010; Ward et al., 2013). The interactions between the rules-in-use and physical context are complicated and their results difficult to predict, but it is reasonable to hypothesize that these interactions are meaningful for irrigation performance.

4. MEASURES OF IRRIGATION SYSTEM PERFORMANCE

There are several ways in which the performance of irrigation systems may be measured (Lam, 1998; Yu et al., 2016; Ostrom, 2005; Kadirbeyoglu & Ozertan, 2015). Because of the limits of the available data and the desire to use a replicable methodology, one of my dependent variables is that of Cox & Ross (2011) and Smith (2016), who use multi-band satellite imagery converted to Normalized Difference Vegetation Index (NDVI) to assess crop growth in Taos, New Mexico. While it is not possible to determine what crops are being grown using NDVI, and therefore the value of the crops produced, there is ongoing use of this measurement in the literature on irrigation (Zwart & Leclert, 2010; Li et al., 2004). If it is assumed that farmers are rationally growing the crops best suited for their soils, expected water supply, technology, and economic conditions (e.g. crop prices and market access), the intensity of crop growth as captured by NDVI should reflect overall welfare. For contexts where subsistence is of more relevance than market prices, NDVI would have even more analytical value since the overall production of crops is directly linked to survival. I assess maximum crop growth, or peak greenness, using the maximum month's NDVI as representative of the harvest in a given year.

Additionally, irrigation systems can be assessed not only for their ability to grow crops – the ultimate end of irrigation – but for their ability to apply that water to their acreage (Lam, 1998). In the SLV, the State monitors and records acreage data, and thus this study also assesses performance on this criterion. A binary irrigated/fallowed indicator is also used for each field. Some studies use the amount of water applied per unit area as a measure of irrigation performance, where more water applied indicates better performance (Yu et al., 2016). However, I lack data on the volume applied to each field. I do have the volume diverted into each ditch system and the overall acreage of that system, but for my purposes here this measure is more appropriate for representing the overall availability of water in a given year than performance.

5. ANALYTICAL FRAMEWORK

To analyze rules in use, I employ the Institutional Analysis and Development (IAD) framework. This follows Cox (2010) and Smith (2016), who use the IAD framework in their work in similar and geographically proximate self-governing irrigation systems in New Mexico. The IAD framework is useful for analyzing institutions in a social-ecological system because it clearly defines and separates variable concepts and can work with multiple theories (Sabatier, 2007). I also employ Common Pool Resource (CPR) theory (Ostrom, 1992; Cox, 2010; Wilson et al., 2013), which is designed to understand the management of a resource that is difficult to exclude people from using and that is depleted by its use, such as an irrigation system. CPR theory has demonstrated ability to explain outcomes in experimental, survey, and field studies of irrigation systems (Ostrom, 2005; Poteete et al., 2010). CPR theory is especially useful in this study for identifying control variables such as irrigation system acreage, irrigation technology, and cultural heritage.

6. METHODS

Irrigation manager survey

Prior to administering the survey, interviewees were identified using data from the Colorado Department of Natural Resources' (DNR) Decision Support Systems website. Each ditch system

has a unique Water District ID (WDID) to which all relevant variables were associated. WDIDs were grouped based on their priority rank (above/below the median ranking in their watershed), stream location (above/below the median ranking in their watershed), and groundwater access (1/0). See Table 5 for these groupings. Additional subgroupings were made based on acreage (above/below the median ranking in the basin), and *acequia* status (1/0). Finally, an effort was made to balance the sample across Water Districts (WD). A random number was then assigned to every WDID, and the WDIDs within each stratified group were sorted based on this random number. The Office of the State Engineer was then contacted for assistance in contacting the WDIDs of interest, which were selected by moving down the random numbers from lowest to highest. The State Engineer contacted the Water Commissioners, who are responsible for monitoring water rights in each WD and have contact with leaders of each WDID. The Water Commissioners contacted the WDIDs of interest, and those willing to participate were scheduled for an interview.

The survey was conducted over two, two-week sampling bouts in May and June of 2013. The instrument was developed in concert with community leaders in the SLV to address questions they had as well as make theoretical abstractions more meaningful for irrigators. Surveys were administered face to face at a location of the interviewee's choosing by two to three researchers at a time, with one researcher leading the questioning and writing down answers, and the others taking notes and confirming accurate recording of responses. Each night after samples were collected the research groups came together to align their understanding of the responses and to identify where improvements to the instrument and its administration could be made. To ensure that questions were being asked the same way by different researchers, the groups of researchers were mixed each day, if not multiple times each day, and discrepancies were quickly and retroactively addressed. The average administration time was approximately 60 minutes. The surveys were conducted in English. Table 5 shows the distribution of the institutional configurations per stratified sample group.

Table 5. Summary of stratified sample groups.					
Sample Group	Total	Rotating not	Sharing and	Rotating	Simultaneou
	Sampled	Sharing	Simultaneous	and Sharing	s not Sharing
Junior, Downstream, Ground	8	1	1	4	2
Junior, Downstream, No Ground	5	1	1	2	1
Junior, Upstream, Ground	4	0	1	2	1
Junior, Upstream, No Ground	3	2	1	0	0
Senior, Downstream, Ground	8	0	2	3	3
Senior, Downstream, No Ground	17	1	3	9	4
Senior, Upstream, Ground	7	1	2	4	0
Senior, Upstream, No Ground	8	2	0	4	2

Table 5. Summary of stratified sample groups

See Sub-Appendix A for the text of the questions and available responses used in this analysis.

Variable development and summaries

Data were accessed using the Colorado Department of Natural Resources' (DNR) Decision Support Systems website and gathered from an irrigation manager surveys administered in Summer 2013. Each ditch system has a unique Water District ID (WDID) to which all relevant variables were associated. Each irrigated field (denoted as a parcel) was given a unique Master ID (MID) and had ditch level information applied to it. The geographic locations of these diversion structures, irrigation footprints, and fields were also available from the DNR's GIS database. Data were processed in R version 3.3.2 and ArcGIS 10.4 unless otherwise indicated. Some data, such as snowpack and streamflow, could not be applied directly to irrigation systems or fields. In these cases, the nearest weather station or stream gage provided the data for the irrigation system. See Table 7 for detailed summaries of the variables used.

Two independent variables of interest in the hypotheses are water availability and field distance form diversion. The volume of water diverted by the irrigation system per acre of irrigable land on that system is used to assess water availability to irrigators. It represents the most proximate measurement possible of water entering the irrigation system from the water source. It is a measure that is comparable across systems of different sizes, and is agriculturally relevant since different crops in the SLV require a certain amount of water per acre, usually between 2-4 acrefeet (Henderson, 1979a, 1979b). Field distance from diversion is measured as a straight line from the centroid of the field to the diversion structure. This approximates the distance that water must flow through the canals, ditches, and laterals to reach the field, but in all cases it is an underestimate. The measure for each field is scaled as a percentage of the largest distance a field is from the diversion of a given irrigation system. This makes the variable comparable across systems of different sizes.

Variable Name	Measurement Summary	Descriptive Stats
Independent Variables		
Field Distance from	Using ArcGIS 10.4 and the DNR's GIS database, the	N: 6711
Diversion (DIV_DIST)	distance from each field to the diversion structure that irrigates it was calculated. For each ditch system, the	Min: 0.00
	maximum distance was determined. Each field on	Med: 55.50
	each system was then scaled as a percentage of that system's maximum distance.	Mean: 54.92
		Max: 100.00
		SD: 22.06
Changes Water	Systems reporting that they make some change to how water is allocated between members during shortage were coded as 1.	N: 60
Allocations in Shortage (SHR_SRC) Rotates Water Delivery in Shortage (ROT_SRC)		PERCENT SHARING SHORTAGE: 65.00
	Systems reporting that they rotate water delivery during shortage were coded as 1. Using the DNR's database, the total volume of water diverted each year by each WDID was divided by total acreage of the fields that could be irrigated.	N: 60
		PERCENT ROTATING IN SHORTAGE: 60.00 N: 239
Acre		Min: 0.00
(AFDIV_PERDACRE)		Med: 1.27
		Mean: 2.06
		Max: 13.41
		SD: 2.34

Table 7. Variable descriptions and summary statistics.

Control Variables		
Field Acreage	Using the DNR's GIS database and ArcGIS 10.4, each	N: 6711
(BASEACRES)	MID had its area calculated.	Min: 0.06
		Med: 24.81
		Mean: 54.65
		Max: 759.86
		SD: 59.79
Crop (CROP)	Using the DNR's GIS database, each MID was	Alfalfa: 9752
	besides corn were coded as Small Grains. New Alfalfa	Grass Pasture: 10928
	was coded as Alfalfa. All other crops were coded as	Potatoes: 2262
	Other.	Small Grains: 2960
		Other:298
Water Right Rank	Water rights were ranked from most to least senior	N: 60
(WDPRIOR)	within their Water Districts, and a negative sign applied (so that the most positive value -1 was the	Min: 1
	most senior, rather than the lowest positive value, $+1$,	Med: 24.50
	being the most senior). The earliest, or highest priority, water right for each diversion structure was associated with that diversion point.	Mean: 52.03
		Max: 311
		SD: 65.83
Field Distance to Stream	Using ArcGIS 10.4 and the DNR's GIS database, the distance from each field to the nearest natural water body was calculated.	N: 6711
(STRM_DIST)		Min: 0.00
		Med: 2018.60
		Mean: 2734.20
		Max: 11488.00
		SD: 2488.75
Slope (SLOPE)	Using the DNR's GIS database, the 1/3 arc-second	N: 60
	USGS National Elevation Dataset downloaded from Google Earth Engine and ArcGIS 10.4, the slope of	Min: 0.08
	each irrigation ditch was calculated.	Med: 0.46
		Mean: 0.67
		Max: 5.37
		SD: 0.79
Field Acreage as	The area of the MID was scaled as a percentage of the	N: 6711
Percent of Total	WDID's total acreage.	Min: 0.000407
Acleage (ACKEPEK)		Med: 0.150320
		Mean: 0.894050
		Max: 100.00
		SD: 3.79
Historical Percent of the		N: 60
Irrigation System's		Min: 2.63

Maximum Acreage	The annual percentage of the maximum acreage	Med: 66.10
Irrigated (PERMAXACIRRAVE)	irrigated by that WDID in the DNR's database averaged from 1984-2015	Mean: 67.73
(i Eidminintendur v E)	uveraged from 1961 2015.	Max: 116.81
		SD: 18.72
Historical Percent of	The nearest stream gage upstream of a given WDID	N: 240
Average Streamflow (PERAVAEGAGE)	was used to calculate the percent of the historical average for that gage in the years 2011-2014. This was	Min: 6.07
	done using the entire range of years for which data	Med: 62.79
	were available for that gage.	Mean: 61.25
		Max: 100.00
		SD: 25.31
Sprinkler Use	Using the DNR's GIS database, any field irrigated	N: 26844
(SPRINK) Monitoring Agent	using a sprinkler in a given year was coded as 1. Systems reporting that they have a dedicated	PERCENT USING SPRINKLERS: 31.23 N: 60
(MONITOR)	monitoring agent, either a "ditch rider" or "mayordomo" were coded as 1. Systems reporting a membership of 1 were coded as 1	PERCENT WITH MONITOR: 55.00
Sole User (SOLEUSER)	Systems reporting a memoersmp of 1 were coded as 1.	PERCENT SOLE USER: 11.67
Water Allocated Based on Land Owned or Need	Systems reporting that water is allocated to members according to the amount of land they own or their need were coded as 1.	N: 60
(LANDNEED)		PERCENT ALLOCATING WATER BASED ON LAND OWNED OR NEED: 21.67
Access to a Surface	Systems reporting access to a reservoir were coded as	N: 60
Reservoir (RES)	1. Irrigation systems which have Spanish names or were	PERCENT WITH RESERVOIR: 41.67 N: 60
(ACEQUIA)	confirmed by locals as acequias were coded as 1.	PERCENT ACEQUIA:
Ditch System	Systems which reported being incorporated or	53.33 N: 60
Incorporated (INC)	appeared in the Secretary of State's database of registered corporations were coded as incorporated.	PERCENT INCORPORATED: 40.00
Infrastructure Problematic (INFRA)	On a scale of 1-5, systems reporting challenges with infrastructure on a level of 3, 4, or 5 were coded as	N: 60
	having problematic infrastructure.	PROBLEMATIC INFRASTRUCTURE: 40.00
Soil Quality Problematic	On a scale of 1-5, systems reporting challenges with soil quality on a layer of $2/4$ or 5 more good of	N: 60
(3012)	having problematic soils.	PERCENT WITH PROBLEMATIC SOIL: 23.33
Southern Aspect	Using the Digital Elevation Model available from	N: 60
(50010)	from the DNR, the average aspect of each irrigation system was calculated with ArcGIS 10.3. Southwest,	PERCENT SOUTH FACING: 20.00

Acreage (DACRES)	South, and Southeast were all considered as facing South to create a binary variable. Using the DNR's GIS data, the area susceptible to irrigation by a given WDID was accessed.	N: 60 Min: 29.24 Med: 1122.40 Mean: 8868.20 Max: 117320.00 SD: 20840.00
(GROUND)	a groundwater well in a given year was coded as 1.	N: 26844 PERCENT IRRIGATED BY GROUNDWATER: 42.39
Field Served by Multiple Ditch Systems (MULTD)	The total number of ditch systems irrigating an MID were determined. Systems with more than one ditch system irrigating it were coded as 1.	N: 6711 PERCENT IRRIGATED BY MULTIPLE DITCHES: 19.74 N: 60
(CNG2ROT)	mechanism from simultaneous delivery to rotational delivery were coded as 1.	PERCENT CHANGING TO ROTATION: 16.0
(WATER_SRC) Dependent Variables	water from was accessed from the DNR's GIS database.	RIO GRANDE: 13 CONEJOS RIVER: 10 ALAMOSA RIVER: 7 LA JARA CREEK: 6 CULEBRA: 5 SAN ANTONIO RIVER: 4 SAN FRANCISCO: 3 RITO ALTO: 2 KERBER CREEK: 2 RITO SECO: 1 COSTILLA: 1 SOUTH CUATES: 1 SAN LUIS CREEK: 1 SAN LUIS CREEK: 1 SANGRE DE CRISTO CREEK: 1 VALLEJOS: 1 VENTERO CREEK: 1 TORCIDO: 1
Percent Maximum Irrigated Area	Using the DNR's data for each MID, the total largest footprint of the field was calculated. Each year's	N: 26844
(PERIRR)	irrigated acreage was then scaled as a percentage of this value	Min: 0.00 Med: 70.99
	tino vulue.	Mean: 50.92
		Max: 100.00
		SD: 45.66
Maximum Monthly	Monthly NDVI rasters were accessed from Google	N: 26844
Average NDVI (NDVI)	Earth Engine using LandSat images from USGS. Each month from January 2011 through December 2014	Min: 0.000
	was evaluated for cloud cover, presence of frost, and	Med: 0.489

	overall quality. Months deemed of sufficient quality were downloaded and loaded into ArcGIS 10.4. In conjunction with a rasterized version of the field level GIS data representing unique MIDs, the average NDVI value for each system in each month of each year of the study period was calculated using Zonal Statistics after setting values less than 0.3 (unirrigated) to 0. The maximum monthly value was assigned to the MID. Although not all years in the time series contain the same number of months, within each year each MID has the same number of months included in its annual average, making this average comparable across systems.	Mean: 0.455 Max: 0.883 SD: 0.260
Irrigated/Fallowed (IRRDUM)	If any portion of the MID was irrigated, this value was coded as 1.	N: 26844 PERCENT IRRIGATED: 57.71

7. DATA ANALYSIS

All analyses were run in R version 3.3.2 unless otherwise indicated. Cluster robust standard errors were calculated using the multiwayvcov (version 1.2.3) (Graham et al., 2016) package for R. Logistic models were estimated using the glm function in the base stats package for R (version 3.3.2). Tobit models were estimated using the censReg (version 0.5-26) (Henningsen, 2017) package for R. Regression tables were generated using the stargazer (version 5.2) (Hlavac, 2015) package for R. Spatial error and spatial lag models were fit using the spdep (version 0.6-12) (Bivand & Piras, 2015) package for R. Effects plots were generated using the effects (version 3.1-2) (Fox, 2003) package for R.

8. RESULTS

Table 8 shows significant differences between head-end and tail-end fields in extreme, moderate, and minor shortage from 2011-2014.

Table 8. Head-end vs. tail-end in extreme, moderate, and minor shortage, displaying overall inequality of outcomes between the head and tail end as water availability increases. Text that is bolded, underlined, or italicized indicates a significant difference (p < 0.1) between head-enders (0% maximum distance from diversion) and tail-enders (100% maximum distance from diversion) at the given shortage levels: extreme (833 cubic meters per hectare), moderate (4900 cubic meters per hectare), and minor (10600 cubic meters per hectare). A caret (^) indicates that tail-enders outperform head-enders. **Bolded** years indicate a significant difference in that year when the dependent variable is binary: fallowed or irrigated. *Italicized* years indicate a significant difference in that year when the dependent variable is the percentage of area irrigated. <u>Underlined</u> years indicate a significant difference in that year when the dependent variable is NDVI. The more modified the text, the more reliable the signal. Given the number of regressions performed, there is a very high chance that some significant differences are Type I errors. Therefore, positive results for years seeing only one DV show significant differences should be taken as tenuous. Rotation shows its ability to equalize head and tail enders under almost all

Institutional	Head enders significantly	Head enders significantly	Head enders significantly
Arrangement	different from tail enders in	different from tail enders in	different from tail enders in
	extreme shortage (833	moderate shortage (4900	minor shortage (10600 cubic
	cubic meters per hectare)?	cubic meters per hectare)?	meters per hectare)?
Sole User	<u>2011^</u>	<u>2011^</u>	<u>2011^</u>
	<u>2012^</u>	<u>2012^</u>	<u>2012^</u>
	<u>2013</u> ^	<u>2013^</u>	<u>2013^</u>
	2014^	2014^	2014^
Simultaneous	2011	2011	2011
Delivery without	2012^	2012	<u>2012</u>
Shortage Sharing	<u>2013</u> ^	<u>2013</u>	<u>2013</u>
	2014^	2014	2014
Simultaneous	<u>2011</u>	<u>2011</u>	<u>2011</u>
Delivery with	<u>2012</u>	<u>2012</u>	2012
Shortage Sharing	<u>2013</u>	<u>2013</u>	2013
	<u>2014</u>	<u>2014</u>	2014
Rotational Delivery	2011	2011	2011
without Shortage	2012	2012	2012
Sharing	2013	2013	2013
	2014	2014	2014
Rotational Delivery	<u>2011^</u>	2011	2011
with Shortage	2012^	2012	2012
Sharing	2013	2013	2013
_	2014	2014	2014

conditions, while simultaneous delivery with shortage sharing generates the most consistent inequality, especially in extreme shortage.

Table 9 shows irrigation performance under extreme vs. slight shortage at the head-end, mid-reach, and tail-end of the irrigation system from 2011-2014.

Table 9. Irrigation performance under extreme vs. slight shortage at the head-end, mid-reach, and tail-end of the irrigation system, displaying overall inequality of marginal productivity between the head and tail end as water availability increases. Text that is bolded, underlined, or italicized indicates a significant difference (p < 0.1) between extreme (0 cubic meters per hectare) and slight shortage (12,335 cubic meters per hectare) at the given distance from the diversion structure. A caret (^) indicates that more water produces significantly worse outcomes. **Bold** years indicate a significant difference in that year when the dependent variable is binary: fallowed or irrigated. Italicized years indicate a significant difference in that year when the dependent variable is the percentage of the total area irrigated. Underlined years indicate a significant difference in that year when the dependent variable is NDVI. The more modified the text, the more reliable the signal. Given the number of regressions performed, there is a very high chance that some significant differences are Type I errors. Therefore, positive results for years seeing only one DV show significant differences should be taken as tenuous. Rotation with shortage sharing shows its ability to improve outcomes equally up and down the ditch as more water becomes available, something simultaneous delivery fails to do for the tail-end. Shortage sharing with simultaneous delivery is the weakest arrangement when it comes to allocating increased water supplies to produce increased crop growth

Institutional	Extreme shortage	Extreme shortage	Extreme shortage
Configuration	significantly different from	significantly different from	significantly different from

	slight shortage for head end	slight shortage for mid ditch	slight shortage for tail end
	(5%)?	(50%)?	(95%)?
Sole User	2011	2011	2011
	2012	<u>2012</u>	2012
	2013	2013	<u>2013</u>
	2014	2014	2014
Simultaneous	<u>2011</u>	<u>2011</u>	2011
Delivery without	<u>2012</u>	<u>2012</u>	2012
Shortage Sharing	2013	2013^	<u>2013</u> ^
	<u>2014</u>	<u>2014</u>	2014
Simultaneous	2011	2011	2011
Delivery with	2012	2012	<u>2012</u>
Shortage Sharing	2013	2013	2013
	2014	2014	2014
Rotational Delivery	<u>2011^</u>	<u>2011^</u>	<u>2011^</u>
without Shortage	2012	<u>2012^</u>	<u>2012^</u>
Sharing	<u>2013^</u>	<u>2013^</u>	<u>2013^</u>
	2014^	<u>2014^</u>	<u>2014^</u>
Rotational Delivery	<u>2011</u>	2011	2011
with	<u>2012</u>	<u>2012</u>	<u>2012</u>
Shortage Sharing	<u>2013</u>	<u>2013</u>	<u>2013</u>
	<u>2014</u>	<u>2014</u>	<u>2014</u>

Table 10 shows the Variance Inflation Factor (VIF) of each variable in the regression model without any interactions for NDVI in the years 2011-2014. VIF evaluates whether multicollinearity is a threat to the model. VIFs less than 5 warrant little to no concern, between 5 and 10 warrant some concern, and greater than 10 are concerning. In cases where categorical variables have more than two levels, it is very common for these variables to be correlated with each other due to being mutually exclusive. However, these VIFs are not a concern for estimation. Overall, these VIF values indicate there is not a problem with multicollinearity despite some control variables having greater uncertainty in their parameter estimates. Thankfully, they are not the independent variables of interest.

Variable	VIF 2014	VIF 2013	VIF 2012	VIF 2011
Sprinkler Use	3.8278152	3.7518914	3.7578638	3.7866480
Crop: Grass Pasture	1.6414125	1.6765613	1.7166795	1.7684032
Crop: Other	1.1343633	1.0960616	1.0998582	1.0914590
Crop: Potatoes	1.5198280	1.4360847	1.5152300	1.4679550
Crop: Small Grains	1.3610961	1.3373053	1.3435003	1.4167290
Groundwater Well	2.2351588	2.1668657	2.1553746	2.1724131
Percent Average at Upstream Gage	16.6775318	10.9307354	13.6427771	21.0036279
Water Source: Alamosa River	5.9920485	4.1427074	6.3086494	4.8427485
Water Source: Conejos River	19.9043486	13.9524251	11.2981428	10.2829619
Water Source: Costilla	1.4698890	1.4240287	1.5636878	1.5492016
Water Source: Culebra	6.4711663	7.4042719	6.0503332	4.6649999
Water Source: Kerber Creek	1.1721786	1.1502459	1.4740857	1.2027849
Water Source: La Jara Creek	3.2518961	2.2520512	2.7539889	3.3051075
Water Source: Rito Alto Creek	1.5839317	1.8635004	1.5817275	1.8352106
Water Source: Rito Seco	1.4054535	1.3906791	1.3646354	1.3737055

Table 10. Variance Inflation Factors for all right hand side variables in the regressions predicting NDVI for 2011-2014 without interactions.

Water Source: San Antonio River	7.0245113	2.2926309	3.5966525	3.4865761
Water Source: San Francisco	1.8417101	1.6786916	1.7830160	1.7335238
Water Source: San Luis Creek	2.1456019	1.9003231	3.9746922	2.2001832
Water Source: Sangre de Cristo Creek	NA	9.7486174	10.8513377	23.5955826
Water Source: Torcido	1.7273416	1.6307968	1.6208106	1.6343547
Water Source: Vallejos	3.9177703	3.9554984	3.7000088	3.2501843
Water Source: Ventero Creek	1.3252967	1.4121848	1.2727628	1.2945855
Reservoir Access	4.7193526	4.4707373	5.2348221	4.3144140
Soil Problematic	7.2721918	7.6214630	7.4329210	7.4146055
Irrigated by Multiple Ditches	1.8037757	1.7840165	1.8107214	1.8010993
Incorporated	4.0522881	3.7161624	4.2561767	4.1306042
Infrastructure Problematic	5.2949085	4.6644303	6.5031044	5.4208852
Water Allocated on Land or Need	6.4224089	9.3429774	7.1679891	7.2237939
Acequia Status	6.5678125	6.6484557	6.5970076	6.8194917
South Facing Aspect	4.5435582	4.1737216	4.4216460	4.6552427
Slope	4.0504562	5.0812529	5.0342402	5.0460654
Field Distance from Stream	1.7735953	1.8099913	1.8111702	1.8032552
Field Acreage	2.3151555	2.3471280	2.3251827	2.3385427
Field/Ditch Area Ratio	2.7596787	2.6098236	2.5714253	2.5955805
Ditch Area	8.6554965	8.9267421	8.5877171	8.5814276
Water Right Priority Rank	2.9711476	3.2147236	3.2944396	3.1580603
Percent Maximum Area Irrigated on Average	4.6054443	5.3652499	6.0826844	4.8909644
Monitoring Agent	3.4964531	3.2299231	3.6496256	3.5894548
Change to Rotation in Shortage	9.4516778	10.7399566	10.4235103	10.4403282
Shortage Sharing	4.8418098	6.0573840	5.0105858	5.0553329
Rotate in Scarcity	4.9944195	5.1401251	5.4416675	5.8931444
Water Availability	4.2724653	5.0747121	6.5360112	4.5920558
Field Distance from Diversion	1.2018021	1.2030769	1.1948040	1.2022178

Comments on statistical significance

There are some shortcomings to the sample. The sample of irrigation systems is not balanced across the institutional configurations, and this lack of balance is even more pronounced at the field-level. This helps explain why some of the confidence bands are as large as they are, especially for rotational delivery without sharing. Additionally, there are relatively few fields at the extreme head and tail-end of systems, which helps explain why the confidence bands become so large at the extreme ends of the x-axis. That said, although statistical significance is a crucial guide for assessing the precision of results, the consistency of the trends across years and different dependent variables are encouraging. Additionally, statistical significance does not equate to agricultural significance. When predicted NDVI lies, with 90% or 95% confidence, between 0.19 to 0.4 under one institutional configuration and 0.39 to 0.6 in another, these are meaningful differences to farmers even if they are not statistically different estimates.

9. DEALING WITH ENDOGENEITY

Over time, irrigation systems adopt rules based on the feedback irrigators receive from past performance (Ostrom, 2014). It could therefore be argued that the effects I find for different rules in use actually reflect past irrigation performance and/or the factors shaping past irrigation performance, not the current rules. I address this concern in three ways. First, I explain the problem and address the endogeneity argument conceptually. Second, I describe the steps taken

in data analysis to address whatever endogeneity may be present. Third, I discuss the contradictory endogeneity stories that could be present in the data.

Additionally, even if an irrigation system may select a set of rules based on the performance it has had in the recent past and generally has had for other reasons, it is still interesting and useful to know what the deeper features of that performance are, specifically the relationship between head and tail-enders and marginal productivity. If the causal link goes the other way, the fact that there is a significant relationship is interesting and deserves the chance to be explained causally. Put another way, if these configurations are considered different solution spaces or basins of attraction that require mutually reinforcing institutions, physical contexts, and social processes, then knowing the significant features of those solution spaces or basins of attraction will be useful to efforts to adapt to climate change.

The conceptual argument against endogeneity

Lam (1998) covers the problem of endogeneity well on page 51, and I quote him at length. He begins by presenting the argument that "FIMS [Farmer Managed Irrigation Systems] that did not attain high levels of performance would have either died out, or had to learn from more successful FIMS how to craft more effective rules to improve their performance." That is, the institutional arrangements of self-governing irrigation systems he observes in Nepal are products of Darwinian selection based on irrigation performance, and therefore the rules in use are endogenous. In response, he states:

While it would be reasonable to believe that a selection process is at work to a certain extent, the magnitude of the effect of such a process should not be overstated. As argued by political economics (North, 1990; E. Ostrom, 1990), while surviving institution arrangements are not necessarily effective, ineffective institutional arrangements could persist for a long period of time. On the one hand, an institutional arrangement is likely to give rise to vested interests with incentives to maintain the status quo arrangement (Knight, 1992). ... On the other hand, one should not assume that farmers in less effective FIMS would necessarily be able to learn from farmers in more effective systems in crafting effective rules. Institutional development is path-dependent (North, 1990; E. Ostrom, 1990; Blomquist, 1992). The kinds of change that are conceivable and practically possible are frequently determined by the status quo condition.

So, while feedbacks do occur, they do so slowly and may not actually generate aggregate net improvements; changes can occur which increase inequality and which promote particular interests over others.² And while certain factors and outcomes may make some rules in use more likely, they do not prescribe them by necessity nor negate the effects of the rules.³ Although these farmers are competing in a market context, provided that they can maintain economic

 $^{^{2}}$ See Cody et al. (2015) for an in-depth discussion of the path-dependent nature of institutional change using the groundwater commons in the SLV as an example.

³ While on a very different time scale, the fact that the shape of a fish's fin has been selected for swimming efficiency does not imply that different efficiencies measured across variations in fin shape are merely measurements of previous swimming efficiencies and ecological contexts.

viability, differential outcomes may not produce the degree of selection pressure scholars might think.

A crucial factor mitigating concerns about endogeneity in the SLV that the irrigation systems are very old, all being founded over 100 years ago. Their bylaws and norms have been established for many decades and it is costly to make changes, especially in a single season. Most farmers interviewed were able to describe their shortage sharing and delivery rules in great detail and without reflection, indicating that they had grown quite accustomed to the operations of the system over a long period of time. Many also had complaints about the rules, indicating that they viewed the rules as important for determining irrigation performance and not perfectly adapted.

Accounting for endogeneity in the analysis

While there is undoubtedly some institutional adaptation over time, provided that I account for the major factors that might shape rule selection in my regressions, I can be confident in my results. Table 6 shows the distribution of some key variables that could shape performance and rule adoption. I pay special attention to performance, because this is the greatest threat to my regression results. To account for any endogeneity in my final regressions, I include the historical average percentage of the irrigation system's acreage irrigated from 1984-2015 as well as water right priority. These variables could influence the adoption of shortage mitigating rules, so the inclusion of these variables reduces the chance that the variation introduced by this feedback is being absorbed by the rules in use. As another hedge against endogeneity, I use multiple years in my analysis to assess the effects of the institutional configurations in 2013. Interviews with irrigators make me confident that I can assume that over the short term (1-5 years) these institutional configurations are essentially stable, so that 2011, 2012, and 2014 have the same shortage sharing and delivery rules as those assessed in 2013. Importantly, there is no conceptual way that 2013 or 2014 performance could influence the rules used in 2013.

Contradictory endogeneity stories in the data

Finally, if the effects I find for the variables of interest are in the opposite direction from what would be expected if the signal were endogenous, I can be further assured that endogeneity is not influencing my results. In my case, I expect shortage sharing and rotation to improve outcomes, whereas if the signal were endogenous, the observed effects of these rules would be negative. That is, worse performance should be associated with the adoption of these rules if these rules are adopted to mitigate poor performance. However, an alternative endogeneity story posits that stronger performance leads to the adoption of these rules, because higher economic productivity facilitates collective action. Overall, the results do not support either endogeneity story. The results show that systems with simultaneous delivery and no shortage sharing are strong performers. This implies that the only endogeneity story that could be operating is that poor performance leads to the adoption of institutions for shortage mitigation: having strong performance, these systems had no need to adopt rules that adapt operations to shortage. However, systems that have adopted both shortage sharing and rotation also have strong performance; in this case, the only endogeneity story that could be operating is that strong performance creates the capital necessary to organize collective action. These two examples from the data falsify each other. So, while it is possible that both endogeneity stories are playing

out with different strengths on different irrigation systems, the parsimonious interpretation is that endogeneity is not behind the results.

Table 6. Key variables that may influence the selection of particular institutional configurations. Descriptive statistics given here are

at the level of the irrigation system, not fields. There is an added category, Sole User, which indicates an irrigation system owned by
 one person. This category serves as a counterfactual to systems that must engage in collective action to achieve irrigation.

Rules in Use	Size	Average	Water Reliability	Irrigation	Formality,	Crops	Social Context
		Performance		Technology	Monitoring,	(2011-	
		(1984-2015)		(2011-2014)	Allocation	2014)	
Sole User	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 28.6%
(7, 11.7%)	Acreage: 619	Maximum	Percentile: 25.8	Wells:	14.3%	Pasture:	Average Users:
	Average Field	Diversion:	Catchment Area:	10.1%	Monitoring: NA	78.9%	1.0
	Distance:	44.5%	224,090	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	1.657km	Percent	Reservoir Access:	Sprinklers:	Rights or Shares:	10.3	619
		Irrigated: 57.9%	42.9%	4.3%	NĀ		
Simultaneous,	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 50%
No Shortage	Acreage: 8,172	Maximum	Percentile: 18.1	Wells:	83.3%	Pasture:	Average Users:
Sharing	Average Field	Diversion:	Catchment Area:	42.7%	Monitoring: 100%	68.7%	45.0
(6, 10%)	Distance:	55.3%	441,630	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	8.888km	Percent	Reservoir Access:	Sprinklers:	Rights or Shares:	19.5%	279
		Irrigated: 55.8%	50.0%	43.0%	100%		
Simultaneous,	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 36.4%
Shortage	Acreage:	Maximum	Percentile: 21.3	Wells:	45.5%	Pasture:	Average Users:
Sharing	21,950	Diversion:	Catchment Area:	51.6%	Monitoring: 54.6%	43.2%	44.4
(11, 18.3%)	Average Field	52.1%	445,700	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	Distance:	Percent	Reservoir Access:	Sprinklers:	Rights or Shares:	38.0%	512
	8.944km	Irrigated: 66.7%	72.7%	56.4%	90.9%		
Rotation, No	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 75%
Shortage	Acreage: 951	Maximum	Percentile: 35.9	Wells:	25.0%	Pasture:	Average Users:
Sharing	Average Field	Diversion:	Catchment Area:	15.3%	Monitoring: 25.0%	52.7%	10.3
(8, 13.3%)	Distance:	46.2%	82,381	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	3.686km	Percent	Reservoir	Sprinklers:	Rights or Shares:	37.5%	162
		Irrigated: 53.1%	Access: 12.5%	18.9%	50.0%		
Rotation,	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 60.7%
Shortage	Acreage: 8,202	Maximum	Percentile: 20.0	Wells:	39.3%	Pasture:	Average Users:
Sharing	Average Field	Diversion:	Catchment Area:	30.6%	Monitoring: 67.9%	36.5%	22.2
(28, 46.7%)	Distance:	54.2%	313,260	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	5.443km	Percent	Reservoir	Sprinklers:	Rights or Shares:	43.0%	208
		Irrigated: 63.5%	Access:35.7%	34.8%	60.1%		

1 2

Overall	Average	Percent	Water Right	Acreage w/	Incorporated:	Grass	Acequia: 53.3%
(60, 100%)	Acreage: 8,868	Maximum	Percentile: 22.8	Wells:	40.0%	Pasture:	Average Users:
	Average Field	Diversion:	Catchment Area:	31.2%	Monitoring: 55.0%	46.9%	24.6
	Distance:	51.7%	309,190	Acreage w/	Allocate on Water	Alfalfa:	Acres per User:
	5.754km	Percent	Reservoir Access:	Sprinklers:	Rights or Shares:	36.2%	302
		Irrigated: 61.2%	41.7%	33.9%	61.7%		

LITERATURE CITED

- 1. Abdullaev, I., Ul Hassan, M., Manthrithilake, H., & Yakubov, M. 2006. *The Reliability Improvement in Irrigation Services: Application of Rotational Water Distribution to Tertiary Canals in Central Asia*. IWMI Research Report 100. Colombo, Sri Lanka.
- 2. Adler, R.W. 2010. Climate Change and the Hegemony of State Water Law. *Stanford Environmental Law Journal*, Vol. 29, No. 1.
- 3. Bernard, M., Dreber, A., Strimling, P., & Eriksson, K. 2013. The subgroup problem: When can binding voting on extractions from a common pool resource overcome the tragedy of the commons? *Journal of Economic Behavior and Organization*, *91*, 122–130
- 4. Bivand, R. & Piras, G. 2015. Comparing Implementations of Estimation Methods for Spatial Econometrics. Journal of Statistical Software, 63(18), 1-36.
- 5. Blomquist, W. 1992. *Dividing the Waters: Governing Groundwater in Southern California*. San Francisco: ICS Press.
- Cody, K., Smith, S., Cox, M., Andersson, K. 2015. Emergence of Collective Action in a Groundwater Commons: Irrigators in the San Luis Valley of Colorado. Society and Natural Resources, 28(4): 405-422.
- 7. Cox, M. 2010. *Exploring the dynamics of social-ecological systems: the case of the Taos valley acequias* (Doctoral dissertation). Retrieved from ProQuest Dissertations and Theses database. (UMI No. 3397459)
- Cox, M. 2014. Modern disturbances to a long-lasting community-based resource management system: The Taos Valley Acequias. *Global Environmental Change* 24: 213– 222.
- Cox, M., and J. Ross. 2011. Robustness and vulnerability of community irrigation systems: The case of the Taos Valley Acequias. J. Environ. Econ. Manage. 61(3): 254– 266.
- D'Exelle, B., Lecoutere, E., & Van Campenhout, B. 2012. Equity-Efficiency Trade-Offs in Irrigation Water Sharing: Evidence from a Field Lab in Rural Tanzania. *World Development*, 40(12), 2537–2551.
- 11. Dayton-Johnson, J. 2000. Choosing rules to govern the commons: a model with evidence from Mexico. *Journal of Economic Behavior & Organization*, 42(1), 19–41
- 12. Department of Natural Resources (DNR). N.D. Colorado's Decision Support Systems. Accessed Feb 16, 2017: http://cdss.state.co.us/basins/Pages/RioGrande.aspx
- 13. Dinar, A., Rosegrant, M.W., Meinzen-Dick, R. 1997. *Water allocation mechanisms: principles and examples.* Policy, Research working paper; no. WPS 1779. Washington, DC: World Bank.
- Fernald, A., Tidwell, V., Rivera, J., Rodríguez, S., Guldan, S., Steele, C., Ochoa, C., Hurd, B., Ortiz, M., Boykin, K., & Cibils, A. 2012. Modeling Sustainability of Water, Environment, Livelihood, and Culture in Traditional Irrigation Communities and Their Linked Watersheds. *Sustainability*, 4(12): 2998–3022.
- 15. Fox, J. 2003. Effect Displays in R for Generalized Linear Models. Journal of Statistical Software, 8(15): 1-27.
- 16. Graham, N., Arai, M., Hagströmer, B. 2016. multiwayvcov: Multi-Way Standard Error Clustering. R package version 1.2.3. https://CRAN.R-project.org/package=multiwayvcov

- He, L., Horbulyk, T. M., Ali, M. K., Le Roy, D. G., & Klein, K. K. 2012. Proportional water sharing vs. seniority-based allocation in the Bow River basin of Southern Alberta. *Agricultural Water Management*, 104, 21–31.
- 18. Henderson, D. 1979a. Engineering Report Water Districts Nos. 21 & 22 Conejos and Alamosa Counties Colorado. The Federal Land Bank of Wichita.
- 19. Henderson, D. 1979b. Revisions Water District 20 Rio Grande River and Tributaries San Luis Valley, Colorado. The Federal Land Bank of Wichita.
- 20. Henningsen, A. 2017. censReg: Censored Regression (Tobit) Models. R package version 0.5-26. https://CRAN.R-project.org/package=censReg
- 21. Hlavac, Marek. 2015. stargazer: Well-Formatted Regression and Summary Statistics Tables. R package version 5.2. http://CRAN.R-project.org/package=stargazer
- 22. Howe, C.W., Alexander, P.K, & Moses, R.J. 1982. The Performance of Appropriative Water Rights Systems in the Western United States During Drought. *Natural Resource Journal*, 22(2): 379-389.
- Janssen, M. A., Anderies, J. M., & Cardenas, J. C. 2011. Head-enders as stationary bandits in asymmetric commons: Comparing irrigation experiments in the laboratory and the field. *Ecological Economics*, 70(9): 1590–1598.
- 24. Janssen, M. A., Bousquet, F., Cardenas, J. C., Castillo, D., & Worrapimphong, K. 2012. Field experiments on irrigation dilemmas. *Agricultural Systems*, *109*, 65–75.
- Janssen, M. A., & Anderies, J. M. 2013. A multi-method approach to study robustness of social–ecological systems: the case of small-scale irrigation systems. *Journal of Institutional Economics*, 9(04): 427–447.
- 26. Kadirbeyoglu, Z., & Ozertan, G. 2015. Power in the Governance of Common-Pool Resources: A comparative analysis of irrigation management decentralization in Turkey. Environmental Policy and Governance, 25: 157-171.
- 27. Kenney, D. 2005. Prior Appropriation and Water Rights Reform in the Western United States. In Bruns, B., Ringler, C., Meinzen-Dick, R (Eds.), *Water Rights Reform: Lessons for Institutional Design*: pp. 167-182. Washington, D.C.: International Food Policy Research Institute.
- 28. Knight, J. 1992. *Institutions and Social Conflict.* Cambridge: Cambridge University Press.
- 29. Lam, W.F. 1998. Governing Irrigation Systems in Nepal: Institutions, Infrastructure, and Collective Action. Oakland, CA: Institute for Contemporary Studies.
- Li, J., Lewis, J., Rowland, J., Tappan, G., Tieszen, L. 2004. Evaluation of land performance in Senegal using multi-temporal NDVI and rainfall series. Journal of Arid Environments, 59: 463-480.
- 31. Lukas, J., Barsugli, J., Doesken, J., Rangwala, I., Wolter, K. 2014. Climate Change in Colorado: A Synthesis to Support Water Resources Management and Adaptation. A report for the Colorado Water Conservation Board by Western Water Assessment. Boulder, CO.
- 32. Mix, K., Lopes, V. L., & Rast, W. 2012. Growing season expansion and related changes in monthly temperature and growing degree days in the Inter-Montane Desert of the San Luis Valley, Colorado. *Climatic Change*, 114(3-4): 723–744.
- 33. Mix, K., Lopes, V. L., & Rast, W. 2012. Growing season expansion and related changes in monthly temperature and growing degree days in the Inter-Montane Desert of the San Luis Valley, Colorado. Climatic Change, 114(3-4): 723–744.

- 34. Mix, K., V. Lopes, and W. Rast. 2011. Annual and growing season temperature changes in the San Luis Valley, Colorado. *Water Air Soil Pollut*. 220(1): 189–203.
- Mix, K., Rast, W., & Lopes, V. L. 2009. Increases in Growing Degree Days in the Alpine Desert of the San Luis Valley, Colorado. Water, Air, and Soil Pollution, 205(1-4): 289– 304.
- 36. Mix, K., V. Lopes, and W. Rast. 2011. Annual and growing season temperature changes in the San Luis Valley, Colorado. Water Air Soil Pollut. 220(1): 189–203.
- 37. North, D. 1990. *Institutions, Institutional Change, and Economic Performance*. Cambridge: Cambridge University Press.
- 38. Ostrom, E. 1990. Governing the Commons: The Evolution of Institutions for Collective Action. New York, NY: Cambridge University Press.
- 39. Ostrom, E. 1992. *Crafting Institutions for User-governing Irrigation Systems*. San Francisco, CA: Institute of Contemporary Studies.
- 40. Ostrom E. 2005. Understanding Institutional Diversity. Princeton, NJ: Princeton University Press.
- Pérez, I., Janssen, M.A., Anderies, J.M. 2016. Food Security in the Face of Climate Change: Adaptive Capacity of Small-Scale Social-Ecological Systems to Environmental Variability. *Global Environmental Change* 40: 82-91.
- 42. Poteete, A. R., M. A. Janssen, and E. Ostrom. 2010. *Working together: Collective action, the commons, and multiple methods in practice*. Princeton, NJ: Princeton University Press.
- 43. Sabatier, P. 2007. *Theories of the Policy Process, Second Edition*. Cambridge, MA: Westview Press.
- 44. Smith, S.M. 2016. Common Property Resources and New Entrants: Uncovering the Bias and Effects of New Users. *Journal of the Association of Environmental and Resource Economists* 3(1): 1-36.
- 45. Torell, G. L., & Ward, F. A. 2010. Improved Water Institutions for Food Security and Rural Livelihoods in Afghanistan's Balkh River Basin. *International Journal of Water Resources Development*, 26(4), 613–637.
- 46. Turral, H., Malano, H., & Chien, N. V. 2002. Development and specification of a service agreement and operational rules for La Khe irrigation system, Ha Dong, Vietnam. *Irrigation and Drainage*, 51(2), 129–140.
- 47. Ward, F. A., Amer, S. A., & Ziaee, F. 2013. Water allocation rules in Afghanistan for improved food security. *Food Security*, 5(1), 35–53.
- 48. Wilson, D., Ostrom, E., & Cox, M. 2013. Generalizing the core design principles for the efficacy of groups. *Journal of Economic Behavior & Organization*, 90: S21–S32.
- 49. Yu, H., Edmunds, M., Lora-Wainwright, A., & Thomas, D. 2016. Governance of the irrigation commons under integrated water resources management A comparative study in contemporary rural China. Environmental Science and Policy, 55: 65-74.
- Zwart, W., & Leclert, L. 2010. A remote sensing-based irrigation performance assessment: a case study of the Office du Niger in Mali. Irrigation Science, 28(5): 371-385.

Sub-Appendix A. Survey Questions and Available Responses Used in Analysis

6. Is your water use association incorporated?

Yes No In Process

10. What is the current size of your association as measured in:

Acres Members

18. Does your association have access to a surface reservoir?

Yes No

29. Please mark whether the amount of water a member in your association can use is proportional to any of the following:

The amount of land users own The amount of water users have contributed The amount of labor users are required to contribute The amount of financial contributions users are required to make Shares owned Not proportional to anything Other

32. Within your association, is water normally distributed by turns along a rotation, or to everyone at once in proportion to their rights?

Rotational Proportional Explanation

33. Does this change when you have less than full flow?

Yes No Explanation

34. How is compliance with water use rules monitored and enforced (check all that apply)?

No monitoring Self-monitored by association members Monitored by members Monitored by Mayor Domo Monitored by ditch rider Monitored by water commissioner Monitored by others Monetary sanctions Water use is cut off Expulsion from scheme Other sanctions No sanctions

38. Do any formal or informal agreements among members of your association involve changing water allocations between them in times of drought and water scarcity?

Yes, Formal Yes, Informal No

39. What process, if any, exists for members to exchange water or land within your association?

OPEN ENDED RESPONSE

41. Please describe any scarcity arrangements, how frequently they are invoked, and any changes to irrigation or cultivation practices required during scarcity:

OPEN ENDED RESPONSE

53. For each threat identified, evaluate the extent to which that threat is problematic for your association, rating this from 1-5 (5 = very problematic, 1 = not problematic)

Poor quality infrastructure (1-5) Poor quality soils (1-5)