

Behavior of Organizational Agents on Managing Information Technology

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Abstract—Improving the impact of information technology (IT) investments is potentially beneficial for our society. This study identifies triggers which influence behavior of organizational agents on managing IT. In scope of this study are the portfolio decisions regarding where to invest the IT euro, the management of IT projects and the management of the IT infrastructure. Following the theory of planned behavior, it is shown for controllers of Dutch organizations that ‘intention’ is positively associated with behavior and that ‘subjective norm’ and ‘perceived behavior control’ are positively associated with intention. For portfolio and IT infrastructure management, attitude is also positively associated with intention. Overall it is concluded that the most important levers for behavior for the focus areas are ‘social pressure’ and the explicit confirmation of the agent’s own intention. This is good news since both can be easily influenced without significant monetary investment.

Keywords—Information technology; theory of planned behavior; project portfolio management; life cycle management; project management; benefits management

I. INTRODUCTION

IT is highly relevant in our current society since IT spending will be an estimated \$3.7 Trillion in 2018 [1], while in 2000 Strassmann [2] found that 55% of the US workforce were devoted to information creation, distribution and consumption. Unfortunately, no more recent numbers could be found but it seems safe to assume that this percentage has grown over the past 17 years, given that even those with non-standardized and difficult to automate jobs spend 47% of their time on email as well as on tracking down information needed for their tasks [3]. In 2015 an estimated 90% of the jobs in the EU required at least basic computer skills [4] and it looks like Davenport’s statement [5] that “all of us are information managers”--grows more accurate on a daily basis.

Against this backdrop, the digital transformation revolutionizes existing industries and creates new ones [6], [7]. Such a transformation is driven by developments such as mobility, social media, big data and cloud computing [8], [9] which change the way information is received, processed and managed.

Given the resources allocated to IT and information processing, as well as the impact of digital transformation, significant monetary benefits are achievable when the bang for an IT buck improves (comp. [10]-[15]). Three interesting and important areas for improving IT impact are studied in this paper. They are seen as important because large upswing

potentials are expected for each of them; the three differ significantly to one another and together cover a significant part of managing IT. The first focus is on where to invest the IT euro since not all IT investments are equally successful. Although 60% of the post calculated IT investments delivered more than 80% of the expected value, 13% of them in the 2015 study diminished the value of the organization [16]. The second focus is on the implementation of IT investment. Not all IT projects are delivered according to expectation [17] and some even threaten the existence of an organization [18]. The third focus is on the usage of the existing IT infrastructure. This is relevant as 50-90% of the total cost is a result of maintenance cost [19], [20].

Within these three focus areas, this paper studies the IT related behavior of the people working in organizations, i.e. organizational agents [21], so that we can better understand how they work in organizations, make IT-related decisions and how they act in relation to IT. The research question is:

What influences the behavior of organizational agents in managing information technology?

This paper discusses the theoretical foundations and associated hypotheses. Then the research method is outlined and results are presented. Finally, the paper concludes with a discussion of the research.

II. THEORY AND HYPOTHESES

This paper conceptualizes three focus points within IT management: (I) deciding where to invest, (II) projects in which IT-investment is implemented and (III) the usage of the IT infrastructure. The focus areas are closely interlinked and together can be defined as a process model with three sub-processes. The first two, project portfolio management and project management, are dominated by scoping, creating and changing the IT capabilities such as processes, procedures and information systems, whereas the third sub-process--lifecycle management--is focused on using those capabilities.

In Portfolio Selection, Markowitz [22] describes a theory which selects securities in order to create a balanced portfolio to protect against risks whilst optimizing return. His theory aims at achieving an ‘efficient portfolio’ meaning that it is impossible to obtain a greater return without incurring a greater standard deviation (risk) or that it is impossible to obtain a smaller standard deviation without giving up return. The theory Markowitz developed is also studied and used for managing IT investment portfolios [23]-[29]. In this paper all activities

performed to optimize information technology impact by allocating IT budgets to individual project calls are called project portfolio management (PPM).

The implementation of IT investments is usually organized into projects. Project management (PM) is the second sub-process and covers all activities which optimize the value generated by IT by delivering the IT investments prioritized by PPM. The relative success of PM depends on efficiency and plan accuracy. Efficiency is defined as delivering project output as fast as possible while sacrificing as few resources as needed [30], [31] whereas plan accuracy is defined as delivering the required quality on time and within budget [17].

The output of an IT project normally comprises a new or an enhanced IT infrastructure. The third sub-process, life cycle management (LCM), leverages this IT infrastructure and includes all activities which optimize IT impact by improving the usage of the extant IT infrastructure (comp. [32]). Its ultimate goal is ‘technical efficiency’ [33] where the maximum output is generated from the extant technology.

The three sub-processes are in the scope of this study and work closely together as PM is fed with project calls from PPM and as LCM receives upgraded IT infrastructure from PM. They can all produce waste and value is only generated by the usage of the infrastructure in the LCM sub-process. All three sub-processes give feedback on their functioning; the feedback of LCM on the usage and effects of the IT assets can be used to optimize PPM and PM. The feedback on the plan accuracy of PM can be used to optimize PPM. An overview of the three sub-processes including their main inputs and outputs is presented in Fig. 1.

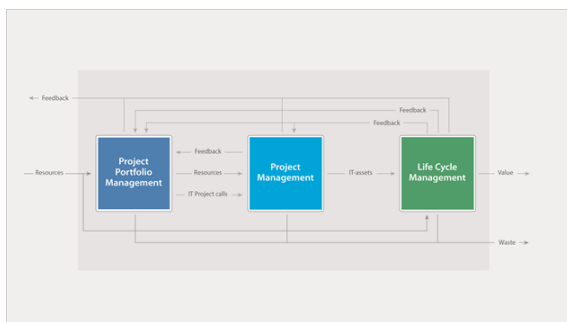


Fig. 1. The main inputs and outputs of the three subprocesses.

Yet the management of IT not only requires technical knowledge and skills, it also is determined by human behavior [34]-[36]. Human decisions and actions directly influence the performance of all three sub-processes. In 1991, Ajzen [37] published a social behavioral model called the theory of planned behavior (TPB). His theory was confirmed by numerous empirical studies [38] and has also been applied successfully in the business domain [39]-[46]. Within the IT discipline, the theory has been employed several times [47]-[55]. In this study, the TPB model is tested in relation to the three sub-processes.

According to the TPB model, intention predicts behavior and states that there is a high probability a human being actually does what she intends to do. Thus, the intention to work on one of the sub-processes is expected to be a predictor

for actually working on them. Yet ‘it is not very illuminating to discover that people do what they intend to do’ [38] even if in an organizational context such a study might not yield similar results since available working time is somewhat ‘artificially’ constrained by working hours and the rigorous financial calendar. The time required to execute the sum of intended behaviors on topics like strategy, reducing working capital, sales, customer relationship management and new business development may well outweigh the time available. This could be one of several reasons that the intention to manage IT does not translate into concrete behavior. Still, the intention to manage IT is expected to predict behavior since most organizations perceive an increasing relevance of IT due to both the significant cost and expected benefits, and will allocate time accordingly. Therefore, the first hypothesis is:

H1: Intention to manage IT is positively associated with actual behavior for the three sub-processes project portfolio management, project management and life cycle management

According to Ajzen, a person’s intention to perform a behavior is influenced by three concepts. Firstly, their attitude towards this behavior, i.e. whether the person has a positive or negative attitude towards the behavior, secondly, the opinion relevant others have about the behavior, otherwise called the subjective norm (SN) and thirdly, perceived behavioral control (PBC) which is defined as the feeling a person has regarding their own ability to perform the behavior.

If IT is seen as ‘valuable’ then that positive attitude toward IT is expected to predict a positive intention to manage IT whilst this intention is not expected where IT is considered ‘worthless’. The same is expected for the sub-processes.

Opinions of decision makers, colleagues and teachers are also expected to be predictors for the intention to managing IT which means that the perception of an organizational agent regarding the social pressure to work on IT--in other words the subjective norm on managing IT--is expected to set the agenda for that particular agent. Thus an agent’s intention to manage IT will be determined by: decision makers declaring that PPM, PM and LCM are important, colleagues regularly discussing sub-processes and educational IT programs followed by the agent themselves.

The last predictor for intention is perceived behavioral control (PBC). PBC is, given the complexity of managing IT, a scarce capability. This capability is built from numerous abilities, such as, the ability to define requirements, build a business case on an IT investment, design a sustainable data model, create a database, customize an enterprise resource planning system, manage and control progress on an IT project, set up a web server, restore backups, program an interface etc. These capabilities require extensive education and/or training and organizational agents having invested time in mastering these capabilities are expected to have an intention to leverage them. This predictive power of PBC on intention is strengthened since an organizational agent who has mastered this capability will have the opportunity to utilize their “locus of value” [19] by increasing the budget or staff for which they are responsible, or by trying to access an increase in personal status like “a leather office chair” [56], [57].

We test the significance of the three TPB indicators on the intention for the sub-processes in hypothesis 2:

H2: Attitude, subjective norm and perceived behavioral control are significant indicators of the intention to optimize the three sub-processes project portfolio management, project management and life cycle management

Following the TPB theory, attitude, SN and PBC influence intention. The predictive power of attitude, SN and PBC are not expected to be equal or as Ajzen [37] describes it: ‘The relative importance of attitude, SN, and PBC on the prediction of intention is expected to vary across behaviors and situations’. Ajzen [38] concludes that SN ‘generally accounted for less variance than the other two predictors’ and that ‘for the behaviors considered, personal considerations tended to overshadow the influence of perceived social pressure. Melas et al. [58] studied and explained the relative low correlation found in other studies between attitude and behavior related to clinical information systems use. Other findings in corporate settings showed the strongest predictive power from both attitude [47] and subjective norm [59]. Armitage and Conner [60] state that in situations where attitudes are strong or normative influences are powerful, PBC may be less predictive.

A different split of the predictive power is expected in this study because of the current immaturity of managing IT--an immaturity which is widely publicized due to the propensity of popular press to cover failed IT initiatives (e.g. [61], [62]). Additionally, each of the sub-processes holds well-known challenges; a delayed time-to-market, too many projects running simultaneously and a modest return of the IT investment portfolio are all examples directly linked to suboptimal PPM [63]-[65]. Delivering projects on time and budget is still a major challenge within PM and in LCM challenges on data leakage, lost data due to back up problems, performance issues and downtime are present in a lot of organizations [66]. These issues are well known and many of them might prevent agents from translating a possible attitude or SN into intention. Conversely an increased PBC is usually the result of heavy personal investment by the agent in mastering IT through years of work and study. After such a high personal investment the probability of IT failure is reduced and it is expected that PBC predicts intention more strongly than attitude or subjective norm, which leads us to hypothesis 3:

H3: Perceived behavioral control is the strongest indicator of intention to optimize the three sub-processes project portfolio management, project management and life cycle management

III. METHOD

The research was performed via a structured online questionnaire comprising 72 questions. The constructs used a five-point Likert Scale and described five TPB variables for each of the three sub-processes and in total covered 15 constructs. IT knowledge was used as a gauge to select agents for the survey. After much consideration, it was decided to survey controllers as opposed to other roles such as information managers, IT experts, IT managers, information

system users, CEOs and CFOs, as controllers cover all processes and outputs in the organization [67]. Controllers support management by creating transparency on the consequences of decision-making and resource allocation. They also ensure the reliability and efficiency of the financial reporting and were, given the impact of IT on almost all processes in an organization, expected to be familiar with all three sub-processes. Finally, controllers may hold a more objective view, as they are not, unlike IT managers, reflecting the output of their own work which might otherwise produce a conflict of interest. The controllers were contacted through the ‘Stichting Instituut voor Control en Management Accounting Nederland’, a non-profit-organization founded in 1994, which aims to improve the quality of the registered controllers and accountants. In total 6.052 registered auditors or controllers in the Netherlands were contacted and 213 respondents answered the questionnaire (3.5%). The respondents worked in both commercial and non-commercial organizations and in all kinds of industries--for example trade, public services and services--but mainly in financial services and production.

The concept PPM was explained within the questionnaire as ‘*management activities assuring that only the best IT-projects are started*’ and even though more rigorous definitions of PPM aspire to an ‘efficient portfolio’ this definition [22] was not expected to be known by all interviewees. Instead, ‘best projects’ were defined in the questionnaire as those which generated more expected value with the same risk or the same expected value with less risk.

The concept ‘project management’ addresses both ‘plan accuracy’ and ‘efficiency’. Where ‘plan accuracy’ is very well known in the financial community, within the questionnaire, the concept of ‘efficiency’ was reduced to ‘*delivering project output with as few resources as possible*’.

LCM is focused on ‘technical efficiency’ and whilst technical efficiency is a theoretical construct that is rarely used by controllers, it was translated operationally to ‘*getting the most out of the existing IT-assets*’. For each of these three sub-processes, questions around behavior, intention, attitude, SN and PBC were developed.

Since managing IT is a complex activity that consumes significant time, actual behavior was tested over the previous twelve months [68]. Behavior was measured using the verbs ‘strengthened’, ‘helped’ and ‘advised’ and subjectively addressed whether the respondent felt they had actually strengthened, helped or advised on the three sub-processes. Behavior was also loaded with a fourth measure on the improvement on the sub-process performance; this addressed the respondent's opinion on whether any actual improvement--such as ‘*better managing the IT-projects than during the prior 12 months*’--had occurred.

Intention was tested for a forthcoming period of three months. Given the continuous flow of project calls and the ongoing activity of LCM it was felt that a period of three months covered enough opportunities to enhance the sub-processes. In medium and large enterprises, a significant proportion of the workforce was dedicated to IT and improving it was not solely up to a single individual. A controller needed the cooperation of their management. Their intention to advise and to help

management as well as their ‘overall’ intention to improve the sub-process (comp. [69]) was the factors used to load the intention concept.

As noted, SN is the agent’s perception of whether personally influential persons believe they should better manage IT and the questionnaire addressed three described dimensions; decision makers, colleagues and educational programs, which covered a significant and relevant part of the participant’s environment. SN of decision makers, colleagues and educational programs were not expected to correlate, since they can differ substantially; changes in the norm from decision makers for example, do not necessarily need to be reflected by educational programs. The causal relationship goes from the indicators into the latent construct. For that reason, they are, unlike the other concepts, not weighted with reflective but with formative measures [70], [71]. This is consistent e.g. with [69] who defined mimetic, coercive and normative pressure as constructs with formative measures.

The questionnaire was pre-tested by five persons with a similar background as the sample group and was optimized based on their feedback.

IV. RESULTS

Most respondents worked for organizations with large revenues and high IT-budgets; more than 68% reported annual revenues over 50 Mio euros and 37% of the respondents reported IT budgets of over 10 Mio euros. For 28% of the participants the annual IT-budget was less than 1 Mio euros.

The reliability of all constructs using reflective measures was tested with Cronbach’s alpha and Dillon-Goldstein’s Rho. The validity was tested with the Average Variance Extracted (AVE) and the discriminant validity as set by Fornell-Larcker [72]. Based on these tests, a few items were excluded in the subsequent analysis. Three questions on intention were dropped since they excluded, unlike the other intention questions, the terms ‘project portfolio management, ‘project management’ or ‘life cycle management’. Where the interviewees were familiar with topics such as ‘I will determine the minimum amount of resources needed for the upcoming three large IT-projects’ they did not map these to the project management sub-processes. Three more questions on behavior were also dropped because they differed from the remaining nine behavior questions which described the behavior of the organization and not the activities of the interviewee.

The results of the tests on the constructs are presented in Table I. The constructs all pass the AVE validity threshold of 0.5 [73] and the tests on the discriminant validity show that the latent variables explain the variance of their own indicators better than the variance of other latent indicators (i.e. the Fornell-Larcker Criterion is passed). Not all constructs pass the Cronbach alpha threshold of 0.7 [74] but the composite reliability tests, measured with Dillon-Goldstein’s Rho, show a strong internal consistency [74]. The reliability of the congeneric model suffices for the statistical tests used in this study.

TABLE I. RELIABILITY AND VALIDITY OF THE CONSTRUCTS

Sub-process	Construct	AVE	Fornell Larker-Criterion	Cronbach alpha	Dillon-Goldstein’s Rho
PPM	Intention	0.787	Passed	0.865	0.917
PM	Intention	0.680	Passed	0.764	0.864
LCM	Intention	0.765	Passed	0.847	0.907
PPM	Behavior	0.685	Passed	0.764	0.865
PM	Behavior	0.630	Passed	0.689	0.832
LCM	Behavior	0.641	Passed	0.705	0.832
PPM	Attitude	0.587	Passed	0.647	0.808
PM	Attitude	0.516	Passed	0.550	0.752
LCM	Attitude	0.623	Passed	0.695	0.831
PPM	Perceived behavioral control	0.615	Passed	0.381	0.760
PM	Perceived behavioral control	0.601	Passed	0.336	0.751
LCM	Perceived behavioral control	0.594	Passed	0.347	0.739

The hypotheses in this research are tested with a Structural Equation Model applying the variance-based model Partial Least Squares (PLS) [72]. The precondition of PLS for the models in this research--a sample size of 30--was fulfilled. The SmartPLS software [75] as described in [76] supported the analysis and the significance of the relations was tested in a bootstrap with 5.000 samples.

The results of the analyses with SmartPLS are presented in Fig. 2, 3 and 4. Fig. 2 presents the three predictors for intention as well as intention and behavior for the PPM sub-process. The attitude construct was weighted with three reflective measures: PPMAtt1, PPMAtt2 and PPMAtt3. The subjective norm construct was loaded with three measures (PPMSN1, PPMSN2 and PPMSN3) with a formative causal relationship from these measures into the construct. The line between the PPMAtt predictor and the intention construct (PPMInt) indicates the explaining power of attitude on intention (0,181); the R² is written in the PPMInt box (0,324). Fig. 3 holds the same TPB components for the PM sub-process as does Fig. 4 for LCM.

Based on the R² (0.322 – 0.336 for intention and 0.365 – 0.404 for behavior) we conclude that the effect sizes are ‘large’ [77] since effect sizes greater than 0.25 are rare in behavioral studies [78]. This analysis allows us to accept hypothesis 1, stating that intention is positively associated with behavior, for all three sub-processes. Attitude holds a positive influence on intention for PPM and LCM. This relationship is not statistically significant for PM. SN and PBC hold a statistically

significant positive influence on intention for all three sub-processes. SN clearly holds the strongest effect on intention (0.349 – 0.491); this is followed by smaller influences of attitude (0.181 for PPM and 0.222 for LCM) and an even smaller influence by PBC (0.104 – 0.152). Based on these insights it is clear that hypothesis 3 must be rejected for all sub-processes. SN is the strongest indicator on intention for IM. Table II presents an overview of the test results for all hypotheses.

TABLE II. SUMMARY ON THE HYPOTHESES TESTING

Hypotheses	Result ^a
H1.1 Intention is positively associated with behavior for project portfolio management	Accepted (***)
H1.2 Intention is positively associated with behavior for project management	Accepted (***)
H1.3 Intention is positively associated with behavior for life cycle management	Accepted (***)
H2.1 Attitude towards PPM has a positive influence on the intention to use PPM	Accepted (***)
H2.2 Subjective norm PPM has a positive influence on the intention to use PPM	Accepted (***)
H2.3 Perceived behavioral control with respect to PPM has a positive influence on the intention to use PPM	Accepted (***)
H2.4 Attitude towards PM has a positive influence on the intention to use PM	Rejected
H2.5 Subjective norm PM has a positive influence on the intention to use PM	Accepted (***)
H2.6 Perceived behavioral control with respect to PM has a positive influence on the intention to use PM	Marginally accepted (*)
H2.7 Attitude towards LCM has a positive influence on the intention to use LCM	Accepted (***)
H2.8 Subjective norm LCM has a positive influence on the intention to use LCM	Accepted (***)
H2.9 Perceived behavioral control with respect to LCM has a positive influence on the intention to use LCM	Accepted (**)
H3.1 Perceived behavioral Control is the strongest indicator of intention to optimize project portfolio management	Rejected
H3.2 Perceived behavioral Control is the strongest indicator of intention to optimize project management	Rejected
H3.3 Perceived behavioral Control is the strongest indicator of intention to optimize life cycle management	Rejected

^a. (significance * ≤ 0.1, ** ≤ 0.05 and *** ≤ 0.01)

The dominance of SN as a predictive power over PBC could indicate a mismatch in resource allocation and be used in future research to explain the high rate of IT failure. Future research could also consider drilling down to the SN concept by studying effects of not only the content but also the emotional expressions (comp. [79]) or on the most relevant SN influencers (e.g. the survey on most relevant users on Twitter [80]) or by expanding the social network (e.g. as has been done in BI software [81]). It could also focus on other constructs which influence intention such as goal clarity, curiosity and enjoyment (comp. [82]).

The confirmation of TPB for the sub-processes provides practitioners with simple but powerful instruments since they could influence behavior via intention simply by improving controllers' attitude, SN and PBC. SN is not only the strongest lever, but it can also be implemented more easily than attitude and PBC since attitude is deeply intrinsic and PBC requires significant time and effort. Practitioners, both managers as well as staff, could increase SN by clearly communicating a strong (noncompulsory) opinion on IT (comp. [83]) perhaps even supported by inputs from scientists or other influential practitioners. The formative measures show that subjective norm is especially strong amongst colleagues, followed by decision makers and educational programs. In other words, colleagues talking about and expressing the importance of IT will drive the intention of controllers to work on IT management.

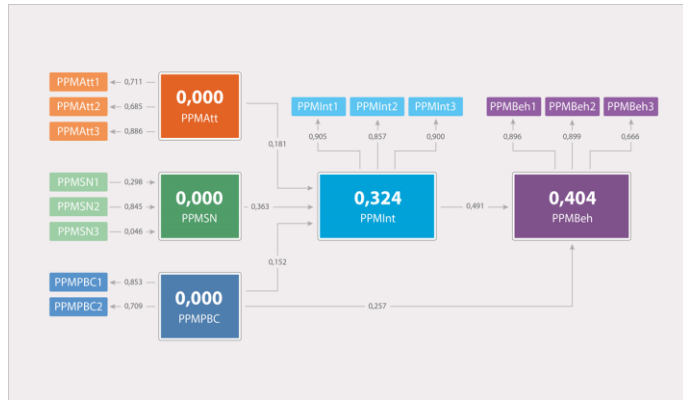


Fig. 2. Results on the model testing on Project Portfolio Management.

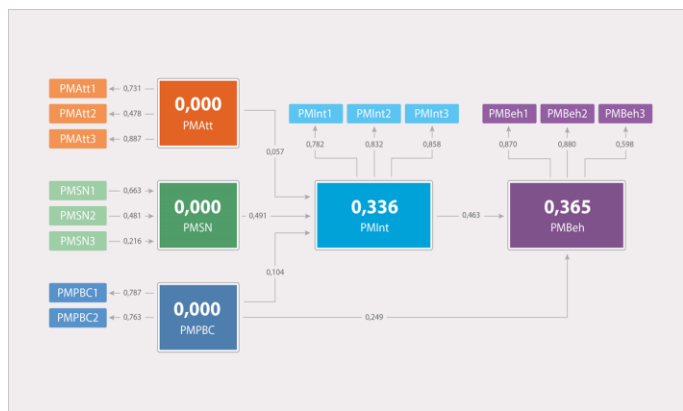


Fig. 3. Results on the model testing on Project Management.

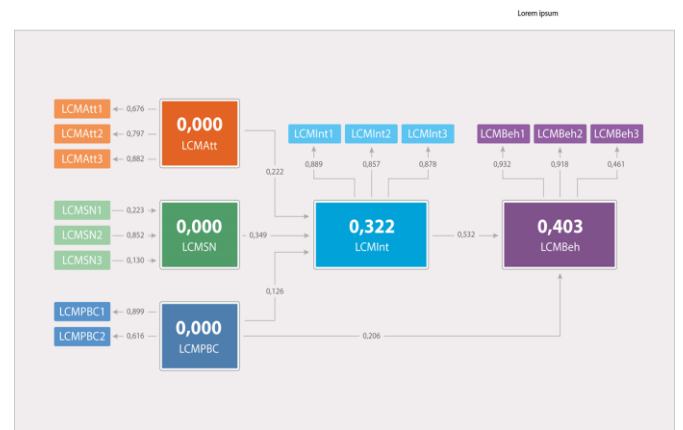


Fig. 4. Results on the model testing on Life Cycle Management.

Practitioners can also apply the finding that IT intention is a good predictor for IT behavior. Increasing the intention, e.g. just by asking ‘do you intend to improve the bottom line impact of an IT euro?’, is likely to lead to a higher intention where the answer is affirmative and thus encourage IT behavior (comp. [84], [85]). The findings of this study show that IT behavior depends largely on saying, and having your colleagues say, the right ‘trigger’ words.

V. LIMITATIONS AND CONCLUSIONS

The study and results are limited for the Netherlands and the conclusions can only be generalized for other countries in case cultural, economic and other differences are taken in consideration. A second limitation comes from the focus on controllers. Controllers could be biased as compared to shareholders, IT-management or general management. Nevertheless, controllers are seen as the agents with the best in-depth knowledge on the value created by the sub-processes.

We conclude that the theory of planned behavior was confirmed for the three sub-processes of managing IT studied in this paper: project portfolio management (PPM), project management (PM) and life cycle management (LCM). The theory was tested to explain the behavior of agents in an organizational context and proved to be solid.

The confirmation of H1 as well as of H2.1, 2.2, 2.3, 2.5, 2.6, 2.7, 2.8, 2.9 shows that the theory of planned behavior can help explain drivers of intention and behavior for all three sub-processes. Intention drives behavior and is in turn influenced by attitude, subjective norm (SN) and perceived behavioral control (PBC) for the sub-processes PPM and LCM and by SN and PBC for PM. This indicates, following the TPB, that in case one of these increases, the intention could also rise.

We expected PBC to hold the strongest influence on intention. This was based on the widespread knowledge on the high risks of managing IT which would discourage untrained agents to engage in managing IT and conversely push trained agents who had invested significantly in their knowledge to leverage their IT-investment. But H3 was rejected and the data showed that intention was best predicted for Dutch controllers by SN. Furthermore, the results show that agents with a relatively low PBC nevertheless hold a relatively high intention to practice IT. On the other hand, agents with a higher PBC hold a lower intention to manage IT.

REFERENCES

- [1] Gartner, Gartner says worldwide IT spending to reach 3.7 Trillion in 2018. Press Release, Orlando October 3rd 2017.
- [2] P.A. Strassmann, Information productivity indicators of U.S. corporations. The Information economics press, 2000.
- [3] M. Chui, J. Manyika, J. Bughin, R. Dobbs, C. Roxburgh, H. Sarrazin, G. Sands, and M. Westergen, The social economy: unlocking value and productivity through social technologies. McKinsey Global Institute, 2012.
- [4] European Commission, Exploiting the employment potential of ICTs. Commission staff working document, 2012.
- [5] E. Davenport, “Information management: an educational perspective,” *International Journal of Information Management*, 8(4), pp.255-263, 1988.
- [6] E. Brynjolfsson, and A. McAfee, The second machine age: work, progress, and prosperity in a time of brilliant technologies. New York: W.W. Norton & Company, 2014.
- [7] B. Stone, The everything store, UK, Random House, 2013.
- [8] N.D. Evans, SMAC and the evolution of IT. *Computerworld* December 9, 2013.
- [9] G.W. Bock, A. Kankanhalli, and S. Sharma, “Are norms enough? The role of collaborative norms in promoting organizational knowledge seeking,” *European Journal of Information Systems*, 15(4), pp.357–367, 2006.
- [10] S. Braun, and R.A. Turner, “Attitudes and company practices as predictors of managers’ intentions to hire, develop, and promote women in science engineering, and technology professions,” *Consulting psychology journal: Practice and research*, 66(2), pp.93–117, 2006.
- [11] C.B. Frey, and M.A. Osborne, The future of employment: how susceptible are jobs to computerization. Oxford University, September 17 2013.
- [12] D.W. Jorgenson, M.S. Ho, and K.J. Stiroh, “A retrospective look at the U.S. productivity growth resurgence,” *Journal of Economic Perspectives*, 22(1), pp.3-24, 2008.
- [13] S. Mithas, A. Tafti, I. Bardhan, and J.M. Goh, “Information technology and firm profitability: mechanisms and empirical evidence,” *MIS Quarterly*, 36(1), pp.205-224, 2012.
- [14] J. van Reenen, N. Bloon, M. Draca, T. Kretschmer, and R. Sadun, The economic impact of ICT. Enterprise LSE, 2010.
- [15] B. van Ark, M. O’Mahony, and M.P. Timmer, “The productivity gap between Europe and the United States: Trends and causes,” *Journal of Economic Perspectives*, 22(1), pp25-44, 2008.
- [16] M. Van der Pas, B. Furneaux, “Improving the predictability of IT investment business value,” completed research papers, Twenty-Third European Conference on Information Systems (ECIS), Münster, Germany, 2015.
- [17] The Standish Group, The chaos report. The Standish Group, 2011.
- [18] B. Flyvbjerg, and A. Budzier, “Why your IT project may be riskier than you think,” *Harvard Business Review*, 89(9), pp. 23-25, 2011.
- [19] M.J. Davern, and R. J. Kauffman, “Discovering potential and realizing value from information technology investments,” *Journal of Management Information Systems*, 16(4), pp.121-143, 2000.
- [20] C. Verhoef, “Quantitative IT portfolio management,” *Science of Computer Programming*, 45(1), pp.1-96, 2002.
- [21] S.A. Ross, “The economic theory of agency: the principal’s problem,” *The American Economic Review*, 63(2), pp.134-139, 1973.
- [22] H.M. Markowitz, Portfolio selection: efficient diversification of investment. Michigan: BookCrafters, 1959.
- [23] C. Beringer, D. Jonas and A. Kock, “Behavior of internal stakeholders in project portfolio management and its impact on success,” *International Journal of Project Management*, 31(6), pp. 794–803, 2013.
- [24] B.S. Blichfeldt, and P. Eskerod, “Project portfolio management - There’s more to it than management enacts,” *International Journal of Project Management*, 26(6), pp. 357–365, 2008.
- [25] E. Gutiérrez, and M. Magnusson, “Dealing with legitimacy: A key challenge for project portfolio management decision makers,” *International Journal of Project Management*, 32(1), pp.30–39, 2014.
- [26] C.R. Fornell, and D. F. Larcker, “Evaluating structural equation models with unobservable variables and measurement error,” *Journal of Marketing Research*, 18(February), pp. 39-50, 1981.
- [27] C.P. Killen, and R.A. Hunt, “Robust project portfolio management: capability evolution and maturity,” *International Journal of Managing Projects in Business*, 6(1), pp. 131-151, 2013.
- [28] M. Martinsuo, “Project portfolio management in practice and in context,” *International Journal of Project Management*, 31(6), pp. 794–803, 2013.
- [29] C. Verhoef, “Quantitative IT portfolio management,” *Science of Computer Programming*, 45(1), pp.1-96, 2002.
- [30] D. Garmus, and D. Herron (2001). *Function point analysis -- measurement practices for successful software projects*. Boston: Addison-Wesley.
- [31] M. van der Pas, "Speeding up time-to-market of IT-investments" Tenth IADIS International Conference on Information Systems, Budapest, Hungary, 2017

- [32] D.L. Lester, J. A. Parnell, and S. Carraher, "Organizational life cycle: a five-stage empirical scale," *The International Journal of Organizational Analysis*, 11(4), pp. 339-354, 2003.
- [33] B.M. Shao, and W. T. Lin, "Technical efficiency analysis of information technology investments: a two-stage empirical investigation," *Information & Management*, 39(5), pp.391-401, 2002.
- [34] J.E. Hunton, "Discussant's comments on presentations by John Lainhart and Gerald Trites," *Journal of Information Systems*, 13 (2000 supplement), pp. 33-35, 2000.
- [35] M. Jeffery, and I. Leliveld, "Best Practices in IT Portfolio Management," *MIT Sloan Management Review*, Spring, pp.41-49, 2004.
- [36] A. Ortiz de Guinea, and J. Webster, "An investigation of information systems use patterns: technological events as triggers, the effect of time, and consequences for performance," *MIS Quarterly*, 37(4), pp.1165-1188, 2013.
- [37] I. Ajzen, "The theory of planned behavior," *Organizational behavior and human decision processes: a journal of fundamental research and theory in applied psychology*, 50, pp.179-211, 1991.
- [38] I. Ajzen, *Attitudes, personality and behavior*. Berkshire: Open university press, 2005.
- [39] S. Braun, and R.A. Turner, "Attitudes and company practices as predictors of managers' intentions to hire, develop, and promote women in science engineering, and technology professions," *Consulting psychology journal: Practice and research*, 66(2), pp.93-117, 2006.
- [40] J. Cohen, Y. Ding, C. Lesage, and H. Stolowy, "Corporate fraud and managers' behavior: evidence from the press," *Journal of business ethics*, 95, pp.271-315, 2011.
- [41] G.J. Fogarty, and A. Shaw, "Safety climate and the theory of planned behavior: Towards the prediction of unsafe behavior," *Accident analysis and prevention*, 42, pp.1455-1459, 2010.
- [42] M. Gagné, *A model of knowledge sharing motivation human resource management*, 48(4), pp.571-589, 2009.
- [43] C.A. Henle, A.L. Reeve, and V.E. Pitts, "Stealing time at work: attitudes, social pressure, and perceived control as predictors of time theft," *Journal of business ethics*, 94, pp.52-67, 2010.
- [44] M. Hill, L. Mann, and A.J. Wearing, "The effects of attitude, subjective norm and self-efficacy on intention to benchmark: A comparison between managers with experience and no experience in benchmarking," *Journal of organizational behavior*, 17(4), pp.313-327, 1996.
- [45] D.M. Randall, and A.M. Gibson, "Ethical decision making in the medical profession: an application of the theory of planned behavior," *Journal of business ethics*, 10, pp.111-122, 1991.
- [46] P. Sharma, J.J. Chrisman, and J.H. Chua, "Succession planning as planned behavior: some empirical results," *Family Business Review*, 16, pp.1-15, 2003.
- [47] A. Chennamanenia, J.T.C. Teng, and M.K. Rajab, "A unified model of knowledge sharing behaviors: theoretical development and empirical test," *Behavior & Information Technology*, 31(11), pp.1097-1115, 2012.
- [48] P. Hallikainen, Q. Hu, E. Frisk, T. Päiväranta, and T.R. Eikebrokk, "The use of formal IT investment evaluation methods in organizations: A Survey of European Countries," *AMCIS 2006 proceedings*, paper 67, 2006.
- [49] M.A. Hameed, S. Counsell, and S. Swift, "A conceptual model for the process of IT innovation adoption in organizations," *Journal of engineering & technology management*, 29(3), pp.358 - 390, 2012.
- [50] A. Kasim, H. Dzakiria, and C. Scarlat, "Exploring the digital divide issues affecting hotel frontliners," *Advances in Business-Related Scientific Research Journal*, 4(2), pp. 165-176, 2013.
- [51] K.Y. Kwahk, and J.N. Lee, "The role of readiness for change in ERP implementation, Theoretical bases and empirical validation," *Information & Management*, 45, pp. 474-481, 2008.
- [52] P.A. Pavlou, and M. Fygenon, "Understanding and predicting electronic commerce adoption: an extension of the theory of planned behavior," *MIS Quarterly*, 30(1), pp.115-143, 2006.
- [53] C.K. Riemenschneider, and V. R. McKinney, "Assessing the adoption of web-based e-commerce for business: a research proposal and preliminary findings," *Electronic Markets*, 9(1), pp.9-13, 1999.
- [54] L. Zhou, "Application of TPB to punctuation usage in instant messaging," *Behavior & Information Technology*, 26(5), pp.399-407, 2007.
- [55] S. Zhu, and J. Chen, "E-commerce use in urbanising China: the role of normative social influence," *Behavior & Information Technology*, 35(5), pp.357-367, 2016.
- [56] V. Gurbaxani, and S. Wang, "The impact of information systems on organizations and markets," *Communications of the ACM*, 34(1), pp.59-73, 1991.
- [57] M.L. Markus, and C. Soh. "Banking on information technology: converting IT spending into firm performance," In: *Strategic Information Technology Management*. Ed. By R. Banker, R. Kauffman and M. A. Mahmood. Harrisburg, PA, Idea Group: pp-375-404, 1993.
- [58] C.D. Melas, L.A. Zampetakis, A. Dimopouloi, and V.S. Moustakis, "The significance of attitudes towards evidence-based practice in information technology use in the health sector: an empirical investigation," *Behavior & Information Technology*, 33(12), pp.1248-1260, 2014.
- [59] P.L. Teh, and C.C. Yong, "Knowledge sharing in IS personnel: organizational behavior's perspective," *MIS Quarterly*, 27(1), pp.19-49, 2011.
- [60] C.J. Armitage, and M. Conner, "Efficacy of the theory of planned behavior: A meta-analytic review," *British Journal of Social Psychology*, 40(4), pp.471-499, 2001.
- [61] The Guardian, "BSkyB will get 318GBPm settlement from Hewlett-Packard," *The Guardian* (07.06.2010).
- [62] The Guardian, "White House relaxes Obamacare deadline as congress reviews 'failures'" *The Guardian* (24.10.2013).
- [63] S. Pass, and B. Ronen, "Reducing the software value gap," *Communications of the ACM*, 57(5), pp.80-87, 2014.
- [64] B. de Reyck, Y. Grushka-Cockayne, M. Lockett, S.R. Calderini, M. Moura, and A. Sloper, "The impact of project portfolio management on information technology projects," *International Journal of Project Management*, 23(6), pp.524-537, 2005.
- [65] A. Zika-Viktorsson, P. Sundström, and M. Engwall, "Project overload: An exploratory study of work and management in multi-project settings," *International Journal of Project Management*, 24(6), pp.385-394, 2006.
- [66] M.A. Bihina Bella, J.H.P. Eloff and M.S. Olivier, "Improving system availability with near-miss analysis," *Network Security*, 10(October), pp.18-20, 2012.
- [67] E. Vaassen, L. Bollen, R. Meuwissen, and M. Vluggen, *Introduction into information & control published in Dutch Basisboek informatie & control*. Groningen, Wolters-Noordhoff, 2006.
- [68] G.W. Bock, A. Kankanhalli, and S. Sharma, "Are norms enough? The role of collaborative norms in promoting organizational knowledge seeking," *European Journal of Information Systems*, 15(4), pp.357-367, 2006.
- [69] H.H. Teo, K. K. Wei and L. Benbasat, "Predicting intention to adopt interorganizational linkages: an institutional perspective," *MIS Quarterly*, 27(1), pp.19-49, 2003.
- [70] T. Coltman, T.M. Devinney, D.F. Midgley, and S. Venaik, "Formative versus reflective measurement models: Two applications of formative measurement," *Journal of Business Research*, 61(12), pp.1250-1262, 2008.
- [71] A. Diamantopoulos, "Formative indicators: introduction to the special issue," *Journal of business research*, 61(12), pp. 1201-1202, 2008.
- [72] J. Henseler, C. M. Ringle, and R.R. Sinkovics, "The use of partial least squares path modelling in international marketing," *Advances in International Marketing*, 20, pp. 277-319, 2009.
- [73] C.R. Fornell, and D. F. Larcker, "Evaluating structural equation models with unobservable variables and measurement error," *Journal of Marketing Research*, 18(February), pp. 39-50, 1981.
- [74] J.C. Nunnally, and I. H. Bernstein, *Psychometric theory*. New York: McGraw-Hill, 1994.

- [75] C.M. Ringle, S. Wende and, S. Will, SmartPLS. Hamburg, 2005
- [76] K.W. Hansmann, and C. M. Ringle, SmartPLS manual. Hamburg: University of Hamburg, 2004.
- [77] J. Cohen, Statistical power analysis for the behavioral sciences. Hillsdale: Lawrence Erlbaum Associates, 1988.
- [78] I. Ajzen, and M. Fishbein, Understanding attitudes and predicting social behavior. Engelwood Cliffs: Prentice-Hall, 1980.
- [79] C. Standing, M. Holzweber, and J. Mattson, "Exploring emotional expressions in e-word-of-mouth from online communities," *Information Processing & Management*, 52(5), pp.721-732, 2016.
- [80] F. Riquelme, and P. González-Cantergiani, "Measuring user influence on twitter: a survey," *Information Processing & Management*, 52(5), pp.949-975, 2016.
- [81] P. Alpar, T.H. Engler, and M. Schulz, "Influence of social software features on the reuse of business intelligence reports," *Information Processing & Management*, 51(3), 2015, pp.235-251.
- [82] J.A. Pratt, L. Cheng, and C. Cole, "The influence of goal clarity, curiosity, and enjoyment on intention to code," *Behavior & Information Technology*, 35(12), pp.1091-1101, 2016.
- [83] T. Wang, C.H. Jung, M.H. Kang, and Y.S. Chung, "Exploring determinants of adoption intentions towards Enterprise 2.0 applications: an empirical study," *Behavior & Information Technology*, 33(10), pp.1048-1064, 2014.
- [84] A.G. Greenwald, C.G. Carnot, R. Beach, and B.Young, "Increasing voting behavior by asking people if they expect to vote" *Journal of Applied Psychology*, 72(2), pp. 315-318, 1987.
- [85] S.J. Sherman, "On the self-erasing nature of errors of prediction," *Journal of Personality and Social Psychology*, 39(2), pp.211-221, 1980.