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아주대학교 경영대학 세미나

Rethinking the Strategic Cannibalization in ICT Industry: Technology Adoption and Diffusion

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Value
Chain
Activity

IS Use and SME's Characteristic
Under Review (2nd Round, JBR)



Rethinking the Strategic Cannibalization in ICT Industry

Research Background : Cannibalization & Double S-Curve

Product Strategy 1998 - 2011

Consumer Pro

Desktop

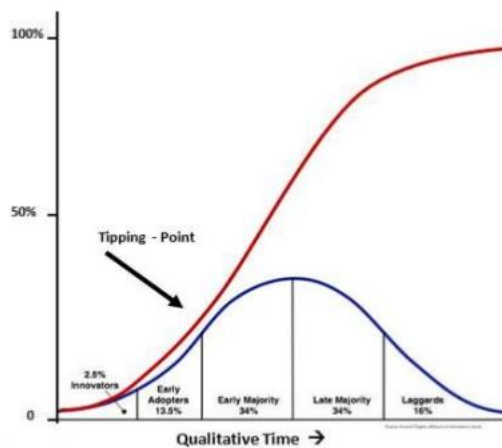


Portable

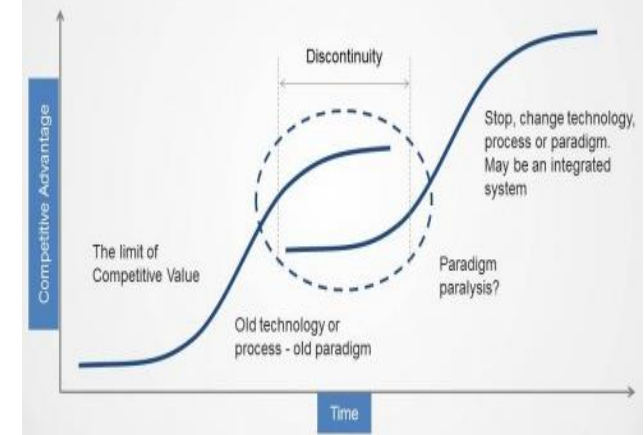


Steve Jobs (1998)

Adoption and the S-Curve



Double S Curve



- **Product cannibalization** is a well known phenomenon in marketing and new product development and describes the case when one product steals sales from a product pertaining to the same brand.
- Apple's Product Strategy: [Line-up & Cannibalization](#)
- [Cannibalization Phobia](#)
- Innovation Diffusion Model: [Bell-shaped curve / S-Curve](#)
- Double S-Curve [[Rethinking the Strategic Cannibalization : When? How? Chasm ? & etc](#)]

Research Background : ICT Ecosystem



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Mobile services with handset bundling and governmental policies for competitive market

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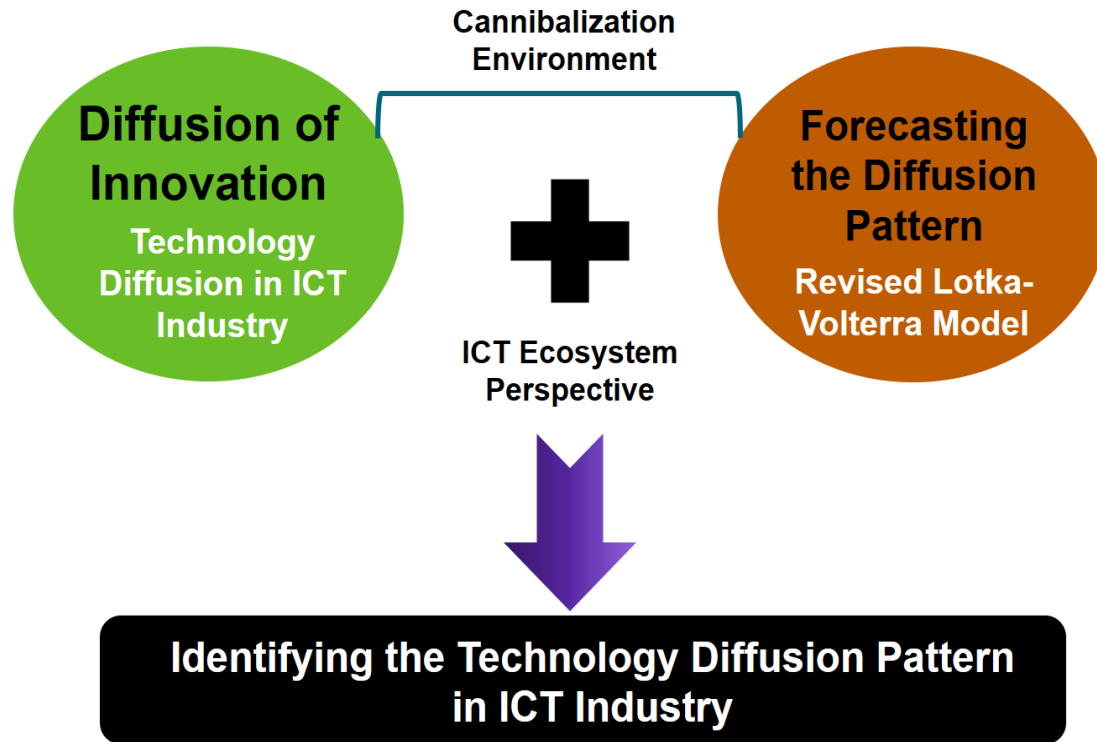
ABSTRACT

Governmental policies can significantly affect the social adoption of services offered by communication technology providers and competition between service providers. Following the implementation of several policies by the Korean government and mobile network operators' promotion of mobile handset bundling, consumer adoption rates of the latest mobile phone and communications services have been higher in Korea than in other countries. Mobile handset bundling provides consumers the bundled sale of mobile phones and services, but this practice can restrict consumers' choice of services and limit competition among service providers. This study analyzes this ambivalent effect of bundling by mobile network operators (MNOs) and evaluates the outcomes of the Korean government policies (2011–14) using market statistics. Our results highlight that the policies have produced changes in market share but the government needs to promote service differentiation among providers.

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- **ICT Ecosystem:** Contents, Platform, Network & Device
- Cannibalization in the ICT Market : Three Type
- **Handset Bundling in Korea / Strong Tie** between Network and Device
- The diffusion of technology occurs in various patterns **depending on the relationship between the four elements of the ICT ecosystem.**
- Focusing on “Device”

Research Purpose



- This study presents a **revised Lotka-Volterra model with asymmetric competition**, which is useful to describe cases of product cannibalization.
- This study applies the model to *the case of Apple Inc, where iPhone sales concurred to determine the crisis of the iPad (comparative analysis with Samsung)*

Related Research : Technology Diffusion Model

- Diffusion models for competition have often focused on modelling the interaction between two products by splitting the *word-of-mouth in two parts*: the *within product word-of-mouth*, which is due to product's specific sales, and the *cross product word-of-mouth*, which is due to competition and may imply either a negative or a positive effect
- Bass Model, Logistic Model, Gompertz Growth Model & etc.
 - Coefficient of Innovation (p), Coefficient of Imitation (q) & Market Size (m)
- Steam of Study on Technology Diffusion Model in the ICT Ecosystem (3 C)

[Bass Diffusion Model]

- Bass model consists of a simple differential equation that describes the process of **how new products get adopted in a population.**

- **Three parameters**

- 1) p = the coefficient of innovation
- 2) q = the coefficient of imitation
- 3) m = market size

$$\frac{f(t)}{1 - F(t)} = p + qF(t)$$

Where:

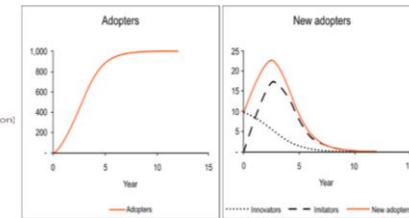
- $f(t)$ is the change of the installed base fraction
- $F(t)$ is the installed base fraction
- p is the coefficient of innovation
- q is the coefficient of imitation

Sales: $S(t)$ is the rate of change of installed base (i.e. adoption)

$$S(t) = m \frac{(p+q)^2}{p} \frac{e^{-(p+q)t}}{(1 + \frac{p+q}{p} e^{-(p+q)t})^2}$$

The time of peak sales: t^*

$$t^* = \frac{\ln q - \ln p}{p + q}$$



Context

- New variables and method reflecting market context
- e.g. the role of advertisement, network effect, epidemic effect

Case

- Applied to business model cases of various industries and firms
- e.g. Game industry, Generation switch in Display Industry

Condition

- Market conditions such as market competition structure and government regulation
- e.g. Market entrance (synchronic, diachronic), Monopoly, Duopoly

Model: LVch model

- Typical case of cannibalization in which competition has **an asymmetric nature**, so that the cannibalizing product is able to steal market to the other, while obviously the cannibalized cannot do the reverse.
- Analyzing the case of intra-brand competition between Apple iPhone and iPad, which gave rise to a case of product cannibalization, which is well described by *the Lotka-Volterra model with asymmetric competition, a special case of the LVch model*.
- **The Lotka-Volterra with churn model**, LVch, by Guidolin and Guseo (2015) is described by a system of differential equations, namely,

$$\begin{aligned}
 z_1'(t) &= \left[p_{1a} + q_{1a} \frac{z_1(t)}{m_a} \right] [m_a - z_1(t)], \quad t \leq c_2 \\
 z_1'(t) &= \left[p_1 + \frac{a_1 z_1(t) + \alpha_2 b_1 z_2(t)}{m_1 + \alpha_2 m_2} \right] [(m_1 - z_1(t)) + \alpha_2 (m_2 - z_2(t))] \\
 z_2'(t) &= \left[p_2 + \frac{a_2 z_2(t) + \alpha_1 b_2 z_1(t)}{m_2 + \alpha_1 m_1} \right] [(m_2 - z_2(t)) + \alpha_1 (m_1 - z_1(t))].
 \end{aligned}$$

- **First equation** describes the stand-alone phase: when the first product acts as a **monopolist in the market** [may see that the product is assumed to behave according to a standard Bass model]
- **The second and third equations** are defined for $t > c_2$, when **the second product has entered the market**, and describe **competition dynamics**.



Model: LVch model

$$\begin{aligned}
 \text{1st stage: iPhone} \quad z_1'(t) &= \left[p_{1a} + q_{1a} \frac{z_1(t)}{m_a} \right] [m_a - z_1(t)], \quad t \leq c_2 \\
 \text{2nd stage: iPhone} \quad z_1'(t) &= \left[p_1 + \frac{a_1 z_1(t) + \alpha_2 b_1 z_2(t)}{m_1 + \alpha_2 m_2} \right] [(m_1 - z_1(t)) + \alpha_2 (m_2 - z_2(t))] \\
 \text{2nd stage: iPad} \quad z_2'(t) &= \left[p_2 + \frac{a_2 z_2(t) + \alpha_1 b_2 z_1(t)}{m_2 + \alpha_1 m_1} \right] [(m_2 - z_2(t)) + \alpha_1 (m_1 - z_1(t))].
 \end{aligned}$$

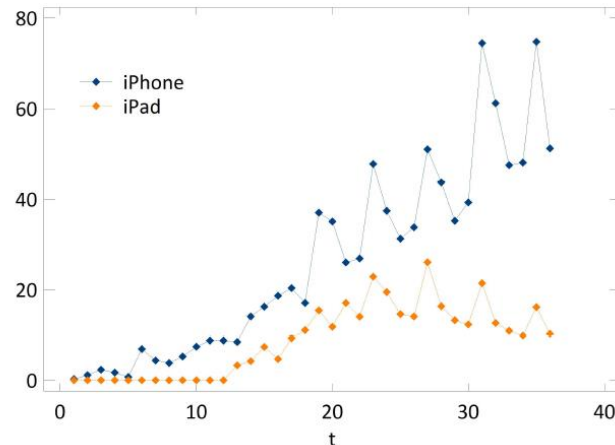
Variable parameters a_1 & a_2 that control a sort of "churn" effect between the two competitors
 $[0 < a_1 < 1, 0 < a_2 < 1, a_1 = 1$ (or 0) & $a_2 = 1$ (or 0)], *Totally 5 types*

Each product's rate sales, $z_i'(t)$, $i = 1, 2$, for $t > c_2$, are proportional to the corresponding residual $[(m_i - z_i(t)) + \alpha_j (m_j - z_j(t))]$, $i = 1, 2, j = 1, 2, i \neq j$, where m_i is the product's specific market potential under competition and $z_i(t)$, $i = 1, 2$, represent the cumulative sales at time t .

P_i , $i=1,2$, is innovative behavior in adoption, while the WOM components have a more complex structure made of a within-product element $[a_1 z_1(t)/(m_1 + \alpha_2 m_2)]$ and of a cross-product one, $[\alpha_2 b_1 z_2(t)/(m_1 + \alpha_2 m_2)]$, for the first competitor and, similarly, $[a_2 z_2(t)/(m_2 + \alpha_1 m_1)]$ and $[\alpha_1 b_2 z_1(t)/(m_2 + \alpha_1 m_1)]$ for the second. Notice that α_1 and α_2 operate on both the WOM and the residual market potentials.

Method

- The statistical implementation of the models presented in previous section is based on **nonlinear least squares (NLS)**, under a **convenient stacking of the two sub-models**; the stacking procedure is necessary in order to obtain a unidimensional nonlinear model estimated with standard NLS methodology, under *Levenberg-Marquardt algorithm*



Quarterly unit sold of iPhone and iPad (data source: Apple Inc).

- the iPhone entered the market in **Q3/2007 (t1)** and is still experiencing an increasing trend
- the iPad entered the market in **Q3/2010 (t13)** and is characterized by an evident declining trend, having already undertaken the life cycle peak
- both products are characterized by an evident seasonal component;
- Apple reports sales data of all its products without making a distinction between product generations.

Empirical Evidence

- Parameter estimates of a standard Bass model for **Apple iPhone before t=13**; Marginal linearized asymptotic 95% confidence limits into brackets. Estimates performed on instantaneous data.
- Parameter estimates of **LVch model**. Marginal linearized asymptotic 95% confidence limits into brackets. Estimates performed on instantaneous data.

m_a	p_a	q_a	R^2
145.809	0.005	0.265	0.8083
(-163.199)	(-0.001)	(-0.001)	
(454.817)	(0.011)	(0.531)	

DW: Durbin-Watson statistic

p_1	a_1	b_1	α_2	m_1	R^2
-0.010	0.526	-0.840	0.998	1347.57	0.8766
(-0.057)	(0.002)	(-8.050)	(-7.668)	(661.55)	
(0.015)	(1.049)	(6.370)	(9.665)	(2033.60)	
p_2	a_2	b_2	α_1	m_2	DW
0.011	0.167	1.058	0.001	378.76	2.073
(-0.096)	(-1.081)	(-395.802)	(-0.989)	(-21.38)	
(0.118)	(1.417)	(397.918)	(0.993)	(778.91)	

In particular, we may see that $a_2 = 0.998$ and $a_1 = 0.001$, which suggests a polarization of the two parameters

Following this observation we estimated this reduced version of the model by setting $a_2 = 1$ and $a_1 = 0$.

Also, we interpreted the negative estimate of parameter , $p_1 = -0.010$ (which is incoherent with the theory of diffusion models), as a signal of the absence of an innovative component for the iPhone within the competition phase

We therefore estimated a reduced version of LVch model, a LV model with asymmetric competition ($a_2 = 1, a_1 = 0, p_1 = 0$)

Empirical Evidence

- Parameter estimates of LV model with asymmetric competition and $P_{1c} = 0$. Marginal linearized asymptotic 95% confidence limits into brackets. Estimates performed on instantaneous data.

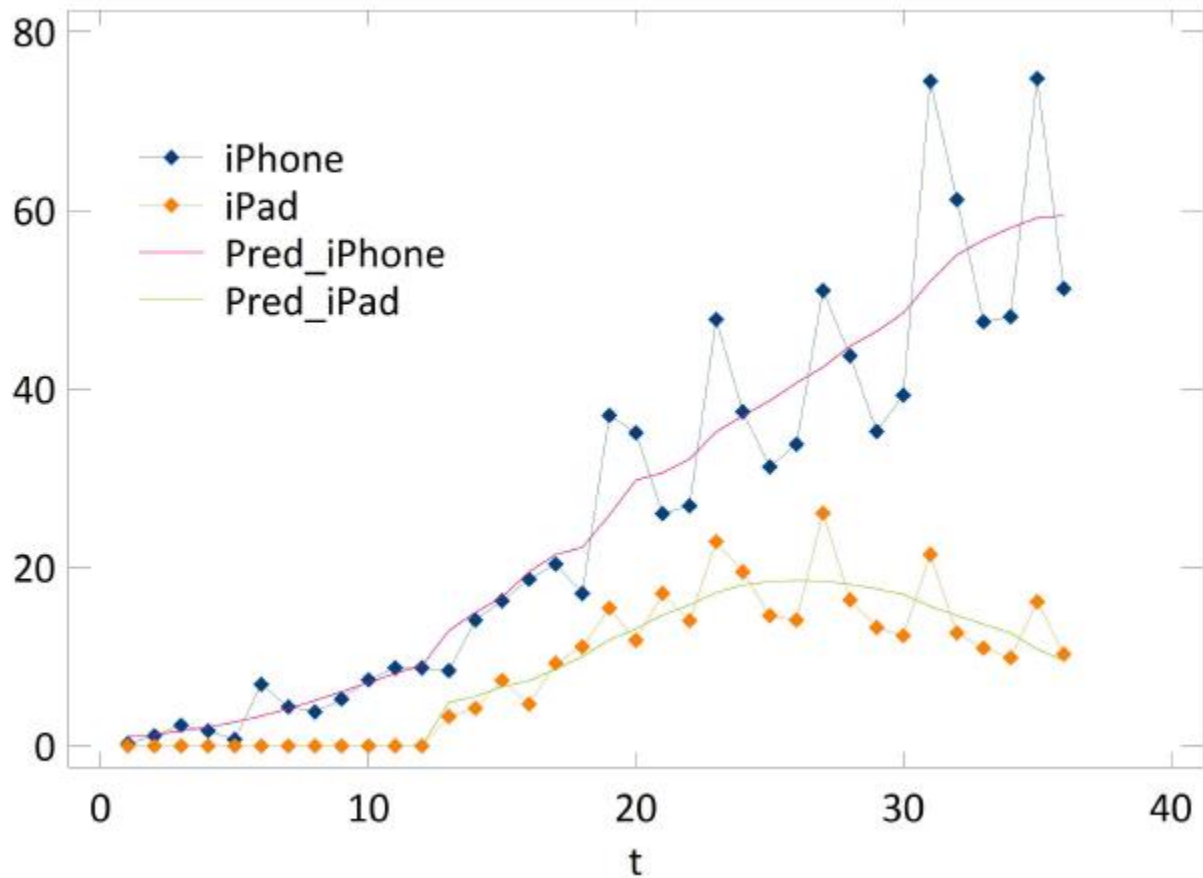
a_1	b_1	m_1	R^2
0.238 (0.146) (0.328)	-0.260 (-0.493) (-0.028)	1798.18 (1415.45) (2180.90)	0.8733
p_2	a_2	m_2	DW
0.011 (-0.004) (0.027)	0.172 (0.077) (0.266)	379.71 (299.54) (459.89)	2.077

The results show that the residual market for the iPhone is given by $(m_1 - z_1(t)) + (m_2 - z_2(t))$, that is the residual market of the iPad results to be completely available to the iPhone. Conversely, by setting $\alpha_1 = 0$, the residual market for the iPad is just given by $m_2 - z_2(t)$, and the cross-product WOM vanishes, $[\alpha_1 b_2 z_1(t) / (m_2 + \alpha_1 m_1)]$

- iPad is described by an independent standard Bass model and is therefore **not influenced by the iPhone**, while the **iPhone has been affected by the iPad both in negative and positive terms**.
- In fact, the iPad implied an extension of the iPhone's residual market but also a negative cross product WOM [since parameter b_1 is negative,

Empirical Evidence

Lotka-Volterra model with asymmetric competition for iPhone and iPad



Implications

- LV with asymmetric competition
- **the competing role of the iPad had both a negative and positive role:** on the one hand the iPad has exerted competition on the iPhone through a negative WOM, but its presence has also been beneficial since its residual market potential is completely available to the iPhone.
- Moreover, through *a non dimensional representation of the proposed LV model* we are able to show that competition has implied a delay in the peak time of the iPhone:
 - ✓ so the entrance of the iPad has been strongly beneficial for the iPhone, **in terms of market potential definition and length of life cycle.**

Taking the first derivative of x'_1 with respect to x_1 and setting it equal to zero we obtain the maximum density condition, \hat{x}_1

$$\hat{x}_1 = \frac{1}{2} + \frac{s}{2}(1 - F_2) - \frac{s}{2v}F_2 = \frac{1}{2} + \frac{s}{2} \left(1 - F_2 - \frac{F_2}{v} \right).$$

Since $v = a_1/b_1$ is typically negative because b_1 , expressing the cross WOM effect, is negative, $(1 - F_2 - F_2/v)$ will be positive.

Reminding that $s = m_2/m_1$ we may rewrite $\hat{z}_1 = m_1\hat{x}_1$ in a more interesting form

$$\hat{z}_1 = m_1x_1 = \frac{m_1}{2} + \frac{m_2}{2} \left(1 - F_2 - \frac{F_2}{v} \right).$$

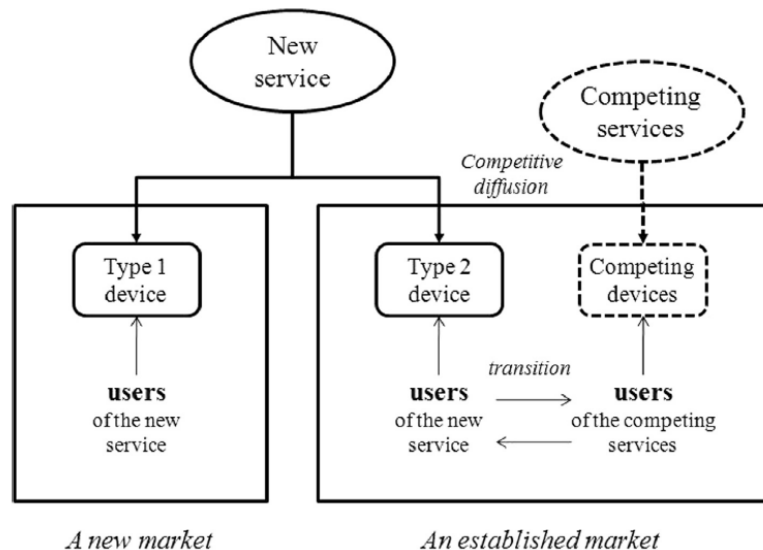
- Equation highlights that as long as the market potential of the second entrant m_2 increases, the maximum peak for z_1 is delayed and **reached beyond $m_1/2$.**

$$\hat{x}_1 = \frac{1}{2} + 0.08327477(1 + 0.04669954 F_2(\tau)).$$

$$0.58327377 \leq \hat{x}_1 \leq 0.58716$$

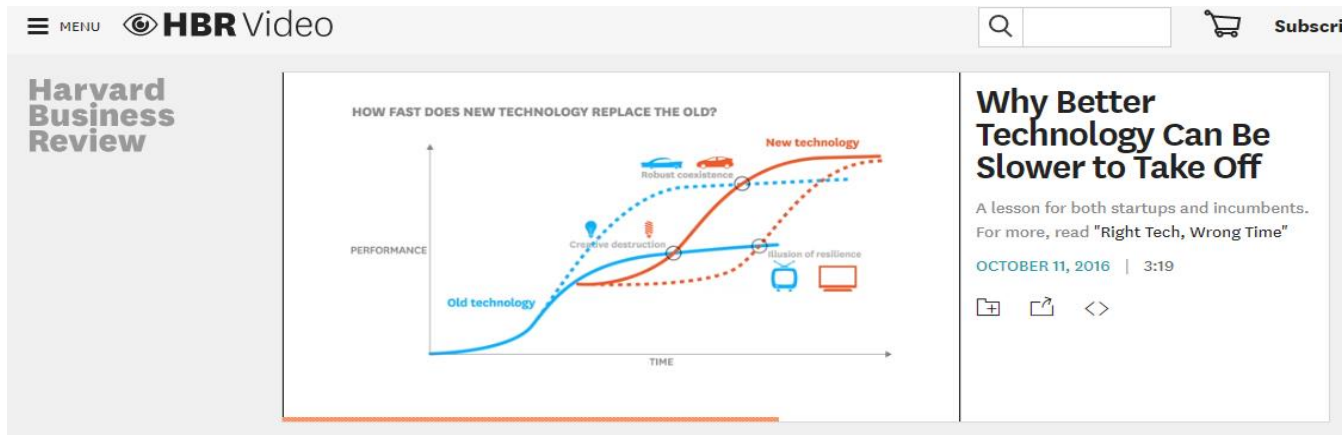
Future Research

- Strategic Cannibalization in ICT Industry
- Limitation: Reflecting the Seasonality / SARMAX Model
Quarterly Data, Data by the Generation (iPhone 6 vs 7)
- Comparison with SAMSUNG
- The Structure of **ICT Ecosystem: C-P-N-D** /the effect of cannibalization
- Legacy System vs Cloud Computing [Private, Public & Hybrid] / **Right Mix**



Implications

- A delay in the peak time of the iPhone:



Harvard Business Review

HOW FAST DOES NEW TECHNOLOGY REPLACE THE OLD?

PERFORMANCE vs. TIME graph showing Old technology (blue) and New technology (orange) curves. Key stages: Creative destruction, Robust coexistence, Illusion of resilience.

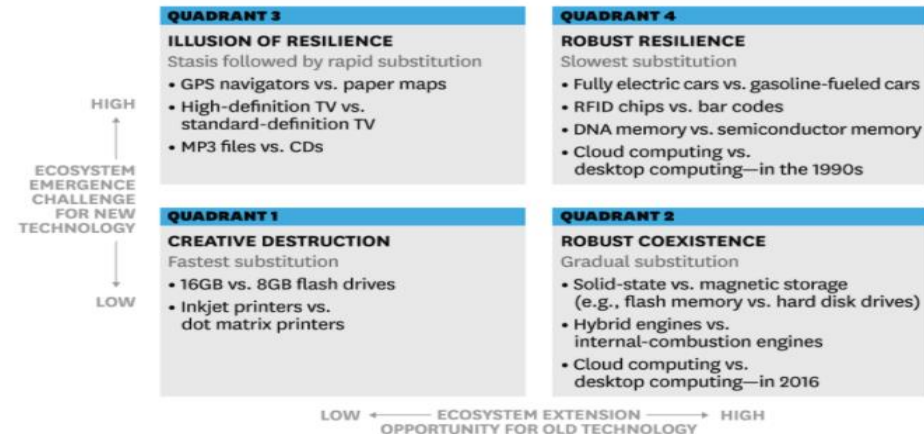
Why Better Technology Can Be Slower to Take Off

A lesson for both startups and incumbents. For more, read "Right Tech, Wrong Time"

OCTOBER 11, 2016 | 3:19

<https://hbr.org/video/5155033576001/why-better-technology-can-be-slower-to-take-off>

A Framework for Analyzing the Pace of Technology Substitution
 The pace of substitution is determined by how quickly the new technology's ecosystem challenges are resolved and whether the old technology can exploit ecosystem opportunities for extension.



Smart factory adoption in small and medium-sized enterprises: Empirical evidence of manufacturing industry in Korea

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Smart factory adoption in small and medium-sized enterprises: Empirical evidence of manufacturing industry in Korea



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Logistic regression
Determinants of technology innovation

ABSTRACT

This paper examines the factors and effects of smart factory adoption of Small and Medium-sized Enterprises (SMEs). With the emergence of the 4th industrial revolution, the use of information technologies has been gradually emphasized in order to improve the company's competence in manufacturing. Moreover, observations from various cases of government support and academic research have reportedly been stressing the impact of the information technologies on the economy. But there is little research about the adoption intentions and implementation for the SMEs. An analysis of the 2012 SMEs in Korea shows that the experienced benefits of prior information and the unique characteristics of SMEs do not have a significant influence on the adoption intention of smart factory. On the contrary, the existing information investments and efforts appear to create a large amount of resistance. This study aims to help executives and policymakers make the right decisions by understanding the meaning of smart factories as well as the conditions and impact of innovations that affect SMEs.



Research Purpose

Does IS use level put different emphasis on **value activities** (primary activities, support activities)?

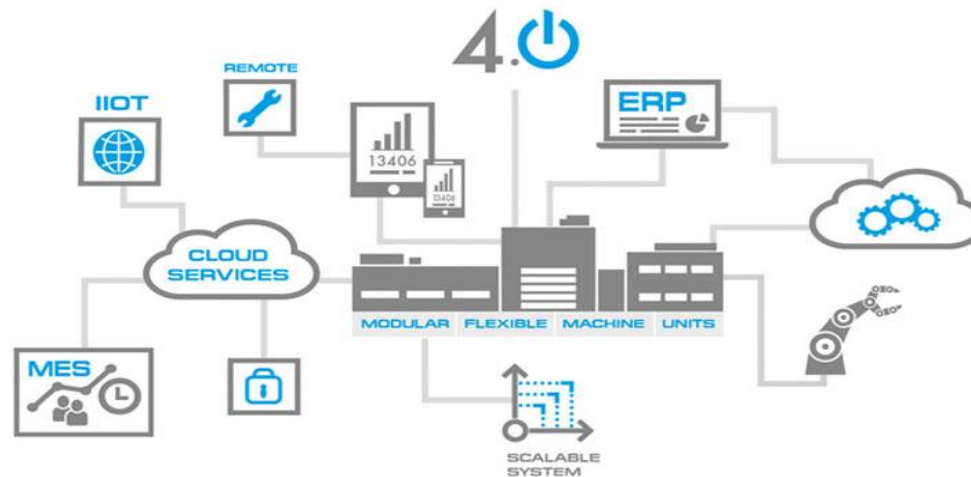
- Rethinking the Porter's Value Chain in the Perspective of IS

What are the **determinants of a paradigm shift in information systems** in the 4th industrial revolution?

- Smart Factory Adoption or Implementation

Overview of Research

- The structural change in the manufacturing industry is being promoted as a Smart Factory.
- This study look at how IS utilization level, corporate capability and environment interact with the introduction of **Smart Factory**.
- The relevant data were collected from the sample (**2,012 SMEs**), and the research hypotheses were verified through **logistic regression analysis**.

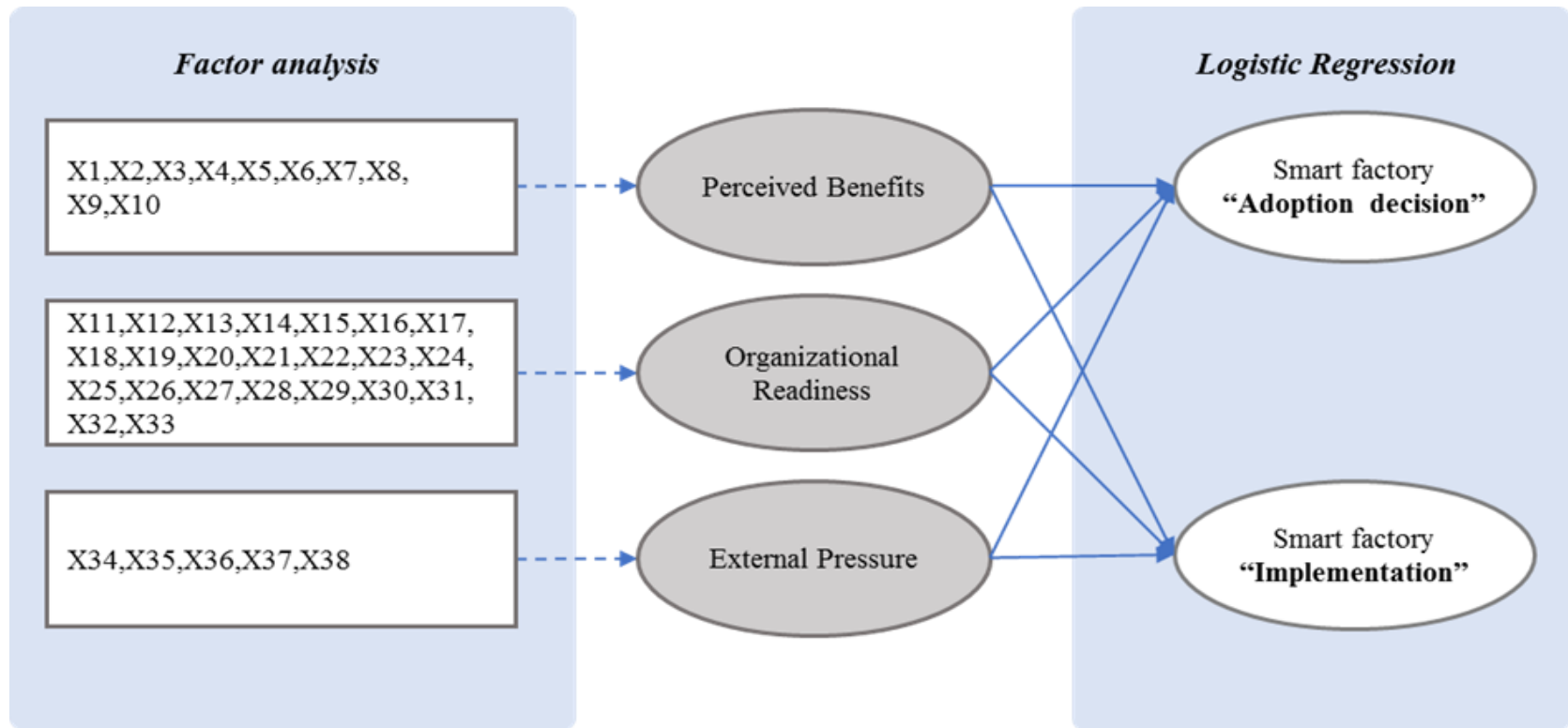




Research Purpose

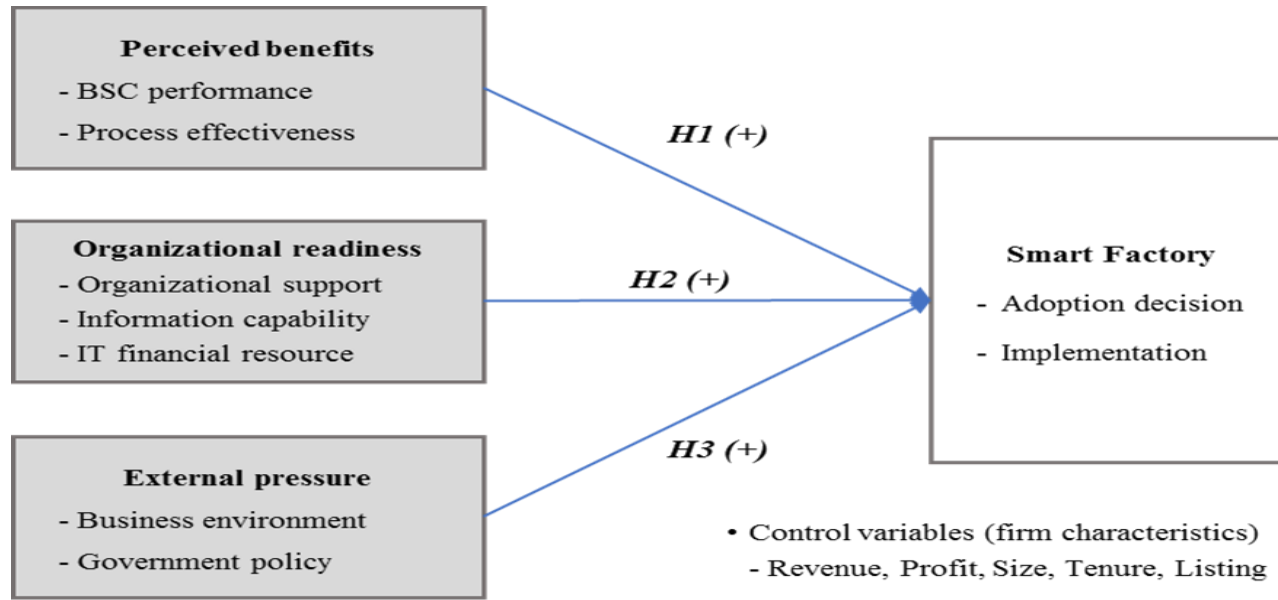
- This study aims for three goals.
 - First, it is to **identify the determinants of introducing the smart factory** to a small and medium sized manufacturer.
 - Second, in the context of the manufacturing industry, it is to **investigate the empirical data of Korea's small and medium sized enterprises on the impact of these determinants** in the introduction and application of the smart factory.
 - Comparison between **Implementation and Adoption**

Research Framework



- the sample: 2,012 SMEs
- Factor Analysis + Logistic Regress

Research Model / Hypotheses



H1: Perceived benefits that gain a successful experience through **the BSC performance and process innovation** positively influences the adoption and use of smart factory by the SMEs.

H2: Organizational readiness such as **organizational support, information capabilities, IT financial resources** positively influences the adoption and use of smart factory by the SMEs.

H3: External pressure such as **business environment and government policy** positively influences the adoption and use of smart factory by the SMEs.



Data

공공데이터포털

data.go.kr

DATA 공공데이터포털 .GO.KR

데이터찾기 국가데이터맵 데이터요청 데이터활용 정보공유 이용안내

목록등록관리시스템 로그인 회원가입 사이트맵

어떤 공공데이터를 찾으시나요?

인기검색어

- 1. 코로나
- 2. 건강검진
- 3. 날씨
- 4. 한국가스공사_월별...
- 5. 지하철

인기검색어 닫기

검색조건

- 분류체계
- 서비스유형
- 확장자

테마별 카테고리별 **국가중점데이터별** 제공기관유형별

- 건축정보
- 교통사고 정보
- 국민건강 정보
- 지방행정 정보
- 통합재정 정보
- 부동산종합 정보
- 수산정보
- 상권정보
- 법령정보
- 더보기

Data

- Open Data (data.go.kr)
- Annually surveyed by Ministry of SMEs and Start-ups
- 4,303 Companies (Year 2016 ~ 2018)

2017년도 중소기업 정보화 수준조사

본 조사는 통계청 제33조(비밀의 보호)에 따라 통계 목적으로 이용되며, 귀사의 비밀이 절대 보장함을 약속드립니다.

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중소기업청과 중소기업정보진흥위원회에서는 매년 정보화시대 기업정책 제고를 위하여 국내 중소기업의 정보화 실태, 추진현황, 지원수요 등 정보화지원에 관한 기초자료 수집을 목적으로 중소기업 정보화 수준평가를 실시하고 있습니다.

조사결과를 향후 중소기업의 정보화 정책 수립을 위한 기초자료로 활용될 예정으로 귀사에 응답해주신 내용은 관련 정책의 연구 및 개발에 중요한 밑거름이 될 것입니다.

조사기간 : 2015년
중소기업정보진흥위원회

조사기관 : 포커스컴퍼니
(문의: 정책연구팀 ☎ 02-556-6440 (팩스: 02-556-6468) 이메일 : hjyang@focuscompany.co.kr)

본 조사는 기업에 대한 조사입니다. 귀 사 자체가 속한 기업 전체를 기준으로 응답해주시기 바랍니다.
(해외에 본사를 둔 기업은 국내소재 사업장 전체를 기준으로 응답해주시시오.)

① 기업명: (사업자등록번호) - - - - -

② 소재지: (시도) (시군구) (연락처번호)

③ 조직형태: 1. 개인사업체 2. 법인(법인종류) - - - - -

④ 출자자수 (연차연도 기재) 현재사업장 명 (기업형태) 명 (기업형태) 생산관련 종 명
생산업장 명 (기업형태) 명 (기업형태) 생산관련 명 명

⑤ 기업형태 (제151년 현재) 1. 대기업 2. 중소기업 ● 창업년도: 년 ● 설립일: 1. 전 사업장 일주 2. 일부 사업장 일주 3. 일부 사업장 일주

◆ 출자자 수의 사항 ◆

1. 질문지는 첫 페이지부터 순서대로 정해진 순서로 응답해 주십시오. 질문 말에 특별한 언급이 없는 한 모든 질문에 답해 주십시오.(표를 포함해 모두 14페이지로 구성되어 있습니다.)

2. 응답할 귀사의 정보화 담당자(담당직 이상)에게 해주시길 바랍니다. 정보화담당자가 없으실 경우 정보화담당 관련 담당자나 대표이사께서 직접 기입해 주시길 바랍니다.

3. 질문지를 응답하실 때 특별한 지시문이 없으면 불가피할 경우 개인 글자 주기가 바랍니다.

4. 특별한 언급이 없는 한 모두 설명의 응답 기준시점인 2015년 6월 1일 기준입니다.
첨단, 주요 표현의 질문에서도 모두 2015년 6월 1일 기준으로 응답해주시기 바랍니다.

중소기업청 · 중소기업기술정보진흥원

A. 기업의 일반현황

다음 항목은 기업의 일반적 현상에 대한 질문입니다.

A1. 현재 기준, 귀 기업이 해당되는 사항에 모두 V표 해주시시오.

구분	내	음
외 국	□(10) 외국기업	□(90) 해당 없음
상. 장	□(21) 출장거래소 상장 □(22) 코스닥 상장	□(90) 해당 없음
벤처	□(30) 벤처기업(중소기업청)	□(90) 해당 없음
인. 출	□(40) 정보화정책지원(MS)인출(중소기업기술정보진흥원)	□(90) 해당 없음
	□(50) MS-3호(인출)인출(중소기업기술정보진흥원)	□(90) 해당 없음

A2. 귀 기업에는 연구개발(R&D) 조직이 있습니까? 해당되는 사항에 모두 V표 해주시시오.

□(1) 제철사 및 관제회사 형태로 존재
□(2) 사내 부설연구소로 존재
□(3) 사내 부서 형태(팀 단위 이상)로 존재
□(4) 기타 ()
□(5) 없음

A3. 귀 기업은 최근 10년 이내에 아래의 정보화지원을 받은 적이 있습니까? 해당되는 사항에 모두 V표 해주시시오.

□(1) 2010년 이후 중소기업기술정보진흥원 정보화 지원사업
□(2) 2009년 이전 중소기업기술정보진흥원 정보화 지원사업
□(3) 기타 정보화 지원사업 ()
□(4) 없음

A4. 귀사의 재무현황에 응답해 주시기 바랍니다. 자료를 공시하는 외감/상감기업은 응답하지 않으셔도 되고, 기업 대신 재무제표를 제출해 주셔도 됩니다. (백만원 미만 금액은 1백만원으로 영이음이 적지던 0으로 기재)

구분	조	천원	백만	십만	여	천만	백만
자본금	전년도						원
	전년도						원
매출액	전년도						원
	전년도						원
영업이익	전년도						원
	전년도						원

A5. 귀사의 주 매출이 발생하는 판매처(서비스) 납품처는 주로 어디입니까? 가장 주된 형태부터 순서대로 3개까지 선택해 주십시오.

1순위 □ 2순위 □ 3순위 □

(1) 요거전 (2) 1-3개 이하의 고정된 기업/기관 (3) 4개 이상의 대기업 또는 공공기관
(4) 4개 이상의 중소기업 (5) 해외 기업/기관 (6) 개인(소분자) (7) 기타

A6. 귀사의 주요 생산품(서비스) 종하는 어떠한 것입니까? 가장 주된 하나에 V표 해주시거나, 구체적으로 기업에 주십시오.

□(1) 서비스 (내용:) /제출
□(2) 원료/중간재 (재료명:) /면적/ 입출
□(3) 최종 완제품 (재료명:) /면적/ 입출
□(4) 기타 ()

A6-1. 귀사의 업종은 무엇입니까? 아래 표를 참고하여 가장 주된 업종에 해당하는 코드번호를 순서대로 3개까지 선택하여 주십시오.

1순위 □ 2순위 □ 3순위 □

<한국표준산업분류 중분류(2자리) 및 업종명>

제조업	10 석유를 제조업
	11 석유를 제조업
	13 섬유제품 제조업(인쇄 제외)
	14 의복, 인쇄업, 세차 및 용품 제조업
	15 가죽, 가방, 모피, 신발 제조업
	16 축산물, 축산물제품 제조업(가공 제외)
	17 쌀, 콩, 기타 곡물을 제조업
	18 인쇄 및 기록정보 처리업
	19 코르크, 연한 및 섬유제품 제조업
	20 제약화학 및 화학제품 제조업(의약품 제외)
	21 의약품, 화장품 및 의약품 제조업
	22 고무제품 및 플라스틱제품 제조업
	23 비금속 광물제품 제조업
	24 1차 금속 제조업
	25 금속가공제품 제조업(기계, 볼, 귀금, 배위)
	26 연마제, 원료의 정제, 용광 및 용사장의 제조업
	27 의료, 정밀, 광학기기 및 기기 제조업
	28 전기장치 제조업
	29 기타 기계, 및, 정비 제조업
	30 자동차 및 트럭/중형 제조업
	31 기타 중형장비 제조업
	32 기타 제조업
제조업	33 기타 제조업
제조업	37 철강, 철강 및 철강 관련업
제조업	38 제기를 수직운반, 처리 및 정렬제조업
제조업	39 정밀 장비 및 측정업
제조업	41 통합 건설업
제조업	42 전문직업, 건설업
제조업	43 자동차 및 부품 판매업
제조업	44 토목 및 건설업
제조업	45 자동차 및 부품 제조업
제조업	46 토목 및 건설업
제조업	47 토목 및 건설업
제조업	48 운송장비 및 항공기 제조업
제조업	50 운송 장송업
제조업	51 항공 운송업
제조업	52 항공 및 운송관련 서비스업
제조업	53 운송업
제조업	54 운송업
제조업	55 운송업
제조업	56 운송업
제조업	57 운송업
제조업	58 운송업
제조업	59 운송업
제조업	60 운송업
제조업	61 운송업
제조업	62 운송업
제조업	63 운송업
제조업	64 운송업
제조업	65 운송업
제조업	66 운송업
제조업	67 운송업
제조업	68 운송업
제조업	69 운송업
제조업	70 운송업
제조업	71 운송업
제조업	72 운송업
제조업	73 운송업

Data

B. 정보화 추진의지 및 계획

다음은 정보화 추진의지 및 계획에 대한 질문입니다.

정보화: 정보통신기술을 활용하여 조직의 경영 효율성을 달성하도록 전방 개선하는 활동

정보화투자: 정보시스템 구축비용, 인력, IT교육, 교육비용, IT 관련 인건비, PC용 하드웨어 및 소프트웨어 구입비용, 유지보수 비용 등 정보화 및 IT와 관련된 모든 지출

B1. 회고경영자, 임직원의 정보화 관심도는 어느 수준인지 해당문에 **√표** 해주십시오.

	구분	매우 높음	높음	보통	낮음	매우 낮음
CEO/임원	정보화예, 대한 관심(필요성)	(5)	(4)	(3)	(2)	(1)
	정보화 시스템구축 및 투자계획	(5)	(4)	(3)	(2)	(1)
직원	정보화예, 대한 관심(필요성)	(5)	(4)	(3)	(2)	(1)
	정보화 시스템 활용능력	(5)	(4)	(3)	(2)	(1)

B1-1. 귀사의 임원들은 자사에 적합한 정보화 솔루션이나 소프트웨어, 시스템 등에 대해 정확히 알고 있습니까?

- (1) 정확히 알고 있음
- (2) 관심 및 필요성은 있으나, 무엇이 필요한지는 정확히 모름
- (3) 알지 못하고 관심이 없음

B1-2. 귀사의 CEO나 정보화 투자 권한이 있는 임원들은 모바일, 클라우드, SNS 등 최근 새롭게 떠오르는 IT에 대해 얼마나 관심이 있습니까?

- (1) 관심이 크고 해당 분야 투자를 진행 중
- (2) 관심이 있으나, 투자를 실시하지는 않고 있음
- (3) 관심이 없고 필요성을 느끼지 못함

B2. 정보화 추진계획이 수립되어 있습니까?

- (1) 계획대로 실행 중
- (2) 계획 수립되었으며 실행예정
- (3) 계획 수립
- (4) 계획 수립 예정
- (5) 계획 없음

B3. 전년보다 1달 이후 정보화 투자비용 증가(감소)를 예상하십니까?

정보화 투자비용성 분석: 정성적평가(시급성, 만족도, 난이도, 개선 등), 단면적평가(생산 및 개발주기 단축, 재고율 감소 등), 분석적평가(ROI, TCO, IT BSC 등)

- (1) 사전타당성 및 사후성과분석 모두를 실시하였다.
- (2) 사전타당성 또는 사후성과분석 중, 한가지를 실시한 적이 있다.
- (3) 사전타당성 및 사후성과분석을 실시한 적이 없다.

C. 정보화 추진환경

C1. 귀사의 정보화 구축 수준은 다음 어디에 해당합니까?

정보시스템: 조직이 수행하는 업무 및 관련 정보를 생산/관리 체계로 소프트웨어, 하드웨어 및 통신망, 데이터베이스 관련 인력 등의 일체를 포함(ERP, CRM 등)과 같은 시스템을 통한 아니라, 전자세금계산서 발행을 위한 재무회계시스템 그룹웨어, 이메일 대신저 등 2인 이상의 네트워크를 기반으로 한 IT활동(시스템을 의미)

- (1) 하나 이상의 정보시스템이 회사 자체로 구축되어 있음(패키지 구매 구축 포함)
- (2) 자체구축 정보시스템은 없으나, ASP(SaaS) 등의 외부서비스를 사용하고 있음(예: 외부업체의 회사 전용 메일계정 및 홈페이지 서비스 이용 등)
- (3) 개별 PC 등을 통해 인터넷 기반의 상용화된 외부 프로그램(포털)의 이메일이나 대신저 등만을 이용함

C2. 귀사의 정보화 투자(지출) 비용은 얼마입니까?

(PC 구입, 유지 보수비용 및 IT 관련 인건비, IT 비용 등을 모두 포함)
* 1백만원 미만인 경우 1백만원으로 표기

구분	전년도(실적)(원)				당해연도(예산)(원)				
	초	하	상	하	초	하	상	하	
정보화 투자비	신규투자								
	(인력/비트 포함) 또는 매출액의 약()%								
유지보수									
	또는 매출액의 약()%								

C3. 귀사는 사내 일직원에 대해 정보화 교육(OA 포함, IT 활용, 교육)을 실시하고 있습니까?

- (1) 예
- (2) 아니요...[→ C4 참조]

C3-1. 정보화 교육 실시대상은 누구인지 해당사항에 모두 **√표** 해주십시오.

- (1) 일반직원
- (2) 정보화 담당직원
- (3) 임원
- (4) 회고경영자

C3-2. 지난 한 해 동안 정보화교육 수강인원 및 비용은 어느 정도입니까?

구분	전년도		당해연도(예산)	
	명	원	명	원
교육인원	전체	(또는 총사자수의 약 %)		(또는 총사자수의 약 %)
	여성인원	(또는 총사자수의 약 %)		(또는 총사자수의 약 %)
전체 총사자수 1인당 단당교육 횟수	회		회	
교육비용	만원		만원	
	(또는 매출액의 약 %)		(또는 매출액의 약 %)	

C4. 귀사에는 IT 투자계획을 수립하고 운영하는데 내외부 전문 인력 또는 전문 컨설팅회사 등을 통한 전문 자문 체계가 확보되어 있습니까?

- (1) 있음
- (2) 필요성을 느끼고 있으나 현재 없음
- (3) 없음

C5. 사내에 정보화 담당 인력이 있습니까? 현재 정보화 담당 인력 현황상주하는 아웃소싱 직원 포함을 기입해 주십시오.

담당인원(명)				추가필요 인력
구분	남성	여성	합계	
□ 전담인력(사내인력+아웃소싱직원 포함)	명	명	명	남성: _____명 여성: _____명
□ 겸임직원(가사직제)	명	명	명	
□ 외부관리(아웃소싱 단기 파견직)	명	명	명	
□ 담당인원 없음				

C6. 정보화 업무의 아웃소싱 비율은 어느 정도입니까? (ASP 서비스는 아웃소싱에 해당합니다)

구분	정보화업무				합계 아웃소싱 도입/ 확대계획
	인용(V)	자체수행	아웃소싱		
전체 정보화업무	□	%	%	100%	(1) 있다 (2) 없다

[아웃소싱을 전혀 하지 않고 계획도 없는 경우는 C7번으로 이동]

C6-1. 정보화 아웃소싱을 도입하신 또는 도입(확대)하려는 이유는 무엇인지 해당사항에 모두 **√표** 해주십시오.

- (1) 핵심 역량에 집중(Focus on Competency)
- (2) 비용 감소(Cost Reduction)
- (3) 품질 향상(Improved Quality)
- (4) 제품 출시 속도 개선(Increased Speed to Market)
- (5) 보다 빠른 혁신(Faster Innovation)
- (6) 기타()

C7. 정보화를 위한 업무혁신은 어느 정도로 이루어지고 있습니까?

- (1) 별도의 업무혁신체계 및 조직이 없음
- (2) 크게 강화되었지만 일부 업무만 일시적으로 혁신
- (3) 부서별로 정해진 업무혁신활동 전개
- (4) 전사 차원에서 혁신활동을 추진 중
- (5) 구체적인 업무혁신체계 및 조직을 바탕으로 혁신문화 정착에 주력

C8. 귀사는 정보보안 마스터플랜(계획)이 수립되어 실행되고 있습니까?

- (1) 계획대로 실행 중
- (2) 계획 수립되었으며 실행예정
- (3) 계획 수립 중
- (4) 계획 수립 예정
- (5) 계획 없음

C9. 다음은 정보보안에 관련된 보안정책 사례입니다. 2011년 이후 정해진 피해 사례에 대해 해당사항에 **√표** 한 후 피해 내용을 직접 기입해주시요.

해킹	(1) 없음	(2) 있음 ()
바이러스	(1) 없음	(2) 있음 ()
스팸메일	(1) 없음	(2)정유지료만 이음됨 (3)업무지장초래 (4)피해가 있음
내부정보유출	(1) 없음	(2) 있음 ()

Results

Logistic regression of factors related to the adoption decision of smart factory

Variables		β	S.E.	Est. Wald	df	Sig.	Exp(B)	
(Constant)		-5.885	0.880	44.747	1	0.000	0.003	
Perceived Benefits	Performance expectation	0.161	0.149	1.161	1	0.281	1.175	
Organizational readiness	Organizational support***	0.707	0.161	19.239	1	0.000	1.980	
	Information capability***	0.722	0.115	39.595	1	0.000	2.083	
	IT infra operation	-0.185	0.138	1.784	1	0.182	0.837	
	IT investment	New project	-0.001	0.001	2.270	1	0.132	0.998
Operation		0.001	0.001	0.978	1	0.323	1.002	
IT staff**		-0.401	0.154	6.776	1	0.009	0.639	
External pressure	Competition pressure	0.138	0.077	3.199	1	0.074	1.139	
	Market & policy pressure	R&D	0.065	0.046	2.069	1	0.150	1.085
		Export ratio	-0.007	0.101	0.005	1	0.942	1.003
		License**	0.572	0.203	7.936	1	0.005	1.791
Control variables	Revenue	0.000	0.000	0.015	1	0.903	1.000	
	Profit	0.000	0.000	0.471	1	0.492	1.000	
	Firm size*	0.006	0.002	5.972	1	0.015	0.349	
	Biz. Period	-0.009	0.010	0.842	1	0.359	0.991	
	Listing status	-1.018	0.538	3.577	1	0.059	1.005	

2LL=956.898, Cox and snell R²=0.098, Nagelkerke R²=0.224
Hosmer and Lemeshow chi-squared=4.055 (d.f.=8, p=0.852)

- **License** : Whether they have government license such as IMS, innoBiz and mainBiz and Venture (+)
- **IT Staff** : In the SME context, much more investment to HR, when compared to manufacturing system (-)

[Trade-off relationship]

Results

Logistic regression of factors related **to the implementation decision** of smart factory

Variables		β	S.E.	Est. Wald	df	Sig.	
(Constant)		-6.330	2.509	6.366	1	0.012	
Perceived Benefits	Performance expectation**	1.348	0.393	11.753	1	0.001	
Organizational readiness	Organizational support	0.796	0.451	3.119	1	0.077	
	Information capability	0.003	0.286	0.000	1	0.992	
	IT infra operation	-0.271	0.361	0.563	1	0.453	
	IT investment	New project	0.001	0.002	0.495	1	0.482
Operation*		0.007	0.003	5.261	1	0.022	
IT staff		-0.645	0.346	3.469	1	0.063	
External pressure	Competition pressure		-0.187	0.189	0.982	1	0.322
	Market & policy pressure	R&D	0.066	0.115	0.334	1	0.563
		Export ratio	0.165	0.246	0.449	1	0.503
		License	0.470	0.498	0.893	1	0.345
Control variables	Revenue**		0.000	0.000	7.802	1	0.005
	Profit**		0.000	0.000	7.130	1	0.008
	Firm size		0.001	0.005	0.037	1	0.847
	Biz. Period		-0.020	0.023	0.805	1	0.370
	Listing status		-0.843	1.503	0.314	1	0.575

2LL=153.541, Cox and snell R²=0.305, Nagelkerke R²=0.425
Hosmer and Lemeshow chi-squared=7.693 (d.f.=8, p=0.464)

- **Performance Expectation / Investment to operation (+)**
- **Revenue/ Profit (+) : The volume of sales and corporate profitability - > Smart Factory Implementation**

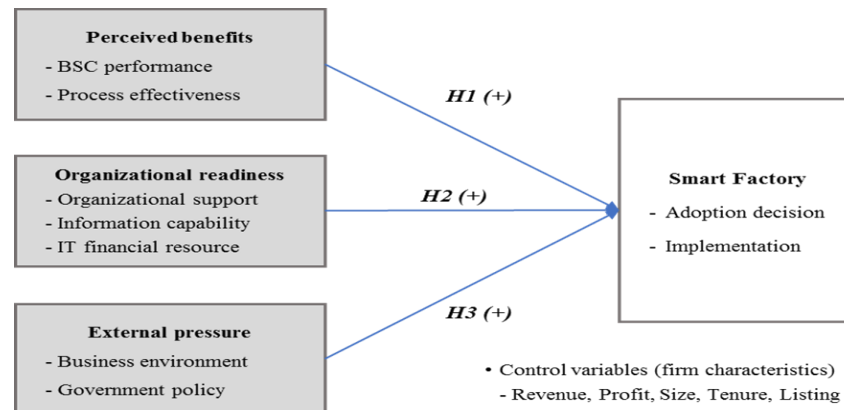
Results

Results of Hypotheses Test

Variables	Significant effect on Adoption	Significant effect on Implementation
Perceived Benefits		
- Performance expectation	No	Yes (+)
Organizational readiness		
- Organizational support	Yes (+)	No
- Information capability	Yes (+)	No
- IT investment (Operation)	No	Yes(+)
- IT investment (Staff)	Yes (-)	No
External pressure		
- Policy pressure (License)	Yes (+)	No
Control variables		
- Revenue	No	Yes (+)
- Profit	No	Yes (+)
- Firm size	Yes (+)	No

Discussion

- Clear understanding of determinants for smart factory adoption and its influence will aid managers and staff of small and medium sized.
- Comparison between **Adoption and Implementation**
- Moreover, this study is to assist the number of methods already in progress or in the planning stage by the policy-making authorities and the academia **to anticipate its effectiveness on accomplishing its goals.**



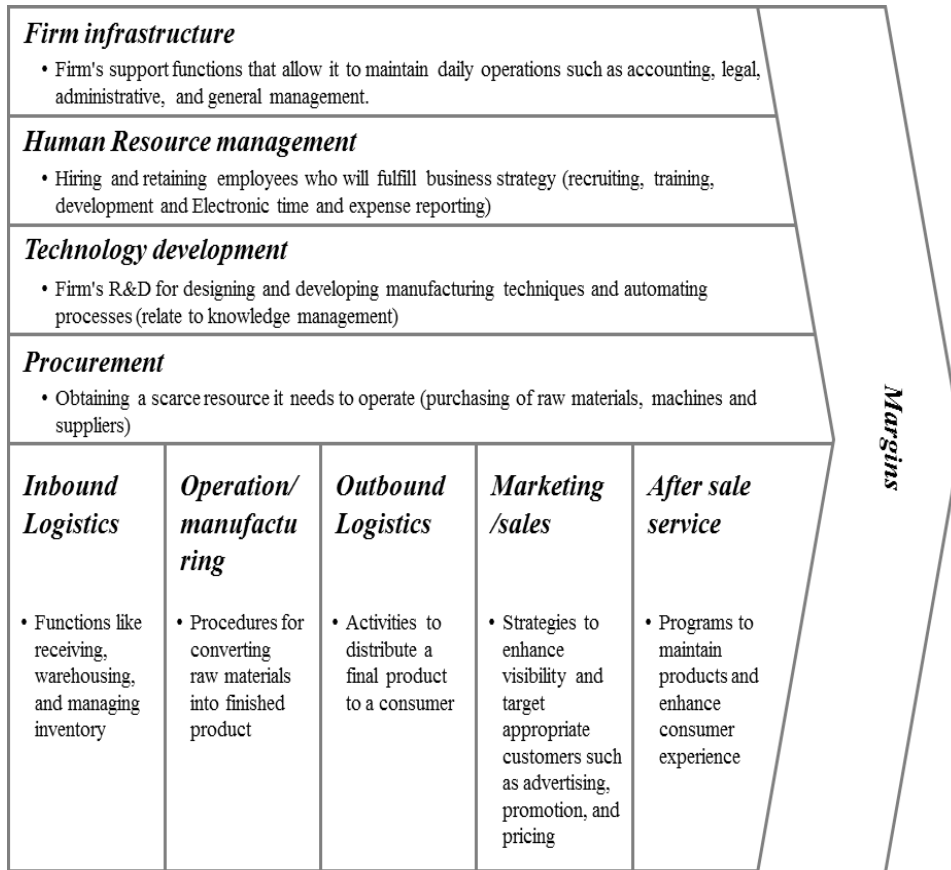


IS Use and SME's Characteristics in Value Chain Activities

Journal of Business Research (2020)

[Under Review, 2nd Round]

Value Chain Activities



- **Information systems** are affecting the entire process of products and services developed by companies
- Value activities can be divided into nine categories.
- The main activities are **the primary activities** for carrying out the business.
- **Supporting activities** are composed of a substructure that enables the input of factors and primary activities.



Information systems has been gradually embedded in most of **value chain activities** of enterprise



Research Agenda

The main research agenda can be described in two main ideas.

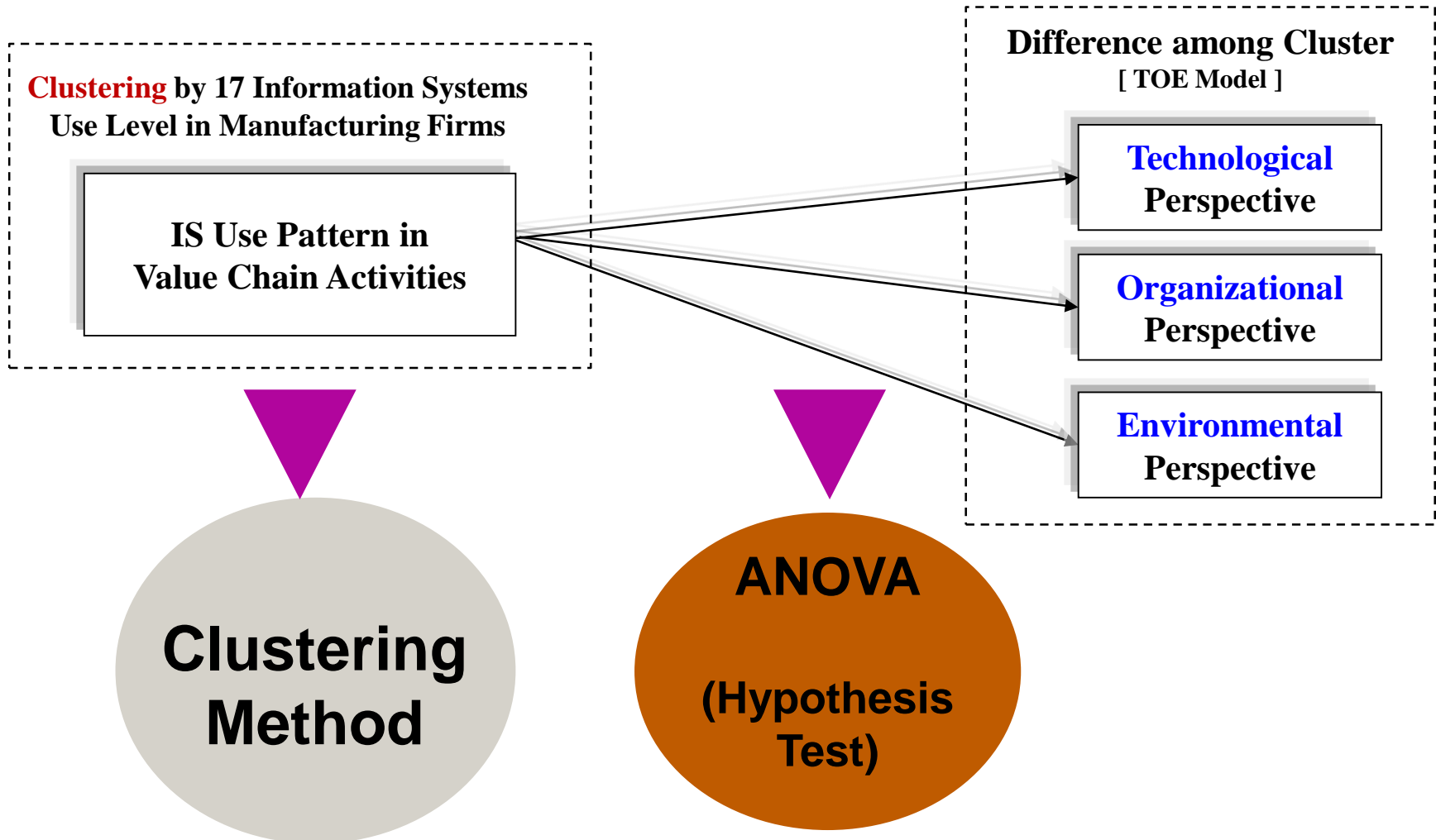
1)

The first was to **discover the popular pattern of utilizing information systems based on the overall value chain activity** of small- and medium-sized manufacturers.

2)

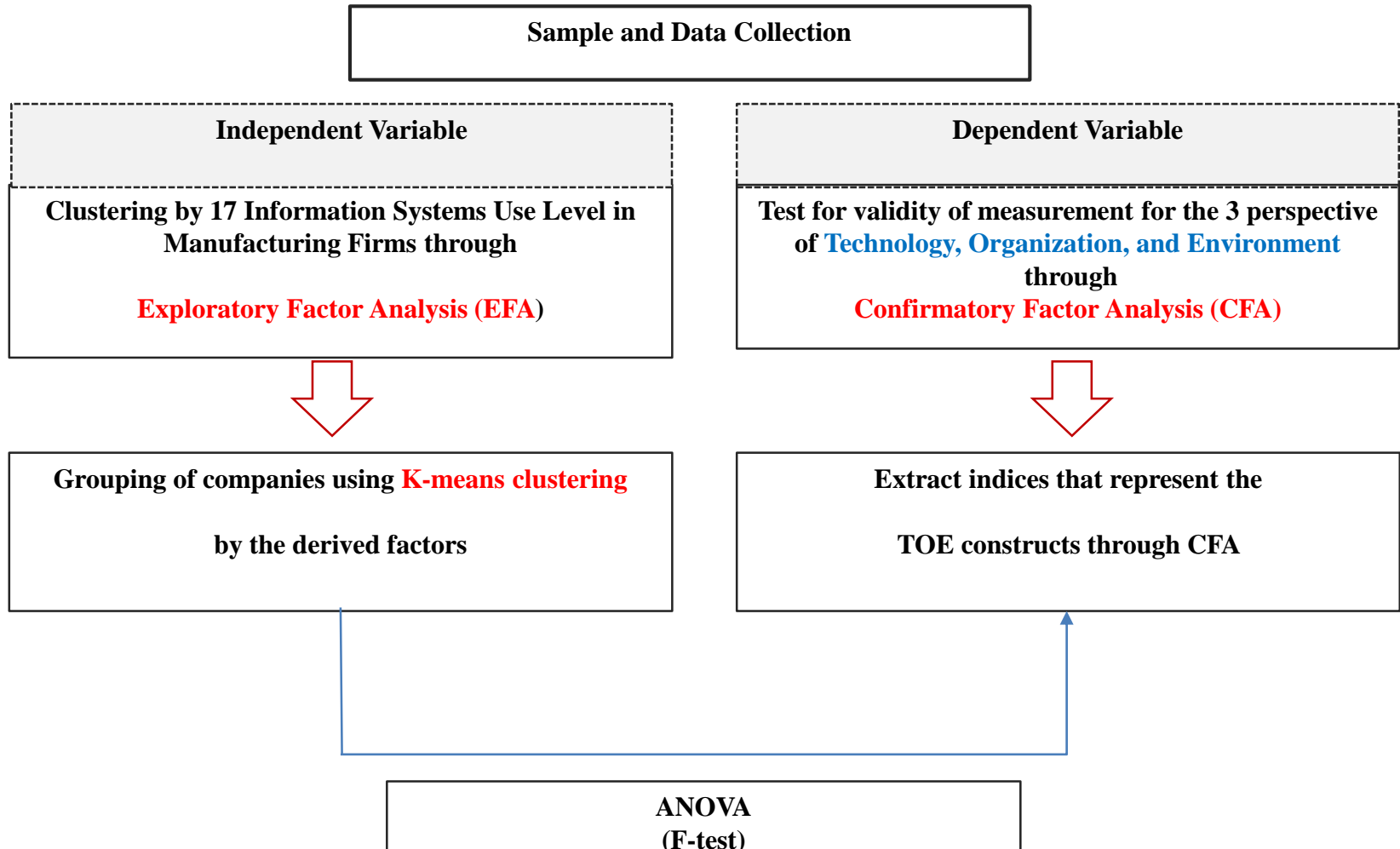
Second, it sought to determine **whether there were significant differences in corporate characteristics**, including corporate performance, coming from the utilization pattern of value chain-based information systems.

Research Model



Method

Totally, 2,012 sample data were used.



Method

Profile of sample companies

Characteristics (N = 2,012)		Frequency	%
Number of employees (Persons)	Less than 5	265	13.2
	6 ~ 10	594	29.5
	11 ~ 50	837	41.6
	51 ~ 100	193	9.6
	More than 100	123	6.1
Business periods (Years)	Less than 5	198	9.8
	6 ~ 10	528	26.3
	11 ~ 20	773	38.4
	21 ~ 30	357	17.7
	More than 30	156	7.8
Industry type (based on technology intensity level)	High Technology	635	31.6
	High-medium Technology	505	25.2
	Medium-low Technology	629	31.3
	Low Technology	243	12.1
Total		2,012	100

Results

Clustering

*Cluster mean: based on five-point Likert scale

		Mean*	Cluster#1 Premie	Cluster#2 Logistic expert	Cluster#3 Mr. Everyman	Cluster#4 Follower	Cluster#5 All-round Leader
		2,012	530 (26.3%)	443 (22.0%)	408 (20.3%)	389 (19.4%)	242 (12.0%)
Primary activities	Inbound logistics	1.97	0.47	1.27	2.36	3.49	3.49
	Operation & Manufacture	1.72	0.94	1.00	1.34	3.12	3.18
	Outbound logistics	1.93	0.08	3.76	0.13	3.47	3.27
	Marketing/Sales	1.93	0.76	1.27	2.41	2.94	3.34
	After sale service	1.23	0.94	0.95	1.07	1.52	2.21
Support activities	Firm infrastructure	2.54	2.24	2.16	2.49	3.00	3.32
	HR Management	1.64	1.35	1.35	1.43	1.71	3.08
	Tech. development	0.74	0.46	0.34	0.44	0.02	3.80
	Procurement	1.36	0.97	0.94	1.17	1.83	2.63

- 9 variables related value chain activities
- **5 Clusters was derived** and labelled by the clustering results

Results

Factor Analysis (PCA)

Factors	Factor loads	Eigen-values	Cum. % variance explained	Cronbach Alpha	AVE
Factor 1: Technological factor		2.280	16.289	0.645	0.416
Information sharing	0.737				
Cloud adoption	0.688				
Organizational IT support	0.642				
Level of system operation	0.542				
System development	0.445				
Factor 2: Organizational factor		2.892	36.945	0.616	0.381
Revenue	0.833				
Profit	0.789				
Firm size	0.778				
Business period	0.510				
Export ratio	0.486				
Listing status	0.473				
Competition pressure	-0.353				
Factor 3: Environmental factor		1.371	46.740	0.435	0.345
Industry type	0.784				
Industrial complex	0.733				

KMO measure of sampling adequacy=0.816; Bartlett test of sphericity=6174.894; $p < 0.000$.

- All variables are well loaded and derived by the measurement items.

Results

ANOVA Test : Technological Perspective

Technological Perspective	Premie (cluster 1)	Logistic expert (cluster 2)	Mr. Everyman (cluster 3)	Follower (cluster 4)	Leader (cluster 5)	F-value
Information sharing	0.59 ^a (2,3,4,5) ^b	0.98 (1,3,4,5)	1.09 (1,2,4,5)	1.76 (1,2,3)	1.95 (1,2,3)	1436.66 ^c p<0.000
Cloud adoption	1.51 (4,5)	1.47 (4,5)	1.63 (4,5)	2.03 (1,2,3,5)	2.76 (1,2,3,5)	108.18 ^d p<0.000
Organizational IT support	3.51 (2,3,4,5)	3.66 (1,4,5)	3.69 (1,4,5)	3.97 (1,2,3,5)	4.21 (1,2,3,4)	218.34 ^c p<0.000
System development	2.55 (4,5)	2.58 (4,5)	2.55 (4,5)	2.72 (1,2,3,5)	2.90 (1,2,3,4)	33.57 ^d p<0.000
Level of system operation	3.87 (3,4,5)	3.96 (3,4,5)	4.12 (1,2,4,5)	4.36 (1,2,3,5)	4.64 (1,2,3,4)	193.53 ^c p<0.000

[Note]

- Underlined values indicate significance at $\alpha = 0.01$

^a Mean based on comparing the 2,012 samples. (Average of samples included in each group)

^b Numbers in parentheses indicate the cluster groups from which this cluster is significantly different at $\alpha = 0.05$.

^c F and corresponding p-values based on Kruskal-Wallis test.

^d F and corresponding p-values based on ANOVA test.

H1. Different IS-use clusters demonstrate different corporate characteristic levels in the perspective of Technology

[Significant]



Results

ANOVA Test : Organizational Perspective

Organization Perspective	Preemie (cluster 1)	Logistic expert (cluster 2)	Mr. Everyman (cluster 3)	Follower (cluster 4)	Leader (cluster 5)	F-value
Revenue	7.51 ^a (3,4,5) ^b	7.62 (4,5)	7.86 (1,4,5)	8.61 (1,2,3,5)	8.87 (1,2,3,4)	219.35 ^c p<0.000
Profit	4.97 (3,4,5)	4.97 (3,4,5)	5.29 (1,2,4,5)	5.66 (1,2,3)	5.95 (1,2,3)	104.89 ^c p<0.000
Firm size	19.55 (3,4,5)	19.82 (4,5)	27.07 (1,4,5)	45.20 (1,2,3)	54.20 (1,2,3)	230.36 ^c p<0.000
Business period	15.29 (5)	14.93 (5)	15.45 (5)	16.25 (5)	18.33 (1,2,3,4)	21.74 ^c p<0.000
Listing status	1.01 (5)	1.00 (4,5)	1.02 (5)	1.04 (2)	1.10 (1,2,3)	12.26 ^d p<0.000
Export ratio	0.30 (5)	0.33 (5)	0.37 (5)	0.42 (5)	0.65 (1,2,3,4)	8.90 ^d p<0.000
Competition pressure	2.96 (4,5)	2.94 (4,5)	2.80 (5)	2.57 (1,2)	2.47 (1,2,3)	13.24 ^d p<0.000

[Note]

- Underlined values indicate significance at $\alpha = 0.01$

^a Mean based on comparing the 2,012 samples. (Average of samples included in each group)

^b Numbers in parentheses indicate the cluster groups from which this cluster is significantly different at $\alpha = 0.05$.

^c F and corresponding p-values based on Kruskal-Wallis test.

^d F and corresponding p-values based on ANOVA test.

H2. Different IS-use clusters demonstrate different corporate characteristic levels in the perspective of Organization

[Significant]

Results

ANOVA Test : Environment Perspective

Environment Perspective	Preemie (cluster 1)	Logistic expert (cluster 2)	Mr. Everyman (cluster 3)	Follower (cluster 4)	Leader (cluster 5)	F-value
Industry type	2.02 ^a (3,4,5) ^b	2.20 (5)	2.22 (1,5)	2.20 (1,5)	2.85 (1,2,3,4)	29.07 ^d p<0.000
Industrial complex	2.52 (5)	2.49 (5)	2.40	2.42	2.21 (1,2)	5.81 ^d p<0.000

- [Note]
- Underlined values indicate significance at $\alpha = 0.01$
 - ^a Mean based on comparing the 2,012 samples. (Average of samples included in each group)
 - ^b Numbers in parentheses indicate the cluster groups from which this cluster is significantly different at $\alpha = 0.05$.
 - ^c F and corresponding p-values based on Kruskal-Wallis test.
 - ^d F and corresponding p-values based on ANOVA test.

H3. Different IS-use clusters demonstrate different corporate characteristic levels in the perspective of Environment

[Significant]



Discussion

- This study compared the key characteristics of companies involved in the promotion of informatization, **comparing the entire value chain activity, not the individual activities of a company.**
- It was discovered that **companies focused on the primary activities for business operations of the *status quo*** but exhibited **very low utilization patterns** in the development of technology.
- In the perspective of policy, **information support must be addressed from the viewpoint of optimizing the entire value chain**, not the improvement of partial value activities of companies.



Contribution

- **Academic Perspective**
 - Investigating the new determinants to adopt IS in SME / Korea Context
 - Rethinking the value chain activity
- **Practical Perspective**
 - Understanding the principal drivers to adopt IS in SME
 - Clustering the SME companies by variables related IS use
- **Empirical Perspective**
 - Open Data
 - IS use and competitiveness of SME from data, 4,303 Companies
- **Methodological Perspective**
 - Utilization of diverse research methodologies and their convergence
 - Regression (Multiple & Logistic) / Clustering method / ANOVA test

Research in Progress

All good things require effort: **U-shaped relationship** between information systems and firm performance

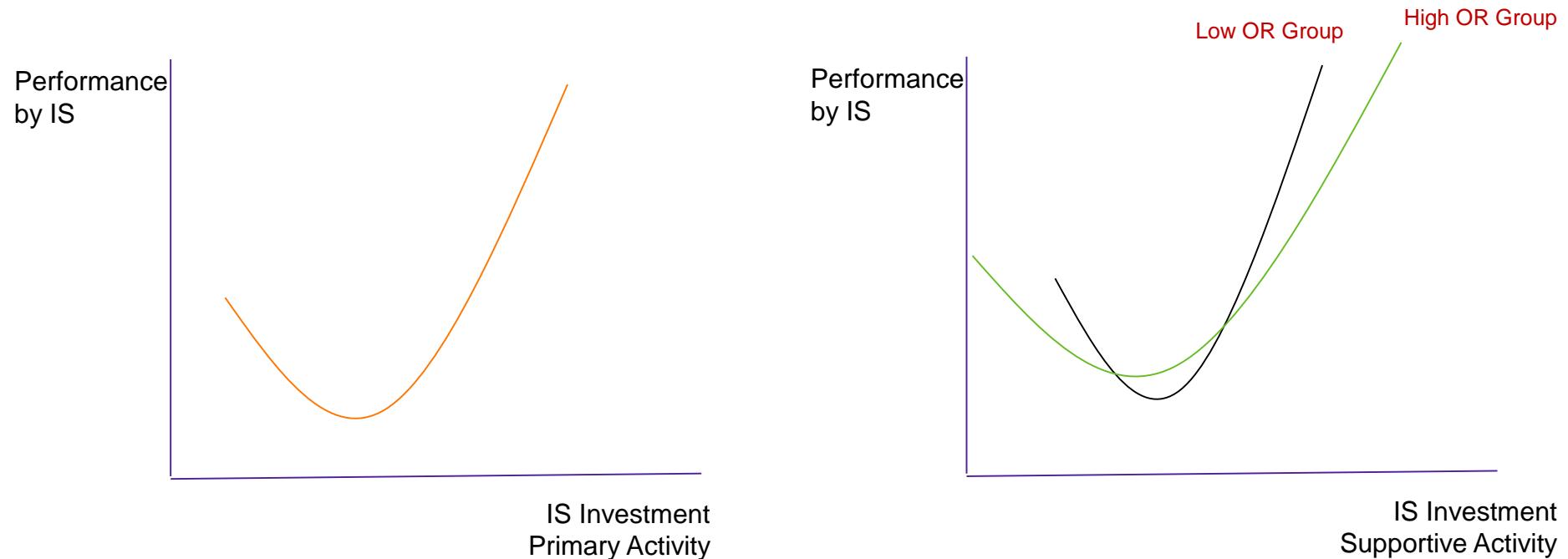
	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6	Model 7	Model 8	Model 9	Model 10
Dependent Variable	Performance									
Main Effects										
PA		0.012 ^{n.s.}	-0.308 ^{***}	0.017 ^{n.s.}	-0.204 ^{***}	-0.162 ^{**}	-0.182 ^{***}	-0.144 ^{**}	-0.186 ^{***}	-0.182 ^{**}
SA		-0.326 ^{***}	-0.317 ^{***}	-1.015 ^{***}	-0.954 ^{***}	-0.871 ^{***}	-0.773 ^{***}	-0.878 ^{***}	-0.794 ^{***}	-0.917 ^{***}
OR		-0.288 ^{***}	-0.289 ^{***}	-0.280 ^{***}	-0.281 ^{***}	-0.309 ^{***}	-0.317 ^{***}	-0.306 ^{***}	-0.303 ^{***}	-0.339 ^{***}
PA ²			0.054 ^{***}		0.037 ^{***}	0.025 ^{**}	0.034 ^{***}	0.023 ^{**}	0.034 ^{***}	0.030 ^{**}
SA ²				0.129 ^{***}	0.119 ^{***}	0.105 ^{***}	0.078 ^{***}	0.106 ^{***}	0.082 ^{***}	0.115 ^{***}
Interaction Effects										
OR * PA						0.044 ^{***}				0.040 ^{n.s.}
OR * SA							0.077 ^{***}			0.308 ^{***}
OR * PA ²								0.006 ^{***}		-0.002 ^{n.s.}
OR * SA ²									0.010 ^{***}	-0.046 ^{***}
Control Variable										
Dummy_Conglomerate	0.045 ^{n.s.}	0.183 [*]	0.183 [*]	0.112 ^{n.s.}	0.112 ^{n.s.}	0.128 ^{n.s.}	0.104 ^{n.s.}	0.131 ^{n.s.}	0.115 ^{n.s.}	0.085 ^{n.s.}
Dummy_KOSPI	-0.193 ^{n.s.}	0.146 ^{n.s.}	0.088 ^{n.s.}	0.014 ^{n.s.}	-0.014 ^{n.s.}	-0.058 ^{n.s.}	-0.040 ^{n.s.}	-0.057 ^{n.s.}	-0.032 ^{n.s.}	-0.064 ^{n.s.}
Dummy_KOSDAQ	-0.070 ^{n.s.}	0.220 [*]	0.171 [*]	0.170 [*]	0.140 ^{n.s.}	0.094 ^{n.s.}	0.117 ^{n.s.}	0.098 ^{n.s.}	0.125 ^{n.s.}	0.088 ^{n.s.}
Tenure	0.004 ^{***}	0.003 [*]	0.003 [*]	0.002 [*]	0.002 [*]	0.002 [*]	0.002 ^{**}	0.002 [*]	0.002 ^{**}	0.002 [*]
Log(employees)	-0.190 ^{***}	-0.061 ^{***}	-0.058 ^{***}	-0.052 ^{***}	-0.051 ^{***}	-0.047 ^{**}	-0.050 ^{**}	-0.049 ^{**}	-0.050 ^{**}	-0.045 ^{**}
Log(Sales)	-0.092 ^{***}	-0.035 ^{**}	-0.034 ^{**}	-0.029 [*]	-0.030 [*]	-0.030 ^{**}	-0.030 [*]	-0.030 [*]	-0.030 [*]	-0.030 ^{**}
R ²	0.176	0.349	0.355	0.366	0.369	0.375	0.374	0.374	0.372	0.379

[Note]

PA: Primary Activity, SA: Supportive Activity, OR: Organizational Readiness/ *:p-value<0.05, **: p-value<0.01, ***:p-value<0.001, n.s.: not significant

Research in Progress

All good things require effort: **U-shaped relationship** between information systems and firm performance

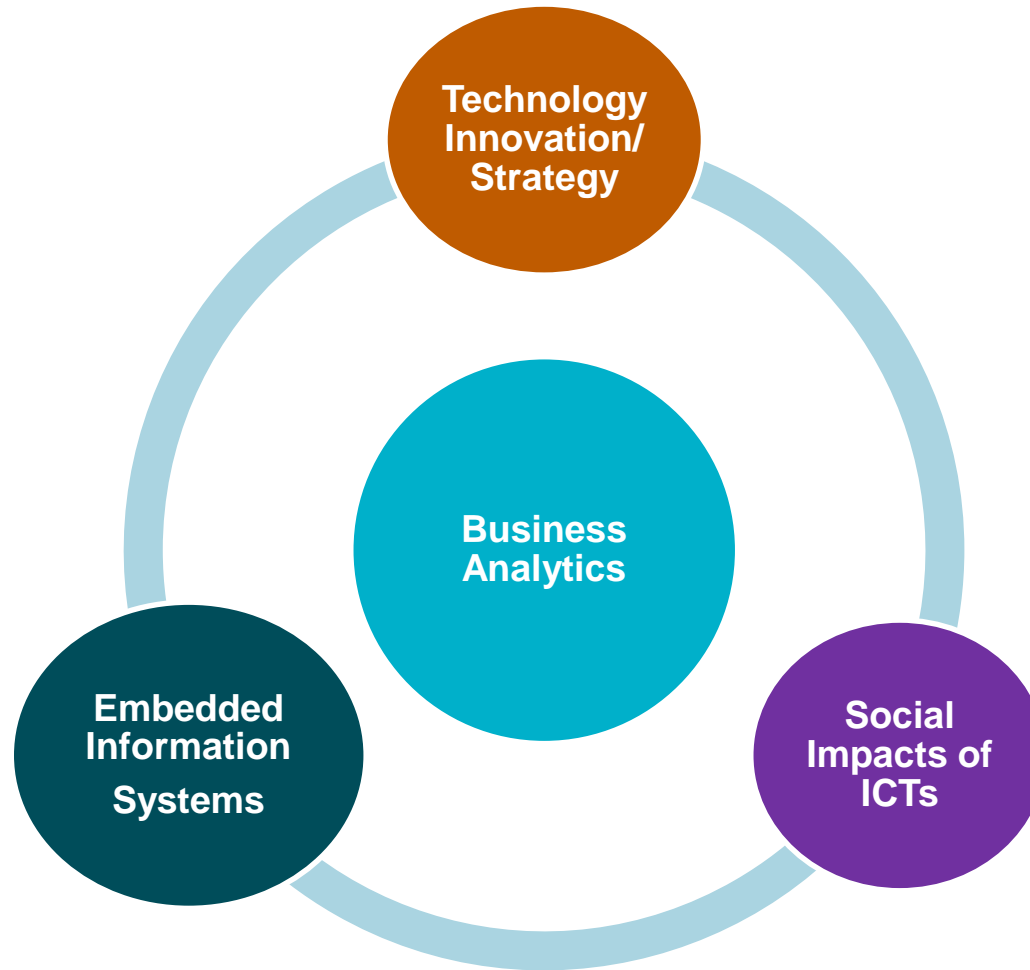


- The Paradox of IS Investment : Resistance
- High Assimilation Capacity : Mitigating effect



Future Research and Plan

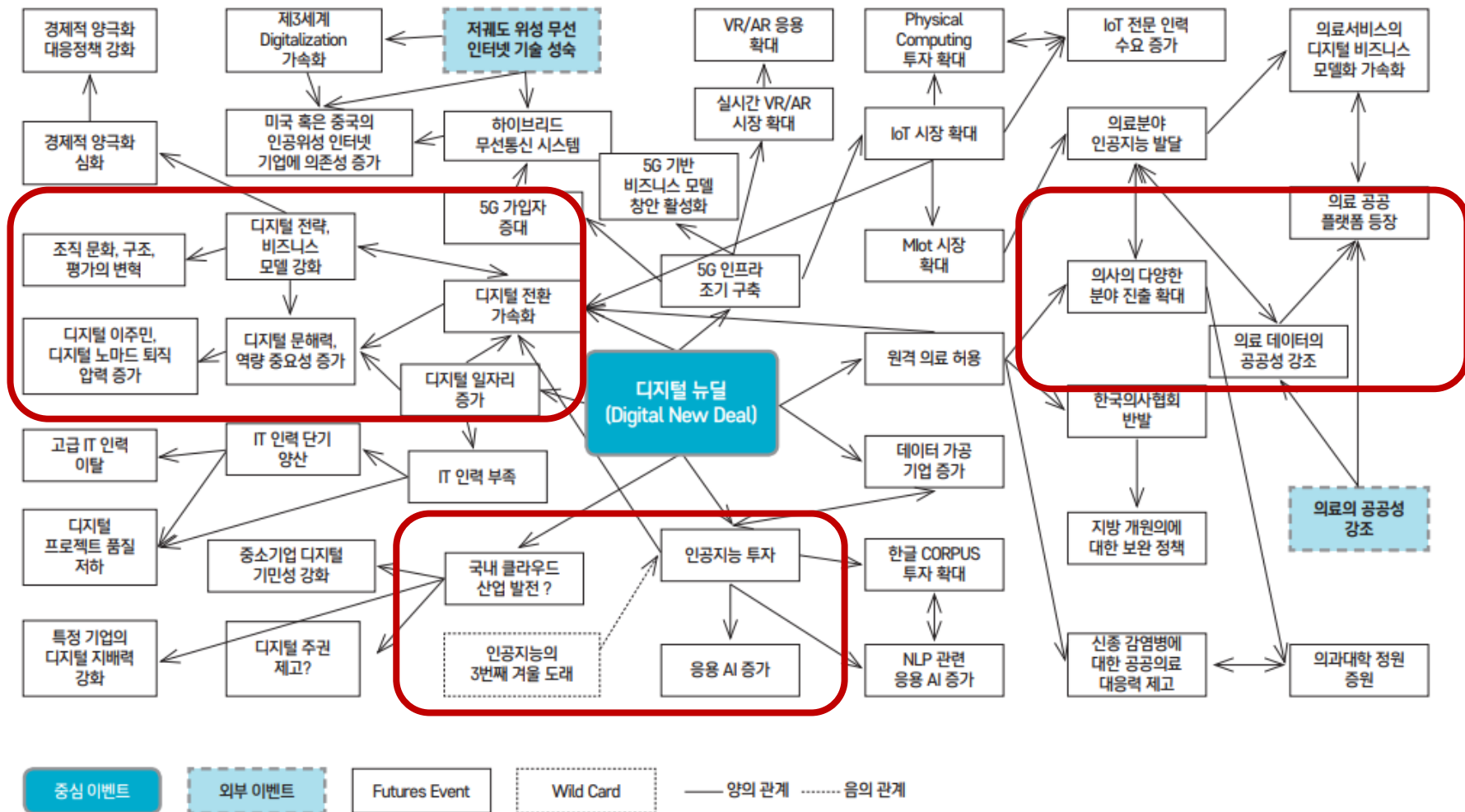
Research Goal



- Research Project
- Intelligent Government / Algorithm as an Infrastructure /AI Governance
- ICT4D (ICT for Development) with AfDB

Research Goal

Digital New Deal





THANK YOU