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# Transaction Costs, Communication and Spatial Coordination in Payment for Ecosystem Services Schemes\*

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#### **Abstract**

Landowner participation and spatial coordination of land use decisions are key components for enhancing the effective delivery of ecosystem services from private land. However, inducing landowner participation in Payment for Ecosystem Services schemes for coordinating land management choices is challenging from a policy design perspective owing to transaction costs associated with participation. This paper employs a laboratory experiment to investigate the impact of such costs on participation and land use in the context of an Agglomeration Bonus (AB) scheme. The AB creates a coordination game with multiple Nash equilibria relating to alternative spatiallycoordinated land use patterns. The experiment varies transaction costs between two levels (high and low), which affects the risks and payoffs of coordinating on the different equilibria. Additionally, an option of costly communication is implemented between neighboring landowners arranged on a local network to facilitate spatial coordination. Results indicate a significant difference in participation and performance under high and low transaction costs, with lower uptake and performance when transaction costs are high. These effects are, however, impacted by transaction costs faced in the past. Communication improves both AB participation rates and performance with the effect being greater for participants facing high transaction costs.

Keywords: Agglomeration Bonus, Content Analysis, Coordination Games, Lab Experiments, Local Networks

#### 1. Introduction

Payment for Ecosystem Services (PES) or agri-environmental schemes offer landowners financial incentives for actions designed to increase the supply of ecosystem services from privately owned land (Hanley et al. 2012; Hanley and White 2014). In many instances, spatial coordination is a desirable feature of such schemes, enabling the delivery of greater ecosystem service benefits compared to a situation where the uptake of contracts is spatially uncoordinated. Examples include greater biodiversity conservation benefits on farmland (Merckx et al. 2009; Dallimer et al. 2010; Wätzold et al. 2010), successful species reintroduction programmes and meta-population management on private land where habitat corridors permit wildlife movements, or where certain minimum sized contiguous habitat is needed (Williams et al. 2005; Önal and Briers 2006), enhanced water quality improvements (Lane et al. 2004; Lane et al. 2006), and native vegetation restoration (Windle et al. 2009).

Since participation in PES schemes is voluntary, economists have looked for means of incentivising spatial coordination. One such mechanism is the Agglomeration Bonus (AB), originally developed by Parkhurst et al. (2002). The AB is a two-part payment mechanism where landowners receive compensation for participating/enrolling, plus a bonus if neighboring landowners participate and select the same land use activity. In this format, the AB resembles a coordination game with multiple Nash equilibria pertaining to different land use choices. The Nash equilibria can be Pareto ranked by their payoffs. Laboratory experiments have indicated that such a payment structure can produce a range of desired spatial patterns of enrolled land parcels (Parkhurst and Shogren 2007; Warziniack et al. 2007). However, Banerjee et al. (2012; 2014) found that spatial coordination is challenging, and the AB can often fail to produce the desired spatial patterns owing to coordination failure.

Additionally, participation in any PES scheme is associated with landowner transaction costs (Shortle et al. 1998; Kampas and White 2004). Examples of such costs include landowners' travel time to meetings with government officials, the time and cognitive effort of determining the relative payoffs of signing or not signing a contract, and the costs of engaging farm advisors. Such transaction costs have been shown empirically to reduce participation in PES schemes (Falconer and Saunders 2002; McCann et al. 2005; Mettepenningen et al. 2009). The AB, with its more complex design, is likely to create additional transaction costs such as those associated with negotiating with neighbors. It seems likely then that the success of the AB will be influenced by the size of transaction costs relative to the payoffs of enrolling. Yet no analysis to date has studied the effects of variations in transactions costs on the performance of the AB. Fooks et al. (2016) is perhaps closest to our study, in which the transaction costs are implicitly captured by a fixed submission fee. However, they studied a conservation auction and not a subsidy scheme as considered here.

Our paper poses two main research questions. First, what is the degree of participation and spatial coordination realized in AB schemes under different levels of transaction costs? Second, to what extent can communication between neighboring landowners improve AB performance by mitigating any negative effects of transaction costs? We answer these questions using a laboratory experiment. Lab experiments are useful to this study because they bypass the fact that it is not practical, and often even impossible, to exogenously manipulate the size of transaction costs for PES schemes participation in the field; and because only a few PES schemes in practice today include payments for spatial coordination (Kuhfuss et al. 2016). By implementing a predefined fixed network structure in the laboratory, thus keeping the environmental complexity constant, the

experiment allows us to specifically investigate how varying transaction costs impact spatial coordination within an AB setting.

Our experiment is comprised of groups of subjects who decide whether to participate in an AB scheme by paying a fixed fee – the transaction cost of participation. The transaction cost treatment is manipulated in a within-subject design. Since we are interested in strategic interactions and spatial coordination, we use a circular local network. On this type of network every individual is connected to two neighbors (to their left and to their right) directly and indirectly to the others in the network (Jackson 2010). While serving as a suitable framework reflecting the decision problems of land managers on real landscapes, this specific network structure also allows us to contribute to the experimental literature on equilibrium selection and individual behavior in network coordination games (Berninghaus et al. 2002; Cassar 2007). The network is also useful for implementing our between-subject communication treatment in a format representative of social interactions in agricultural communities where communication incurs a transaction cost and but is expected to be more frequent between geographical neighbors than with others within a community.<sup>1</sup>

Our results indicate that participation is significantly higher when transactions costs are low than when they are high. Moreover, in the event that individuals incur the transaction costs and participate, we observe higher rates of spatial coordination. The role of communication is not straightforward. Messaging unambiguously improves performance relative to no-communication situations when transaction costs are high. However, its efficacy in low transaction cost regimes

<sup>&</sup>lt;sup>1</sup> In the field, transaction costs and costs of communication might vary with the degree of environmental complexity owing to individual and landscape heterogeneity (e.g., due to the amount and nature of land holdings, the number of landowners, or the extent of their social capital). However, the dynamics of these factors can make it difficult to isolate how transaction costs and communication affect spatial coordination. Thus, in this study, we have controlled the transaction cost and communication cost to be the same for every individual.

depends upon whether subjects faced high costs in the past and had previous experience with participating in the AB scheme.

#### 2. The Strategic Environment

There are i=1,...,N landowners who face two simultaneous decision opportunities. The first decision entails whether or not to participate in the AB scheme. If a landowner decides to participate, he or she can use his or her land for two different types of conservation land uses,  $\sigma_i=X,Y$ , which produce different levels and types of ecosystem services benefits. Our choice decision is thus at the *extensive margin* and different from the original setup proposed in Parkhurst and colleagues 2002; 2007 where subjects make an *intensive margin* choice of how many acres to enroll. We have made this distinction so that our results may prove insightful in understanding choices facing actual landowners where enrollment options in a PES scheme are "all or nothing", such as in the Conservation Stewardship Program under which the entire eligible acreage has to be enrolled in specific land uses to receive payments (NRCS 2016).

We assume that the ecosystem service benefits delivered from coordination of land use type X have greater agglomeration rewards than for type Y, and the regulator sets the AB payments to reflect this ranking. Such differences in environmental benefits from spatial coordination of enrollment might reflect differences in the ecological objectives of a scheme, or in the kinds of land use change that are rewarded. Let  $\sigma_i = NP$  denote non-participation for landowner i whereby land is devoted to profit-based conventional agriculture, earning only agricultural returns.<sup>2</sup>

<sup>&</sup>lt;sup>2</sup> Traditional agricultural land use practices (denoted by *NP*) can also deliver ecosystem services such as reduction in soil erosion and biodiversity benefits by providing nesting and foraging habitats. These benefits are, however, not additional as they are associated with business-as-usual land use practices. Since one of the criteria for receiving ecosystem services payments is additionality (Wunder 2007; Engel et al. 2008), such benefits should not be rewarded by the conservation agency. We therefore do not consider them in our model.

The AB scheme consists of two payoff components. The base component is a participation subsidy,  $s(\sigma_i)$ , intended to compensate for any opportunity cost of conservation relative to profit-maximising agricultural land use. Landowner i receives an additional bonus,  $b(\sigma_i)$ , if a neighboring landowner implements the same conservation land use practice as landowner i. Thus, the total bonus received is proportional to the number of neighboring landowners choosing the same land use strategy, denoted by  $n_{i\sigma}$ . We assume that the environmental agency provides AB payments for adoption of pro-conservation land use of one type only, i.e., landowners cannot choose both X and Y. We make this assumption because (i) PES schemes typically involve a menu of land use practices from which landowners usually can select a few suitable ones, and (ii) paying some landowners for undertaking all listed actions may exhaust the limited PES budget (Cooper, Hart, and Baldock 2009; Armsworth et al. 2012), creating high participation clusters in some areas at the expense of low participation rates elsewhere. Let  $r(\sigma_i)$  denote the agricultural revenue under land use  $\sigma_i = X, Y, NP$ .

If a landowner i chooses to participate in the scheme he or she incurs transaction costs,  $T_i$ . We assume that all landowners have identical transaction costs, i.e.,  $T_i = T$ , either High or Low depending on the treatment. In practice, these transaction costs will vary substantially across landowners and across land use strategies. However, by sacrificing some realism (which would probably not cause large behavioral differences) we gain tractability to identify causal treatment effects. The payoff,  $u_i(\sigma_i)$ , of landowner i under the AB scheme reads as follows:

$$u_i(\sigma_i) = \begin{cases} r(\sigma_i) + s(\sigma_i) + n_{i\sigma}b(\sigma_i) - T & if \ \sigma_i = X, Y \\ r(\sigma_i) & if \ \sigma_i = NP \end{cases}$$
 (1)

<sup>3</sup> Such localized clustering may be interpreted as geographical targeting of conservation funds which can be politically contentious to the extent that the U.S. Congress has prohibited such targeting (Shortle et al., 2012).

In Eq. (1) the number of neighbors and hence the bonus payment is contingent on the specific landscape structure. Following Banerjee et al. (2012, 2014), in this study we impose a simple circular network structure to represent neighborhood interactions. On such a circular local network  $n_{i\sigma}$  can either take the value 0, 1 or 2. By employing a circular network each individual faces the same level of strategic uncertainty within the decision environment, since all have the same number of neighbors. Given this spatial symmetry in terms of the individuals' location on the network, we avoid additional complications, such as holdout problems due to bargaining power of some individuals that are strategically located. In networks featuring an asymmetric neighborhood structure (e.g., a two-dimensional lattice grid or a straight-line), individuals could respond differently to the transaction cost variation and information available through communication.

We note here that while the choice of network structure is simpler than the more complex spatial grids implemented by Parkhurst et al. (2002) and Parkhurst and Shogren (2007) to study spatial targeting, it still captures the main strategic interdependencies that are relevant for studying spatially contiguous land use. First, in many realistic environments, individuals typically do not interact with all individuals within their network directly but perhaps only interact with a few neighboring individuals who provide them with information about what others within the same network are doing. Second, like more complex spatial grids, a circular network also exhibits strategic uncertainty regarding individuals' decision-making, especially if individuals have imperfect information about the choices of individuals that are not their direct neighbors (see Banerjee et al., 2014). In this sense, while simple, our strategic setting is relevant to studying such PES institutions. The payoff function specification in Eq. (1) makes the AB mechanism a coordination game with Nash equilibria pertaining to situations where individuals and their

neighbors choose the same strategy. This coordination game is similar to critical mass coordination games where the payoff from choosing an action is positive only if a specific number of players also choose that action (Devetag 2003).

The AB coordination game has a Pareto efficient and multiple risk dominant Nash equilibria (Harsanyi and Selten 1988; Parkhurst et al. 2002). Strategy *X* corresponds to the Pareto efficient strategy as it generates the highest payoffs (because it has the greatest environmental benefits and hence highest agglomeration bonus). Strategy *Y* on the other hand constitutes a situation of coordination failure explained by the presence of strategic uncertainty within the game environment. That is, it might be less risky for a subject to choose the land use practice that corresponds to a lower payoff *loss* in the event that one or more of the neighbors chooses not to coordinate on the efficient outcome. Strategy *NP* is also an equilibrium strategy but does not involve participating in the AB scheme.

Appendix B.I contains all parameters that have been used to construct the payoff tables 1a and 1b for the High (T=40) and Low (T=15) transaction cost treatments, respectively. The AB payments for X and Y are chosen to reflect the fact that ecosystem services generated through adoption of X land use are spatially contingent to a higher degree than those generated through Y. For example, X can correspond to land uses which when adopted leads to a reduction of habitat fragmentation. Here, the location of adopted use matters much more than in the situation where land use involves reduction in fertilizer use where the number of adoptees may matter more than their location. The value of the high transactions cost is chosen such that, the game features two Nash equilibria:  $\sigma_i = X$  ( $\forall i$ ) and the outside option  $\sigma_i = NP$  ( $\forall i$ ) with the former one Pareto dominating the latter. Choosing land use practice Y is not a Nash equilibrium because it is strictly dominated by NP. Therefore, if a subject chooses to pay the fee and participate in the scheme, he

or she would be likely to choose X over Y. This is an interesting setting because the presence of the fee reduces strategic uncertainty and the coordination problem in the event of participation. Reasoning based on forward induction involves making an inference about the future play in a subgame based on information about play leading up to the subgame (Van Huyck et al. 1993; Cooper et al. 1994; Cachon and Camerer 1996; Plott and Williamson 2000; Dufwenberg et al. 2016), and can then guide behavior towards making the efficient X choice. In contrast, for the low transaction cost setting, selection of Y by a landowner and both direct neighbors leads to a payoff which is not strictly dominated by the reservation payoff, yielding a third Nash equilibrium  $\sigma_i = Y$  ( $\forall i$ ). This Nash equilibrium is risk dominant relative to the Pareto dominant Nash equilibrium  $\sigma_i = X$  ( $\forall i$ ). Forward induction is not applicable in this setting.

Further, for the high transaction cost setting, T is greater than the participation payment for strategy X only. We chose this format because if the transaction cost is less than the participation components for both X and Y, participation is trivially incentivized even in the presence of the transaction cost and in the absence of the bonus. This is not an interesting case. The high-cost T value is not set to be greater than the participation payments for both strategies as well because this feature would further reduce landowner appeal to participate in the AB scheme. Under the low-cost condition, the transaction cost value is less than the participation component for both X and Y to generate a situation where participation is individually rational. We did not set T to be greater than both the participation components for reasons similar to those for the high-cost environment. Finally, setting the low value of T to be greater than the participation component for any one of the strategies would have been interesting but we decided to consider a scenario where incentives to participate are enhanced since, in the high-cost setting, participation barriers are substantial. Given this setup, we have two hypotheses:

HYPOTHESIS I: (TC1) Participation levels are lower in the high transaction cost treatment compared to the low transaction cost treatment.

HYPOTHESIS II: (TC2) Conditional upon choosing to participate, choice of the Pareto efficient equilibrium action is more frequent in the high transaction cost treatment compared to the low transaction cost treatment.

Additionally, the individual's land use choice, and hence the ability of the AB scheme to reach the efficient outcome and maximize ecosystem services benefits, is influenced by the degree of community-level communication and interactions. This is especially important in PES schemes where landowners need to spatially coordinate their decisions (Lawley and Yang 2015). Communication can provide an opportunity to (i) announce and declare sustained commitment for a particular action, (ii) articulate reasons for having made a choice in the past as well as those which will guide future decisions, (iii) influence direct neighbors to choose the same strategy, and (iv) persuade direct neighbors to convince other social peers to make the same choice. Thus, communication might reduce strategic uncertainty and lead to a higher uptake, reduce or avoid coordination failure, and improve the ability of the scheme to generate the Pareto efficient outcome as has been presented by Parkhurst et al. (2002) and Warziniack et al. (2007). Warziniack et al. (2007) also find that pre-play communication reinforces landowners' decision-making to reach the Pareto efficient outcome more quickly. Yet, in a conservation auction with AB payments, Fooks et al. (2016) find that communication may lead to collusion and higher rent extraction.<sup>4</sup>

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<sup>&</sup>lt;sup>4</sup> Note that Parkhurst et al. (2002), Warziniack et al. (2007) and Fooks et al. (2016) focus specifically on spatial targeting, i.e., how agglomeration bonuses – both with and without communication – can promote the establishment of a pre-determined land configuration across space. In this paper we do not investigate spatial targeting as such and

Thus, the impact of communication in the AB context is predicated on the nature of the strategic environment. As a result, it is important to study the role of communication on AB outcomes in new settings such as the current one. Additionally, in all the aforementioned studies, communication was assumed to be costless for landowners and introduced as an exogenous treatment variable. However, communication typically incurs costs; for example, the time spent calling or visiting neighbors. In essence, this cost is another transaction cost associated with PES scheme participation and it is realistic to incorporate communication in a costly format into the current decision environment. In fact, owing to the cost associated with messaging, landowners may be likely to recognize and place greater value on the content of the messages that are being sent and/or received. In doing so, the opportunities for communication might lead to a higher uptake, reduce or avoid coordination failure, and improve the ability of the scheme to generate the Pareto efficient configuration. In our model this is particularly true for the high transaction cost setting where there is no coordination problem and the only bottleneck is the participation hurdle.<sup>5</sup> Yet, the messaging fee could still serve as an impediment because subjects may not want to incur it and hence the benefits of communication may not be realized. Thus, our third hypothesis is:

HYPOTHESIS III (Communication): Communication opportunities between neighboring landowners leads to (a) higher participation levels, and (b) given participation, improves coordination on the Pareto efficient equilibrium.

concentrate on the general coordination problem of achieving the efficient land use on a given spatial network of landowners.

<sup>&</sup>lt;sup>5</sup> We note here that we chose the value of the messaging fee such that the Nash equilibrium strategies under the two transaction cost conditions are the same in the no-communication and communication settings.

#### 3. Experimental Design and Procedures

We report data from 24 sessions with 8 subjects per session, as summarized in Table 2, producing a data set with 192 subjects. Each experimental session was divided into two phases consisting of 15 periods each. In Phase I for 12 sessions termed HLTC (abbreviating *High-Low Transaction Cost*), subjects faced the high transaction cost of 40, followed by the low cost of 15 in Phase II. In the remaining 12 sessions termed LHTC (abbreviating *Low-High Transaction Cost*), the cost ordering was reversed. We implemented this within-subject variation (*i*) because transaction costs associated with the same economic decision may change over time, (*ii*) to minimize within-subject variation for comparison across treatments, and (*iii*) to study behavior of inexperienced subjects and those with some prior experience with a transaction cost value.

Non-binding pre-play communication, denoted by COMM, was implemented as a between-subject treatment in 8 of the 24 sessions. Each subject could communicate privately in chat windows with adjacent neighbors for 60 seconds by paying a fee of 5 experimental francs per neighbor. Subjects could receive messages from neighbors for free despite having chosen not to communicate. This communication protocol is similar to the one implemented in Cooper et al. (1989) and represents the reality that communication is almost always costly for the sender whereas receiving messages (an email, voicemail or written communication) incurs minimal cost. Earlier we noted that forward induction could help subjects coordinate on the Pareto efficient equilibrium in the high transactions cost treatment. The choice to incur costs to communicate could signal intentions to play *X* (Cachon and Camerer 1996) and coordinate efficiently irrespective of message content.

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<sup>&</sup>lt;sup>6</sup> We kept chat windows open for 60 seconds to ensure that even if subjects chatted in all 30 periods, the experiment would not last for more than 90 minutes beyond which subject fatigue might compromise the quality of responses.

At the beginning of the experiment, every subject received a randomly-assigned ID that determined their location and their networked neighbors' identities. This ID remained the same in Phase I. We implemented this fixed-matching protocol because private land ownership is usually unchanged for long time periods and also because repeated interactions with the same set of subjects can foster coordination by building subjects' reputation for playing a particular strategy amongst their direct neighbors. At the beginning of Phase II the neighborhood structure was shuffled and every subject received a new ID and a new set of neighbors which remained unchanged henceforth. This ID switch was implemented to break any possible path dependence that is often present in coordination game experiments (Van Huyck et al. 1993; Romero 2015). This path dependence can confound the transaction cost variation treatment when transitioning from Phase I to Phase II. During each phase of the experiment, subjects received hand-outs (see Appendix B.II) containing information on the payoffs, the transaction cost of participation associated with that phase (15 or 40), the reservation (non-participation) income (175), and a figure representing their positions on the network.

In the COMM treatment, at the beginning of a period, subjects first decided whether they wanted to pay the fee to communicate with their neighbors. Those who chose not to pay the fee waited for others to finish chatting. After this stage, everyone made their participation decisions. In the periods of the NO-COMM sessions, everyone proceeded to the participation stage directly. In this stage each subject had to decide whether to participate in the AB scheme by incurring the transaction cost. Neighbors' participation decisions were not revealed while subjects made this decision. Individuals who chose to participate moved on to the next stage in which they selected land use *X* or *Y*. Those who did not participate earned the reservation income.

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<sup>&</sup>lt;sup>7</sup> By following this approach, we were able to retain the simultaneous move feature of the coordination game although it comprised of two stages of decision-making.

Once all subjects made choices they received information about their own and their direct neighbors' communication decisions, participation, land use choices and payoffs for the current period. Additionally, an on-screen history table provided this information for all past periods within a phase. In the COMM sessions, this History table also included subjects' own and neighbors' current and past communication decisions, and the total fees paid to communicate.

We used content analysis methodology to analyze all messages from the COMM sessions. Three undergraduate students from the University of Nebraska-Lincoln reviewed chat content incorporated in 195 different chat rooms representing both dialogues and monologues. Rather than classifying individual chat sentences separately, all messages within a chat room were encoded jointly and classified into different categories on the basis of a message classification scheme. The classification scheme was developed on the basis of review of two randomly drawn COMM sessions (one for each transaction cost ordering). The content of each chat room could be assigned to multiple categories. In order to minimize bias, the research assistants coded statements without being aware of the research questions and did not interact with each other during this exercise.

Since the coding is subjective, we measured inter-rater agreement using Cohen's Kappa (Cohen 1960; Krippendorff 2004). This is a scaled measure of agreement and takes a value of 0 when the agreement between coders is implied by random chance and 1 when the coders agree perfectly. Kappa values between 0.41 and 0.60 indicate that coders have Moderate agreement for that category, those between 0.61 and 0.8 indicate Substantial agreement and beyond that implies Almost Perfect agreement (Landis and Koch 1977). Table 3 presents a sub-set of categories from the message classification scheme which were coded with Moderate and higher reliability.<sup>8</sup>

<sup>8</sup>We did consider other categories and sub-categories in our analysis, but they were coded with less than "Moderate" agreement and hence are not presented in the paper.

The experiment was implemented in z-Tree (Fischbacher 2007) and subjects were recruited from the broad undergraduate Purdue University population using ORSEE (Greiner 2015) during August 2013 and November 2014. All experiment instructions (included in Appendix B.III) were made available on subjects' computer screens. We did not include any contextual terminology relevant to ecosystem services provision other than land use because we wanted to study how financial incentives impact experimental outcomes and also because pro-environmental terminology can potentially trigger various subject behaviors and confound the treatment effect (Cason and Raymond 2011).

Experiment instructions indicated that all subjects would be facing the same payoff table, that all AB scheme payoffs were net of the transaction costs of participation, and that the experiment would last for 30 periods. Before starting the experiment, subjects participated in a quiz to verify their understanding. The sessions lasted between 60 and 90 minutes. Subjects were paid a \$6 show-up fee and additional money earned during the experiment. An exchange rate of US\$1 for 250 experimental currency (francs) was used to convert earnings, and average subject earnings (including the show-up fee) were \$26.82.

#### 4. Experimental Results

Our results focus on the role of transaction costs and communication on (a) participation levels in the AB scheme, (b) the rates of efficient land use choice, and (c) the degree of spatial coordination on the efficient land use choice. <sup>10</sup> In Section 4.1, we present the results related to the first two aspects followed by the findings related to spatial coordination in Section 4.2.

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<sup>&</sup>lt;sup>9</sup> To ensure that subjects knew that all payoffs were net of transaction costs, we clearly indicated their total payoff for each outcome in the experimental handout provided to them.

<sup>&</sup>lt;sup>10</sup> The Y land use (although not payoff efficient) is valuable for delivery of ecosystem services benefits, but are spatially explicit to a lesser degree in our model as reflected by the lower AB payment. However, our results focus on the

#### 4.1. Participation and Efficient Land Use Choices

Consider first the findings from the non-communication (NO-COMM) sessions. The top two panels of Figure 1 present the participation rates in the two 15-period phases for both the cost treatments pooled across the 16 NO-COMM sessions. Participation rates are always higher under low transaction costs in both Phases of the experiment. These rates fall steadily from 70% in Period 1 to 20% in Period 15 in the HLTC-NO-COMM sessions. By contrast, subjects in LHTC-NO-COMM sessions are able to maintain relatively higher levels of participation with only a weak negative trend in Phase I. A non-parametric Wilcoxon Mann-Whitney test based on session-level average rates of participation in Phase I indicates a statistically significant treatment effect at the 5% level (*p-value* = 0.015). Thus, high transaction costs prove to be a deterrent for participation in the AB scheme, providing support for Hypothesis I. While this result is intuitive it is interesting considering that conditional on participation, no coordination problem exists in the high cost sessions. The weak negative trend for the low-cost setting also indicates that transaction costs are less problematic at low values for AB scheme participation.

**Result 1:** *High transaction costs can significantly reduce participation rates in the AB schemes.* 

The falling rates of participation across repeated interactions under both cost conditions may be attributed to factors that resolve subjects' strategic uncertainty (in favor of non-participation) and impact the likelihood of participation. First, unlike in a non-network coordination game, both direct and indirect neighbors influence payoffs but only past choices of

participation and payoff efficient X choices because of the low frequency of Y choices in our experimental data (presented in Figure I in Appendix A), which makes it difficult to draw confident conclusions about Y land use for the current setting.

<sup>&</sup>lt;sup>11</sup> All nonparametric tests reported in the paper employ independent 8-person groups as the unit of observation.

direct neighbors are visible. The second factor is that, given the structure of the payoffs, participation and subsequent coordination on X is profitable only when both direct neighbors participate. This feature is true for both high and low transaction cost values, but losses induced by coordination failure are greater when costs are high.  $^{12}$ 

The experiment's two treatment phases are useful for evaluating how subjects' prior experience with a particular transaction cost regime affects participation. After the cost treatment switchover, in the HLTC-NO-COMM the participation rate jumps substantially from 20% in Period 15 to nearly 86% in Period 16. This increase is statistically significant (Wilcoxon matched-pairs signed-rank test *p-value* = 0.013). The corresponding change from 78% to 80% for the LHTC-NO-COMM group is not statistically significant (Wilcoxon matched-pairs signed-rank test *p-value* = 0.943). This result suggests a path dependence in outcomes. Focusing on overall trends across all Phase II periods, we observe only a small decrease in participation in the HLTC-NO-COMM from 85% in Period 16 to 78% in Period 30. For the LHTC-NO-COMM treatment, a fall in program uptake occurs from 79% in Period 16 to 36% in Period 30. However, no significant difference exists in participation rates between the HLTC-NO-COMM and LHTC-NO-COMM groups in Phase II (Wilcoxon Mann-Whitney test *p-value* = 0.14). To summarize:

**Result 2**: Prior experience with low transaction costs reduces the negative impact of a transaction cost increase on future participation rates, moderating the effect of transaction costs as an obstacle for participation.

<sup>&</sup>lt;sup>12</sup> We adopted this feature to evaluate the performance of the AB scheme in an adverse payoff setting with the expectation that if the incentive scheme performs well in the current environment, it will perform even better in scenarios where efficient coordination is profitable even if only some neighbors choose *X*. Moreover, this adverse payoff situation also reflects recent reductions in PES scheme budgets overall, which require resources to be spread thinly over numerous existing programs (Claassen and Ribaudo 2016; Shortle et al. 2012).

Figure I in Appendix A shows the percentage of X, Y and NP choices for both treatments for all periods. We observe 21% of Y choices when transaction costs are low and only 4% when costs are high in the NO-COMM groups. Thus, conditional on participation, most subjects select the efficient X strategy. The top panel of Figure II in Appendix A displays the percentage of X choices conditional on participation for both phases for both cost treatments for the 16 NO-COMM sessions. Wilcoxon Mann-Whitney tests indicate no significant difference in the rate at which X is chosen between high and low cost costs groups in both Phases I (p-value = 0.461) and Phase II (p-value = 0.368). Accordingly, our data do not provide support for Hypothesis II. Thus, while it is a deterrent for participation, the transaction cost regardless of its value does not hinder the ability of the AB to incentivize efficient X strategy choices in groups who participate. This result is true for any level of subject experience.

Next consider participation rates and efficient land use choice *X* in the COMM sessions.<sup>14</sup> The two bottom panels of Figure 1 display participation rates for the 8 COMM sessions under the two transaction cost ordering treatments for all periods across both phases. No discernible time trend exists in any phase, and the participation is higher when transaction costs are lower (after few initial periods). For an understanding of these outcomes, we analyze the nature of communication.

Figure 2 presents information on chat frequency, indicating that despite adding to the total transaction costs incurred, subjects utilized communication opportunities to promote efficient strategy choices. Of the 195 chat rooms used, there is a predominance of dialogues (69 instances

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<sup>&</sup>lt;sup>13</sup> Concerning the frequency of *Y* choices, Wilcoxon Mann-Whitney tests indicate a marginally significant transaction cost treatment effect (p-value = 0.052) in Phase I and at a 5% level of significance (p-value = 0.047) in the latter part of Phase II of the No-COMM sessions (after Period 20).

<sup>&</sup>lt;sup>14</sup> We also ran 8 sessions under both cost orderings where communication was free and observed participation and efficient choices very near 100%. We do not report these additional results in the interests of brevity.

constituting 138 chat rooms in total) rather than monologues (57 chat rooms in total) under all conditions except in Phase I of the LHTC-COMM sessions. This is not surprising as a dialogue is a more credible form of communication. Players exchanging messages have a stronger chance of agreement than in a monologue where the messaging player has no way of knowing if the receiver will respond appropriately. Yet as mentioned earlier, the communication fee elevates the credibility of messages conveyed through monologues, both for the senders and receivers. For the receiver, the fee paid by the sender may signal commitment to the message content and for the sender it can serve as a commitment mechanism to follow through with what is communicated.

Focusing on the timing of communication, Figure 3 indicates that most messaging occurs in the early periods of both Phase I (nearly 65% of all chat rooms) when subjects are unfamiliar or have low levels of experience in the experiment and early in Phase II (remaining 35%) when subjects are re-assigned to new neighbors. Such behavior is to be expected given the costly messaging setting because once coordination on a particular strategy has been established most subjects do not need to pay the messaging fee and rely predominantly on information feedback at the end of a period before making subsequent choices.

Turning to the communication content, Table 3 presents the Cohen's Kappa values and the relative frequency of the different categories and sub-categories into which the messages were classified. The most common category coded is "Influence neighbors to choose Strategy X" (Category 4X) with a frequency of 44%; i.e., in 44% of the chat rooms, a subject tried to influence a neighbor to select strategy X by sending a message such as "Pick X and we all win big". Moreover, across all COMM sessions we find that in 72 out of the 99 cases when subjects sent messages classified in this way, the neighbor receiving the communication selected X.

The second most common category with an average frequency of 33% is "Discuss experimental game features and payoffs" (Category 10). This category mainly includes messages that explain the value of coordination on strategy *X* to neighbors such as "*If you participate and choose X you will see a much larger payoff*". The category "Declare one's commitment to select Strategy *X*" (Category 1X) is coded with an average frequency of 28% and is often combined with Category 4X as is evident from the statement "*I'm going to choose A. it would do well if you did the same. We will garner the most money this way*". In fact 61 instances of *X* choices are observed in the periods in which players sent messages (across all COMM sessions through 65 chat rooms) conveying their commitment to strategy *X*. Such commitment is also strongly predicated on past behavior. Of the subjects who communicated to neighbors that they were committed to *X* (in 44 chat rooms across all COMM sessions), 32 had chosen *X* in the previous period.<sup>15</sup>

Finally, Category 8, denoting "Ask neighbors to influence their other neighbor's future strategy choice", has a frequency of 18% and it highlights the importance of the network structure. It indicates that subjects recognize that sustained participation and efficient coordination over repeated interactions requires neighbors' neighbors to participate and choose *X* as well. Thus, subject use messages such as "The entire room needs to choose *X* to maximize payout, begin choosing *X* and pass it on to your other neighbor" in 39 chat rooms (across all COMM sessions).

These frequently-used categories represent the overarching goal of communication within this strategic setting – namely to reduce strategic uncertainty in favor of a strategy, to spread information about the benefits of choosing a particular strategy, and to generate sustained commitment for that strategy. The choice data confirm that communication is successful because

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<sup>&</sup>lt;sup>15</sup> The number of chat rooms (44) mentioned here is different from the total classified in Category 1X (65). This is because when assessing the relationship between messaging content and previous period behavior, we excluded 21 chat rooms for Period 1 for which there is no past history and for Period 16 in which neighbor identity and the strategic setting were reset.

relative to NO-COMM settings, little negative time trend exists in participation rates (Figure 1 bottom panel) and a weak or no time trend exists for *X* choices conditional on participation (bottom panel of Figure II in Appendix A). Despite the obvious value of communication to promote coordination, however, 17 (out of 64) individuals never communicate. These individuals sometimes received messages from neighbors and could have also used feedback information about neighbors' behavior at the end of a period to guide their behavior towards participation and efficient coordination.

To evaluate the impact of transaction costs on participation in the presence of communication opportunities, we analyze participation decisions using 2-way clustered logit regressions for both phases. The dependent variable is the likelihood of participation in a period. The control variable is the dummy variable taking a value of 1 for the high cost sessions. <sup>16</sup> The standard errors are clustered by subject and period (Cameron et al. 2012). The regression results are presented in Model (1) and Model (2) of Table 4 and suggest no significant transaction cost treatment effect in Phase I and a negative and significant effect in Phase II at 1% significance level. This result provides partial support (in Phase II only) for Hypothesis I for the COMM treatment. Note that this result contrasts with the finding in the NO-COMM treatment, where the treatment effect is found in Phase I only.

In the COMM treatment subjects use communication to encourage their neighbors to participate, to generate commitment for choosing the efficient strategy, and to ensure that the willingness to participate and the commitment to choose *X* is passed on to other parts of the local network through direct and indirect neighbor linkages. This implies that in Phase I communication allows groups to sustain a stable participation rate over repeated interactions even with high

<sup>&</sup>lt;sup>16</sup> We do not control for learning effects since Figure 1 (bottom panel) does not indicate any trend in the data.

transaction costs. Combined with the fact that participation rates remain high and stable in the low cost groups, no treatment effect emerges in Phase I. In Phase II after the treatment switchover, participation rates remain near the level observed during Phase I in the LHTC-COMM groups. For the HLTC-COMM groups, nearly everyone participates in Phase II owing to improvement in cost conditions. This situation leads to a significant cost treatment effect in Phase II.

Conditional on participation, 2-way clustered logit regression results indicate a significantly greater likelihood (at 1% level of significance) of *X* choices in high cost groups than in low cost groups in the presence of communication in Phase I. This provides support for Hypothesis II for the communication treatment and is contrary to the result obtained for NO-COMM. One possible explanation for this finding is that since subjects are already paying a high transaction cost, the extra communication fee if paid increases the value of the communication and focuses behavior of more subjects (senders and receivers) in the HLTC-COMM sessions on *X* than it does in the LHTC-COMM sessions where the losses from paying the transaction cost and the messaging fee are lower.

Considering differences in behavior driven by the communication treatment, relative to no communication we can draw two conclusions from Figure 1. First, the participation rate is on average higher with communication than without it under both transaction cost conditions. Second, communication plays a more important role in the high transaction cost groups than in the low cost groups. Communication in high-cost groups averts the negative trend observed in the corresponding groups without communication in both phases, whereas in the low-cost groups behavior is relatively stable both with and without communication. For a statistical analysis of these claims, we employ 4 clustered logit regressions (one for each Phase and transaction cost condition). The dependent variable is again the likelihood of participation, which is regressed on

a dummy variable equal to 1 for the COMM sessions, the reciprocal of the Period variable to control for learning and capture the time trends, and an interaction term between these two variables to account for differences in learning rates between treatments. All standard errors are clustered by subject and period. Table 5 presents the results in Models (1) through (4).

A positive and significant estimate (at the 1% level) is obtained for the communication treatment dummy variable in both phase regressions for the high cost condition and for Phase II of the low cost treatment, providing partial support for Hypothesis III(a). Thus, while incurring an additional transaction cost for the subjects who choose to message (and 47 subjects do so at various points during the experiment), communication resolves the strategic uncertainty of many more subjects in the COMM sessions leading to more *X* choices. The positive estimate for the reciprocal of the period variable and the negative estimate for the interaction term for both phases of the high-cost treatment and Phase I of the low-cost treatment signify the impact of experience on participation. Thus, relative to no-communication scenarios, communication has an unambiguously positive effect under unfavorable participation conditions and its benefits under low-cost conditions are obtained only when subjects have had no prior experience with participation in the AB scheme. To summarize:

**Result 3:** Communication generates greater rates of participation in the AB scheme. Communication has a greater positive impact when compared to the no-communication setting in high-cost groups at all levels of subject experience than in low-cost groups.

#### 4.2 Spatial Coordination

This section presents an analysis of location-specific land use choices of all participants to assess the performance of the AB in creating spatially coordinated land use patterns. We develop a performance metric counting every instance where a subject and his/her two direct neighbors within their local neighborhood are able to *locally coordinate* on the same land use strategy. This metric can take a maximum value of 8, signifying that all 8 group members are perfectly or *globally coordinated* on either strategy *X* or *Y*. Any other lower non-zero value indicates only localized clustering of similar choices on the network. In this format, the same metric captures instances of both local and global coordination that are routinely observed in all groups during the experiment. Since coordination on *X* is Pareto efficient, we refer to this as locally *efficient* coordination.

Let us start by examining spatial coordination under the no-communication regime. The top two panels of Figure 4 present the average levels of locally efficient coordination by a subject and both of their neighbors in the NO-COMM groups for all periods of Phases I and II. Localized coordination on X is of special interest for the high-cost condition since the non-participation strategy NP strictly dominates option Y. For these groups, post-participation, forward induction reasoning can guide many adjacent subjects' choices to the Pareto efficient X equilibrium. While forward induction may not explain the many adjacent X choices in the low-cost groups, incurring the transaction cost focuses multiple neighboring subjects' choices on X, which pays more than Y in the event of localized coordination.

A Wilcoxon Mann-Whitney test detects a significant difference in efficient localized coordination between low and high-cost groups without communication (p-value = 0.05) in Phase I after Period 8. This finding is aligned with the results supporting Hypothesis I as presented in the discussion on participation. Since participation is significantly lower in the HLTC-NO-COMM

sessions, so is overall AB performance. A likely reason for any significant difference appearing after Period 8 is that in the initial periods subjects are unfamiliar with the strategic environment, so most *X* choices are either non-adjacent or involve only two neighbors selecting *X*.

With repeated interactions, participation rates fall in both groups, but they fall more steeply in the high-cost sessions (as an increasing number of subject's strategic uncertainty gets resolved in favor of *NP*) causing fewer neighbors to choose *X*. As a result, rates of localized efficient coordination fall to about 14% in Period 15 in HLTC-NO-COMM groups. Performance is maintained between 40% and 50% in the LHTC-NO-COMM groups, where more people choose *X* and the participation rate has a weak negative trend, leading to the significant treatment effect. In Phase II there is no significant difference across transaction cost treatments, consistent with the previous result regarding no significant difference in participation rates.

Figure 5 presents the fraction of instances of globalized efficient coordination for the NO-COMM sessions, defined as all eight group members choosing *X*. Wilcoxon Mann-Whitney tests indicate no significant cost-treatment effect in either Phase. Group-level coordination is difficult – for any value of the transaction cost, it is challenging to get all group members to make the same choices, especially given that information feedback is limited to direct neighbors. Yet positive rates of global coordination suggest that, despite participation challenges, the AB scheme can sometimes fully coordinate environmentally-beneficial choices.

**Result 4**: Greater transaction costs reduce localized efficient coordination only for inexperienced groups and globalized efficient coordination is not significantly impacted by variation in the transaction cost values.

Let us now compare rates of spatial coordination with communication. The bottom panel of Figure 4 shows the percentage of localized coordination in the COMM groups by transaction cost and for both phases. A surprising result is that in Phase I, localized coordination is greater in the HLTC-COMM groups relative to the LHTC-COMM groups. This difference is marginally significant at the 10% level on the basis of a 2-way clustered logit regression (Table 4, Model (3)) where the dependent variable takes a value of one when players within a local neighborhood are able to coordinate on the efficient strategy X and 0 otherwise. The independent variables are the high cost treatment dummy and the reciprocal of the period variable included to capture non-linear rates of learning. Thus, although in Phase I there is no support for Hypothesis I (as there is no difference in the number of individuals who participate under the two cost conditions), more neighboring players participate in HLTC-COMM groups than in LHTC-COMM groups. Localized coordination is improved in low-cost groups in Phase II relative to high-cost groups since virtually every individual in the HLTC-COMM group participates (reinforcing the significant treatment effect supporting Hypothesis I) and nearly everyone chooses X. Model (4) in Table 4 shows that this difference is statistically significant at the 1% level on the basis of a 2-way clustered logit regression.<sup>17</sup>

Finally, we compare localized coordination rates with and without communication. Models (5) through (8) in Table 5 present the results of four 2-way clustered logit regressions (for each Phase and transaction cost condition). The dependent variable takes a value of one when players within a local neighborhood are able to coordinate and choose *X*. Similar to the previous models, the control variables include a dummy variable taking a value of 1 for the COMM sessions,

<sup>&</sup>lt;sup>17</sup> 2-way clustered logit regressions (with every group being the unit of observation) indicate no significant effect of transaction costs on likelihood of global efficient coordination in the presence of communication (the data pooled across all sessions are presented in Figure 5).

the reciprocal of the period variable and an interaction term. Results indicate a significant (at the 1% level) and positive estimate for the COMM dummy variable in both phase regressions for the high transaction cost condition and for the low-cost condition in Phase II, substantiating the information presented in Figure 4 when comparing across top and bottom panels for each cost condition and phase.

Relative to the no-communication settings, messaging can guide behavior of a greater number of adjacent individuals to the efficient choice, hence significantly improving the likelihood of localized efficient coordination. For groups facing low transaction costs, the COMM dummy variable is not significant in Phase I which is in line with Result 3. Moreover, the signs of the significant estimates for the interaction term and the reciprocal of the period variable for the high-cost models indicate that repeated interactions improve performance in groups with communication. Since the negative trend is largely a result of strategic uncertainty being resolved in favor of *NP* and communication reduces strategic uncertainty in favor of participation and *X*, this result follows automatically. This finding supports Hypothesis III(b) and underscores the positive role of communication (even though it adds to the transaction cost incurred) in guiding the selection of the efficient Nash equilibrium outcome in coordination games with both Pareto-dominant and risk-dominant Nash equilibria within a local network.

**Result 5**: Mechanisms to reduce strategic uncertainty, such as communication, can build commitment for choosing the efficient strategy and improve AB performance in the presence of transaction costs.

#### 5. Discussion

Our study results are of course predicated on the nature of the strategic environment, i.e., the payoff functions under either high or low transaction costs, the size and circular nature of the local network, and the degree of information feedback. A circular network does not describe many real world settings where an AB policy could be introduced. Using a spatial set-up different from the circular network (such as a line or lattice) may produce different results, since some individuals would have different numbers of neighbors, and would therefore face different levels of strategic uncertainty and payoffs. In the context of coordination games, Cassar (2007) finds that the frequency of payoff-dominant choices is higher in a "small world" or a "random" network than in a local network such as the one we consider. She also finds that coordination is obtained much faster in the small world setting, while noting that "a theory linking network characteristics to individual behavior is not yet available" (page 228). However, compared to networks where strategic uncertainty varies across players, we could argue that the circular network provides a lower bound on coordination failure in an AB setting.

We could have chosen a transaction cost value less than 40, which would not have made *Y* strictly dominated by *NP*. We conjecture that this would lead to much greater participation and many more *Y* choices than is currently observed under the high-cost treatment. While this is interesting, this finding is similar to results obtained in Banerjee et al. 2014 and could have eliminated (*i*) any difference between high-cost and low-cost groups and (*ii*) subjects' ability to use forward induction to guide their behavior in our network AB coordination game. Moreover, the transaction cost treatment is more interesting if it generates differences in the set of equilibria compared to when it just produces a difference in net payoffs. This leads to an interesting thought experiment: if a regulator wishes to increase participation or efficient localized coordination in an

AB scheme for a given budget, is it better to spend this money on increasing the baseline (participation) subsidy, or on subsidizing the transactions costs that participants face (e.g. by providing free advice)? In our experiment, no real difference exists in the effects of these actions if the subsidy increase is equivalent for schemes *X* and *Y*, other than in the framing of the payments. But targeting the baseline subsidy increase at *X* only could increase the uptake of this land use relative to *Y* or non-participation by more than an equivalent reduction in transactions costs. Unfortunately, we were unable to test whether significant differences in desired spatial coordination emerge from such re-allocation of funds in the lab.

The size of the circular network and nature of information feedback may also impact behavior. More information and smaller group sizes usually generate greater rates of efficient choices in coordination games. However, with a group size of 8 we believe we have struck a reasonable middle ground whereby the group is small enough for many individuals to choose *X* and large enough for many to select *NP* or *Y* (owing to high strategic uncertainty). With this group size we are able to assess the extent to which the AB can still deliver on its environmental goal when the effect of each individual is relatively small compared to the total group. Finally, we could have provided information to subjects beyond their local neighborhoods (e.g., on their indirect neighbors such as in Banerjee et al., 2014). Although this would be inconsistent with our localized communication format, it provides an avenue for future research especially if regulatory agencies start publicly announcing enrollment rates in order to promote greater participation. It is also possible that coordination failure would have implications for what participants consider "fair", and this could influence the likelihood of coordination on the Pareto-superior equilibrium, especially if outcomes are observable such as in Reeson et al. (2011).

#### 6. Conclusions

PES schemes are increasingly being implemented as policy mechanisms to enhance the supply of ecosystem services. The predominant property rights regime in countries such as the US, the UK, New Zealand and Australia requires that landowners be financially compensated to encourage the supply of ecosystem services, rather than being compelled to do so by regulation: the "provider gets" principle (Hanley et al. 1998). Second, for many environmental outcomes, spatial coordination increases the size of environmental benefits for a given level of enrollment in voluntary conservation programs. The policy design challenge is to find systems of incentives that spatially coordinate a voluntary sign-up program. The Agglomeration Bonus (AB) is one such mechanism. However, the AB faces a number of potential problems, including the tendency over time for participants to converge on risk-dominant outcomes, a lack of cost-effectiveness, and, like many incentive programs, the size and nature of transaction costs. To date, the effects of transactions costs have not been investigated in the AB literature, despite their importance to PES scheme participation decisions.

In this paper we use a laboratory experiment to investigate how private transaction costs affect the degree of participation in an AB scheme, its efficiency and the patterns of spatial coordination in the presence and absence of communication. Results show that higher transaction costs lead to greater non-participation, whilst lower transaction costs are conducive to producing a greater degree of coordination on the most preferred environmental outcome. Full coordination on the most efficient outcome is rarely achieved, but localized clusters of coordinated conservation actions emerge in most cases.

Communication is costly and thus adds to the transaction costs incurred, but it improves outcomes, generating economic and environmental benefits. There are clear parallels here with

experimental findings on the implications of communication (albeit costless) in "ambient" pollution tax schemes (Segerson 1988), where the pollution tax liability of each firm depends on group behavior. For example, Suter et al. (2008) find that allowing participants to communicate in a non-binding fashion produces lower pollution levels and maximizes group profits. Our communication results can also be compared with the effects of costless communication in experiments on Voluntary Contribution Mechanisms for public goods, such as in Isaac and Walker (1988), where non-binding group discussion significantly reduced free-riding behavior.

The policy implications of our results are clear: if the regulator can design an AB scheme in a way which keeps transaction costs low relative to the payoffs of coordination, then it will be easier to achieve spatial coordination (both locally and globally). This, in turn, enhances a more effective delivery of ecosystem services. However, if achieving a given environmental objective requires writing (complicated) rules for potential participants, then there is a trade-off between improving environmental effectiveness and increasing coordination, since such complications will increase transactions costs. Set against this scenario, facilitating low-cost communication between landowners would improve the likelihood of successful coordination towards socially-desirable land use patterns. Providing subsidies to lower transaction costs initially would also foster early coordination, and our results suggest that improved performance could persist even after such subsidies are removed and transaction costs increase.

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**TABLES** 

**Table 1a: Payoff Table for High Transaction Cost condition** 

# **Payoff Table**

# **Actions Chosen by Neighbors**

Your Action	Both Participate Choose X	Both Participate and one Chooses X & other Y	Both Participate and Choose Y	Only one Participates & Chooses X	Only one Participates & Chooses Y	No Neighbor Participates
X	210	125	40	125	40	40
$\mathbf{Y}$	145	155	165	145	155	145
NP (Non- Participation)	175	175	175	175	175	175

# **Table 1b: Payoff Table for Low Transaction Cost condition**

# **Payoff Table**

# **Actions Chosen by Neighbors**

Your Action	Both Participate Choose X	Both Participate & one Chooses X & other Y	Both Participate & Choose Y	Only one Participates & Chooses X	Only one Participates & Chooses Y	No Neighbor Participates	
X	235	150	65	150	65	65	
$\mathbf{Y}$	170	180	190	170	180	170	
NP (Non- Participation)	175	175	175	175	175	175	

**Table 2: Summary of Experimental Design** 

	<b>Communication Treatment</b>			
Transaction Cost Ordering Treatment	No-Comm	Comm		
High-Low	HLTC-No-Comm (8 sessions)	HLTC-Comm (4 sessions)		
Low-High	LHTC-No-Comm (8 sessions)	LHTC-Comm (4 sessions)		

Table 3: Categories for coding messages (reaching at least Moderate Reliability) and observed frequency in chat rooms

Category <sup>+</sup>	Description	Cohen's Kappa	Relative Frequency of Coding
1	Declare one's commitment to a particular strategy		
1X	Will select X	0.83	0.28*
1Y	Will select Y	0.90	0.03
1NP	Will select NP	0.75	0.06
2	Explain own reason for choosing a strategy (X, Y or NP)		
2P	In the past periods	0.45	0.02
3	Inform one neighbor about other neighbor's strategy choice		
3X	Other neighbor chose X	0.45	0.03
3Y	Other neighbor chose Y	0.79	0.03
3NP	Other neighbor chose NP	0.69	0.04
3NX	Other neighbor did not chose X	0.56	0.03
4	Influence neighbor(s) to select a particular strategy		
4X	Choose X	0.81	0.44*
4Y	Choose Y	0.78	0.02
4NP	Choose NP	0.79	0.01
5	Ask neighbors about their future choices	0.55	0.07
6	Ask neighbors about their reasons for choosing a strategy	0.65	0.03
7	Ask neighbors about their other neighbors past choices	0.53	0.02
8	Ask neighbors to influence their other neighbor's future strategy choice	0.88	0.18*
8X	Influence other neighbor to select X	0.89	0.17
8Y	Influence other neighbor to select Y	0.49	0.00
9	Refer to own past strategy choice	0.49	0.01
10	Discuss about experimental features & game payoffs	0.73	0.33*
11	Agree on a strategy	0.55	0.13
12	Other	0.54	0.34*

<sup>&</sup>lt;sup>+</sup> Only those categories (and sub-categories) reaching an agreement of Moderate or higher reliability are listed. *X* and *Y* labels correspond to Strategies *A* and *B* in the experiment.

<sup>\*</sup> Represents categories which have a relative frequency of coding of 15% or more.

Table 4: 2-way Clustered Logit Regressions for Participation and Performance Analysis in each Phase for Communication Groups

Dependent Variables	Partici	Participation Localized Efficient Coordinati			
Independent	Model 1 Model 2		Model 3	Model 4	
Variables	Phase I	Phase II	Phase I	Phase II	
High Transaction	-0.024	-0.157**	0.027*	-0.106***	
Cost	(0.019)	(0.032)	(0.015)	(0.023)	
1 Period <sup>+</sup>	-	-	-1.343** (0.344)	-0.756** (0.048)	
Constant	2.161** (0.612)	7.43** (1.15)	-0.098 (0.478)	1.975*** (0.49)	
Number of observations	960 (480 in each Phase)				

**Cluster Variables** 

Individual Subject and Experimental Period in a Phase

Table 5: 2-way Clustered Logit Regressions for Performance comparison of Communication and No Communication Treatments by Phase and Transaction Cost#

Independent - Variables	Participation				<b>Localized Efficient Coordination</b>			
	Model 1: Phase I (HC)	Model 2: Phase II (LC)	Model 3: Phase I (LC)	Model 4: Phase II (HC)	Model 5: Phase I (HC)	Model 6: Phase II (LC)	Model 7: Phase I (LC)	Model 8: Phase II (HC)
Comm	0.892*** (0.229)	1.999*** (0.622)	0.197 ( 0.245)	0.782*** (0.246)	1.063*** (0.221)	2.019*** (0.374)	0.028 (0.192)	0.864*** (0.237)
$\frac{1}{Period^+}$	2.197** (0.871)	0.428 (0.421)	1.960*** ( 0.652)	2.674*** (0.902)	0.027 (0.458)	-0.368 (0.227)	-1.152*** (0.381)	0.610** (0.252)
1 Period+ x Comm	-1.060** (-0.467)	-1.094 (0.81)	-1.285*** (0.356)	-1.179*** (0.489)	-0.848** (0.368)	-0.375 (0.658)	0.078 (0.327)	-0.652*** (0.095)
Constant	-0.600** (0.29)	1.579*** (0.251)	1.549*** (0.29)	-0.5* (0.26)	-1.088*** (0.297)	-0.086 (0.728)	0.171 (0.449)	-0.546** (0.245)

Number of 0bservations 1440

Cluster Variables

Individual Subject and Experimental Period in a Phase

<sup>\*\*</sup> Represents statistical significance at the 1% level, \* at the 10% level

<sup>+</sup> Period takes a value between 1 and 15

<sup>#</sup> HC refers to High Transaction Cost and LC refers to Low Transaction Cost

<sup>\*\*\*</sup> Represents statistical significance at the 1% level, \*\* at the 5% level and \* at the 10% level

<sup>+</sup> Period takes a value between 1 and 15