

# MAKING COMMUNICATION VISIBLE: USING NETWORK ANALYSIS TO DIAGNOSE COMMUNICATION PROBLEMS

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# Making communication visible: using network analysis to diagnose communication problems

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**Purpose** – The aim of this research is to identify the contribution of network analysis as a communication audit method for diagnosing communication problems and predicting organizational identification.

**Design/Methodology/Approach** – A network analysis was conducted within the communication department of a cooperation of municipalities in the Netherlands. Data were collected by using sociometric questioning and a communication climate questionnaire.

**Findings** – On the one hand, network analysis has proven to be a useful communication audit method for diagnosing communication problems, since it offers the possibility to measure multiple communication networks extensively and in-depth. On the other hand, network variables have proven to be insufficient predictors for organizational identification.

**Originality/value** – Earlier research stated that future communication audits should focus more on the extent to which various techniques involved contribute to the diagnosis of communication problems in organizations. This has been done by adding a communication climate questionnaire to this communication audit. The added value of this research lies in the evaluation of the contribution of network analysis as a communication audit method and the fact that it is now known that network variables are not good predictors for organizational identification.

**Keywords** – Communications, Internal Communication, Communication Audit, Communication Climate, Reciprocity of Communication, Network Analysis, Communication Monitoring, Communication Alignment, Municipal Authorities.

**Paper type** – Research paper.

## Introduction

The role of organizational communication is an important factor in understanding the value of intangible organizational assets (Ritter, 2003:50). A better quality of communication within organizations is linked to higher levels of performance and service (Tourish and Hargie, 2009), generating communication capital (Malmelin, 2007) and social capital (Lee, 2009). This indicates how important it is for managers to be able to assess internal communication. Many well established tools developed in the 1970's are still used, such as the Communication Satisfaction Questionnaire (CSQ), the ICA Audit and, for example, the Critical Communication Experience Survey (Downs and Adrian, 2004). Already in 1974, Roberts and O'Reilly indicated that the communication literature concerned with human behavior in organizations suggests additional aspects of communication overload (Porat and Haas, 1969) and satisfaction with one's communication (Lawler, Porter, and Tenenbaum, 1968; Lawson, 1965). Since communication is a process rather than a static variable, it is one of the most difficult organizational variables to measure. Therefore, communication is one of the most interesting organizational phenomena to investigate precisely because it is so complex and multifaceted.

Numerous reviews of network analysis exist and at least three sources of network analysis can be identified, namely: empirical work in social anthropology (for example Bott, 1957; Mitchell, 1969;

Kapferer, 1972), the practice of sociometry (Moreno, 1951) and more mathematical models and theory such as graph theory (Harary, Norman, and Cartwright, 1965; Rapoport, 1957). Lately, the communication method 'network analysis' has proven to be relevant to non-profit organizations as schools (Zwijze-Koning and De Jong, 2009) as well as for profit organizations (Zwijze-Koning and De Jong, 2014). Today, the method is widely used by scholars from various research areas to map the relationships between people in societies, organizations, and other groups (ibid.). Positions in a network reveal who controls, facilitates, or inhibits the flow of information, and who has similar information needs or uses. The social network analysis provides tools for the information professional which can help in the identification, diagnosis, and active modification of information routes (Haythorntwaite, 1996).

In 2005, Zwijze-Koning and De Jong stated that systematic research is needed in comparing the various data collection techniques available for network analysis. Both within-method research and between-method research will be relevant. Such studies should focus on the similarities and differences between the methods and on the extent to which they might complement each other in practice. Furthermore, these authors have indicated that research is needed for linking network characteristics to other organizational communication measures, such as communication satisfaction and identification with the organization. This type of research may generate valuable theoretical insights into factors affecting organizational communication quality and employee satisfaction and may also be used to explore the predictive and construct validity of network data. As Zwijze-Koning and De Jong (2005:2) stated: "methodological discussions concerning communication audits should focus more on the extent to which the various techniques involved contribute to the diagnosis of communication problems in an organization".

The aim of this research is to identify the contribution of network analysis to diagnose communication problems and to predict organizational identification. This will be done by performing a network analysis and a communication climate questionnaire. This article answers the following research question:

- To what extent is it possible to diagnose communication problems and predict organizational identification by performing a network analysis?

#### Case

This research was performed on the case of the communications department of a cooperation among municipal authorities that are based in the South-Western part of The Netherlands, namely: Dordrecht, Alblasserdam, Hendrik-Ido-Ambacht, Sliedrecht, Papendrecht and Zwijndrecht. All together, these municipalities inhibit 262.000 residents. In September 2013 there were 450 employees working within the organization, the most of them were working within one building in Dordrecht. The communications department consists of 42 employees. The mentioned group of municipal authorities decided to work together for budgetary reasons, but also in order to improve the quality of their services. Therefore, a shared back office for finance, general and technical services, administration and information management, computerization and automation, communication, legal services and human resource management was raised in 2008. At that time it became necessary to reduce costs, while maintaining a high quality of public services at the same time. This process of centralization was especially important for the smaller municipal authorities that had to deal with a relative big organization for a marginal amount of residents. Due to the fact that it was a necessity to start with the cooperation, this startup process went somewhat ad-hoc. As a result of the rather sudden reorganization. One of the main

reasons for this uncertainty was that there were no clear communication structures. The overall opinion was that internal communication processes should be as good as possible in order to work together successfully and realize the highest possible extent of efficiency. However, through (role) ambiguity, physical distance, technology mediated communication and almost continuously changing roles, the employees indicated that internal communication had become a serious topic for management and employees. As addressed in the previous section, this was the main reason to investigate and monitor the organizational communication climate.

### **Theoretical framework**

The following section will present a clarification of the variables. Since this research investigates the contribution of a research method, the method itself will be presented in the method section. The remaining variables, organizational networks and organizational identification, will be introduced here.

#### Social networks in organizations

Organizational networks are social networks relating to a specific organization (Contractor, Wasserman, and Faust, 2006). These social networks consist of a set of actors and one or more relations between the actors. The network perspective is flexible in its applicability to different kinds of actors and to different kinds of relations. Actors may be any kind of meaningful social unit, including individuals, collective entities, firms, organizations, and divisions within organizations (Contractor et al., 2006). The relations may be any kind of linkage between those actors, including formal role relations, affective expressions (friendship, respect), social interactions, workflows, transfers of material resources (money, goods), to name only a few (ibid.). This social network approach to organizations is entirely fitting, since, as O'Reilly observes, "Organizations are fundamentally relational entities" (1991:446). Nohria (1992:4) elaborated on this by stating that "All organizations are in important respects social networks and need to be addressed and analyzed as such". By using this network perspective, organizational researchers have been able to explain variance in these traditional organizational outcomes as, for example, individual satisfaction, performance, job exit, group structure, performance, and organizational innovation (Brass, Galaskiewicz, Greve, and Tsai, 2004).

In this research, the social networks within the organization of the cooperation of Dutch municipalities will be mapped and researched. People who are central to one of these networks are called *role stars* (Brass, 1995), whereas *liaisons* link two or more groups to which they do not belong. Furthermore, *bridges* link two or more groups by virtue of belonging to them, while *gatekeepers* act as the single link between parts of the network, and thus control the flow of information. *Isolates* are people who have no connections, or perhaps only a few, with other people (ibid.). Furthermore, based on the research multiple network variables will be calculated: *degree*, which indicates the number of contacts a respondent has in the workplace (Borgatti, Everett, and Johnson, 2013). Also *closeness* will be calculated, which can be regarded as a measure of how long it will take to spread information from one to all other employees sequentially (Borgatti et al., 2013). Finally, *betweenness* is a network variable to be measured, this variables gives insight in the number of time an employee acts as a bridge along the shortest path between two other employees (ibid.). By identifying these network roles and variables, it will be possible to address the research question stated.

#### **Organizational Identification**

Organizational Identification is an individual's perception of unity with an organizational identity of the perceived oneness of organizational members with their organization (Ashforth and Mael, 1989). Strongly identified individuals "possess similar attributes and share common issues with their group members" (Carmeli, Gilat, and Waldman, 2007:978). This leads to intra-group cohesion among employees and a positive attitude towards their organization (Ashforth and Mael, 1989). Members identifying with their organization are more likely to become integrated in the collective as well. This process is called *member adjustment* and is defined as "the extent to which an employee becomes integrated or fits in with his or her organization's professional and social system" (Carmeli et al., 2007:978).

In 2001, Smidts, Pruyn, and Van Riel stated that there are two different underlying mechanisms regarding to organizational identification: self-categorization and self-enhancement. The selfcategorization is likely to occur when members perceive their organization to possess characteristics they value (Dutton, Dukerich, and Harquail, 1994; Meyer and Herscovitch, 2001). Self-categorization needs are fulfilled through the reception of useful and adequate information about the central, enduring and distinctive (CED) characteristics of the organization and individual organizational role (Bartels, Pruyn, De Jong, and Joustra, 2007). On the other hand, the self-enhancement mechanism is based on pride; individuals increase their self-esteem and strongly identify with their organization when they believe outsiders consider their organization to possess a positive and distinguishing external image (De Roeck and Delobbe, 2012). The self-categorization mechanism which is based on the fulfillment of the central, enduring and distinctive characteristics of the organization, is for the present research conceptualized as internal identification. The self-enhancement mechanism which is based on pride, is in this research conceptualized as external identification. By using the literature in this way, the different constructs for measuring organizational identification are theoretically founded. This means that the questionnaire to be used focuses on the same perspectives as the stated literature in order to measure the correct constructs.

#### Method

#### Participants

The participants in this research are all employees of the communications department of the earlier mentioned cooperation of municipal authorities. In total, 42 employees were asked to participate. Due to a variety of reasons like maternity leave, serious illness or the fact that some employees were hired by the organization short before the start of the research, these employees have indicated that they are not willing to cooperate in this research. The total amount of participants therefore was 34 (N=34). This means that nearly 81% of the entire communications department cooperated with this research. Those 34 employees represent the communications department as follows; 26% of the respondents represent team red, 21% of the respondents represent team yellow, 15% represent team purple and 32% of the respondents represent team green. The last group, 6% of the respondents, are situated in the management team. Finally, 94% of the respondents have a contract for an indefinite period of team. The other 6% of the respondents possess a temporary contract. Altogether, the sample is representative for the communications department because 81% of the population cooperated in the research.

#### Instrument

In this research a network analysis was performed by using sociometric questioning and a communication climate questionnaire. Gathering network data through sociometric questioning means asking

respondents to indicate the frequency of their contacts with other members of the organization (Zwijze-Koning and De Jong, 2005). Contacts can, for example, be analyzed with regard to duration, type of exchange, medium used and importance. Respondents were asked to react to the statement "during a typical workday, I usually communicate about work-related matters with the following people through the following channels" (Goldhaber, 1993:363). All answers together led to the different networks within the organization.

The first part of the data collection form contained explanation of the form and instructions about how the participants should fill it out. In the second section, the participants had to indicate with whom they had contact since the reorganization in May 2013 whereby it was made sure that all interactions that consisted merely of greetings were excluded from this research. Furthermore, the participants had to indicate about which topics they communicated with their colleagues: work issues about daily projects, other work issues, experiences as employee in the department and private issues. These pre-structured categories were developed in this way because it was estimated that all communication between employees from this department will be about one of these four topics, which have proven to be correct.

Participants moreover had to fill out how often they communicated with each other, this was quantified by a number and an indication of an exact period. The exact period was quantified as follows: three times a week became 3W, four times a month became 4M, etcetera. The participants also needed to indicate by means of which medium they had contact: e-mail, telephone, conference or face-to-face. These four categories were also pre-structured and chosen with regard to the estimation that all communication between employees from this department will be in one of these ways. The resulting networks were visualized and several network measures were calculated using the UCINET package (Borgatti, Everett, and Freeman, 2002).

The third and last page of the data collection form consisted of the communication climate questionnaire which is developed by Smidts et al. (2001). This questionnaire measures the constructs internal and external identification, as explained in the theoretical framework. Despite the fact that this questionnaire has been used often, it was necessary to perform a factor analysis before the correct constructs were composed. This was necessary because in the initial situation nine different constructs were identified, while the intention was to measure four different constructs. After deletion of the items which matched with two or more constructs or which formed a construct on their own, four constructs with a high Cronbach's alpha value remained, namely: internal identification, external identification, top-down communication and reciprocity of communication. Those are summarized in the table below, together with the items that measured them.

Construct	Cronbach's Alpha	Items		
Internal identification	.85	I am happy to be part of the organization I am proud to work in this organization If the organization is successful, it feels like I am successful I feel that I am deeply involved in the organization If one says positive things about the organization, it feels like a compliment		
External identification	.72	I would be embarrassed if the organization is criticized in the media If one is critical about the organization, I feel that I'm personally accountable If I talk about the organization, I talk about 'us' and not about 'them'		
Top-down communication	.78	I receive important information mostly via-via I get more information from colleagues than fror the management The organizational targets are only known by th manager who has stated them		
Reciprocity of communication	.79	I trust the information I receive from the management The input I deliver is taken seriously		

Table 1. Overview of constructs, Cronbach's Alpha and the items measuring the construct.

#### Procedure

Data collection was performed from the 25<sup>th</sup> of September 2013 until the 7<sup>th</sup> of December 2013. The management requested the employees to cooperate with the research, which they did. After the data collection period, seven interviews with employees were held in order to interpret the results. These interviews were held with one manager and six people from the four different teams. Employees from a variety of functions, ages and sexes were interviewed. This distribution was chosen in order to retrieve interpretations of the results from all possible perspectives. During these interviews, the anonymized visualizations of the networks were shown, and subsequently, the employees provided their explanation of these visualizations. The interviews resulted in clarification on some of the outcomes and therefore greatly contributed to the quality of the research. By using their interpretations and explanations some findings (such as outliers) were exemplified.

#### Analysis

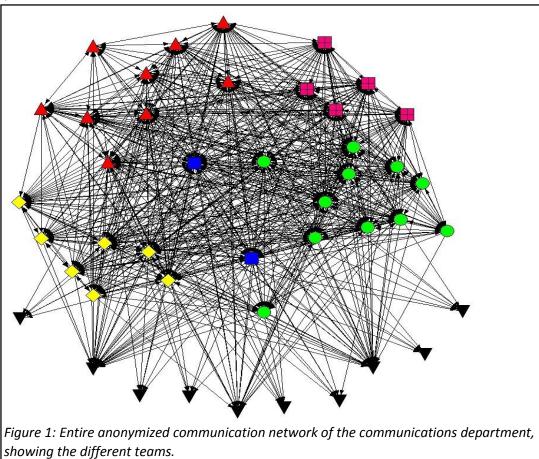
The network data were analyzed using the software-package UCINET (Borgatti, Everett, and Freeman, 2002) and visualized by means of NETDRAW, the network visualization package that comes with UCINET. At first, an actor-by-actor matrix for each type of network was drawn in Microsoft Excel. All filled out values, like 3W, 2D, 4M and so on, were valued on a list. The lowest amount of contact within a professional relationship which was filled out, was 1Y, this was valued with a '1' in the Microsoft Excel matrix. After 1Y came 2Y which was valued with a '2' in the matrix, and so on. In the end, the most intense

relationship which was filled out was 10W, which was valued by '23'. These values had direct influence on the thickness of relationship lines in the drawn visualization of the network. By using the Microsoft Excel matrix, the above explained network variables degree, closeness and betweenness could be calculated (appendix A).

Afterwards, the results of the sociometric questioning part were analyzed, using two different perspectives. On the one hand this analysis has been made based on the entire visualized network, without making distinctions in communication subjects or ways of communicating. On the other hand this analysis has been made based on the eight individual networks, four for the communication subjects and four for the ways of communicating. Furthermore, the results of the communication climate questionnaire were analyzed. By performing this step, it became possible to analyze the results on a more in-depth level to find out if the four constructs of the communication climate questionnaire can be predicted by the variables of the network analysis. In the end, it became possible to address the research question stated.

# Results

The results of the network analysis including the communication climate questionnaire are now known. Those results will be presented as follows: first on network level, followed by the results on individual level and finally the results per communication manner. Afterwards, the regression results will be presented.



#### Networks

The above presented Figure 1 shows the overall network of the communications department. A single line within a network means that an employee indicated communicating with this particular colleague on a regular basis. When the line has an arrow pointing in both directions, the relationship is claimed to be reciprocal. In figure 1 and appendices B to I the teams are marked with colors and figures to see the differences more clearly. The blue (squares) team consists of two people, they are the managers. The employees who correspond with the black (down triangle) are managers from other departments, such as for example IT, human resources and facility services. The fact that there is a bigger spread within the red (upper triangle) and yellow (diamond) team is logically explicable since the team members individually are stationed in different municipalities. This physical distance led to less face-to-face communication and less communication about personal issues. No significant differences were found in amount of relationships within the teams, this is supported by the density of the networks in which also no significant differences were found. Based on the same calculations, no role stars, liaisons, bridges, gatekeepers or isolates appeared to be present in these networks. Furthermore, clear results were retrieved with regard to communication problems, such as blockages or communication overload. It has proven to be the fact that these problems are not significantly present within the communication networks of the organization.

However, there are some remarkable results. In the overall network as well as in the specific networks per subject and per communication manner (see Appendices B - I), it is obvious to see that the team members are communicating most of the time with colleagues from their own team. Taking a closer look at the network in which the communication about *experiences as an employee* (appendix D) and *private subjects* (appendix E) are visualized, a huge share of the teams are still communicating with colleagues from the same team. This is remarkable since the given fact that the composition of the teams changes from time to time. So, all employees know each other and can contact anyone they want to talk about their experiences as an employee and their personal life, stories and questions. Furthermore, there are two teams who are communicating more with each other than with other teams; the green (circles) and purple (square including plus) team. This is clarified by the fact that they are physically working in the same building, whereas the other teams are working at other locations. A few years ago, these two intensive communicating teams were one team. This specific history and shared location may be a clarification for the close relations between these teams.

#### Individual

On an individual level, it is remarkable that one of the managers has a more marginal position in several network visualizations than one would expect, especially in the communication network about *experiences as an employee* (appendix D). The two managers both have two teams to supervise, as soon as one manager has a less central role, it appears that the other manager automatically gets a more central role. In practice this might mean that the manager with a central role is more trusted or involved in conversations about a variety of subjects. Furthermore, one individual has sometimes an odd position in the networks. This becomes clear when a look is taken in the green (circle) team in figure 1 and appendices D, F and H. This outlier was logically explicable due to the fact that this team member was transferred recently to another team. Due to this transfer, his or her relationships in the workplace are still intense with his or her former direct colleagues.

#### **Communication manner**

In the visualizations of the networks that are based on ways of communication, it is clear to see that the density is higher in the network about communication through e-mail than any other way of

communication. The second most-used way of communication is the conference, followed by face-to-face communication and contact through phone. In all ways of communicating the above presented results are still applicable, so the green and purple team still communicate more with each other and the other teams are somewhat at distance. In case of for example the face-to-face communication this is logical, since the location of the teams differ as well as the history: two of the teams were a few years ago all together within one team. The relationships which occurred at that time, may still be present in today's practice.

Another explanation of the fact that there is more e-mail contact comes from the fact that the organization introduced the alternative working strategies. In the case of this organization, this means that employees are free to work where they want. A consequence of this freedom is that employees are keeping in touch by means of e-mail. However one would then also expect a high degree of communication through phone, this has proven to be not the case.

#### Regression

In order to go more in depth and find more information, the communication climate questionnaire from Smidts et al. (2001) was used. As stated in the method section, the questionnaire measured *internal identification, external identification, top-down communication* and *reciprocity of communication*. Afterwards, regression analyses were performed in order to find out which variables predicted the variance in the constructs. Table 2 shows the regression results of the impact of the variables on internal identification. First of all, this table shows that the communication climate (top-down communication and reciprocity of communication) predicts 20% of the variance in internal identification. The network variables degree, closeness and betweenness predict 23% of the variance in internal identification. This table also shows the fact that the communication has proven to be significant effect on employees' internal identification. The same counts for the network variables, these have not proven to be significant predictors of the variance in the construct internal identification. This result itself is not convincing enough to answer the research question, but it can be stated that the network variables are not a significant predictor of internal identification.

Table 3 shows the regression results of the impact of the variables on external identification. This table shows that communication climate (reciprocity of communication, top-down communication and internal identification) predicts 16% of the variance in external identification. The network variables degree, closeness and betweenness predict also 16% of the variance in external identification. Again, one construct of the communication climate has proven to be a significant predictor for the variance in the construct. Internal identification has proven to be a significant predictor for external identification ( $\beta$  = 0.39; p < .05). This does not count for the other communication climate constructs; not for reciprocity of communication nor for top-down communication. These constructs have proven to be no significant predictors for the variance in external identification. The network variables, again, have not proven to be significant predictors of the variance in the construct external identification. Based on these results, it can be stated that the communication climate is only partially a predictor for organizational identification. Furthermore, it can be stated that the network variables are not significant predictors for both types of organizational identification.

Predictors	Model 1			Model 2	
	$\Delta R^2$	β	t	β	t
Communication climate	.20				
Reciprocity of communication		0.27	1.74	0.16	0.96
Top-down communication		- 0.41	- 2.63*	- 0.24	- 1.38
Network variables	.23				
Degree				- 0.40	- 0.27
Closeness				- 0.15	- 0.10
Betweenness				0.54	1.82
R <sup>2</sup>		.25		.35	
F		5.21*		3.00*	
df		2, 31		5, 28	

#### **Table 2.** Regression for impact of communication climate and network variables on internal identification.

Note. \* p < .05.

Predictors		Мо	del 1	Model 2	
	$\Delta R^2$	β	t	β	t
Communication climate	.16				
Reciprocity of communication		- 0.16	- 0.94	- 0.16	- 0.92
Top-down communication		- 0.19	- 1.05	- 0.18	- 0.95
Internal identification		0.39	2.10*	0.37	1.86
Network variables	.16				
Degree				- 0.63	- 0.40
Closeness				- 0.96	- 0.64
Betweenness				- 0.10	- 0.29
R <sup>2</sup>		.23		.31	
F		3.03*		2.06	
df		3, 30		6, 27	

**Table 3.** Regression for impact of communication climate and network variables on external identification.

Note. \* p < .05

### Conclusion

Since there was found a research gap in earlier research towards communication within organizations, this study aimed at identifying the contribution of network analysis to diagnose communication problems and to predict organizational identification. Based on the case and method the results are now known and with help of these results the research question will be answered: 'To what extent is it possible to diagnose communication problems and predict organizational identification by performing a network analysis?'

Based on the performed research, network analysis as such has proven to be a very useful method for diagnosing communication problems. The power of this method lies in the fact that it measures communication networks very extensively and in-depth. Clear examples of this depth are the several communication topics and ways of communicating which were used in the present research. It became possible to investigate not only how the communication networks within the department look when communicating about four different work related and non-work related topics, but also how the communication networks are depicted when looking at e-mailing or conferencing behavior. Combining these variables offered insight in which methods are mostly used for internal communication in this organization. The added value of this combination lies in the fact that the communication problems to be diagnosed do not per se have to concern the communication topics. It might be the case that there is good communication about all work related and non-work related topics, but too much information is exchanged through e-mail. Another example of the depth of this communication audit method lies in the fact that it will be possible to find possible communication blockages or communication overload within the network, when networks are to be visualized. Network roles, such as role stars, liaisons, bridges, isolates and gatekeepers (Brass, 1995), will be identified by using a network analysis. The visualization of the communication networks offered interesting insights, such as centrality of certain individuals and intensity of cooperation between different individuals and teams. The best example of the added value of the visualization of the networks to diagnose communication problems, is the situation in which one manager appeared to have a very marginal position in some networks.

Even in cases where a network analysis would not offer the necessary information for diagnosing communication problems, the method can be merged with a variety of other research designs. This can for example be done by questionnaires, which for example would help to research communication experiences. An example of this is adding a communication climate questionnaire (Smidts et al., 2001) to the research, to find out if the results from the questionnaire support the results of the network analysis. Thus, it can be stated that using network analysis as a communication audit method offers a very good possibility to diagnose communication problems, since its nature is identifying communication networks and the network's characteristics.

Regarding the results of the regression analysis, it can be stated that the network variables as measured here have proven to be no significant predictors of internal or external identification. Internal identification was only predicted by top-down communication, whereas external identification was only predicted by internal identification. In practice this means that there is no direct relation between the amounts of relationships in the workplace (degree), how long it will take to spread information from one to all other employees sequentially (closeness), the number of times an employee acts as a bridge along the shortest path between two other employees (betweenness) and organizational identification. In short, based on this research it can be stated that network analysis offer a good possibility to diagnose communication problems, but it does not offer a good possibility to predict organizational identification.

#### Discussion

In this study the strength and weaknesses of the network analysis as a communication audit method have been researched. This has been done by visualizing multiple communication networks of the communication department within an organization where after several network measures were calculated and the complete set of results was analyzed. During the entire process, the aim was to identify the contribution of a network analysis to diagnose communication problems and to predict organizational identification. This study has shown that this method can make an important contribution to the evaluation of an organization's internal communication system. Since this specific organization was raised a few years ago and in the last years they already had to cope with a reorganization and other organizational problems, this communication audit method proved to be useful for a first measure of the quality of internal communication.

This method might also be very useful as a monitoring tool for the management to trace possible (internal) communication problems at an early stage. Management and employees may not always be able to oversee the risks involved in certain crucial communication-related roles, or to evaluate the strengths and weaknesses of the communication system beyond their individual perceptions. The possibility to do this is offered when performing a network analysis on a regular basis, which uncovers various communication characteristics and makes it possible to perform relevant measurements. The results can indicate if and where employees are outside certain (communication) networks or can indicate employees who form a blockage in the communication flows.

Apart from the conclusion about the contribution of network analysis in general, this study also shows the importance of studying different types of communication networks within (departments of) organizations. The visualization of several networks makes it possible to study the extent to which individuals communicate differently in a variety of networks and with the possibility of communicating in several manners. This adds to the general knowledge of individual (internal) communicative behavior within organizations or departments from organizations. Also, this adds to the general knowledge of individual (internal) communicative behavior in organizations where the alternative working strategies are introduced. Since the expansion of technology mediated communication it is expected that our classic ways of communicating will shift towards more modern communication ways (Neufeld, Wan, and Fang, 2010). In this specific research this has been shown by the fact that communication via e-mail constitutes the largest share of communication in this specific department, future developments might have their impact on the communicative landscape within (departments of) organizations.

This study is an attempt to empirically investigate the contribution of network analysis as a communication audit and as a predictor for organizational identification. Furthermore, differences in use of communication manners within organizations were found during this research. An important limitation is the relatively small number of cases, which can be a danger to the reliability of this research. When interpreting the results of a network analysis, the unit of analysis ranges from the organization as a whole to individual respondents. All these respondents are employees of the communications department of one organization, which is a limitation to the generalizability of the specific network results. The fact that network analysis offers a good possibility for diagnosing communication problems is however generalizable to a variety of other organizations; this method has proven to be useful for further research towards communication problems within organizations.

More research is needed towards the use of network analysis as a communication audit instrument. Not only the overall network analysis needs more research but also the ways of

communicating need more research to form a solid body of conclusions and recommendations for organizations. Special interest may occur for alternative working strategies, since these might possibly have a great impact on the future landscape of communications (Neufeld et al., 2010). Also extensive research in use of (internal) social media within organizations might be very interesting for the nearby future. The influence of such developments on the general communications landscape offer a variety of possible starting points for future research. Based on the findings in this research, it may be argued that the method network analysis deserves a more central position on the palette of communication audit techniques.

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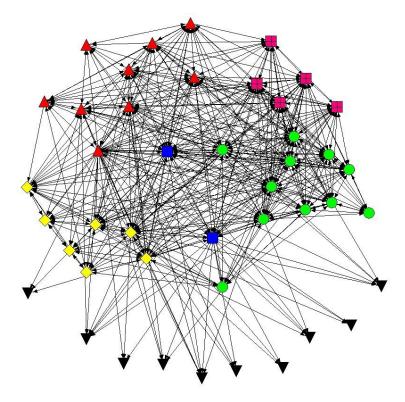
Node	Degree (in+out) <sup>1</sup>	Closeness <sup>2</sup>	Betweenness <sup>3</sup>
1	26	60.000	15.814
2	10	76.000	2.355
3	23	63.000	3.783
4	11	80.000	0.000
5	26	60.000	8.524
6	20	66.000	3.918
7	21	65.000	3.575
8	12	74.000	0.683
9	17	69.000	3.780
10	20	66.000	4.559
11	24	62.000	7.819
12	15	71.000	2.232
13	41	45.000	122.759
14	25	61.000	6.441
15	18	68.000	1.889
16	34	52.000	82.985
17	14	72.000	1.464
18	27	59.000	18.296
19	21	65.000	3.960
20	34	52.000	42.623
21	20	66.000	7.498
22	20	66.000	4.374
23	28	58.000	19.452
24	22	64.000	5.546
25	26	60.000	14.387
26	14	72.000	1.289
27	34	52.000	71.535
28	34	52.000	29.880
29	23	63.000	8.352
30	25	61.000	7.161
31	21	65.000	4.763
32	26	60.000	12.290
33	28	58.000	11.107
34	19	67.000	2.396

Appendix A – Calculated network variables

<sup>1</sup> Degree (in+out) is the amount of incoming and outgoing relationships mentioned.

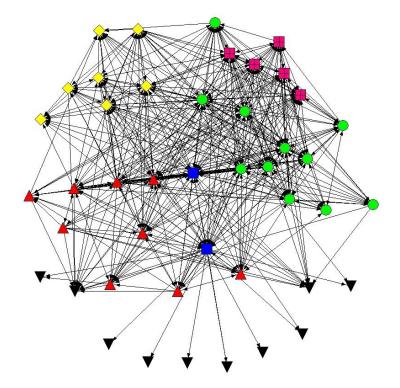
<sup>2</sup> Closeness can be regarded as a measure of how long it will take to spread information from one to all other nodes sequentially. In the classic definition of the closeness centrality, the spread of information is modeled by the use of shortest paths.

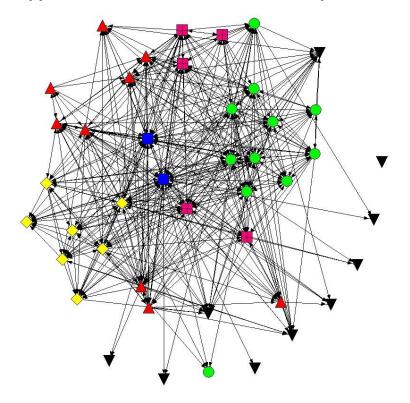
<sup>3</sup> Betweenness centrality quantifies the number of times a node acts as a bridge along the shortest path between two other nodes. It was introduced as a measure for quantifying the control of a human on the communication between other humans in a social network. In his conception, vertices that have a high probability to occur on a randomly chosen shortest path between two randomly chosen vertices have a high betweenness.



Appendix B – Communication within projects

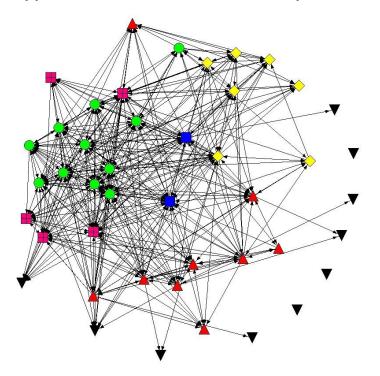
Appendix C – Communication about other work-related issues

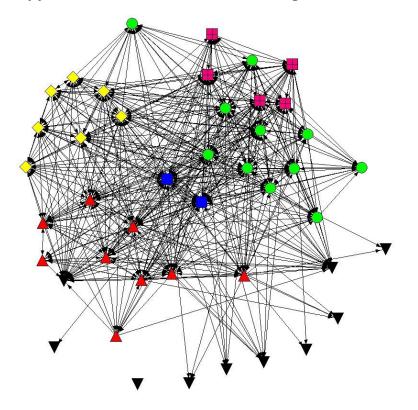




Appendix D – Communication about experiences as an employee

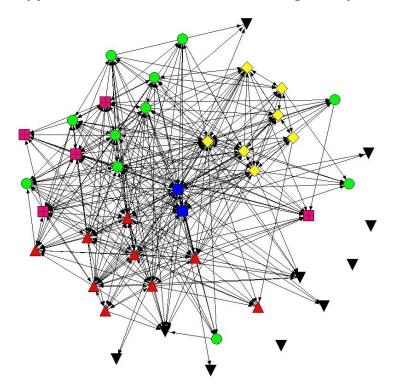
Appendix E – Communication about private issues

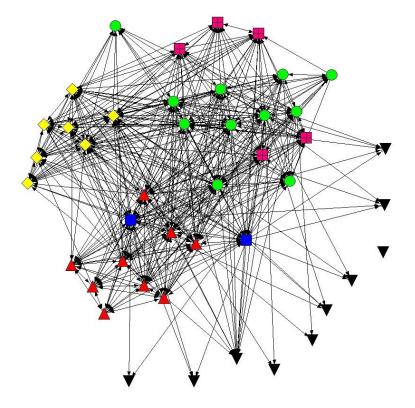




Appendix F – Communication through e-mail

Appendix G – Communication through telephone





# Appendix H – Communication in conferences

Appendix I – Communication face-to-face

