SOCIAL NETWORKS AND WAGES
IN SENEGAL’S FORMAL SECTOR

Nicoletta Berardi

March 2013
SOCIAL NETWORKS AND WAGES
IN SENEGAL’S FORMAL SECTOR

Nicoletta Berardi

March 2013
Social Networks and Wages in Senegal’s Labor Market

Nicoletta Berardi

Banque de France

We thank for support and comments J.P.Azam, participants at IARIW, AFSE, DIME, ADRES, and EEA conferences, Bicocca and OECD Development Centre seminar, IZA and GREQAM summer schools, and anonymous referees, S.Avouyi-Dovi, R.Berlinschi, P.Dubois, G.Fields, G.Friebel, J.Y.Lesueur, M.O.Jackson, E.La Ferrara, M.Gilli, J.Miquel-Florensa, J.Ortega, L.Pagani, F.Portier, R.Rathelot, F.Salanié, P.Seabright, N.Treich, G.Verdugo, and Y.Zenou. The views expressed in this paper are those of the authors and do not necessarily represent those of their institutions.

Contact address: Banque de France - 31, rue Croix des Petits Champs - 75001 Paris - France.
E-mail: Nicoletta.Berardi@banque-france.fr
Résumé: Nous développons un cadre théorique prenant en compte le rôle joué par l’aléa moral et la diversité de réseaux et cultures dans le choix du canal d’embauche. Dans des contextes de favoritisme, les réseaux sociaux, et particulièrement les liens forts, sont adoptés comme canaux d’embauche pour des postes peu qualifiés et impliquent des pénalités salariales, tandis que le contraire arrive autrement. Nous estimons un modèle de changement de régimes endogène pour le cas du secteur manufacturier formel Sénégalais et trouvons que, de façon cohérente avec les prédictions du modèle théorique dans le cas de favoritisme, les canaux d’embauche informels sont préférés pour des postes peu qualifiés et sont associés avec des pénalités salariales, particulièrement quand les liens sont forts.

Mots clés: Réseaux sociaux; Canal d’embauche; Différentiel de salaire

codes JEL: O12; J31

Abstract: We develop a theoretical framework that considers the role played by moral hazard and the diversity of networks and cultures in the choice of hiring channel. In favoritism contexts social networks, and particularly strong ties, are adopted as hiring channels for unskilled jobs and result in wage penalties, while otherwise the opposite happens. We estimate an endogenous switching model for the case of Senegal’s manufacturing formal sector and find, consistently with our theoretical predictions in case of favoritism, that informal hiring channels are preferred to fill unskilled vacancies and are associated with a wage penalty, especially when ties are stronger.

Keywords: Social networks; Hiring channel; Wage differential

JEL classification: O12; J31
1 Introduction

Why are some workers hired through social networks, while other employees through formal channels, and what is the effect of the hiring channel on their wages? In this paper we theoretically explore the circumstances in which either informal or formal hiring channels are preferred and either positive or negative wage differentials emerge, considering the role played by moral hazard and the diversity of networks and cultures in the choice of hiring channel. On the empirical side, we investigate the adoption of social networks as hiring channels and its impact of wages in the case of a developing country, Senegal, whereas the others contributions to this topic generally focus on OECD countries.

An impressive number of vacancies is filled through informal hiring channels, which comprise family, friends, and in general social networks to which individuals belong, rather than through the formal labor market. Granovetter [1973], Rees [1966] and Corcoran [1980] find that about half of the jobs in the United States are filled through personal contacts and Ioannides and Loury [2004] notice that the role played by networks increased over time. Sociologists and economists have first looked at the supply side of the labor market. Holzer [1988], for example, showed that when multiple search methods are possible, workers prefer social networks to formal hiring channels, because the former are less expensive and characterized by a higher probability of being hired than the latter. On the demand side, the traditional wisdom among economists is that informal hiring channels may help to mitigate selection problems arising in recruitment. For instance, Montgomery [1991], Saloner [1985] and Simon and Warner [1992] all argue that informal hiring channels may reduce information asymmetry between employers and employees and provide a better matching of unobservable characteristics. Montgomery assumes that social networks are based on homophily of unobservable characteristics, so that people tend to refer others like themselves. Saloner’s results rest instead on the referees’ willingness to safeguard their reputation. Simon and Warner posit that the use of informal hiring channels reduces employers’ uncertainty about applicants productivity.

All these models predict that hiring through social networks should always be preferred

---

1 We follow the literature in using the expression ‘informal hiring channel’ to indicate that a social network served as information channel for a hiring.

2 For an interesting review of economic and sociological competing theories providing a rational for the use of informal hiring channels, see Fernandez et al. [2000].
to formal channels. Moreover, the enhanced selection that is guaranteed by informal hiring channels should be specially exploited for vacancies requiring high skills and should imply wage premia for workers hired through social networks. However, in the real world, formal and informal hiring channels coexist and their adoption greatly varies in different contexts. First of all, the practice of hiring through social networks is even more pronounced in developing countries than in industrialized ones. Moreover, many empirical studies suggest that vacancies for unskilled occupations are more likely to be filled through social networks than jobs requiring high skills, while some find the opposite. Finally, wage differentials imputable to informal hiring channels are far from being found always positive. For instance, Pelizzari [2009] finds that, out of 15 industrialized countries, in Austria, Belgium and the Netherlands networked workers enjoy wage premia, in Greece, Italy, Portugal and UK they suffer wage penalties, while in the 8 remaining countries there are no significant wage differentials due to the adopted hiring channel.

The discrepancies between theoretical predictions and empirical studies suggest that theories focusing on adverse selection overlook some crucial aspect of the phenomenon. This paper aims at reconciling theory and empirical findings on the choice of hiring channel and its potential effect on wages. It does so, first of all by taking into account that, besides selection issues, incomplete information may also imply problems of moral hazard. Second, it considers that networks differ in their tightness, while the existing theoretical literature does not consider the variety of social networks. We argue that the strength of links is important, because tight networks are able to exert peer pressure to ensure proper behavior of members who are hired

---

3See Ben-Porath [1980] and Falchamps [2006], who suggests that reliance on interpersonal relationships and networks can be seen as a symptom that formal institutions do not work well.
4See Rees [1966], Rees and Schultz [1970], Corcoran [1980], Banerjee [1984], Pistaferri [1999], Antoninis [2006], Munshi and Rosenzweig [2006], and Pelizzari [2009]. Kugler [2003], for example, argues that the use of referrals is more widespread in high-skilled occupations.
5While Simon and Warner [1992] and Kugler [2003] conclude that workers hired through social networks get wage premia with respect to employees hired through formal channels, penalties are found by Pistaferri [1999] and Bentolila et al. [2010].
6A tight network is characterized by very strong ties. Different concepts of strong ties populate the literature. Hennig and Lieberg [1996] and Wahba and Zenou [2005] define strong ties as those based on a repeated and regular relationship, while Grecco [1987], Lin [1999] and others measure the strength of the ties by the degree of commitment, reciprocity, trust and mutual obligation. Our preferred notion is the one proposed by Granovetter [1973]: “The strength of a tie is a (probably linear) combination of the amount of time, the emotional intensity, the intimacy (mutual confiding), and the reciprocal services which characterize the tie.”.
7One recent exception is Zenou [2011], where geographical distance plays the role of tightness.
Indeed, Shapiro and Stiglitz [1984] show that, when observing employees’ effort is costly for firms, employers need to increase workers’ expected value of not shirking with respect to shirking. That is, firms need to rise either the monitoring or the salary of their workers. However, the role played by peer pressure may decrease the monitoring costs for workers hired through social networks with respect to other employees. Third, even networks characterized by similar tightness may play a very different role in the job market depending on the culture. There are contexts in which a worker hired through a social network reciprocates the working opportunity by exerting more effort than workers hired through the formal channel, while a culture of favoritism encourages networked employees to work less than the others. Our model integrates all these aspects and explains why either formal or informal hiring channels are adopted and why either positive or negative wage differentials may emerge for workers hired through informal channels, depending on circumstances. Moreover, it accounts for the stylized facts that developing countries rely even more on social networks as hiring channels than industrialized ones and that informal hiring channels are often adopted to fill unskilled vacancies.

The paper also contributes to the empirical literature by investigating the determinants of hiring channels at worker, network and firm level and the impact of the adopted hiring channel on wages in the Senegalese formal manufacturing sector. While most of the empirical literature on social networks as hiring channels is largely confined to developed countries studies, very few studies have analyzed the crucial role of social networks in less developed countries’ labor markets and none takes into account the fact that social networks differ in their tightness.

The cultural parameter in the theoretical framework presented in section captures what Loury [2000] interprets as due to two different types of links. Notable exceptions are Egypt’s studies by Assaad [1997] and Wahba and Zenou [2005].
Sub-Saharan Africa refers to the colonial period \cite{falchamps2009}. However, this region is pervaded with informality to a greater extent than other developing countries\footnote{An example of the economic relevance of informality in Africa is provided by \cite{azam2001} concerning the credit market.} and social networks play a crucial role in their labor markets\footnote{\cite{luke2006} and \cite{magruder2010} find that traditional social networks, such as those based on kinship, are pivotal for labor markets respectively in Kenya and South Africa. \cite{barr2002} stress the importance of ethnic networks for labor outcomes in Ghana.}. At the same time, Senegal is a rare example of a Sub-Saharan African country characterized by a dynamic economy moving away from the ubiquitous informality to a market economy, thus providing a unique opportunity to investigate the remains of informality in an economy that is developing toward formal markets.

We adopt an empirical approach that to our knowledge has not been applied before to investigating informal hiring channels. Estimating an endogenous switching model, we find that informal hiring channels are preferred to fill unskilled vacancies and are associated with a wage penalty. Moreover, the probability of having been hired through a social network and the absolute value of wage penalties is increasing with the strength of ties. These findings are consistent with our theoretical predictions in contexts where favoritism is widespread.

Section \ref{sec:descriptive_statistics} analyzes the case of Senegal, providing details on the data and some descriptive statistics characterizing sampled firms and workers. Section \ref{sec:theory} presents a theoretical framework that accounts for the elements intuitively singled out above and corroborated by the analysis of rough data. Section \ref{sec:econometric_evidence} presents econometric evidence supporting the hypotheses and the predictions of our theoretical framework. Finally, section \ref{sec:conclusion} concludes.

## 2 Descriptive statistics

The empirical analysis relies on the Investment Climate Assessment (ICA) survey for Senegal, run by the World Bank in 2003. It provides information about 262 firms and 1637 of their workers in the formal manufacturing sector. One of the salient features of this data set is

\footnote{The survey defines the formal sector as made up by registered firms. However, there are many other firms that do not officially exist (and thus do not pay taxes). The latter firms make up the so-called informal sector of the economy, which represents a notable part of the economy and employs a great number of workers. Data available for 2001 indicate that it represented almost 55\% of GDP and that about 1.2 million people worked in informal firms. However, the informal sector of the economy is likely to hire almost only through social networks. Thus, the formal sector is a more interesting ground to pin down the determinants of firms’ choices concerning the hiring channel.} \footnote{The fact that sampled firms belong to the manufacturing sector implies that it is not possible to reach conclusions about the Senegalese economy in general. However, the manufacturing sector is a large part of it.}
that it matches workers and firms, which allows controlling for idiosyncratic characteristics of both.

Social networks based on family, friends are the main channel of matching between firms and workers in the dataset. On the demand side, the majority of firms use sometimes formal and sometimes informal hiring channels, and 60% of the sampled firms declare to mainly rely on informal networks in order to fill their vacancies. On the supply side, 65% of interviewed workers found their job through social networks.\(^{18}\)

In order to get some insights about the phenomenon, it is useful to analyze the characteristics of both firms and workers thoroughly. Some characteristics of the sampled firms are reported in Table 1 which distinguishes between firms that declare to mainly rely on formal and on informal hiring. All sampled firms are located in an urban area and 95% of them in the capital city, reflecting the distribution of manufacturing employees in the country.\(^{19}\) Enterprises where the owner is also the director of the firm are also those that more often use informal hiring channels, while bigger firms tend to rely more on formal hiring channels.

Having noticed these characteristics at the firm level, we now investigate the characteristics of sampled workers.\(^{20}\) Table 2 reports available information about sampled employees, distinguishing between those hired through formal channels and those who found their job through social networks. Workers who found their job through networks of relatives, friends are about 65% of interviewed workers. The survey also provides information concerning two types of social networks. The first one is the network binding the owner or manager of the firm with employees belonging to her ethnic group.\(^{21}\) The second one includes members of her extended family working in the firm.\(^{22}\)

\(^{18}\) Notice that the focus of this paper is on the hiring channel and not on the characteristics of the contract hold by workers. Indeed, the ICA survey does not provide information on workers’ contract, i.e., whether it is written and complete, whether it specifies benefits and social insurance, etc. However, Combarnous\(^{2001}\) shows that in Côte d’Ivoire workers who found their job through informal channels usually have incomplete contracts, while employees holding complete contracts often applied to a vacancy announcement.

\(^{19}\) Indeed, more than 2 million people live in Dakar, while less than 250 thousands in the other cities. Thus, the concentration in Dakar of interviewed workers is almost representative.

\(^{20}\) Notice that the information available concerns neither the pool of applicants, nor just-hired workers, but workers employed at the time the survey took place.

\(^{21}\) 99% of sampled workers answered the question about whether they belong to the same ethnic group as that of the firm manager or owner. Notice that the survey does not report the ethnic group of interviewed workers. Senegal has a wide variety of ethnic groups. The main ethnic groups are the Wolof (41%), the Fula and Toucouleur (26%), and the Serer (15%).

\(^{22}\) As in the case of ethnic group, 99% of workers answered to the question ‘Are you a relative of the firm
networks whereby workers may be hired, since employees that belong to the same ethnic group
as the head of the firm are 21% among workers hired through an informal network and 13%
in the formal labor market. Since family ties are likely to be tighter than merely ethnic ones,
the comparison between their effects enables to test the role played by network tightness in the
labor market.\footnote{Unfortunately, the precise type of link is not specified in the survey.}

Our data set provides evidence that workers are hired more often through social contacts
for jobs requiring lower qualifications. Indeed, 76% of unskilled workers found their job through
their family or friends. The percentage falls to 60% for skilled blue collars and to 41% for skilled
white collars and managers.\footnote{The survey categorizes workers into ten types of jobs. We group them into four occupational categories: manager, skilled white collar (engineer, scientist, economist, programmer, mathematician, accountant), skilled blue collar and other skilled (technician, supervisor, maintenance and repairing man, medical staff, clerk, secretary), and unskilled (other production worker, guard, cook).} Workers who found their job through informal contacts are also
less educated, experienced, and younger than employees hired on the formal labor market.
Finally, the mean of the natural logarithm of real monthly salary,\footnote{Real wages are computed adjusting reported salaries at the time of hiring for the harmonized consumer price index, provided by the Senegalese Forecasting and Statistics Direction (Direction de la Prévision et de la Statistique). Notice that the questionnaire asks workers to report their salary at the time of hiring, which may imply a recall bias.} is significantly lower for
workers hired through social networks.

While the rigor of econometrics is necessary to disentangle the relative role played by different
variables, the analysis of crude data suggests several potentially relevant dimensions, which are
integrated in the theoretical framework developed in section 3. In particular, the incidence of
informal hiring channels varies with job characteristics and network tightness.

3 A Model of Hiring Through Formal and Informal Channels

The need of a theoretical framework accounting for what we observe in reality and in the data
described in section 2 motivates our modeling exercise. In order to understand the use of social
networks as hiring channels, the key point is investigating why and when firms and applicants
prefer to rely on them. Since adverse selection has long been investigated in the context of hiring
channel choice without managing to account for empirical evidence, we abstract from it for the
manager or owner?. Unfortunately, the data on the precise contacts each individual has are not available. Therefore, we proxy
network tightness based on the available information, like\cite{patacchini2012}.
sake of tractability and we focus instead on other crucial characteristics of the phenomenon that received little attention until now. Moreover, we simultaneously take into account the choices of employers and applicants.

3.1 Setting

We model a formal-sector firm that can hire labor either through the formal channel, at a market wage $w^F$, or from a pool of workers who are linked to that firm by a social network.\footnote{Table \[ in appendix \[ summarizes the variables introduced in the model.} In the latter case, the wage is determined by the bargaining between the firm and the worker.\footnote{A vacancy posted through formal channels is likely to announce a wage. However, when informal hiring channels are used, wage is much more likely to be the object of some negotiation and to depend on the bargaining power of a specific candidate.} Assume that the outcome is determined by the Generalized Nash Bargaining Solution (Rubinstein [1982]), so that the wage paid to a worker, when hired by the informal channel, maximizes $(w^N_{i,j} - w^N_{i,j})\eta_i(w^N_{i,j} - w^N_{i,j})^{1-\eta_i}$. In this function, $\eta_i$ is the worker’s bargaining power, $w^N_{i,j}$ is the minimum wage that employee $i$ is willing to accept through informal channels for working for firm $j$, rather than only accepting jobs through formal channels, and $\overline{w}^N_{i,j}$ is the maximum wage that the firm is prepared to pay this worker rather than hiring another one via the formal channel. The latter two variables ($w^N_{i,j}$ and $\overline{w}^N_{i,j}$) are determined endogenously, as described below. In conclusion, if the firm hires through informal channels, the corresponding wage will be determined as follows:

$$w^N_{i,j} = \eta_i \overline{w}^N_{i,j} + (1 - \eta_i) w^N_{i,j}.$$  \hspace{1cm} (1)

This expression simply says that the agreed wage will be a linear combination of the two extreme points of the bargaining set, being closer to the top the higher is the worker’s bargaining power.

We assume that the firm can observe worker’s individual output only by costly monitoring her. For the sake of simplicity, the worker can either shirk or exert some effort, and that effort may be influenced by how she was hired. A worker hired through the formal channel chooses $e^F_i \in \{0, e\}$, while somebody hired through social networks $e^N_i \in \{0, e + \delta \varphi_{i,j}\}$. Indeed, the characteristics of the social network whereby a worker is hired, and namely its tightness ($\varphi_{i,j}$), are likely to influence the extent of her effort. In some contexts workers hired through social networks may be eager to reciprocate the working opportunity, while elsewhere they may feel...
that they don’t need to exert as much effort as the others (i.e., the sign of $\delta$ is culturally driven).

Denote $q_{i,j}^k$ the probability that worker $i$ hired through channel $k \in \{F, N\}$ gets fired by firm $j$, and assume that the monitoring technology is such that the worker will only be fired if she is caught shirking, which happens with probability $\mu_{i,j}^k$ when she does. The payoff of a worker hired by the formal channel is:

$$U_{i,j}^F = (1 - q_{i,j}^F) w^F - \gamma e_i^F$$

where $\gamma$ is the per-unit cost of effort. However, a worker hired through a social network also feels peer pressure by members of her hiring channel not to compromise its reputation. Indeed, if she is caught shirking and fired, she will be punished by the network that served as hiring channel to an extent that depends on its tightness. Therefore the payoff of a worker hired by the informal channel is:

$$U_{i,j}^N = (1 - q_{i,j}^N) (w_{i,j}^N + \zeta_{i,j}) - \gamma e_i^N - q_{i,j}^N \varphi_{i,j}$$

where $\zeta_{i,j}$ is the non-monetary gain that a worker may derive from working with or for a member of her social networks. This parameter captures the benefits that the worker can get from being an active member of the network, including gifts in special occasions like weddings and various kinds of help.\footnote{The potential role played by non-pecuniary benefits is stressed in \cite{Fontaine2007} and \cite{Bentolila2010}. It is likely that such benefits depend somehow on network tightness. However, the model is agnostic concerning the specific functional form describing this potential relationship, since the latter is far from being obvious. While this simplification entails that tightness explicitly appears only with a negative sign into the worker’s utility function, the key point is of course accounting for the net impact of tightness on it.}

**Lemma 1** (No-Shirking Conditions). When formal and informal channels are adopted the no-shirking conditions are respectively:

$$\mu_{i,j}^F \geq \frac{\gamma e_i^F}{w_{i,j}^F}$$  \hspace{1cm} (2)

$$\mu_{i,j}^N \geq \frac{\gamma (e + \delta \varphi_{i,j})}{w_{i,j}^N + \zeta_{i,j} + \varphi_{i,j}}$$  \hspace{1cm} (3)

Proof is provided in appendix A. The no-shirking conditions (2) and (3) suggest that the intensity of monitoring that maximizes the firm’s profit depends on the chosen hiring channel.
This result is a direct consequence of the fact that the utility function of workers depends on their hiring channel. Indeed, when a social network is adopted as hiring channel, its tightness (as well as the cultural parameter $\delta$) determines the level of monitoring inducing effort. Moreover, the larger the non-monetary benefit enjoyed by networked workers, the lower the monitoring needed to induce their effort.

It can be readily checked that no-shirking conditions (2) and (3) will hold as an equality, as this is the value of $\mu_{i,j}^k$ that maximizes the firm’s profit per worker. Assuming that labor productivity is $\vartheta$, and denoting $\xi_j$ the unit cost of monitoring, the profit of firm $j$ when hiring worker $i$ through formal and informal channels are respectively:

$$\Pi_{i,j}^F = \vartheta e_i^F - (1 - q_{i,j}^F) w^F - \xi_j \mu_i^F$$

such that $e_i^F = e$ and $q_{i,j}^F = 0$ if $\mu_i^F \geq \frac{\gamma e}{w^F}$, and $e_i^F = 0$ and $q_{i,j}^F = \mu_i^F$ if $\mu_i^F < \frac{\gamma e}{w^F}$;

$$\Pi_{i,j}^N = \vartheta e_i^N - (1 - q_{i,j}^N) w_{i,j}^N - \xi_j \mu_{i,j}^N$$

such that $e_i^N = e + \delta \varphi_{i,j}$ and $q_{i,j}^N = 0$ if $\mu_{i,j}^N \geq \frac{\gamma(e + \delta \varphi_{i,j})}{w_{i,j}^N + \xi_j + \varphi_{i,j}}$, and $e_i^N = 0$ and $q_{i,j}^N = \mu_{i,j}^N$ if $\mu_{i,j}^N < \frac{\gamma(e + \delta \varphi_{i,j})}{w_{i,j}^N + \xi_j + \varphi_{i,j}}$.

Therefore, per worker profit when the firm hires through respectively formal and informal channel may simply be written as:

$$\Pi_{j}^F = \vartheta e - w^F - \xi_j \frac{\gamma e}{w^F}$$ (4)

$$\Pi_{i,j}^N = \vartheta (e + \delta \varphi_{i,j}) - w_{i,j}^N + \xi_j \frac{\gamma(e + \delta \varphi_{i,j})}{w_{i,j}^N + \xi_j + \varphi_{i,j}}$$ (5)

which of course have to be non-negative, so that there exist a $w_{i,j}^N_{\max}$, a $w_{i,j}^F_{\min}$, and a $w_{i,j}^F_{\max}$.

In the sub-game perfect equilibrium, workers hired through formal and informal channels know that the firm will respectively choose $\mu_i^F = \frac{\gamma e}{w^F}$ and $\mu_{i,j}^N = \frac{\gamma(e + \delta \varphi_{i,j})}{w_{i,j}^N + \xi_j + \varphi_{i,j}}$, so that their payoff is in fact:

$$U^F = w^F - \gamma e$$ (6)
and
\[
U_{i,j}^N = w_{i,j}^N + \zeta_{i,j} - \gamma(e + \delta \varphi) \tag{7}
\]

We are now in a position to determine the bounds \([w_{i,j}^N, w_{i,j}^N]\) of the bargaining problem in proposition 1 whose proof is provided in appendix A.

Proposition 1 (Bargaining Set). The upper and lower bound of the bargaining set are determined as follows:

1. The firm prefers hiring through social networks worker \(i\) if \(w_{i,j}^N \leq w_{i,j}^N\), where \(w_{i,j}^N\) is the maximum of \(w_{i,j}^N\) fulfilling:
\[
- \nu \delta \varphi_{i,j} + w_{i,j}^N + \frac{\gamma(e + \delta \varphi_{i,j})}{w_{i,j}^N} \leq w_F + \xi_j \frac{\gamma e}{w_F} \tag{8}
\]

2. The worker will accept a job from the informal channel if:
\[
w_{i,j}^N \geq w_{i,j}^N = w_F - \xi_j + \gamma \delta \varphi_{i,j} \tag{9}
\]

Proposition 1 thus specifies the acceptable range of values of the informal wage for making a transaction by this channel. If the monitoring cost is relatively low and the cultural context is such that workers hired through social networks are willing to exert extra effort to reciprocate \((\delta > 0)\), the upper bound is increasing with network tightness, reciprocity, and productivity. If instead networked workers exert less effort than employees hired through the formal channel \((\delta < 0)\), the upper bound is decreasing with network tightness, extent of favoritism (the absolute value of \(\delta\)), and productivity.

At the other end of the range, the lower bound is smaller the larger the non-monetary benefits that the worker gets from this informal transaction. When workers hired through social networks are eager to reciprocate the working opportunity, the lower bound increases with network tightness, while it decreases when networked workers exert less effort.
3.2 The Choice of the Hiring Channel

For the firm to hire through the informal channel, such a transaction must be worthwhile for both the firm and the worker. In other words, as a familiar saying suggests, ‘it takes two for tango’. Figure I, which depicts the set determined by proposition I, makes clear that this condition may fail if either the firm, or the worker, is not interested in making that transaction. For example, if the market wage is higher than \( \hat{w}^F \), defined as the point where \( w^{N}_{i,j} \) and \( w^{N'}_{i,j} \) coincide, workers do not want a job through social networks because firms are not willing to pay them enough through such a hiring channel. Only within the area labeled ‘informal hiring channel’ both sides are willing to use the informal channel.

This remark allows us to establish the following proposition

**Proposition 2** (Choice of Hiring Channel). When \( \delta > 0 \) (i.e., in a culture of gratitude),

1. informal hiring channels will be used:
   - always if \( \vartheta \geq \gamma - \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} \), or
   - only when \( w^F \) is below the threshold level \( \hat{w}^F \) if \( \vartheta + \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} < \gamma \);
2. informal and formal hiring channels are indifferent if \( \gamma - \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} < \vartheta \) and \( w^F = \hat{w}^F \);
3. formal hiring channels will be used otherwise.

When \( \delta < 0 \) (i.e., in a culture of favoritism),

1. informal hiring channels will be used:
   - always if \( \gamma \geq \vartheta + \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} \), or
   - only when \( w^F \) is below the threshold level \( \hat{w}^F \) if \( \gamma - \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} < \vartheta \);
2. informal and formal hiring channels are indifferent if \( \gamma - \frac{\zeta_{i,j}}{\delta \varphi_{i,j}} < \vartheta \) and \( w^F = \hat{w}^F \);
3. formal hiring channels will be used otherwise.

Indeed, only informal hiring channel are used when the area labeled ‘informal hiring channel’ becomes open-ended, that is when either \( \zeta_{i,j} > \varphi_{i,j} \delta (\gamma - \vartheta) \) or, if \( \zeta_{i,j} \to 0 \), when \( \delta (\gamma - \vartheta) \leq 0 \). Intuitively, the first condition suggests that social networks prevail as hiring channel when
non-monetary gains from informal hiring are substantial. Since in developing countries social networks are often very important and informal exchanges widespread, the relative weight of non-monetary benefit versus salary may be substantial. Therefore, our theoretical framework predicts that informal hiring channels should be even more common in developing countries than in industrialized countries. At the same time, since the same non-monetary gain will impact on workers’ utility more if their salary is lower, social networks should be more often adopted as hiring channel for less skilled jobs.

Even when networks do not provide a high non-monetary gain, only informal hiring channels are adopted if $\vartheta \geq \gamma$ when $\delta > 0$ and if $\gamma \geq \vartheta$ when $\delta < 0$. If the spread between productivity and cost of effort of a worker is increasing with her skills, our framework predicts that informal hiring channels should be preferred to fill skilled vacancies, when the culture is such that a worker hired through a social network reciprocates the working opportunity by exerting more effort than workers hired through the formal channel ($\delta > 0$). At the same time, in contexts of favoritism ($\delta < 0$) they should be preferred for unskilled jobs, while skilled vacancies should be filled through formal channels.

### 3.3 The Wage Differential

Figure 1 shows that the stronger the willingness to reciprocate a job opportunity obtained through social networks and the tightness of the social network adopted as hiring channel, the higher tends to be the wage of a worker hired through informal channels. The opposite is true the stronger the culture of favoritism and the tighter the social network adopted as hiring channel. The wage of a worker who found her job through a social network increases when her bargaining power is strong (i.e., $w^N_{i,j}$ close to $\bar{w}^N_{i,j}$) and decreases when it is weak (i.e., $w^N_{i,j}$ close to $w^N_{i,j}$). Moreover, when the bargaining power is limited, the salary earned by workers hired through the informal channel decreases with the non-monetary gain workers enjoy, while, if networked employees have strong bargaining power, the effect is weaker and the more so the larger the non-monetary gains.

We now formally assess when workers hired through the informal channel get a wage premium or a wage penalty with respect to employees hired through the formal channel.
Proposition 3 (wage differential). When $\delta > 0$,

1. both wage premium and penalty are possible, depending on the bargaining power, if $\zeta_{i,j} > \gamma \delta \varphi_{i,j}$;

2. only wage premium to workers hired through social networks is possible if $\zeta_{i,j} < \gamma \delta \varphi_{i,j}$.

When $\delta < 0$,

1. both wage premium and penalty are possible, depending on the bargaining power.

Proposition 3 suggests that depending on the parameter values, informal hiring channels may have either positive or negative consequences on salaries, as hinted by the empirical literature discussed in section 1. In particular, wage penalties should be more likely in contexts of favoritism and wage premia in the opposite case.\(^{29}\) Even in case of low bargaining power, workers hired through social networks earn for sure wage premia when they reciprocate the working opportunity by exerting more effort than workers hired through formal channels if non-monetary gain don’t exist. In such a culture, the value of wage premia are \textit{ceteris paribus} positively affected by network tightness and the intensity of reciprocity. On the other hand, in contexts of favoritism, workers hired through informal hiring channels can get wage premia only if the bargaining power is particularly strong.

4 Econometric analysis of hiring channel choice and wage differentials

We exploit the Senegalese data to investigate the determinants of hiring channel choice and wage differentials imputable to the hiring channel.\(^{30}\) A fundamental concern undermines the analysis: is the hiring channel choice exogenous to unobservable determinants of wage? If hiring channel and salary share some unobservable determinants, sample selection\(^{31}\) biases the

\(^{29}\)Interestingly enough, Pellizzari [2009] finds wage penalties in Italy and wage premia in countries like Belgium and the Netherlands.

\(^{30}\)It would be very interesting to test our theoretical insights concerning the role played by informal hiring channels in different institutional contexts, but a systematic cross-country comparison is beyond the purposes of this paper.

\(^{31}\)Sample selection is an issue because we observe wages of workers hired through a social network only when they were hired through that channel (and never if they were hired through formal channels).
estimation of coefficients. If for instance less able individuals are more likely to be hired through social networks than through formal channels and therefore receive lower wages \textit{ceteris paribus}, then failing to control for this correlation would yield biased estimates of the impact of hiring channel on wages.

Besides the potential sample selection bias, a further concern is that the hiring channel may have an indirect impact on the salary through the standard wage determinants. For example, the role played by a worker’s education on her wage may be weaker for an applicant hired through social networks than for one hired on the formal labor market. The econometric framework addressing at the same time the endogenous sample selection and the switching impact that wage determinants may have for workers hired through different channels is the endogenous switching model (see \cite{Heckman1979}). Roughly speaking, it is a treatment effect model that allows for a full set of interaction terms between the hiring channel and the standard determinants of wage. Some details on the endogenous switching econometric model are given in appendix \ref{appendixB}.

4.1 Specification of estimation

To take advantage of the richness of the available data, we take into account not only variables at the individual level as in the standard endogenous switching model, but also firms’ characteristics. Therefore, the system of equations of interest is as follows:

\begin{align}
\ln w_{i,j}^F &= \beta^F_{\text{worker}} X_i + \beta^F_{\text{firm}} \Xi_j + \epsilon^F_{i,j} \\
\ln w_{i,j}^N &= \beta^N_{\text{worker}} X_i + \beta^N_{\text{firm}} \Xi_j + \epsilon^N_{i,j} \\
H_{i,j}^* &= \gamma Z_{i,j} + u_{i,j}
\end{align}

Since our focus is on the choice of the hiring channel, variables should refer to the hiring time of each worker. Even though some variables explicitly refer to that time (hiring channel, type of job, salary and previous experience), the large majority of them explicitly refer to the time hiring occurred. However, some information obtained in 2003 may well approximate several variables at the hiring time. For instance, the years of education declared at the time hiring occurred are likely to correspond to the years of education at hiring time. Therefore, we assume that some variables at the firm (size, sector, location, public capital, and whether the director is also the owner) and the worker (years of education, hours of work and marital status) level are good proxies for their value at the time hiring occurred.

14
where the dependent variable of the wage regressions is the natural logarithm of the real monthly wage, $X_i$ are the regressors at worker $i$ level, $\Xi_j$ the characteristics of firm $j$, and $Z_{i,j}$ includes $X_i$, $\Xi_j$ and variables that allow identification. In particular, the vector $X_i$ is represented by worker $i$’s years of education and experience before the current job, gender, marital status, place of origin, number of hours worked per week, type of vacancy filled when hired, whether worker $i$ is a relative of firm’s manager or owner, or does not, but belongs to her ethnic group. The vector $\Xi_j$ includes firm $j$’s size, sector, and three dummy variables taking unit value respectively if firm $j$ is located in Dakar, if a large share of its capital belongs to the State, and if its owner personally runs the firm.

While the available data allow controlling for a great variety of observable characteristics both at worker and firm level, it may still be the case that some unobserved characteristics differ between individuals hired through different hiring channels. The best available exclusion restriction is a dummy taking unit value when a worker was over 40 years old when hired. The identifying assumption is that this variable is legitimately excluded from wage regressions (10) and (11), but significant in the selection equation (12). While by definition this hypothesis is not testable, economic reasoning supports our choice of this exclusion restriction. Indeed, it is standard to posit that age should not be relevant in a wage determination once experience and education are accounted for. The hypothesis that that relatively old people looking for a job are more likely to be hired through informal rather than formal channels is supported by evidence in Delattre and Sabatier [2007] and it is consistent with our theoretical framework in contexts of favoritism.

Finally, the observed dichotomous realization of the latent variable $H_{i,j}^*$ is whether each
sampled worker was hired through social networks \( H_{i,j} = 1 \) or not \( (H_{i,j} = 0) \):

\[
H_{i,j} = \begin{cases} 
1 & \text{if } H_{*,j}^* > 0 \\
0 & \text{otherwise} 
\end{cases}
\]

### 4.2 Econometric results

Table 3 shows the results for the simultaneous estimation of equations (10), (11), and (12). The second column of the table reports the coefficients of the determinants of the hiring channel, which correspond to the vector of parameters \( \gamma \) in equation (12). The determinants of salary for workers hired through social networks, corresponding to \( \beta_N^s \) in equation (11), are reported in column four. Those for employees hired through formal channels, corresponding to \( \beta_F^s \) in equation (10), are presented in the sixth column.

The main object of interest in table 3 is the type of social network whereby a worker was hired. A relative of the owner or manager of the firm \textit{ceteris paribus} has significantly greater chances of being hired through informal hiring channels. At the same time, relatives suffer a substantial wage penalty.\(^{37}\) The role played by kinship, possibly the tightest existing network, reflects the theoretical prediction of our framework that the tighter the social network that serves as hiring channel, the larger the potential wage penalties suffered by networked workers, in contexts where favoritism is widespread.\(^{38}\) Indeed, the fact of belonging to the same ethnic group as the firm’s head (without being a relative) has not significant impact once kinship is taken into account.

Table 3 clearly indicates that the use of social networks as hiring channel greatly varies with the type of vacancy to be filled, a stylized fact described in section 1. Unskilled workers have a significantly higher probability of being hired through social networks than skilled blue collars (the category of reference), while the opposite is true for skilled white collars. Such result verifies the theoretical implications of the model that are developed in section 3.2. If the spread between productivity and cost of effort of workers is decreasing with their skills, and the potential non-

\(^{37}\)Significant wage penalties suffered by workers hired through their relatives are also found by Nordström Skans and Kramarz [2011].

\(^{38}\)Since we do not separately observe the hiring choices of firms and applicants, but only the outcome of their joint decisions \( (i.e., \text{that someone is working for a firm}) \), some caution is needed in interpreting these results. However, the magnitude of coefficients undoubtedly points to their consistency with a context of favoritism.
monetary gains quite large with respect to unskilled workers’ monetary wage, networks are likely to be adopted as hiring channel despite favoritism, while the opposite is true for skilled white collar workers. Managers are not significantly more likely to be hired through formal rather than informal channels, probably because the two countervailing effects, namely large non-monetary benefits and high productivity combined with very costly monitoring, compensate each other.

The coefficients of the wage regressions show that a worker earns significantly more if hired as manager or a skilled white collar and less if hired as unskilled worker than if she is hired as skilled blue collar, consistently with what intuition suggests, whatever the hiring channel. However, the magnitude of the coefficients differs between hiring channels, a point that we will further investigate later on in this section.

Longer education is associated with a lower probability of being hired through social networks and the use of informal hiring channels is a decreasing and convex function of experience prior hiring. This feature is consistent with the prediction of our theoretical framework that larger productivity increases the incidence of formal channels. Education and experience, the classical Mincerian wage determinants, as expected significantly increase wages, whatever the hiring channel whereby a worker was hired.

Notice that, even controlling for workers’ experience, people over 40 years old are significantly more likely to have found their job through informal rather than formal channels. Our theoretical framework helps to intuitively understand the widely recognized phenomenon that elder people seldom get a job on the formal labor market. In fact, the burden of reconversion of their competences, which is required by a new working environment, tends to increase their cost of effort with respect to younger workers, so that formal hiring channels are hardly used despite favoritism, while peer pressure consequent to the adoption of informal hiring channels may compensate it.

We control for marital status, which is not a significant determinant of the hiring channel and does not affect wages of workers hired through social networks. However, workers hired on the formal labor market enjoy significantly higher wages if they are married. Workers’ gender, place of origin, and hours worked per week are maintained as control variables at the individual

\footnote{The same result is found for example by Pistaferri [1999].}

\footnote{An intriguing interpretation is that the network that has served as hiring channel constitutes a guarantee of trustworthiness, substituting marital status in the formal labor market.}
level, but they are never significant.

Table 3 also shows that there are a number of firms’ characteristics affecting the choice of the hiring channel and the wage. The location of a firm in Dakar rather than in other towns decreases the likelihood of hiring somebody through informal hiring channels. At the same time, employees working in a firm in Dakar gain significantly higher wages.

The size of the firm, in terms of total number of employees, has a significantly negative impact on the probability of being hired through informal channels and a positive one on wages. This is consistent with our theoretical predictions, since in small firms the recruiter and the employees tend to work closely, while in large firms peer pressure is less effective.

Workers employed by a firm run by its owner are not significantly more likely to be hired through social networks, but they earn less *ceteris paribus*. Indeed, a manager may get positive utility out of hiring people belonging to her social networks, even in cases when the choice of informal hiring channels does not maximize the firm’s expected profit, and may hire too often workers through their social networks. Instead, the utility of a director who is also the owner directly depends also on firm profit and principal-agent distortions are avoided: she uses her social networks as hiring channel only when convenient and she pays her networked employees what is needed to induce their effort and not more than that.

To account for time effects due to the fact that surveyed workers were hired in different years, we control for the total factor productivity change, which is as expected positively strongly correlated with salaries. Finally, we control for firms’ public capital and sector.

At the bottom of Table 3 are reported the estimated correlation coefficients between residuals of the regression for the choice of the hiring channel and for wages. The correlation between the residuals of the selection equation (12) and the wage regression for workers hired through formal channels (10), $\rho_F$, is not significantly different from zero. However, the correlation between the residuals of the selection equation and the wage regression for workers hired through informal

---

41 This finding is coherent with the view that big cities entail weaker social networks, an idea that dates back to the nineteenth century (see Tönnies [1887] and Simmel [1903]) and was developed by the social disorganization theory (see Wirth [1938], Redfield [1947] and Alexander [1973]) and the overload theory (see Milgram [1970]). For a short and enlightening discussion on the topic in sociology, see Amato [1993].

42 While the qualitative result is intuitive, the magnitude of the coefficients needs to be taken with a grain of salt, since 96% of sampled employees work in Dakar.

43 Pistaferri [1999] also finds that large firms are less likely to hire through informal channels and pay higher wages. More in general, the fact that larger firms tend to pay higher wages is a well-established finding (see for instance Oi and Idson [1999]).
channels \( \llbracket 11 \rrbracket, \rho_N \), is significantly negative. Therefore, selection is endogenous and, in particular, workers hired through social networks \textit{ceteris paribus} suffer a significant wage penalty due to unobservable determinants.

A visual way to see the wage penalty due to unobservable factors that is suffered by workers who got their job through social networks is to compare the true distribution of wage earned by workers hired through informal channels with the unconditional expected wage for the same subsample, \( i.e., \mathbb{E}(\ln w_{i,j}^N) = \hat{\beta}^N_{\text{worker}} X_i + \hat{\beta}^N_{\text{firm}} \Xi_j \). Figure 2 shows that the true distribution of wages of the subsample of workers hired through informal channels is shifted toward lower wages with respect to the unconditional wage distribution predicted for the same workers. However, the distribution of expected wages for the subsample of workers hired through social networks conditional on the dependent variable being observed, \( i.e., \mathbb{E}(\ln w_{i,j}^N|H_{i,j} = N) = \hat{\beta}^N_{\text{worker}} X_i + \hat{\beta}^N_{\text{firm}} \Xi_j + \hat{\sigma}_N \hat{\rho}_N f(\hat{\gamma} Z_{i,j})/F(\hat{\gamma} Z_{i,j}) \), fits quite well the true distribution of wages for the same subsample. The difference between the unconditional and the conditional expected wage distribution is precisely the negative selection effect of informal hiring channels.

In order to reach a conclusion about whether overall informal hiring channels imply on average wage penalties in the Senegalese manufacturing sector, the switching impact of observable wage determinants has to be taken into account, too. We therefore compare the estimated parameters \( \hat{\beta}^N \) and \( \hat{\beta}^F \) of Table 3 to assess whether the differences are statistically significant. Table 4 shows that informal hiring channels also entail a wage penalty due to observable determinants, but only through the switching impact of unskilled jobs.

Jointly considering our results concerning the unobservable and observable wage determinants for workers hired through social networks and formal channels, we can conclude that the former ones suffer a significant wage penalty.

5 Conclusions

This paper sheds light on the role played by social networks as hiring channel and on wage differentials between employees hired through formal and informal hiring channels. It contributes to the theoretical literature on informal hiring channels and to the empirical literature on social networks as hiring channels in developing countries.
From a theoretical point of view, we focus on the role played by moral hazard and allow for heterogeneity of networks’ tightness. Our framework helps to interpret the fact that firms and workers rely sometimes on formal hiring channels and sometimes on informal ones and the rather mixed findings of the empirical literature on the impact that the hiring channel has on wages. In particular, the choice of the hiring channel varies with country’s development and culture, with the characteristics of networks available as hiring channel and with the type of vacancy to be filled. In contexts of favoritism social networks are predicted to be mainly adopted as hiring channel to fill unskilled vacancies; moreover, such jobs may be associated with wage penalties and the more so the tighter the network that served as hiring channel. However, when skilled workers are hired through informal hiring channel, they are likely to get wage premia, and the more so the tighter the network. The opposite is predicted to happen in a culture where reciprocity prevails.

We empirically verify the implications of the model in the particularly interesting case of the Senegalese formal manufacturing sector. While the analysis of a single country does not allow to study the relationship between the development of formal institutions and the use of informal hiring channels, this paper could be the first step in further research on the cross-country analysis, since similar surveys exist for many countries. Our econometric results support the theoretical predictions that, conditional on being employed, when favoritism is widespread social networks are often exploited as hiring channel for unskilled jobs and when non-monetary gains are likely to be large, like in the case of relatives of the firm’s head or in small firms. Formal hiring channels are instead adopted for filling skilled vacancies and when the required competences are higher. Finally, we find that workers hired through whatever informal channel suffer a wage penalty. Wage determinants are the standard ones (worker’s education, experience and type of job, and firm’s location and size), but belonging to a very tight network decreases wages, which of course may be at least partly compensated by larger non-monetary gains.

From a policy perspective, it is therefore important not only to investigate whether workers hired through social networks have wage penalties or premia imputable to their hiring channel, but also to understand the extent of non-monetary benefits that they may enjoy. Moreover, wage differentials crucially depend on the bargaining power of workers and firms, so that the latter could represent a lever for policy intervention. In conclusion, informal hiring channels
may be beneficial for everyone, but it is necessary to make sure that employment is accessible through formal channels as well.

Further research could take into account some peculiar features implied by the use of the extended family as a hiring channel. For instance, family ties not only are very tight, but also provide almost full commitment among its members. If the chief of a firm guarantees employment to her relatives, the pooling of business risk within the family should be considered, too. A fundamental step would be taking into account the multi-dimensionality of concerns arising from incompleteness of information in the labor market and developing a theoretical framework that takes simultaneously into account moral hazard and selection problems. The predictions of a such model could then be empirically tested in order to disentangle the relative weight of the two. Indeed, a key difference between moral hazard and selection problems is that the latter fades away over time, while the former does not.

\footnote{Several empirical studies find evidence of risk pooling within highly clustered networks in African countries (see for example \textcit{Barr and Genicot 2008}).}
Table 1: Characteristics of sampled firms by their main hiring channels.

<table>
<thead>
<tr>
<th></th>
<th>Formal</th>
<th>Informal</th>
<th>Difference</th>
<th>Total</th>
</tr>
</thead>
<tbody>
<tr>
<td>total number of interviewed firms</td>
<td>104</td>
<td>152</td>
<td>-48</td>
<td>256</td>
</tr>
<tr>
<td>firm located in Dakar</td>
<td>98</td>
<td>145</td>
<td>-47</td>
<td>243</td>
</tr>
<tr>
<td>public firm</td>
<td>8</td>
<td>4</td>
<td>4</td>
<td>12</td>
</tr>
<tr>
<td>mean number of employees</td>
<td>194</td>
<td>72</td>
<td>122**</td>
<td>130</td>
</tr>
<tr>
<td></td>
<td>(592)</td>
<td>(180)</td>
<td>(51)</td>
<td>(425)</td>
</tr>
<tr>
<td>owner and director</td>
<td>59</td>
<td>105</td>
<td>-46**</td>
<td>164</td>
</tr>
<tr>
<td>sector: agro-industry</td>
<td>40</td>
<td>53</td>
<td>-13</td>
<td>93</td>
</tr>
<tr>
<td>chemical/paint products</td>
<td>13</td>
<td>17</td>
<td>-4</td>
<td>30</td>
</tr>
<tr>
<td>building materials</td>
<td>10</td>
<td>8</td>
<td>2</td>
<td>18</td>
</tr>
<tr>
<td>furniture</td>
<td>1</td>
<td>5</td>
<td>-4</td>
<td>6</td>
</tr>
<tr>
<td>metals</td>
<td>10</td>
<td>15</td>
<td>-5</td>
<td>25</td>
</tr>
<tr>
<td>paper industry</td>
<td>12</td>
<td>24</td>
<td>-12</td>
<td>36</td>
</tr>
<tr>
<td>plastics</td>
<td>3</td>
<td>12</td>
<td>-9*</td>
<td>15</td>
</tr>
<tr>
<td>textile and leather</td>
<td>8</td>
<td>15</td>
<td>-7</td>
<td>23</td>
</tr>
<tr>
<td>wood</td>
<td>7</td>
<td>3</td>
<td>4*</td>
<td>10</td>
</tr>
</tbody>
</table>

Note: Standard deviation in brackets. Significance levels based on Wilcoxon-Mann-Whitney (for continuous variables) and Fisher exact (for categorical variables) test: *: 10%; **: 5%; ***: 1%.
Table 2: Characteristics of sampled workers by their hiring channel.

<table>
<thead>
<tr>
<th></th>
<th>Workers hired through channel:</th>
<th>Total</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>formal</td>
<td>informal</td>
</tr>
<tr>
<td>number of workers</td>
<td>555</td>
<td>1018</td>
</tr>
<tr>
<td>same ethnicity as firm’s head</td>
<td>71</td>
<td>214</td>
</tr>
<tr>
<td>same family as firm’s head</td>
<td>30</td>
<td>150</td>
</tr>
<tr>
<td>job: managers</td>
<td></td>
<td></td>
</tr>
<tr>
<td>managers</td>
<td>32</td>
<td>23</td>
</tr>
<tr>
<td>skilled white collar</td>
<td>101</td>
<td>71</td>
</tr>
<tr>
<td>skilled blue collar</td>
<td>238</td>
<td>351</td>
</tr>
<tr>
<td>unskilled workers</td>
<td>183</td>
<td>569</td>
</tr>
<tr>
<td>mean education (years)</td>
<td>13.0</td>
<td>10.5</td>
</tr>
<tr>
<td></td>
<td>(4.73)</td>
<td>(4.62)</td>
</tr>
<tr>
<td>mean previous experience (years)</td>
<td>5.0</td>
<td>4.1</td>
</tr>
<tr>
<td></td>
<td>(6.39)</td>
<td>(6.06)</td>
</tr>
<tr>
<td>mean age at hiring (years)</td>
<td>29.9</td>
<td>28.8</td>
</tr>
<tr>
<td></td>
<td>(7.41)</td>
<td>(8.34)</td>
</tr>
<tr>
<td>gender: male</td>
<td>447</td>
<td>840</td>
</tr>
<tr>
<td>marital status: married</td>
<td>377</td>
<td>647</td>
</tr>
<tr>
<td>origin: Dakar</td>
<td>220</td>
<td>426</td>
</tr>
<tr>
<td>other in Senegal</td>
<td>311</td>
<td>546</td>
</tr>
<tr>
<td>other</td>
<td>24</td>
<td>45</td>
</tr>
<tr>
<td>weekly work hours</td>
<td>43.2</td>
<td>43.3</td>
</tr>
<tr>
<td></td>
<td>(8.51)</td>
<td>(9.98)</td>
</tr>
<tr>
<td>mean ln real monthly salary</td>
<td>11.2</td>
<td>10.9</td>
</tr>
<tr>
<td></td>
<td>(0.87)</td>
<td>(0.86)</td>
</tr>
</tbody>
</table>

Note: Standard deviation in brackets. Significance levels based on Whicoxon-Mann-Whitney (for continuous variables) and Fisher exact (for categorical variables) test: *: 10%; **: 5%; ***: 1%.
Table 3: Endogenous switching model: determinants of the choice of hiring channel and of the wage for workers hired through formal and informal hiring channels.

<table>
<thead>
<tr>
<th></th>
<th>Choice of informal hiring channel</th>
<th>Wage regression for workers hired through:</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td></td>
<td>social networks</td>
</tr>
<tr>
<td>same family as firm’s head</td>
<td>0.476*** (0.151)</td>
<td>-0.297** (0.133)</td>
</tr>
<tr>
<td>only same ethnicity as firm’s head</td>
<td>0.081 (0.154)</td>
<td>0.025 (0.089)</td>
</tr>
<tr>
<td>job: manager</td>
<td>-0.458 (0.287)</td>
<td>0.629* (0.335)</td>
</tr>
<tr>
<td>skilled white collar</td>
<td>-0.336** (0.145)</td>
<td>0.436*** (0.138)</td>
</tr>
<tr>
<td>unskilled</td>
<td>0.252** (0.112)</td>
<td>-0.434*** (0.075)</td>
</tr>
<tr>
<td>education (years)</td>
<td>-0.030** (0.012)</td>
<td>0.040*** (0.010)</td>
</tr>
<tr>
<td>previous experience (years)</td>
<td>-0.063*** (0.019)</td>
<td>0.043*** (0.017)</td>
</tr>
<tr>
<td>previous experience sq. (years)</td>
<td>0.002*** (0.001)</td>
<td>-0.002** (0.001)</td>
</tr>
<tr>
<td>origin: Dakar</td>
<td>-0.054 (0.265)</td>
<td>0.134 (0.217)</td>
</tr>
<tr>
<td>other in Senegal</td>
<td>-0.215 (0.266)</td>
<td>0.100 (0.074)</td>
</tr>
<tr>
<td>married</td>
<td>0.108 (0.092)</td>
<td>0.100 (0.074)</td>
</tr>
<tr>
<td>gender: male</td>
<td>-0.042 (0.114)</td>
<td>-0.019 (0.083)</td>
</tr>
<tr>
<td>hours worked</td>
<td>0.005 (0.005)</td>
<td>0.000 (0.003)</td>
</tr>
<tr>
<td>firm located in Dakar</td>
<td>-0.397* (0.211)</td>
<td>0.654*** (0.215)</td>
</tr>
<tr>
<td>ln of n.employees</td>
<td>-0.110*** (0.039)</td>
<td>0.132*** (0.032)</td>
</tr>
<tr>
<td>owner and director</td>
<td>0.110 (0.110)</td>
<td>-0.126* (0.073)</td>
</tr>
<tr>
<td>TFP at hiring</td>
<td>0.015 (0.156)</td>
<td>0.360*** (0.120)</td>
</tr>
<tr>
<td>public firm</td>
<td>0.051 (0.253)</td>
<td>-0.037 (0.230)</td>
</tr>
<tr>
<td>age over 40 at hiring</td>
<td>0.304** (0.141)</td>
<td></td>
</tr>
<tr>
<td>intercept</td>
<td>1.260*** (0.469)</td>
<td>9.675*** (0.328)</td>
</tr>
<tr>
<td>sector dummies</td>
<td>yes</td>
<td>yes</td>
</tr>
<tr>
<td>$\rho_N$</td>
<td>-0.747*** (0.256)</td>
<td></td>
</tr>
<tr>
<td>$\rho_F$</td>
<td>-0.142 (0.270)</td>
<td></td>
</tr>
<tr>
<td>Log-likelihood</td>
<td>-1844.84</td>
<td></td>
</tr>
<tr>
<td>Wald $\chi^2_{26}$</td>
<td>128.49</td>
<td></td>
</tr>
<tr>
<td>N</td>
<td>1139</td>
<td></td>
</tr>
</tbody>
</table>

Note: Robust Standard Errors in brackets, clustered by firm. Significance levels: *: 10% **: 5% ***: 1%.
Table 4: Switching impact of the hiring channel on wages: difference between estimated coefficients of wage determinants for workers hired through informal and formal channels.

<table>
<thead>
<tr>
<th>Term</th>
<th>$\hat{\beta}^N - \hat{\beta}^F$</th>
</tr>
</thead>
<tbody>
<tr>
<td>same family as firm’s head</td>
<td>-0.082 (0.254)</td>
</tr>
<tr>
<td>only same ethnicity as firm’s head</td>
<td>-0.153 (0.175)</td>
</tr>
<tr>
<td>job: manager</td>
<td>0.143 (0.428)</td>
</tr>
<tr>
<td>skilled white collar</td>
<td>0.239 (0.210)</td>
</tr>
<tr>
<td>unskilled</td>
<td>-0.242** (0.113)</td>
</tr>
<tr>
<td>education (years)</td>
<td>-0.017 (0.056)</td>
</tr>
<tr>
<td>previous experience (years)</td>
<td>0.018 (0.040)</td>
</tr>
<tr>
<td>previous experience sq. (years)</td>
<td>-0.001 (0.002)</td>
</tr>
<tr>
<td>origin: Dakar</td>
<td>0.094 (0.328)</td>
</tr>
<tr>
<td>Senegal</td>
<td>0.056 (0.425)</td>
</tr>
<tr>
<td>married</td>
<td>-0.062 (0.119)</td>
</tr>
<tr>
<td>gender: male</td>
<td>-0.083 (0.134)</td>
</tr>
<tr>
<td>hours worked</td>
<td>-0.004 (0.028)</td>
</tr>
<tr>
<td>firm located in Dakar</td>
<td>-0.067 (0.335)</td>
</tr>
<tr>
<td>ln of n.employees</td>
<td>0.074 (0.078)</td>
</tr>
<tr>
<td>owner and director</td>
<td>0.074 (0.110)</td>
</tr>
<tr>
<td>TFP at hiring</td>
<td>-0.117 (0.170)</td>
</tr>
<tr>
<td>public firm</td>
<td>-0.027 (0.239)</td>
</tr>
<tr>
<td>intercept</td>
<td>0.675 (2.538)</td>
</tr>
</tbody>
</table>

Note: Bootstrap Standard Errors in brackets. Significance levels: *: 10% **: 5% ***: 1%.
Figure 1: The choice of hiring channel and the wages of workers hired through formal and informal hiring channels.
Figure 2: True distribution of wages for workers hired through informal hiring channels and distribution of unconditional and conditional expected wages for the same subsample of workers.
A Theoretical Appendix

Proof of lemma 1. Worker $i$ chooses whether to shirk (i.e., $e_i^k = 0$) or not (i.e., $e_i^F = e$ or $e_i^N = e + \delta \varphi_{i,j}$) by maximizing her utility.

If she was hired through formal channels, she does not shirk if $w^F - \gamma e \leq (1 - \mu^F) w^F$. Therefore, the no-shirking condition for workers hired on the formal labor market is (2).

If she was hired through a social network, she does not shirk if $w_{i,j}^N + \zeta_{i,j} - \gamma (e + \delta \varphi_{i,j}) \leq \left(1 - \mu_{i,j}^N\right) (w_{i,j}^N + \zeta_{i,j}) - \mu_{i,j}^N \varphi_{i,j}$, i.e., if condition (3) is satisfied.

Proof of proposition 1. For informal hiring channel to arise, both the firm and the worker should prefer it:

1. the firm prefers hiring worker $i$ through social networks, if per worker profits when hiring through informal channels (5) are greater than or equal to per worker profits when hiring through formal ones (4):

$$\vartheta (e + \delta \varphi_{i,j}) - w_{i,j}^N - \xi_j \frac{\gamma (e + \delta \varphi_{i,j})}{w_{i,j}^N + \zeta_{i,j} + \varphi_{i,j}} \geq \vartheta e - w^F - \xi_j \frac{\gamma e}{w^F}$$

Therefore,

$$-\vartheta \delta \varphi_{i,j} + w_{i,j}^N + \xi_j \frac{\gamma (e + \delta \varphi_{i,j})}{w_{i,j}^N + \zeta_{i,j} + \varphi_{i,j}} \leq w^F + \xi_j \frac{\gamma e}{w^F}$$

and $\overline{w}_{i,j}^N$ is the maximum of $w_{i,j}^N$ fulfilling this condition.

2. the worker will accept a job from the informal channel if her utility (7) is greater than or equal to what she could get if she was hired through the formal channel (6):

$$w_{i,j}^N + \zeta_{i,j} - \gamma (e + \delta \varphi) \geq w^F - \gamma e$$

Therefore:

$$w_{i,j}^N \geq \overline{w}_{i,j}^N = w^F - \zeta_{i,j} + \gamma \delta \varphi_{i,j}$$
Table 5: Description of variables used in the theoretical framework (section 3).

<table>
<thead>
<tr>
<th>Variable</th>
<th>Support</th>
<th>Index</th>
</tr>
</thead>
<tbody>
<tr>
<td>$k$</td>
<td>Hiring channel</td>
<td>$k \in {F, N}$</td>
</tr>
<tr>
<td>$\eta_i$</td>
<td>Worker’s bargaining power</td>
<td>$0 \leq \eta_i \leq 1$</td>
</tr>
<tr>
<td>$\gamma$</td>
<td>Worker’s cost of effort</td>
<td>$\gamma &gt; 0$</td>
</tr>
<tr>
<td>$e_i^k$</td>
<td>Worker’s effort</td>
<td>$e_i^F \in {0, e}$</td>
</tr>
<tr>
<td>$\vartheta$</td>
<td>Productivity of effort</td>
<td>$\vartheta &gt; 0$</td>
</tr>
<tr>
<td>$\zeta_{i,j}$</td>
<td>Non-monetary benefit</td>
<td>$\zeta_{i,j} \geq 0$</td>
</tr>
<tr>
<td>$\phi_{i,j}$</td>
<td>Network tightness</td>
<td>$0 &lt; \phi_{i,j} \leq 1$</td>
</tr>
<tr>
<td>$\delta$</td>
<td>Cultural factor</td>
<td>$\delta \in (-\infty, +\infty)$</td>
</tr>
<tr>
<td>$\mu_{i,j}^k$</td>
<td>Probability of monitoring</td>
<td>$0 \leq \mu_{i,j}^k \leq 1$</td>
</tr>
<tr>
<td>$\xi_j$</td>
<td>Unit cost of monitoring</td>
<td>$\xi_j &gt; 0$</td>
</tr>
<tr>
<td>$q_{i,j}^k$</td>
<td>Probability of firing</td>
<td>$0 \leq q_{i,j}^k \leq 1$</td>
</tr>
<tr>
<td>$w_{i,j}^k$</td>
<td>Worker’s salary</td>
<td>$w_{i,j}^F &gt; 0$</td>
</tr>
</tbody>
</table>

**B Empirical Appendix**

Endogenous switching models can be estimated one equation at a time either by two-step least square or maximum likelihood estimation. However, both of these estimation methods are inefficient. An efficient alternative is the full information maximum likelihood method (FIML) that simultaneously estimates binary and continuous parts of the model. Endogenous switching models describe the behavior of an agent with two regression equations, and a criterion function that determines which regime of wages the agent faces:

\[
\ln w_i^F = \beta^F X_i + \epsilon_i^F \\
\ln w_i^N = \beta^N X_i + \epsilon_i^N \\
H_i^* = \gamma Z_i + u_i
\] (13) (14) (15)

where $w_i^F$ is the wage of individual $i$ who was hired through a formal channel, while $w_i^N$ is the wage of individual $i$ who was hired through some social network. $H_i^*$ is the latent variable that determines the hiring channel of individual $i$. $X_i$ is a vector of individual characteristics that is

\[\ldots\]
thought to influence the individual wage, while $Z_i$ is a vector of characteristics that influences the decision regarding the hiring channel. The parameter vectors are $\beta^N$, $\beta^F$, and $\gamma$. Finally, $\epsilon_i^F$, $\epsilon_i^N$, and $u_i$ are the disturbance terms. Notice that the impact of the hiring channel does not show up as a dummy variable in wage regressions, but rather in the fact that the constant term and the $\beta$-parameters may differ between the sample of workers hired through formal channels and the sample of workers hired through social networks (i.e., $\beta^N \neq \beta^F$). The difference in the constants yields the difference in average wages if a networked and a formally hired worker had $X_i = 0$. The difference in the $\beta$-parameters represents how the returns to different observable wage determinants vary depending on the hiring channel. The observed dichotomous realization ($H_i$) of the latent variable $H_i^*$ determining the hiring channel of individual $i$ has the following form:

$$
H_i = \begin{cases} 
1 & \text{if } H_i^* > 0 \\
0 & \text{otherwise}
\end{cases}
$$

(16)

As in any model entailing latent variables, it is necessary to take care of identification. Endogenous switching models are identified by construction through non-linearities introduced by the selection equation (15). However, the goodness of estimations completely relies on the parametric assumptions about the distribution of error terms. Therefore, it is often preferred to add one or more exclusion restrictions. They are imposed by the researcher, based on economic intuition. By their very nature, exclusion restrictions are not testable, but indirectly. Therefore, $Z_i$ may include some or all variables in $X_i$, plus at least one additional variable that is legitimately excluded in wage regressions (13) and (14).

The main assumption of FIML is that $\epsilon_i^F$, $\epsilon_i^N$, and $u_i$ have a trivariate normal distribution, with mean vector zero and covariance matrix $\Omega$ as follows:

$$
\Omega = \begin{bmatrix} 
\sigma^2_u & \cdots & \\
\sigma_{uF} & \sigma^2_F & \cdots \\
\sigma_{uN} & \cdots & \sigma^2_N 
\end{bmatrix}
$$

where $\sigma^2_u$ is the variance of the error term in the selection equation (15), and $\sigma^2_F$ and $\sigma^2_N$ are the variances of the error terms in the regression equations (13) and (14) respectively. $\sigma_{uF}$ is
the covariance of $u_i$ and $\epsilon_i^F$, and $\sigma_{uF}$ is the covariance of $u_i$ and $\epsilon_i^N$. The covariance between $\epsilon_i^F$ and $\epsilon_i^N$ is not defined, as $w_i^F$ and $w_i^N$ are never observed for the same worker.

To see whether sample selection is endogenous or exogenous, the correlation coefficients between residuals in each of the wage regressions and the hiring channel choice are estimated. The correlation between residuals in equation (13) and (15) is designated by $\rho_F$:

$$\rho_F = \frac{\sigma_{uF}}{\sigma_u \sigma_F}$$

(17)

and the correlation between residuals in equation (14) and (15) by $\rho_N$:

$$\rho_N = \frac{\sigma_{uN}}{\sigma_u \sigma_N}$$

(18)

If the unobserved factors determining the hiring choice are not correlated with unobserved determinants of wage, the selection is exogenous. In this case, the sorting into workers hired through formal and informal channel is random and there is no risk of a sample selection bias.

The adoption of an endogenous switching model provides also crucial information concerning the indirect impact of the hiring channel on wages. Indeed, the switching model estimates a full set of interaction terms between the hiring channel of each worker and the impact of education, experience, and the other regressors in the wage equations. Therefore, for each wage determinant it is possible to assess whether its impact is dependent or independent of the channel whereby workers were hired. The combination of the switching impact of observable determinants of wage and the unobserved factors allows to draw a conclusion concerning the existence of a wage penalty or premium to workers hired through social networks.
Table 6: Description of variables used in the empirical analysis (sections 2 and 4).

<table>
<thead>
<tr>
<th>Variables</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Firms:</strong></td>
<td></td>
</tr>
<tr>
<td>Sector</td>
<td>Categorical variable indicating the manufacturing sector to which a firm belongs</td>
</tr>
<tr>
<td>Location</td>
<td>Dummy variable indicating whether a firm is located in Dakar or elsewhere</td>
</tr>
<tr>
<td>Public firms</td>
<td>Dummy variable categorizing a firm as public if more than 45% of its capital belongs to State</td>
</tr>
<tr>
<td>Owner and director</td>
<td>Dummy variable indicating whether the owner of a firm is also its director or manager</td>
</tr>
<tr>
<td>Mainly informal hiring channels</td>
<td>Number of firms that declared to mainly hire through informal channels</td>
</tr>
<tr>
<td>Number of employees</td>
<td>Number of employees working in a firm</td>
</tr>
<tr>
<td><strong>Workers:</strong></td>
<td></td>
</tr>
<tr>
<td>Education</td>
<td>Number of years of education</td>
</tr>
<tr>
<td>Previous experience</td>
<td>Number of year of experience before being hired in current firm</td>
</tr>
<tr>
<td>Age</td>
<td>Worker’s age at hiring time</td>
</tr>
<tr>
<td>Gender</td>
<td>Dummy variable indicating worker’s gender</td>
</tr>
<tr>
<td>Origin</td>
<td>Categorical variable indicating worker’s place of origin</td>
</tr>
<tr>
<td>Marital status</td>
<td>Dummy variable indicating whether a worker is married</td>
</tr>
<tr>
<td>Same ethnicity as firm’s head</td>
<td>Dummy variable indicating whether a worker belongs to the same ethnic group as the owner or the manager running the firm</td>
</tr>
<tr>
<td>Same family as firm’s head</td>
<td>Dummy variable indicating whether a worker belongs to the extended family of the owner or the manager running the firm</td>
</tr>
<tr>
<td>Job</td>
<td>Categorical variable indicating the type of job for which a worker was hired</td>
</tr>
<tr>
<td>Hours worked</td>
<td>Number of hours worked per week</td>
</tr>
<tr>
<td>Ln real monthly salary</td>
<td>Natural logarithm of worker’s monthly salary when she was hired, adjusted for HCPI</td>
</tr>
<tr>
<td>Hiring channel</td>
<td>Dummy variable stating whether a worker was hired through social network</td>
</tr>
</tbody>
</table>
References


Nordström Skans, O. and F. Kramarz (2011). When strong ties are strong networks and youth labor market entry.


Pour accéder à la liste complète des Documents de Travail publiés par la Banque de France veuillez consulter le site :
www.banque-france.fr

For a complete list of Working Papers published by the Banque de France, please visit the website:
www.banque-france.fr

Pour tous commentaires ou demandes sur les Documents de Travail, contacter la bibliothèque de la Direction Générale des Études et des Relations Internationales à l’adresse suivante :

For any comment or enquiries on the Working Papers, contact the library of the Directorate General Economics and International Relations at the following address :

BANQUE DE FRANCE
49-1404 Labolog
75049 Paris Cedex 01
tél : 0033 (0)1 42 97 77 24 ou 01 42 92 63 40 ou 48 90 ou 69 81
e-mail : 1404-nt@banque-france.fr