



The transformative direction of innovation toward an IoT-based society - Increasing dependency on uncaptured GDP in global ICT firms

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ABSTRACT

Driven by the possibilities of the Internet of Things (IoT), global information and communication technology (ICT) firms have taken significant steps forward in recent years.

The Internet provides extraordinary services to people while promoting a free culture. However, such services cannot be captured through gross domestic product (GDP) data that measure revenue. Consequently, advancement of the Internet leads to increasing dependency on uncaptured GDP (added value providing people utility and happiness beyond economic value) and ICT price decreases.

Against such circumstances, global ICT firms are quickly embracing digital solutions for new competitiveness that urge them to restructure their business model toward digital business strategies. Aiming at demonstrating this hypothetical view, this paper attempts to explore new approach for analyzing such dynamism and examines some optimal solutions that are co-evolving with it.

An empirical analysis of digital business solutions in 500 global ICT firms over the period 2005–2016 was conducted with special attention to their specific features.

It was identified that research and development-intensive firms have fallen into a trap in ICT advancement, resulting in a decline in their marginal productivity of ICT that could be due to increasing dependency on uncaptured GDP. As a result, these firms are endeavoring to harness soft innovation resources and activate a self-propagating function that induces functionality development sublimating sophisticated digital business strategies, such as:

- Shifting from software to network (e.g., Apple and Google),
- Merging network and real (e.g., Amazon's merging of e-commerce and brick-and-mortar retail),
- Shifting from commodity to culture (e.g., Facebook and Samsung).

All can be considered as soft value addition in response to uncaptured GDP.

This analysis explores new insights for ICT firms in their transformative strategies toward an IoT-based society.

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¹ [18] defines IoT as scenarios where network connectivity and computing capability extend to objects, sensors, and everyday items not normally considered computers, allowing these devices to generate exchanges and consume data with minimal human intervention.

1. Introduction

1.1. IoT and the new productivity paradox

Driven by the Internet of Things (IoT),¹ the physical world is becoming an ecosystem composed of physical objects embedded with sensors and actuators connected to applications and services through a wide range of networks. The IoT has the potential to drive the next steps toward the digitization of our society and economy [15]. It promises several benefits to its customers, varying from faster and more accurate sensing of our environment to more cost-

effective tracking of industrial processes. The wide adoption of the IoT is expected to generate significant revenues to the providers of its applications and services [26].

The IoT will change the bases of competition and drive new business models for users and suppliers. Firms that use the IoT in novel ways to develop new business models or discover new ways to monetize the IoT data are likely to enjoy more sustainable benefits [27,28]. Report also discussed that the challenges in capturing the full potential of the IoT require innovation in technologies, business models, investment capabilities, and talent, together with policy actions to encourage interoperability, security, and protection of privacy and property rights. It was also noted the possibility of a new “productivity paradox” in the context of the IoT—a possible lag between technology investments and productivity gains at macroeconomic level.

1.2. From “computer paradox” to “productivity paradox” in the IoT

1.2.1. Computer-initiated productivity paradox

There have been long-lasting debates on the information and communication technology (ICT)–driven “productivity paradox.”

Significant numbers of analyses demonstrated the impact of ICT advancement on the socio-economy triggered by Nobel Laureate Solow’s “Productivity Paradox” [34] and reaction to it by Ref. [4]. This reaction was followed by more sophisticated models to tease out the relationship between ICT and productivity [5,22,23].

By the late 1990s, there were some signs that productivity in the workplace had been improved by the introduction of ICT, especially in the US. Brynjolfsson et al. found a significant positive relationship between ICT investments and productivity [6,7] encouraging popular consideration that there was no paradox [37].

1.2.2. Internet-initiated new productivity paradox

Late in the first decade of this century, a new paradox appeared to have emerged. This can largely be attributed to the third industrial revolution initiated by the dramatic advancement of the Internet [32]. The Internet has transformed how people live, work, socialize, and meet, and how countries develop and grow. It has changed from a network for researchers to a day-to-day reality for billions of people in two decades [27]. Consequently, the computer-initiated ICT world has changed significantly. The entire system has become interactive, integrated, and seamless. This interconnectedness is creating new opportunities for cross-industry relationships.

[13] argued that, “Contrary to the dramatic advancement of the Internet and subsequent ICT advancement, we were living through the consequence of a dramatic decrease in the rate of innovation.” He argued that the consequence of slowing innovation was fewer new industries and less creative destruction, hence fewer new jobs. He stressed that, while the technological progress brought a big and predictable stream of growth across most of the economy, those assumptions were turning out to be wrong or misleading when it came to the Internet. He then suggested the possibility of the consequence of the two-faced nature of ICT.

From the dramatic advancement of the Internet and subsequent third industrial revolution inevitably emerged a new paradox of the advancement of ICT. Brynjolfsson, who first reacted to Solow’s production paradox in 1993, raised the question, “Could technology be destroying jobs?” [8]. He argued by giving an example of the music industry: “Because you and I stopped buying CDs, the music industry has shrunk, according to revenues and GDP. But we’re not listening to less music. There’s more music consumed than before.” He further mentioned that maybe it’s not the growth that is deficient but the yardstick that is deficient and postulated the limit of GDP [9].

Inspired by these arguments [24], postulated that the Internet promotes more free culture, the consumption of which provides utility and happiness to people but cannot be captured through the GDP data that measure revenue.

1.3. Uncaptured GDP and its source

1.3.1. Sources of free culture

Considering the evolutionary services that the Internet provides under free culture, several analyses and debates were initiated on the sources of its free culture.

1.3.1.1. Unique function stemmed from online intermediaries. [11] studied the impact of online intermediaries² (that play a core role in the Internet function) on GDP of EU27 countries in 2012 by identifying: (i) direct contribution through consumption increase, (ii) indirect contribution through productivity increase, and (iii) beyond measurement. The report estimated that, contrary to direct and indirect GDP contributions of EUR 220 billion (1.7% of GDP) and EUR 210 billion (1.65% of GDP), respectively, EUR 640 billion (5.0% of GDP) derived from B2B platforms by e-commerce, online advertising, and consumer benefits of free services like Google search was beyond measurement by the GDP statistics. The report also pointed out that these estimates were understated, as they didn’t include the direct contribution by investments, which are hard to measure, and the sociocultural value created by social network development.

1.3.1.2. Consumer surplus. The research by Ref. [10] (Revised 2017) analyzing online booksellers found that significant consumer surplus gains were created by the increased product variety available through electronic markets and that efficiency gains resulted from increased competition leading to lower average prices. Their analysis indicates that the increased product variety of online bookstores enhanced consumer welfare by US\$731 million to US\$1.03 billion in the year 2000, which is seven to 10 times larger than the consumer welfare gain from increased competition and lower prices in this market.

[10] (Revised 2017) also mentioned the possibility of large welfare gains in other SKU-intensive consumer goods, such as music, movies, consumer electronics, and computers. Similar results were demonstrated by the white paper of Japan’s ICT, analyzing consumer surplus in music and audio-visual services [30].

Analyzing the big economic opportunities and challenges in capturing the maximum value of IoT [28] estimated that consumer surplus derived from the IoT could be more than 10% of the global economy by 2025.

1.3.1.3. New goods and services derived from disruptive innovations. The [38] pointed out that the apparent slowdown in productivity in the industrialized countries could be simply due to the lack of capacity in statistical offices to properly measure the massive quality gains and hard-to-measure benefits of relatively new goods and services (e.g., Google, Facebook, Twitter) that are radical breaks with previous products or, in some cases, are provided for free to the users.

The report also discussed that, despite tremendous previous problems in accurately measuring the benefits of new goods and services, there is some evidence that statistical agencies are now better at capturing this value. But adjustment issues related to

² Online intermediaries provide platforms for the exchange of goods, services, or information over the Internet.

previous gains still remain to accurately measure productivity growth.

It also pointed out that current estimates for the non-market benefits of free goods and services like Google, Wikipedia, and Facebook do not make up for the shortfall in productivity growth. It may turn out that those estimates understate the non-market benefits, but it would be very hard to know.

Similar points were also made by The [14] claiming that “GDP is a bad gauge of material well-being and it is a time for fresh approach.”

1.3.1.4. Online piracy. In addition to the foregoing beyond-measurement difficulties inherent to disruptive innovations caused by the dramatic advancement of the Internet, it was generally pointed out that a corresponding increase in online piracy is another difficult issue beyond GDP measurement.

1.3.2. Uncaptured GDP

Following these analyses and debates [47], discussed the two-faced nature of ICT and the emergence of uncaptured GDP as fatal to the advancement of the Internet [47–50]. They pointed out that, while advancement of ICT generally contributes to enhanced prices of technology by new functionality development, the dramatic advancement of the Internet contributes to decreased prices of technology due to its unique, inherent characteristics of freebies, easy copying, and mass standardization. With this understanding, they supported [24], postulate that the Internet promotes free culture, the consumption of which provides utility and happiness to people but cannot be captured through GDP data that measure revenue. The authors defined these added values that provide people utility and happiness beyond economic value under free culture as an uncaptured GDP.

1.4. Consequence of IoT

The Internet continues to grow rapidly and changes every aspect of our lives by introducing new ways of communication, learning, socialization, and doing business, further transforming our world into an IoT-based society [3,19]. The IoT has also changed the traditional meaning of the word “product” introduced in the era of “Product of Things (PoT).” In the era of the IoT, the product can be a technology, device, service powered by software, a flow of data, a software application for monitoring, automation, and analysis, or any combination of the above.

The transformation of the traditional Internet, where data are “created by people,” to the IoT, where data are “created by things” [25] will generate data at a much larger scale that requires more advanced technological capabilities, as most of the data collected today are not fully exploited. To be competitive and to capitalize on the highly promising business opportunities of the IoT, global ICT firms need to embrace sophisticated digital solutions and restructure their business models [3].

Due to the challenges and huge interest in the IoT, the importance of business models and digital business strategies cannot be over-emphasized [3], and [21] stressed the significance of digital business strategies (DBS) and discussed the fundamental role of digital technologies in transforming business strategies, business processes, firm capabilities, and the nature of products and services.

They also highlighted the significance of digital business strategy as: (i) the significant role of ICT pervading digital resources in other functional areas such as operations, purchasing, supply chain, and marketing; (ii) going beyond systems and technologies; and (iii) explicitly linking digital business strategy to creating differential business value, thereby elevating the performance

implications of ICT strategy beyond efficiency and productivity.

[3] also pointed out that it is clearly time to rethink the role of ICT strategy from that of a functional-level strategy subordinating business strategy to the digital business strategy that fuses ICT strategy and business strategy.

1.5. New business strategies spinning off from a PoT society to an IoT society

The authors, in their previous research, analyzed the business strategies of 500 global ICT firms in 2007 and 2010 (before and after the Lehman shock in 2008) and identified the following strategy for resilient market value creation in the digital economy³ [46].

- Dependency on high R&D profitability while restraining its elasticity
- Effective utilization of external resources in innovation
- Hybrid management of technology between indigenous R&D and assimilation of spillover technology

In their sequel studies, the authors tried to compare the spinning-off dynamisms from traditional computer-initiated ICT innovation in the era of the PoT to Internet-initiated ICT innovations by using their developed co-evolutional framework between the advancement of ICT, a paradigm change, and a shift in people's preferences (Fig. 1).

The authors have found that, corresponding to a shift from computer-initiated innovation toward the new stream of Internet-initiated innovations, social preferences have shifted from economic functionality to supra-functionality. The economic impact of innovation has shifted from captured GDP (monetized revenues) to increasingly uncaptured GDP (un-monetized revenues) due to the digital nature, free availability of the products, and new business models [47–51].

In their further studies [31,50,51] the authors recognized the consolidated challenges in social demand and the importance of trust between stakeholders in introducing successful disruptive innovations [12], in its sequel report also pointed out the significant contribution of online intermediaries in building trust.

The authors suggested that the digital business strategy corresponding to the new stream of innovations should be supported by a trust-based, ICT-driven disruptive business model (IDBM) with consolidated challenge to social demand (CCSD) incorporating the inherent self-propagating function.

The significance of the above suggestions should be recognized in the foregoing transformation of traditional ICT-driven functionality development strategy toward digital business strategy [1].

1.6. Dynamism transforming into digital business strategy

None of the previous research has elucidated the dynamism of this transformation leading global ICT firms to create digital business strategy corresponding to an IoT-based society.

This paper attempts to explore new approach to demonstrate the above hypothetical views by explaining the transformation dynamism, in shifting from the PoT toward the IoT and give constructive insights to global ICT firms for their digital business strategies.

Based on the findings obtained from the following preceding analyses illustrating the spin-off from traditional to new co-

³ As shown by Tapscott [35] in his best-seller “The Digital Economy” the Internet has changed the way of business and daily life dramatically. The digital economy is also known as the Internet economy, the new economy, or the web economy.

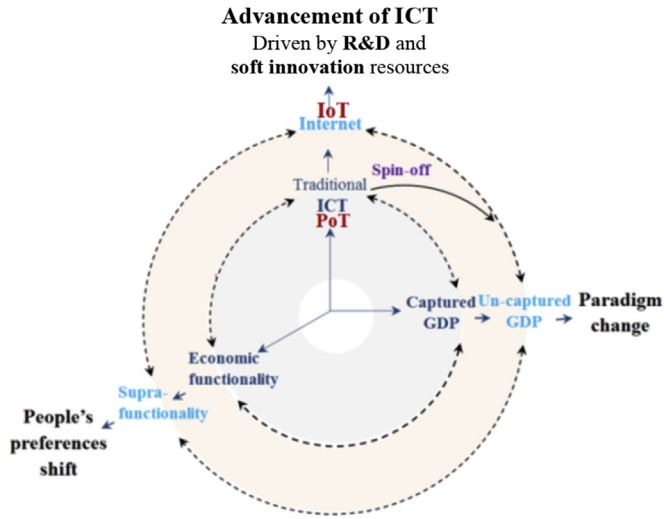


Fig. 1. Scheme of spin-off dynamism.

evolution, an empirical analysis was conducted by evaluating the new survival strategy of top 500 global ICT firms over the period of 2005–2016, with a focus toward the following new business models and also paying special attention to their specific features similar to:

- Similarity and disparity of world ICT leaders [48]; [49],
- Uber's ridesharing revolution [49]; [51],
- Trust-based digital education [52],
- Commodification of past experiences [45],
- Co-evolution of streaming and live music [31], and
- Harnessing the vigor of untapped resources by activating women's potential [53].

It was identified that high R&D-intensive firms have fallen into a trap in ICT advancement resulting in declining their marginal productivity of ICT that, which can be considered a consequence of two-faced nature of GDP. Consequently, these firms are endeavoring to increase self-propagating functionality development by sublimating sophisticated digital business strategies, which can be considered a soft value addition to deal with the issue of uncaptured GDP. Fig. 2 illustrates dynamism spinning-off to increasing dependency on uncaptured GDP.

This analysis thus explores a new insight for ICT firms for their transformative strategy toward an IoT-based society.

Section 2 of this paper reviews the shift of global ICT firms toward the IoT. Section 3 analyzes increasing dependency on uncaptured GDP in the global ICT firms. The sources inducing high self-propagating function are analyzed in Section 4. Section 5 briefly summarizes noteworthy findings, policy suggestions, and future research.

2. Shift of global firms toward IoT

2.1. Influence of R&D-Driven growth in global ICT firms

Given that sales (S) of global ICT firms are governed by ICT stock, their sales can be depicted as follows (see Appendix A):

$$\ln S = a + b \ln R \quad (1)$$

where R : R&D investments; and a , b : coefficients.

The top 500 global ICT firms were divided into three groups by using cluster analysis⁴ based on their R&D and sales levels in year 2016 as illustrated in Fig. 3.

Based on the above findings, and utilizing equation (1), correlation between (S) and (R) in the top 500 global ICT firms by R&D level in 2016 was analyzed.

$$\ln S = 2.319 + 0.997D_1 \ln R + 1.013 D_2 \ln R + 1.023D_3 \ln R + 2.903 D$$

S : Net sales, R : R&D investment, D_1 , D_2 , D_3 , and D are dummy variables. D_1 : High R&D-intensive firms, D_2 : R&D-increasing firms, D_3 : Low-R&D firms, D : Outliers.

The figures in parentheses indicate t-statistics: All are significant at the 1% level.

The result of the correlation analysis is statistically significant. This demonstrates that sales of the global ICT firms are governed by their ICT stock as cumulative stock of R&D investment constructs ICT stock.⁵

2.2. Business structure comparison of top 70 global ICT firms

With the foregoing understanding, Table 1 lists the top 70 R&D-intensive global ICT firms in 2016 and compares their business performance by R&D (R), sales (S), operating income (OI), R&D intensity (R/S), profitability (OI/S), and R&D profitability (OI/R).

Fig. 4 compares the performance of the top 70 R&D-intensive global ICT firms in 2005 and 2016.

2.3. Activation of global ICT firms

Over the last decade, dramatic advancement of the Internet worldwide paved the way to the acceleration of the IoT. This advancement was conspicuous after 2010, as initiated by global ICT firms as demonstrated in Fig. 3 and Table 2 (See Fig. 5).

2.4. Noteworthy shift of global firms from 2010 to 2016

Foregoing strong initiatives toward the IoT led by global ICT firms, particularly after 2010, resulted in a structural change of market value in leading firms. Table 3 traces the trend in the ranking of market value of the leading firms in 2005, 2010, and 2016.

The above review highlights the following noteworthy shift of global firms from 2010 to 2016 toward the IoT. First, leading global firms in the market, with respect to their market capitalization, have been shifted from those in the finance and energy sectors to ICT firms. Table 2b demonstrates that ICT firms comprise nine of the top 15 firms with respect to market value in 2016. The top three firms were all ICT firms.

Second, within ICT firms, the following shifts in their business focus have been evidently observed:

- From mechatronics to software (e.g., General Electric, IBM, and Siemens have decreased their status)
- From software to network (e.g., Apple and Google have exceeded their status, while Microsoft has decreased its status)

⁴ K-means clustering analysis was used.

⁵ This result leads to (b : elasticity). This suggests that marginal productivity of R is proportional to R productivity in R -driven growth trajectory, typical for the digital innovation.

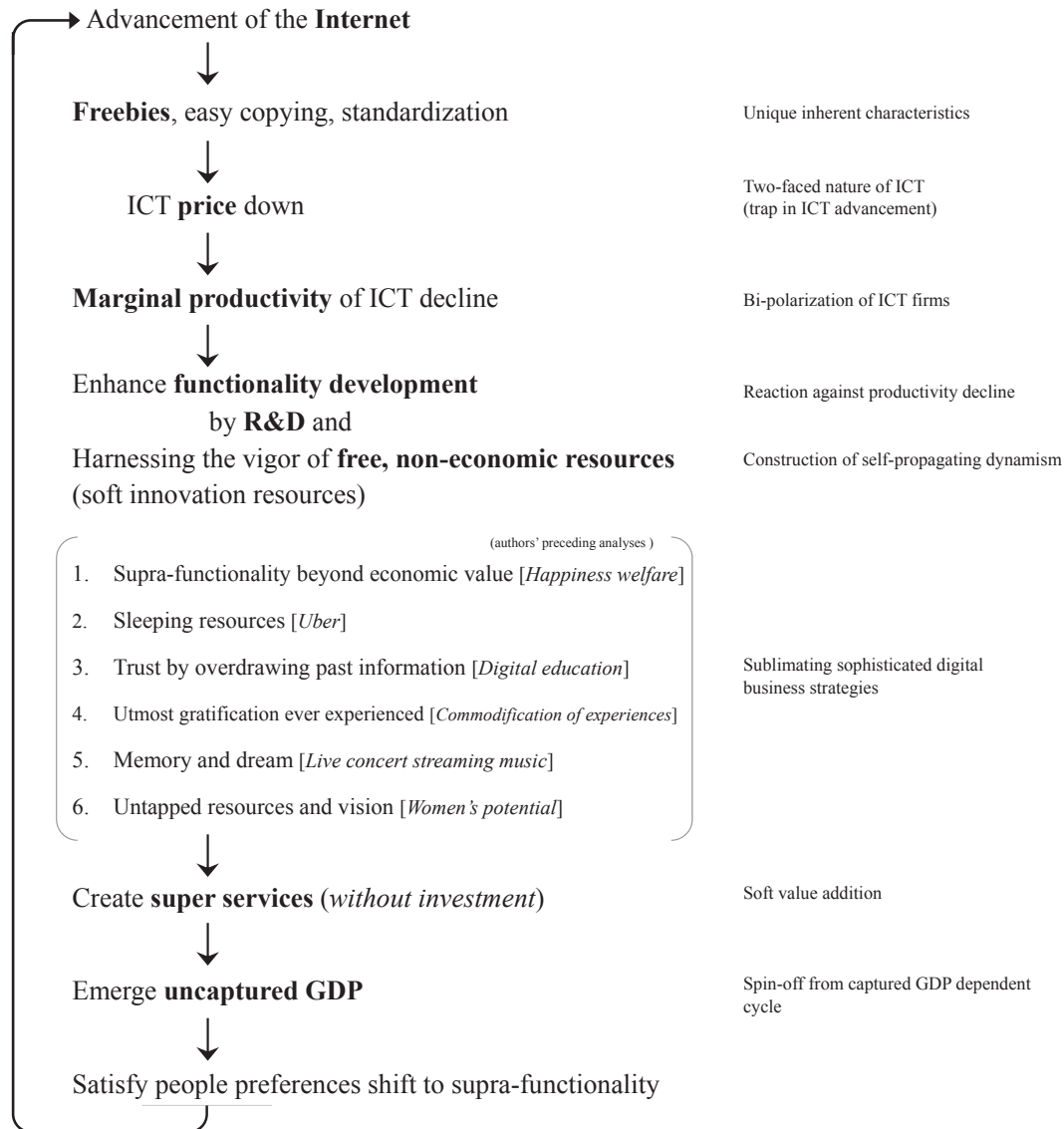


Fig. 2. Dynamism spinning-off to increasing dependency on uncaptured GDP.

- From Network to a merging of network and physical (e.g., Amazon has dramatically raised its status by merging e-commerce and brick-and-mortar retail)
- From commodity to culture (e.g., noting increase in status of Facebook and Samsung)

These noteworthy shifts can be considered a consequence of endeavoring to increase a self-propagating functionality development by sublimating sophisticated digital business strategies against a trap in ICT advancement resulting in declining marginal productivity of high R&D-intensive ICT firms. This accomplishment can be considered a soft value addition to deal with the issue of increasing dependency on uncaptured GDP.

The next section demonstrates this hypothetical view.

3. Increasing dependency on uncaptured GDP in global ICT firms

3.1. Development trajectory of global ICT firms

(1) Analytical Framework

As reviewed in the preceding section, sales (S) of the global ICT firms are governed by their ICT stock (T). With this situation, their development trajectory can be depicted as follows [47]:

$$S = F(X, T) = F(X(T)) \approx F(T) \quad (2)$$

where X : production factors other than T .

In long run, T can be treated proportional to R&D investment (R)

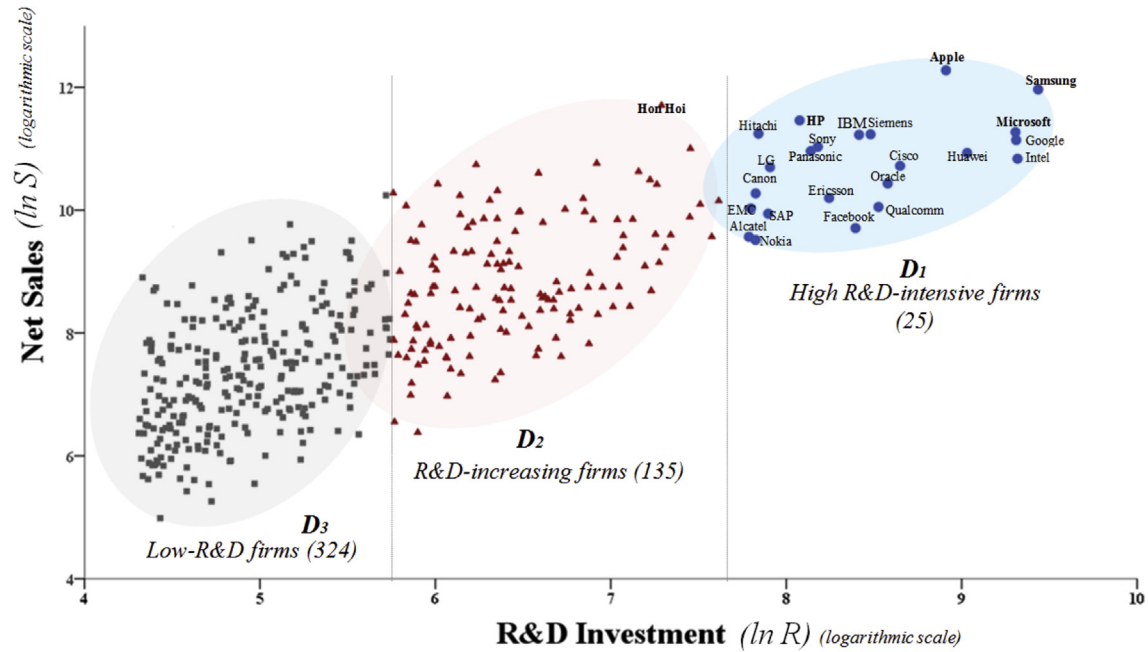


Fig. 3. Correlation Between R&D Investment and Sales in 500 Global ICT Firms (2016).

Note: The figures in parentheses indicate number of ICT firms. 16 outliers scattered in D_2 and D_3 were not presented.

Table 1

Digital Business Structure in Global ICT Firms in 2016 (Top 70 R&D-intensive ICT firms by R&D level).

R&D level	Firm	R&D (R)	Net sales (S)	Operating income (OI)	R/S	OI/S	OI/R	R&D level	Firm	R&D (R)	Net Sales (S)	Operating income (OI)	R/S	OI/S	OI/R
		EUR mil	EUR mil	EUR mil	%	%	%			EUR mil	EUR mil	EUR mil	%	%	%
1	Samsung	12528	157190	20692	8.0	13.2	165.2	36	Lenovo	1285	41253	−20	3.1	−0.05	−1.6
2	Intel	11140	50845	13016	21.9	25.6	116.8	37	Fujifilm	1243	18993	1457	6.5	7.7	117.3
3	Google	11054	68879	17783	16.0	25.8	160.9	38	NVIDIA	1223	4602	806	26.6	17.5	66.0
4	Microsoft	11011	78369	18683	14.1	23.8	169.7	39	Tencent	1177	14555	5717	8.1	39.3	485.5
5	Huawei	8358	55893	6479	15.0	11.6	77.5	40	Texas Inst	1176	11941	3946	9.8	33.0	335.6
6	Apple	7410	214674	65427	3.5	30.5	883.0	41	STM	1149	6335	121	18.1	1.9	10.6
7	Cisco	5701	45235	11875	12.6	26.3	208.3	42	Danaher	1138	18888	3298	6.0	17.5	289.8
8	Oracle	5316	34029	12036	15.6	35.4	226.4	43	Seagate	1136	10251	409	11.1	4.0	36.0
9	Qualcomm	5043	23221	5451	21.7	23.5	108.1	44	Yahoo!	1110	4564	−4266	24.3	−93.5	−384.2
10	Siemens	4820	75636	5809	6.4	7.7	120.5	45	ASML	1046	6287	1861	16.6	29.6	177.8
11	IBM	4515	75081	14586	6.0	19.4	323.1	46	Elect Arts	1019	4038	825	25.2	20.4	81.0
12	Facebook	4424	16467	5718	26.9	34.7	129.3	47	Sharp	992	18764	−1423	5.3	−7.6	−143.5
13	Ericsson	3806	26870	2356	14.2	8.8	61.9	48	eBay	973	7892	2018	12.3	25.6	207.5
14	Sony	3569	61787	2243	5.8	3.6	62.8	49	Marvell	968	2504	−750	38.7	−30.0	−77.5
15	Panasonic	3429	57559	2797	6.0	4.9	81.6	50	Broadcom	964	6268	1534	15.4	24.5	159.2
16	HP	3217	94934	7353	3.4	7.7	228.6	51	NEC	945	21505	743	4.4	3.5	78.6
17	LG	2718	44269	934	6.1	2.1	34.4	52	Schneider	937	26640	2220	3.5	8.3	236.9
18	SAP	2689	20793	4252	12.9	20.4	158.1	53	Juniper	913	4462	837	20.5	18.8	91.6
19	Hitachi	2544	76461	4597	3.3	0.1	180.7	54	Salesforce	875	6124	102	14.3	1.7	11.7
20	Canon	2504	28968	2708	8.6	9.3	108.1	55	Cerner	870	4065	717	21.4	17.7	82.4
21	Nokia	2502	13574	1842	18.4	13.6	73.6	56	Adv. Micro	870	3666	−308	23.7	−8.4	−35.4
22	EMC	2437	22691	3023	10.7	13.3	124.0	57	Sumitomo	845	22358	999	3.8	4.5	118.2
23	Alcatel	2409	14280	890	16.9	6.2	36.9	58	Twitter	826	2037	−413	40.6	−20.3	−50.0
24	Medtronic	2043	26484	4860	7.7	18.4	237.9	59	Freescall	817	4108	694	19.9	0.2	84.9
25	ZTE	1954	14176	955	13.8	6.7	48.9	60	Infineon	817	5795	557	14.1	9.6	68.2
26	Taiwan SEM	1827	23508	9104	7.8	38.7	498.4	61	Boston Sci	805	6868	944	11.7	13.7	117.4
27	SK Hynix	1543	14726	4180	10.5	28.4	270.9	62	LinkedIn	802	2747	−139	29.2	−5.0	−17.3
28	West Digital	1494	11935	754	12.5	6.3	50.5	63	Adobe	792	4405	831	18.0	18.9	104.9
29	Hon Hai	1463	124916	5219	1.2	4.2	356.7	64	NetApp	791	5094	426	15.5	8.4	53.9
30	Baidu	1444	9393	1651	15.4	17.6	114.3	65	Ricoh	778	15357	960	5.1	0.1	123.4
31	Mitsubishi	1426	33497	2296	4.3	6.9	161.0	66	SanDisk	768	5112	698	15.0	13.7	90.9
32	Micron Tec	1415	14873	2756	9.5	18.5	194.9	67	LAM	753	5406	987	13.9	18.3	131.0
33	MediaTek	1380	5943	727	23.2	12.2	52.6	68	Midea	745	18063	1845	4.1	10.2	247.7
34	Fujitsu	1371	36126	1113	3.8	3.1	81.1	69	Renesas	742	5285	788	14.0	14.9	106.2
35	Applied Mat	1332	8872	1387	15.0	15.6	104.1	70	NXP	734	5604	691	13.1	12.3	94.1

Note: Amazon is not presented because it did not meet the criteria of top 70 R&D-intensive firms in 2016, as its position was 95th. The same applies to GE, Toshiba and Alibaba.

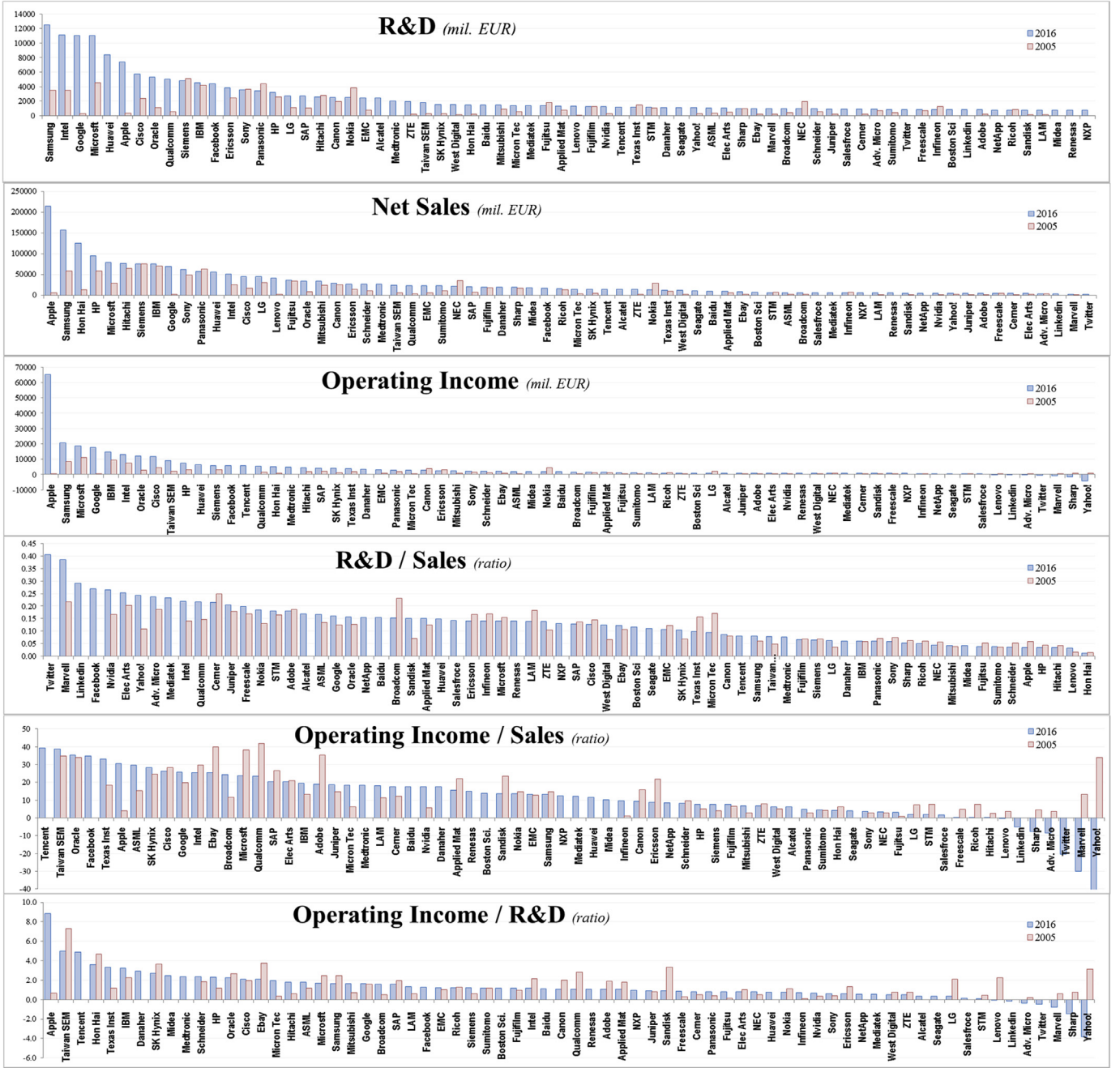


Fig. 4. Digital Business Structure in Global ICT Firms (Top 70 R&D intensive ICT firms in 2016).

and time trend (t)⁶ [42].

Given the logistic growth nature of ICT, increasing trajectory of S in global ICT firms can be depicted by the following R-driven logistic growth function:

⁶ ICT stock at time t can be measured by the following equation $T_t = R_{t-m} + (1 - \rho)T_{t-1}$ and $T_0 = R_{1-m}/(\rho + g)$. Then, $T_t = R_{t+1-m}/(\rho + g)$. When $t \gg m - 1$, $T_t \approx R_t/(\rho + g)$. R_t is generally proportional to time trend t in ICT firms. m : time-lag between R&D and commercialization,

ρ : rate of obsolescence of ICT, and g : growth rate of R&D at the initial period.

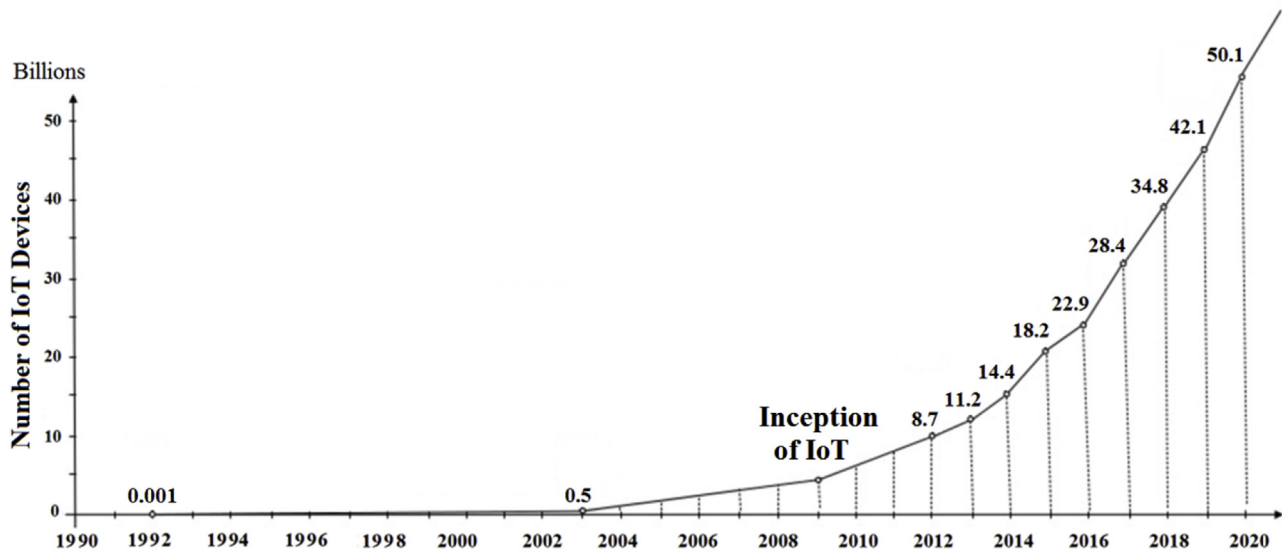
$$\frac{dS}{dR} = aS \left(1 - \frac{S}{N} \right) \quad (3)$$

where a : velocity of diffusion, and N : carrying capacity (upper limit of diffusion).

Given the global ICT firms, equation (3) can be approximated as follows [43].

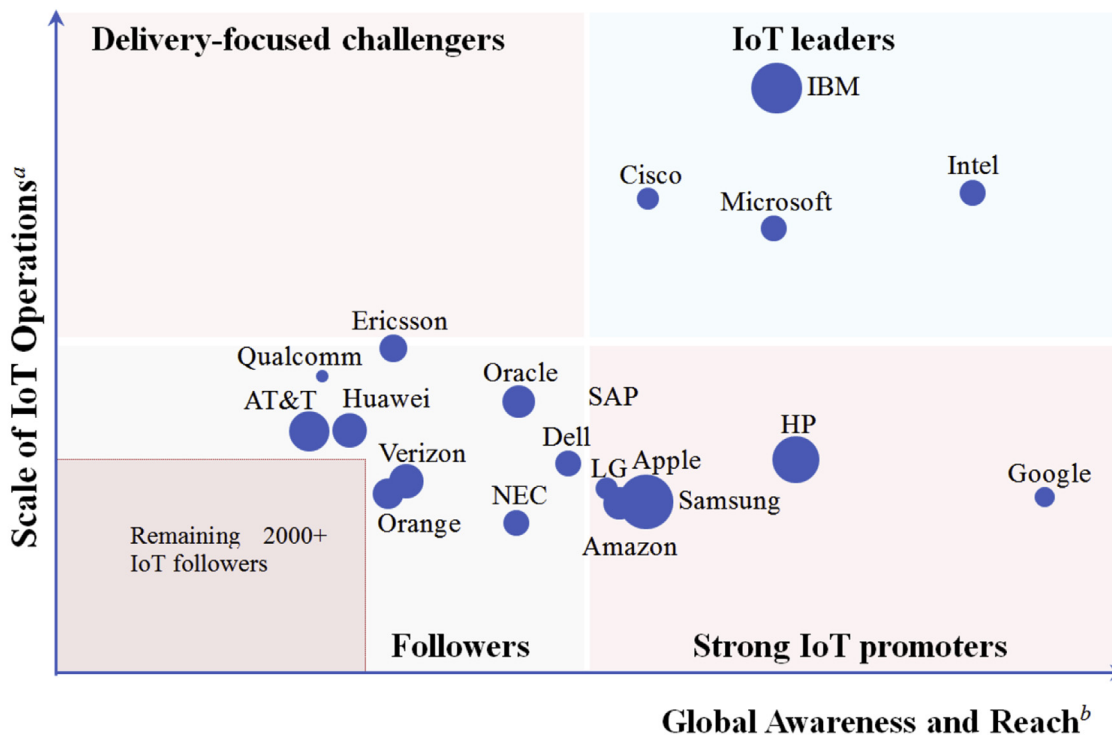
$$\frac{dS}{dR} = aS \left(1 - \frac{S}{N} \right) \approx \frac{\partial S}{\partial R} \quad (4)$$

Equation (3) is developed to the following simple logistic growth (SLG) function which incorporates special advantage in



a. Trend in Growth of the IoT Worldwide (1990-2020).

Source: The Connectivist (2014).



b. Leading Firms of the IoT (2015).

● Size of Firm (by number of all employees worldwide).

^a Measured by estimated number of employees performing IoT-related operations.

^b Measured by number of news appearances and related search engine inquiries.

Source: IoT Analytics (2015).

Fig. 5. Advancement of IoT initiated by global ICT firms (2015) [20,36].

Table 2
IoT endeavor of top 25 global ICT firms.

1	Samsung	ARTIK platform, smart home, and digital health devices
2	Intel	IoT hardware, new-generation low-power chips for connected IoT devices, Intel IoT platform for connecting the data from your things to the cloud, Intel Galileo developer kit
3	Google	Self-driving cars, home automation, IoT beacons, work on IoT standards, IoT cloud
4	Microsoft	Windows 10 IoT Core operating system, Microsoft IoT Central, Azure IoT suite
5	Huawei	Huawei IoT management platform and smart solutions (e.g., Smart water, smart parking, smart logistics, smart energy, internet of vehicles)
6	Apple	HomeKit smart home and HealthKit health tracking platforms
7	Cisco	Cloud-based IoT software platform, connectivity hardware, IoT-related services and consulting
8	Oracle	IoT cloud service platform
9	Qualcomm	IoT development platform, chips, security services, acquisition of connected assets from NXP
10	Siemens	IoT industrial platforms, IoT security services, connected industrial machines
11	IBM	IBM Watson IoT, cloud services
12	Facebook	Learning about different cultures, beliefs, histories and technologies
13	Ericsson	IoT accelerator
14	Sony	Acquisition of Altair Semiconductor for M2M and IoT, Sony Smart Home Automation, mixed-reality hardware, image sensing chips
15	Panasonic	Supportive technologies for IoT/robotics, smart electronics using IoT
16	HP	Edge computing technology, acquisition of Aruba Networks, HP's Helion cloud platform (an open-source dev-ready cloud platform aimed at connecting devices)
17	LG	LG CNS IoT platform, Smart Green Platform
18	SAP	SAP HANA Cloud Platform for the IoT
19	Hitachi	Lumada intelligent IoT platform
20	Canon	Fusing optical technologies with digital health-care
21	Nokia	Open innovation challenge to leverage IoT technologies enabling a smart, safe and sustainable world
22	EMC	New services framework including management of devices, connectivity, data and storage
23	Alcatel-Lucent	Network application challenge with new access switch added analytics and SDN (software defined networking) capabilities
24	Toshiba	Imbedding of sensors in data-collection devices, the real time processing of big data
25	Amazon	Amazon Web Services (AWS) IoT cloud, Amazon Echo home automation device, Amazon dash buttons

R&D investment level in 2016 order.

While firms 1–23 correspond to Table 1, 24 and 25 are not included in Table 1 (see footnote of Table 1).

assessing the state and prospect of productivity and development trajectory objectively:

$$S = \frac{N}{1 + be^{-aR}} \quad (5)$$

where b : coefficient indicating the initial state of the diffusion.

Given that $be^{-aR} = \frac{1}{x}$, marginal productivity of ICT can be depicted as follows:

$$\frac{\partial S}{\partial R} = aS \left(1 - \frac{S}{N} \right) = aN \cdot \frac{1}{1 + \frac{1}{x}} \left(1 - \frac{1}{1 + \frac{1}{x}} \right) = \frac{aN \cdot x}{(1 + x)^2} \quad (6)$$

(2) Empirical Analysis

Based on this analytical framework, development trajectory of global ICT firms over the period 2005 and 2016 was analyzed.

1) Specific features of global ICT firms

In conducting the analysis, following specific features of development trajectory identical to global ICT firms were carefully considered.

While digital innovation accelerates logistic growth of global ICT firms induced by logistic growth nature of ICT, this innovation emerges “mutation” firms with outlying behavior. They are generally newly founded young firms but expand at tremendous pace as demonstrated in Table 4 and Fig. 6.

In order to explore a new insight for ICT firms for their

transformative strategy toward an IoT-based society, objective state and prospect of productivity and development trajectory of global ICT firms general (not certain particular noting firms) should be analyzed not biased by particular gigantic “mutation” firms. However, since SLG function depends on fixed carrying capacity common to all firms analyzed resulting in biased estimate by highest development state in gigantic firms.

Fig. 6 allows us to imagine SLG estimation of R -driven development trajectory of 500 global ICT firms is biased by several gigantic firms with extraordinary high level of sales such as Apple, Samsung and Hon Hai while majority of 500 global ICT firms belong to the sales level below Euro 60 billion.

Aiming at avoiding such bias by certain gigantic firms, comparative assessment of the bias of gigantic firms in distorting R -driven development of the majority of 500 global ICT firms was conducted by treating gigantic firms that may distort such behavior as dummy variable in the SLG function. This comparative assessment identifies such gigantic ICT firms which have high variance from the general behavior of global ICT firms, and measures the magnitude of that variance, without which the highest representation of R -driven development trajectory can be analyzed by using SLG function (see the details of this treatment in Appendix B).

Table 5 summarizes the result of the comparative assessment.

Table 5 suggests that Case C (sales top 3 gigantic firms, Apple, Samsung and Hon Hai distort 500 global ICT firms' SLG trajectory most significantly) demonstrates statistically most significant.

2) Results of the analysis

By conducting the similar assessment, Table 6 tabulates results of the estimation of SLG function over the period of 2005 and 2016.

Table 3
Trend in market capitalization of global ICT Firms [16].

a Ranking of Global ICT Firms within Top 100 Firms		
2005	2010	2016
1 General Electric (2)	Microsoft (3)	Apple (1)
2 Microsoft (3)	Apple (10)	Google (2)
3 IBM (13)	General Electric (16)	Microsoft (3)
4 Intel (15)	Google (17)	Amazon (4)
5 Cisco (25)	IBM (21)	Facebook (6)
6 Dell (34)	Cisco (30)	Tencent Holdings (10)
7 Samsung (47)	Oracle (36)	Alibaba (12)
8 Nokia (50)	HP (38)	General Electric (13)
9 Siemens (55)	Intel (42)	Samsung (14)
10 HP (72)	Samsung (50)	Oracle (34)
11 eBay (82)	Siemens (63)	Intel (40)
12 Google (93)	Qualcomm (87)	Cisco (41)
13	Canon (98)	IBM (44)
14	Amazon (101)*	SAP (56)
15		Siemens (64)
16		Broadcom (93)

* While Amazon was ranked 101 in 2010, it is listed for reference, as it conspicuously jumped to rank 4 in 2016.

Firms marked in bold are newly ranked-in firms.

b Ranking of Global ICT Firms within Top 15 Firms		
2005	2010	2016
1 General Electric (2)	Microsoft (3)	Apple (1)
2 Microsoft (3)	Apple (10)	Google (2)
3 IBM (13)		Microsoft (3)
4 Intel (15)		Amazon (4)
5		Facebook (6)
6		Tencent Holdings (10)
7		Alibaba (12)
8		General Electric (13)
9		Samsung (14)

Figures in parentheses indicate market capitalization rank computed based on Forbes Global 2000 statistics.

Telecom firms are not included.

Source: Forbes Global 2000.

Table 4
Outlining features of top 5 global ICT firms.

	R&D	Sales	Operating income
Year of foundation	1 Samsung 1969	Apple 1976	Apple 1976
	2 Intel 1968	Samsung 1969	Samsung 1969
	3 Google 1998	Hon Hai 1974	Microsoft 1975
	4 Microsoft 1975	HP 1939	Google 1998
	5 Huawei 1987	Microsoft 1975	IBM 1911
Ratio of Top 1 and 10	2.6	3.5	8.9

All results are statistically significant.

3.2. Trend in marginal productivity of ICT in global ICT firms

3.2.1. Declining trend in the marginal productivity of ICT

Utilizing equation (6) in Section 3.1, Fig. 7 demonstrates a trend

in the marginal productivity of ICT in global ICT firms over the period 2005–2016. Fig. 7 demonstrates explicit bi-polarization between high R&D-intensive firms (HRIF: D_1 in Fig. 6) out of 500 global ICT firms and remaining low R&D-intensive firms (LRIF: D_2 and D_3 in Fig. 6). HRIFs have fallen into a vicious cycle between R&D investment centered by ICT and its marginal productivity, as the former increase results in declining the latter. On the contrary, LRIFs have been enjoying a virtuous cycle between them, as R&D increase leads to marginal productivity increase.

Fig. 8 compares this bipolarization between 2005 and 2016. Looking at Fig. 8, we note that the inflection point shifted slightly higher from EUR 2.0 billion in 2005 to EUR 2.1 billion in 2016, corresponding to the increase in R&D investment during this period. However, the maximum level of marginal productivity of ICT at the inflection point decreased during this period, reflecting the declining trend in this productivity in global ICT firms.

Table 7 compares HRIFs that have fallen into a vicious cycle between R&D investment and marginal functionality of ICT

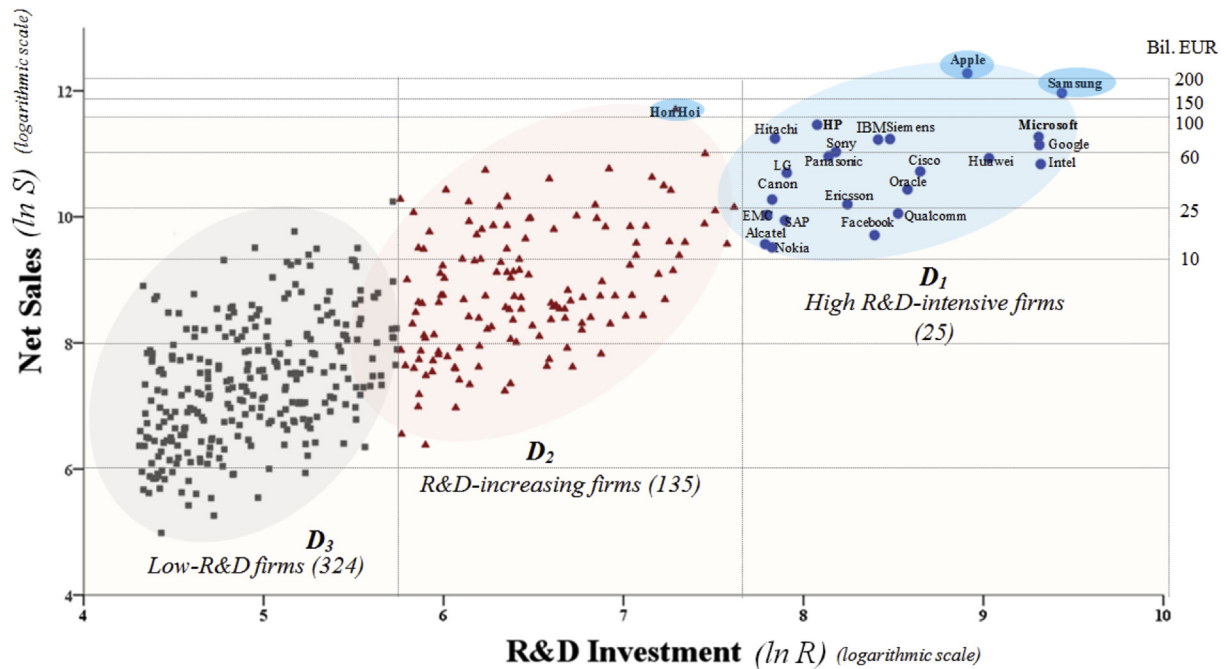


Fig. 6. Correlational Development between R&D and Sales in 500 Global ICT Firms (2016). 16 outliers scattered in D_2 and D_3 were not presented.

Table 5

Comparison of bias of gigantic firms in distorting R-driven SLG in majority of 500 global ICT firms (2016).

$$S = \frac{N}{1 + be^{-aR}} + cD$$

where S: sales, R: R&D investment, N: carrying capacity, a, b, c: coefficients, D: dummy variable ($D = 1$ for designated outlier firms, $D = 0$ for other firms).

	N	a	b	c	adj. R^2	*D (outlier firms treated by dummy variable)
A	68.72 (17.92)	1.21 (10.70)	16.36 (20.02)	96.87 (22.07)	0.695	Apple
B	58.24 (18.04)	1.44 (10.31)	15.55 (18.75)	97.82 (25.09)	0.734	Apple, Samsung
C	59.62 (17.39)	1.32 (10.98)	15.91 (21.87)	99.09 (29.74)	0.784	Apple, Samsung, Hon Hai
D	61.23 (16.77)	1.01 (10.72)	13.30 (21.63)	99.69 (29.22)	0.780	Apple, Samsung, Hon Hai, HP
E	50.38 (15.95)	1.33 (9.41)	12.71 (17.93)	90.72 (27.83)	0.766	Apple, Samsung, Hon Hai, HP, Microsoft
F	53.91 (14.63)	1.03 (9.27)	11.99 (18.87)	87.80 (27.79)	0.766	Apple, Samsung, Hon Hai, HP, Microsoft, Hitachi

*In addition to the above firms, Amazon and McKesson are included as outliers. The figures in parentheses indicate t-statistics: All are significant at the 1% level.

between 2005 and 2016. Numbers of HRIFs that have fallen into a vicious cycle have increased significantly from 16 in 2005 to 25 in 2016.

3.2.2. Structural source of decline in marginal productivity of ICT

Decline in marginal productivity of ICT can be attributed to the dependency on the Internet and its subsequent two-faced nature [47]. Advances in ICT can largely be attributed to the dramatic advancement of the Internet [17,27], which has changed the computer-initiated world significantly.

Advancement of ICT generally contributes to enhanced prices of technology by increasing new functionality development.⁷

⁷ Functionality development is generally defined as the ability to dramatically improve performance of production process, goods, and services by means of innovation [41].

However, the dramatic advancement of the Internet actually causes a decrease in the price of technology due to its nature of freebies, easy copying, and mass standardization [13,47]. Consequently, prices of technology in highly ICT-advanced firms change to a declining trend, as illustrated in Fig. 9.

3.2.3. ICT leaders endeavor against marginal productivity of ICT decline

Given that the firms seek maximum profit in the competitive market, marginal productivity of technology corresponds to relative price of technology (ratio of technology prices and prices of product). Therefore, the Internet-driven price decrease corresponds to marginal productivity decline.

This can be the structural source of marginal productivity decline in ICT leaders. Given such circumstances, ICT leaders endeavor to accelerate price increase by means of successive,

Table 6

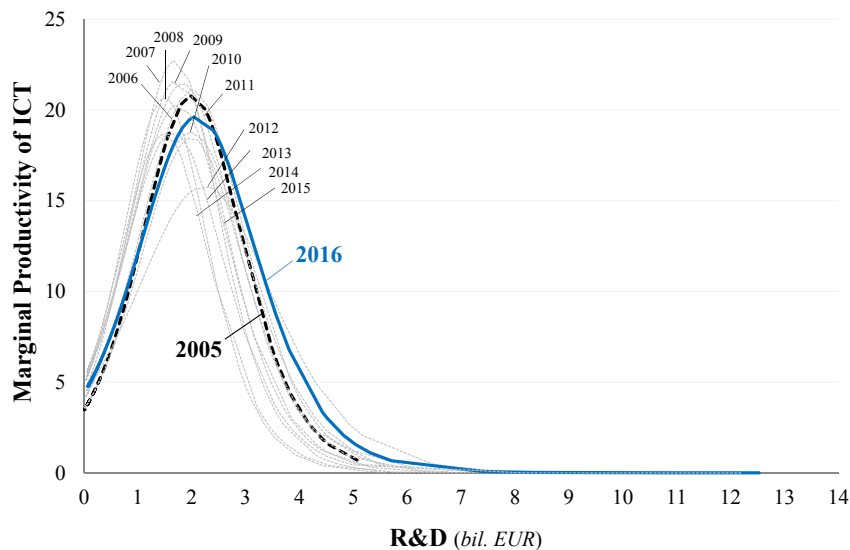
Estimation of development trajectory of the 500 global ICT firms (2005–2016).

$$S = \frac{N}{1 + be^{-aR}} + cD$$

where S : sales, R : R&D investment, N : carrying capacity, a, b, c : coefficients, D : dummy variable ($D = 1$ for designated outliers, $D = 0$ for other firms).

	N	a	b	c	adj. R^2	D (outlier firms treated by dummy variable)
2005	53.80 (21.18)	1.55 (16.96)	22.02 (29.44)	42.63 (18.13)	0.734	Dell
2006	57.62 (22.19)	1.47 (16.30)	18.97 (30.62)	51.13 (20.52)	0.757	General Electric, Dell
2007	52.67 (22.11)	1.73 (15.05)	18.51 (27.09)	53.86 (22.08)	0.735	Metro, General Electric
2008	45.55 (20.81)	1.81 (13.43)	15.06 (25.10)	54.97 (23.72)	0.741	Metro, General Electric, Siemens
2009	54.96 (20.07)	1.58 (12.91)	15.49 (25.34)	58.68 (22.20)	0.724	Metro, General Electric
2010	55.46 (17.26)	1.35 (13.84)	14.70 (27.25)	58.53 (24.34)	0.742	Metro, HP, General Electric
2011	58.59 (20.32)	1.46 (13.88)	14.57 (26.74)	61.07 (22.58)	0.738	Hon Hai, Metro, HP, General Electric
2012	55.55 (16.31)	1.14 (11.73)	12.56 (24.50)	65.44 (23.38)	0.727	Samsung, Apple, Hon Hai, Metro, HP
2013	49.11 (17.90)	1.53 (10.52)	12.56 (21.04)	74.38 (25.86)	0.730	Samsung, Apple, Hon Hai, Amazon, McKesson, Tesco
2014	44.14 (17.18)	1.69 (9.46)	12.42 (19.45)	73.88 (26.29)	0.725	Samsung, Apple, NTT, AT&T, Hon Hai, Amazon, Tesco
2015	53.22 (17.81)	1.53 (10.94)	14.37 (20.82)	82.98 (27.32)	0.739	Samsung, Apple, Hon Hai, Amazon, McKesson, Metro, Tesco
2016	59.61 (19.45)	1.32 (11.40)	15.94 (21.04)	99.09 (29.68)	0.784	Samsung, Apple, Hon Hai, Amazon, McKesson

The figures in parentheses indicate t-statistics: All are significant at the 1% level.

**Fig. 7.** Trend in marginal productivity of ICT in global ICT firms (2005–2016).

efficient, new functionality development by minimum expenditures and minimizing price-decrease factors by outsourcing them to other parties [47]. Activating the ICT-inherent self-propagating function can lead to increasing uncaptured GDP⁸ [49,51] as explained in Fig. 9.

⁸ Uncaptured GDP can be defined as added value providing utility (satisfaction of consumption) and happiness beyond economic value to people but cannot be measured by traditional GDP accounting (captured GDP) that measures economic value.

3.3. Trend in dependency on uncaptured GDP in the global ICT leaders

3.3.1. Self-propagating dynamism

As reviewed in 3.1, the development trajectory of the global ICT leaders can be traced by the R&D-driven simple logistic growth function, as depicted by equations (4) and (5). While the level of carrying capacity (N) is assumed constant through the development process in this function, in particular innovations, the correlation of the interaction between innovation and institutions

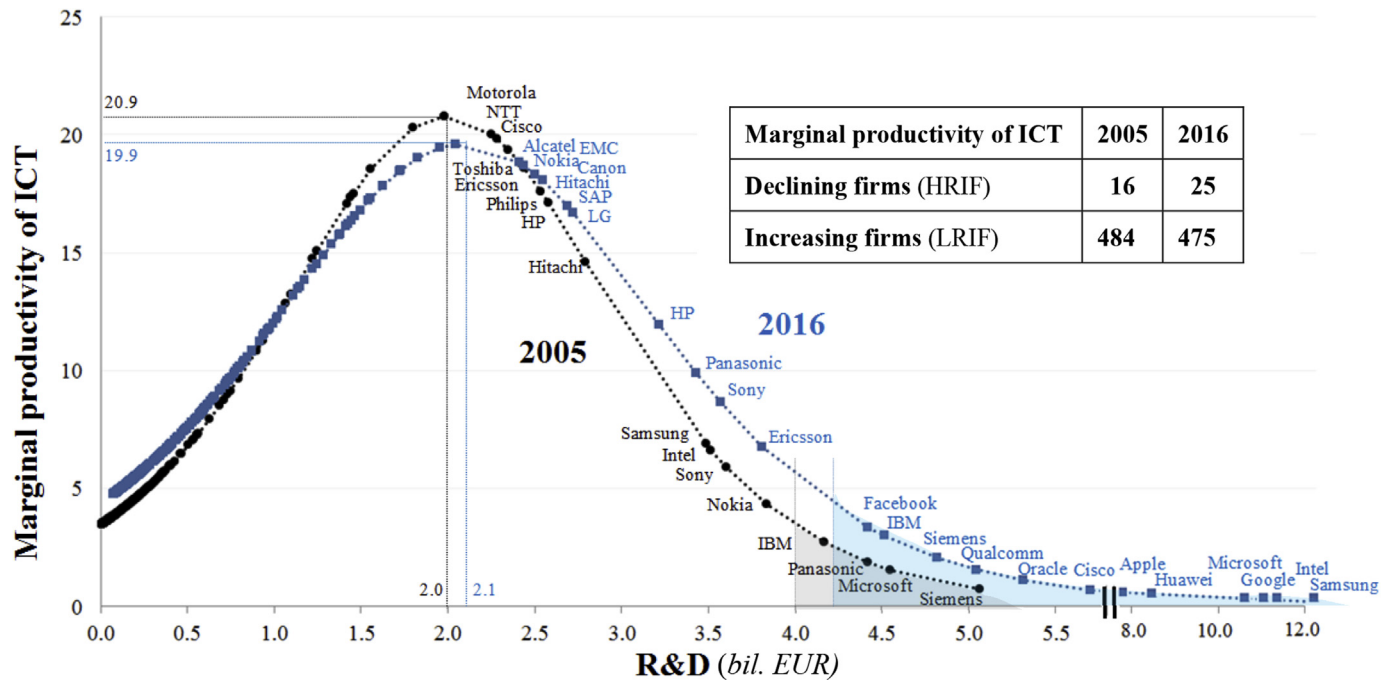


Fig. 8. Comparison of marginal productivity of ICT in 500 global ICT firms (2005, 2016).

Table 7

Comparison of HRIFs with R&D investment in 2005 and 2016.

	2005		2016	
	Firm	R&D (bil. EUR)	Firm	R&D (bil. EUR)
1	Siemens	5.06	Samsung Electronics	12.53
2	Microsoft	4.55	Intel	11.14
3	Panasonic	4.42	Google	11.05
4	IBM	4.17	Microsoft	11.01
5	Nokia	3.83	Huawei	8.36
6	Sony	3.60	Apple	7.41
7	Intel	3.52	Cisco Systems	5.70
8	Samsung Electronics	3.48	Oracle	5.32
9	Hitachi	2.79	Qualcomm	5.04
10	Hewlett-Packard	2.58	Siemens	4.82
11	Philips Electronics	2.53	IBM	4.51
12	Ericsson	2.44	Facebook	4.42
13	Toshiba	2.42	Ericsson	3.81
14	Cisco Systems	2.35	Sony	3.57
15	NTT	2.28	Panasonic	3.43
16	Motorola	2.25	Hewlett-Packard	3.22
17			LG Electronics	2.72
18			SAP	2.69
19			Hitachi	2.54
20			Canon	2.50
21			Nokia	2.50
22			EMC	2.44
23			Alcatel-Lucent	2.41
24			Toshiba	2.40
25			Amazon	0.59*

Order by level of R&D investment.

* Amazon is included in top 25 list as its market capitalization is conspicuous while its R&D investment is small and ranked 95th in 2016.

Note: blue color indicates 12 ICT firms with extraordinary high level of R&D.

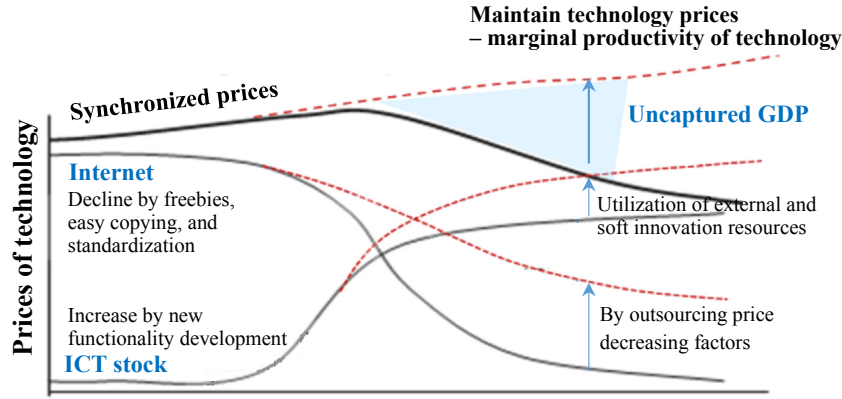


Fig. 9. Two-Faced Nature of ICT and Uncaptured GDP Emergence.

Note: At the initial stage of Internet commercialization, its price is extremely higher than that of ICT.

displays a systematic change in the process of growth and maturity. This leads to the creation of a new carrying capacity in the process of its development, similar to equation (7) as follows:

$$\frac{dS(R)}{dR} = aS(R) \left(1 - \frac{S(R)}{N(R)} \right) \quad (7)$$

This equation leads to the following logistic growth within a dynamic carrying capacity (LGDC) function, which demonstrates the level of carrying capacity enhancement as the development proceeds [29]:

$$S(R) = \frac{N_k}{1 + be^{-aR} + \frac{b_k}{1 - \frac{a_k e^{-aR}}{a}}} \quad (8)$$

where N_k : ultimate carrying capacity, and a_k and b_k : coefficients similar to a and b .

Equation (8) demonstrates that the third term of the denominator governs the dynamic carrying capacity and, without this term, results in SLG with a constant carrying capacity.

From equation (7), dynamic carrying capacity can be expressed as follows:

$$N(R) = S(R) \left(\frac{1}{1 - \frac{1}{a} \cdot \frac{dS(R)}{dR} / S(R)} \right) \quad (9)$$

This demonstrates that $N(R)$ increases together with that of $S(R)$ and its R&D-driven growth rate. This implies that the LGDC function demonstrates functionality development in the context of the self-propagating behavior [39,43].

This self-propagating function plays a vital role of the engine in spinning-off from the traditional co-evolutional of three megatrends in the world of the PoT⁹ to the new co-evolution toward the IoT, as illustrated in Fig. 1. This spin-off plays a significant role in inducing ICT-driven innovation [47,49]. Here, spin-off is defined as jumping to more sophisticated co-evolutional dynamism from traditional co-evolutional dynamism in inducing innovation [44].

Since the potential of functionality development can be traced by the ratio of development state and its upper limit (carrying capacity) [43], functionality development in the LGDC function can be depicted from equation (9) as follows:

Table 8

LGDC function in 500 global ICT firms in 2005 and 2016.

	N_k	a	b	a_k	b_k	adj. R^2
2005	75.28 (30.37)	1.27 (177.19)	26.65 (25.42)	0.35 (2.50)	0.34 (6.71)	0.999
2016	102.23 (178.83)	0.77 (26.13)	15.84 (9.72)	0.43 (7.06)	1.32 (2.53)	0.999

$S(R)$: sales; N_k : carrying capacity; R : R&D investment; a , b , a_k , b_k : coefficients.

Results are based on the third step approximation.

The figures in parentheses indicate t-statistics: All are significant at the 1% level.

$$\text{Functionality development} = FD = \frac{N(R)}{S(R)} = \frac{1}{1 - \frac{1}{a} \cdot \frac{dS(R)}{dR} / S(R)} \quad (10)$$

This equation demonstrates that functionality development can be accelerated as its growth rate increases. This explains functionality development in the context of self-propagating behavior. Since functionality development plays a locomotive role in leveraging spin-off [44], equation (10) indicates that the self-propagating function leverages spin-off by inducing functionality development (see Appendix C dynamism in developing self-propagating function).

With the understanding that this self-propagating function can be attributed to its adaptability to ICT-driven logistic growth within a dynamic carrying capacity (LGDC) function that increases functionality as it grows rather than a simple logistic growth (SLG) function that fades out functionality as it grows [39], Table 8 estimates the LGDC function of 500 global ICT firms in 2005 and 2016¹⁰ and results are statistically significant.

The self-propagating function can be attributed to dynamism of functionality development (FD) increase as growth proceeds (S increase) [40]. FD can be estimated by the ratio of N (carrying capacity) and S [43]. Therefore, the magnitude of the self-propagation function can be estimated by the ratio of $N_k(R)$ (dynamic carrying capacity that leads development trajectory after incorporating the self-propagating function) and $S_k(R)$ (development trajectory

⁹ Under the PoT, computer- and semiconductor-initiated mass production played a vital role.

¹⁰ Estimation of LGDC depended on the three-step approximation approach (see Appendix D).

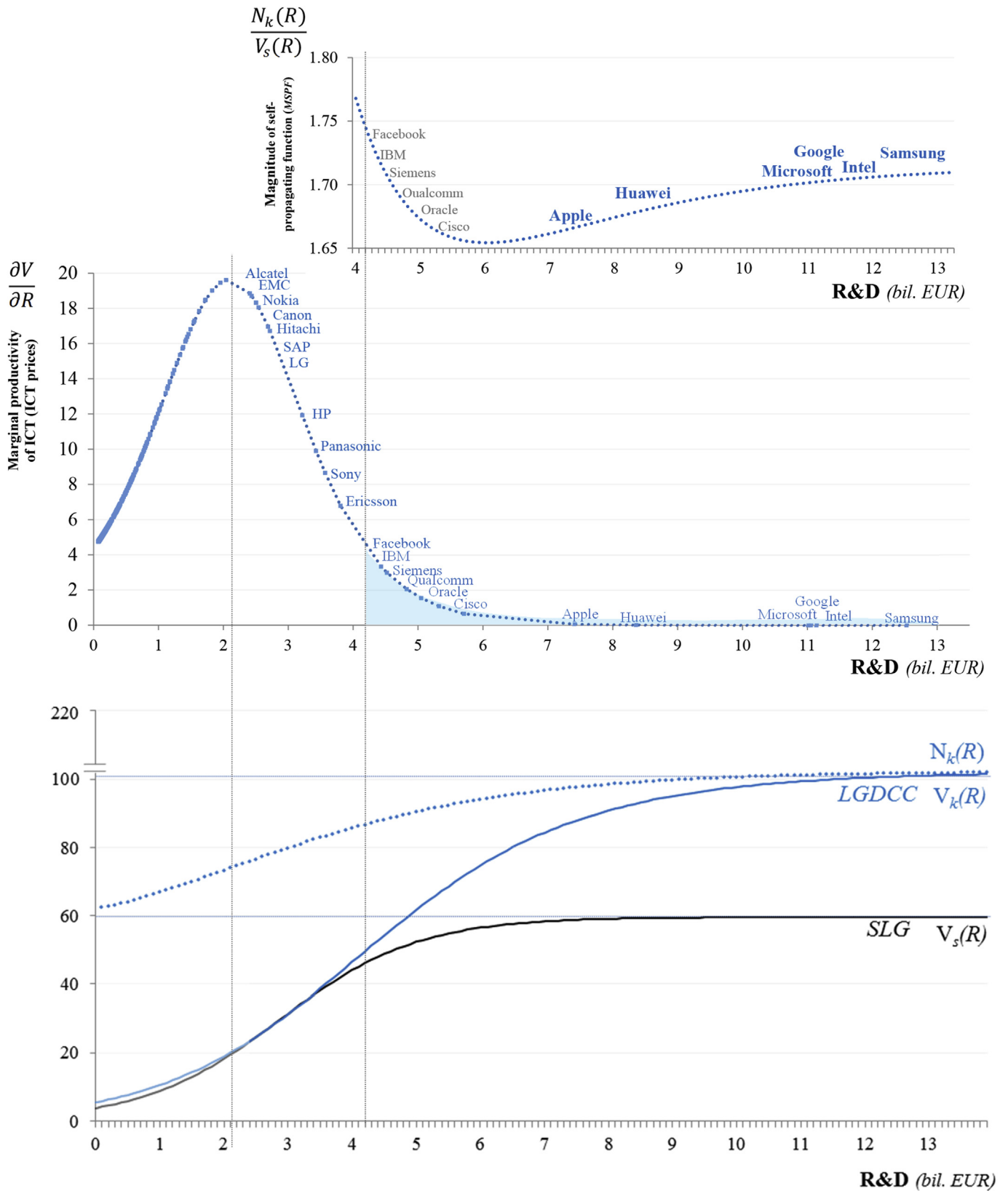


Fig. 10. Dynamism in Transforming Productivity Decline into Supra functionality (2016).
 –New Open Innovation by Harnessing Soft Innovation Resources.

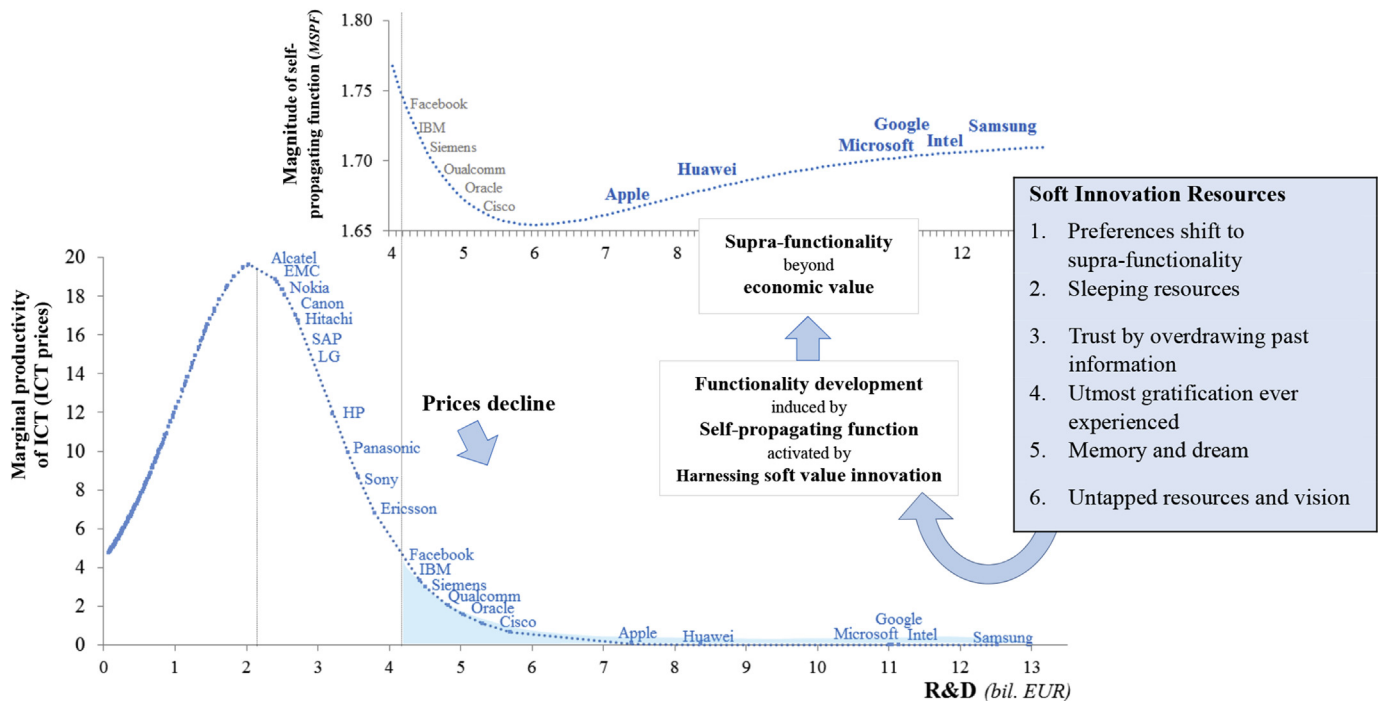


Fig. 11. Scheme of functionality development by harnessing soft innovation resources. –High R&D intensive global ICT firms (2016).

estimated by *SLG* that demonstrates development level when no self-propagating function incorporates) [53].

Fig. 10 demonstrates trends in marginal productivity of ICT and magnitude of the self-propagating function in global ICT firms in 2016. This figure shows that, in repulsion to marginal productivity of ICT decline, self-propagating function increase in high R&D-intensive global ICT firms such as Samsung, Intel, Google, Microsoft, Huawei and Apple. Thereby these firms correspond to peoples' preference shift to supra-functionality beyond economic value as demonstrated in Fig. 1. This survival strategy can be called the long tail of the global ICT leaders [2].

The above analyses demonstrate the following noteworthy structural changes in global ICT firms toward the IoT acceleration after 2010:

- Dramatic decrease in ICT prices
- Subsequent decline in marginal productivity of ICT
- Intensive efforts in increasing functionality development by activating the self-propagating function.

It is postulated that this activation can be attained by harnessing the vigor of soft innovation resources, including sleeping/untapped resources, thus leading to increasing dependency on uncaptured GDP.

The next section demonstrates this hypothetical view.

4. Functionality development and the transformative direction of innovation

4.1. Scheme of functionality development

Fig. 11 demonstrates the dynamism of functionality development (which presents supra-functionality beyond economic value) induced by the self-propagating function which can be activated by harnessing the vigor of the following soft innovation resources:

- People's preferences shift to supra-functionality beyond economic value
- Sleeping resources (similar to ridesharing revolution by Uber)
- Trust by overdrawing past information
- Utmost gratification ever experienced
- Memory and dream
- Untapped resources and vision

This can be attained in reaction to marginal productivity of ICT decline due to the high dependency on ICT that incorporates a two-faced nature.

4.2. Transformative direction of leading global ICT firms

With the understanding of such dynamism aiming at demonstrating that high R&D-intensive global ICT firms succeeded in harnessing the vigor of soft innovation resources, Table 9 reviews the transformative direction of seven leading global ICT firms in harnessing such innovation resources over the period 1970–2020.¹¹

Based on the preceding review, Fig. 12 summarizes the noteworthy transformative direction of ICT-driven disruptive business models accomplished by seven leading global ICT firms in response to marginal productivity decline. Such accomplishments are correlated with soft innovation resources identified as a soft value addition corresponding to uncaptured GDP and essential for the spin-off from traditional PoT-driven innovation to new IoT-oriented co-evolutional innovation as reviewed in section 1.6.

¹¹ Seven selected ICT firms include the top six high R&D-intensive firms in 2016 as demonstrated in Fig. 10 and Amazon. Amazon was included in this review due to its conspicuously high market value in 2016 (ranked fourth, see Table 2) while R&D investment was limited.

Table 9

Transformative direction of seven leading global ICT firms.

	1970–1980	1981–1990	1991–2000	2001–2010	2011–2020
1. Samsung	Mechatronics 1938: Samsung founded 1969: Samsung-Sanyo electronics established 1970: Black-and-white TV 1972: Washing machine Refrigerator 1977: Color television 1979: Microwave ovens	Computers 1980: Air conditioner 1983: Personal computers (PCs) 1984: Export of VCRs 1986: Smallest video tape recorder 1987: SAIT established	Mobile Phones, Digital TVs 1992: Mobile phones HDD, DRAMs Industrial robots China expansion 1993: Digital video recorder (DVD-R) 1994: Electric car (SEV-III) 1995: MPEG-3 technology 1996: Fastest CPU (alpha chip) 33" double-screen TV 1997: World lightest TVs 30" TFT-LCD display 1998: Digital TV, flat-screen TV 1999: Smartphone, wireless internet phone, multi-function phone 2000: 50 th millionth mobile phone	Smartphones, Smart TVs 2004: World largest LCD TV (46") Smartphones 2008: World's 1st dual-color bezel TV 2009: World's slimmest LED TV 2010: World's 1st TV app store World's 1st FHD 3D TV	Tablets, Wearables, VR, IoT 2011: Galaxy tablets Hard disk biz sold to Seagate 2012: Samsung and Apple patent infringement controversy Samsung shares on the KOSPI index fell 7.7% 2013: World's 1st curved TV 2014: Gear VR devices Galaxy Note 4 World's 1st bendable UHD TV Stopped music streaming business, Music Hub app 2015: Granted world's most patents World's largest curved UHD TV 2016: IoT, partnership with Microsoft Smartwatch (Gear Fit 2, etc.) Icon-X, Galaxy Note 7
2. Intel	Integrated Electronics 1968: Co-founded by Gordon Moore and Robert Noyce 1969: World's 1st MOS 1970: First property, first board 1971: New era in integrated electronics 1972: First international factory in Malaysia 1975: Computers get personal 1979: 486 th position in Fortune 500	Computer Boards, Chips 1982: PC industry takes off 1983: US\$1 billion annual revenue 1984: One of the 100 best companies to work for in America 1985: Super computer, Intel 386 processor 1987: Second-generation super computer 1988: Intel foundation established 1990: Robert Noyce died	Processors 1992: Largest semiconductor supplier in the world 1993: Intel Pentium processor 1995: Became a chipset leader 1998: Intel strong ARM processor 1999: Intel Pentium III, Xeon Processor 2000: Intel Pentium 4 processor	Cell Phone Microchips 2002: Hyper-threading technology, more power at lower cost 2003: Cellular phone microchips 2004: 46 th in Fortune 100 Best Companies to work for 2005: 40 th anniversary of Moore's law 2006: World's 1st quad-core processor 2008: 45-nm transistor 2009: Intel atom processor Going Green Paid US\$1.25 billion to AMD in lawsuit settlement 2010: Buys McAfee i7 Processor, Intel App-Up store	Supporting Technologies for IoT and Wearables 2011: Intel Ultrabook 2012: 450-nm manufacturing technology 2013: New generation of processors i3, i5, i7 2014: Intel Quark chip powering IoT and wearable devices 2016: Announces withdrawal from smartphone market
3. Google			Information Search 1998: Google founded 2000: World's largest search engine	Gmail, Earth, YouTube, Smartphones, OS, Apps 2001: Image Search 2002: Google News 2004: Gmail 2005: Google Earth, Maps, Talk, Video, Books, Mobile Search, Scholar 2006: Android, Google Trends 2007: YouTube 2008: Google Chrome, Street View 2009: Google Translate 2010: Google Nexus phone	Google (Play store, Glass, Balloons), Cloud, IoT 2011: Google Panda, acquired Motorola, Google + 2012: Google Play store 2013: Google Nexus 7 tablet Google Hangouts, Google Balloons 2014: 2015: 2016
4. Microsoft			Software	Software, Play Stations	Cloud, Platforms, Analytics, IoT

(continued on next page)

Table 9 (continued)

	1970–1980	1981–1990	1991–2000	2001–2010	2011–2020
	1975: Microsoft founded 1979: Shifted from New Mexico to Washington	1981: Microsoft incorporates IBM 1st PC with MS-DOS 1.0 1986: Moves to Redmond, Washington Microsoft stock goes public 1989: Earliest version of Office suite 1990: Microsoft launches Windows 3.0	1995: Microsoft launches Windows 95 Bill Gates outlines Microsoft's commitment to the Internet 1998: Microsoft launches Windows 98 2000: Steve Ballmer named president and CEO for Windows 2000	2001: Windows XP, Office XP Xbox play station 2002: Tablet PC 2003: Windows Server 2003 MS Office System 2004: Xbox 360 next generation 2006: Zune music player 2007: Windows Vista MS Office 2007 2008: Windows server, SQL server Visual Studio 2010: Windows phone OS MS Office 2010	2011: Windows Phone, Xbox Kinect Office 365 2012: Surface tablets Windows 8, Windows phone 8, Windows Server 2013: Surface 2, Pro 2, Xbox one Office 2013 2014: Buys Nokia devices & services Buys Minecraft, Office iPad, Android, Surface Pro 3 2015: Windows 10, Office 2016, Lumia 950, Lumia 95 XL Surface 3, Pro 4 2016: LinkedIn, Surface Studio, Dial, Book, Visual Studio 2017 Smartphones, Cloud, IoT
5. Huawei		Distributor 1988: Huawei founded as distributor of imported PBX products	Fixed-Line and Digital Network Products 1993: Digital telephone switch with capacity over 10,000 circuits 1996: Wins first big overseas contract for fixed-line network products from Hong Kong's Hutchison-Whampoa	Mobile Networks 2003: Joint venture with 3Com Cisco Systems sues for copyright violations 2004: Overseas sales surpass domestic sales for first time 2008: Contract orders rose 46% to US\$23.3 billion World's 3rd largest mobile network gear maker 2009: World's top patent seeker Head the UN WIPO list iPod, iTunes, Smartphones, Tablets 2001: iPod 1st gen 2002: iPod 2nd gen, iPod 14", iMac 2003: iPod 3rd gen, PowerBook G4 2004: iPod Mini (1st gen) iPod (4th gen) 2005: iPod Mini, (2nd gen) iPod Nano (1st gen) iPod (4th gen) iPod Shuffle 2006: MacBook Pro (15", 17") iPod Hi-Fi, iPod Nano (2nd gen) iPod Shuffle (2nd gen) 2007: Apple TV (1st gen) iPhone (4, 8 GB) 2008: iPhone 3G (8, 16 GB) iPhone (16 GB) 2009: iPhone 3 GS 2010: iPad (WiFi + 3G), iPhone 4 Top Online Retail Store	2011 2012 2013 2014 2015: Smartphones, Huawei P8 Huawei P8 Max
6. Apple	Computers, Printers 1976: Apple I 1977: Apple II 1978: Apple (Writer, file type) 1979: 1980: Apple III	Computers 1981: Apple ProFile 1982: Apple printers (dot matrix, letter quality)	Laptop Computers 2000: PowerBook Prismo Cinema Display 22"	Smart Devices, Platforms, IoT 2011: iPad 2 (16, 32, 64 GB) iPhone 4S 2012: iPad, iPad Mini, iPhone 5 2013: iPhone 6, iPhone 6 Plus iPad Air 2, iPad Mini 3 2014: Apple Watch, iPhone 6S iPad Mini 4, iPad Pro 2015: iPhone 7, iPhone 7 Plus iPad Pro	
7. Amazon			Book Store 1995: Amazon launched 1997: Amazon on NYSE, Nasdaq Buys bookpages.co.uk Launches Amazon UK 1998: CDs and DVDs 1999: Toys and electronics	2000: Marketplace, Amazon's third-party business A to the Z in Amazon launches 2001: Takeover Borders.com	Fusing Physical and Digital 2011: Kindle Fire tablet 2012: Buys Kiva, a robotics company, for US\$775 million to contain technology just for itself 2013: Big cloud systems contract of

Table 9 (continued)

1970–1980	1981–1990	1991–2000	2001–2010	2011–2020
			Borders collapses 10 years later Amazon makes its first profit 2002: Amazon Web Services cloud computing platform 2003: Selling jewelry 2004: Selling shoes 2005: Amazon Prime membership 2006: Amazon Fresh (food online) 2007: Kindle e-reader 2008: Games 2009: Buys Zappos 2010: Logistics infrastructure scaling Amazon Studios to create original television content	US\$600 million for 17 US intelligence agencies Prime Air drone delivery plans 2014: Amazon Echo voice device 8 th generation fulfillment centers 2015: Amazon brick-and-mortar store Amazon Flex a-piece-rate delivery (Uber model) Amazon passes Walmart in market capitalization 2016: Amazon captures 50% of online spending in US Amazon doubles its distribution facilities 2017: Amazon buys Whole Foods

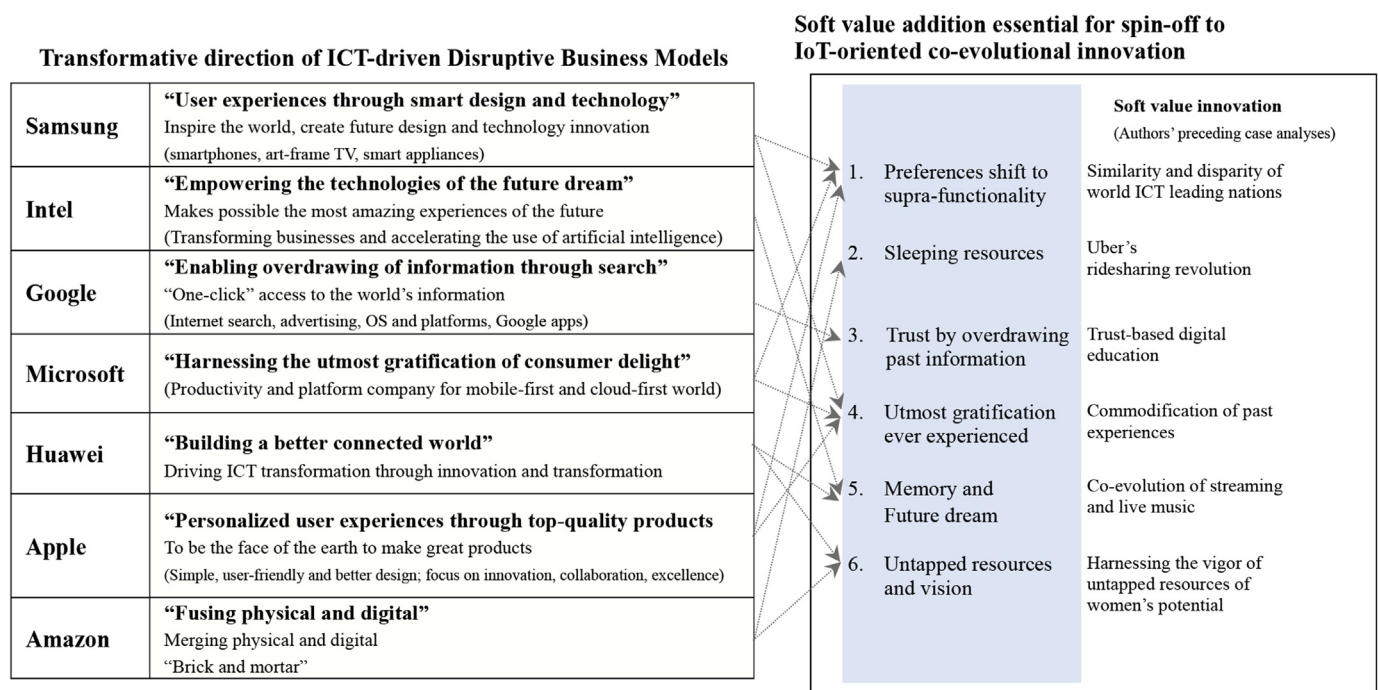


Fig. 12. Noteworthy direction of ICT-driven disruptive business models.

With respect to the transformative direction of IDBM, all seven leading global ICT firms demonstrate their success in harnessing the vigor of the soft innovation resources identified as soft value-addition corresponding to uncaptured GDP and an essential element for the spin-off from traditional PoT-driven innovation to a new IoT-oriented co-evolutional innovation.

4.3. Noteworthy lessons for harnessing the soft innovation resources

Supported by the success of self-propagating functionality development by harnessing the soft value innovation resources as demonstrated by seven leading global ICT firms, the transformative direction of trust-based IDBM with CCSD can be envisioned as illustrated in Fig. 13.

Soft innovation (Authors' preceding case analyses)		Past	Current	Future
		PoT Captured GDP Economic functionality	IoT Uncaptured GDP Supra-functionality	Beyond IoT New concept of GDP Digital supra-functionality
1.	Similarity and disparity of world ICT leaders			
2.	Uber's ridesharing revolution	Sleeping resources (cars, drivers)	Effectively utilization of sleeping resources through technology platforms Trust-based tripartism cooperation frameworks	Driverless cars Autonomous electric taxi fleets In-road inductive charging
3.	Trust-based digital education	Knowledge and experiences	Overdrawing of past information, developing trust	AI, VR Realtime language processing Teaching avatar assistants Brain computer interfaces Machines gain statistical intuition
4.	Commodification of past experiences	Utmost gratification ever experienced	Conceptualization of invisible voice of consumers	Commodification of experiences
5.	Co-evolution of streaming and live music	Past unforgettable memories and experiences	Invoking memories Live entertainment Participative creativity Synthesizing future dream	Collaborative value creation Virtual participation Augmented reality Machine-generated art and music
6.	Harnessing the vigor of un-tapped resources by activating women's potential	Untapped resource Domestic responsibilities Limited participation and opportunities	Harnessing the women's potential Giving responsibilities Gender-balance equality	Ambitious vision for harnessing women's potential together with men to generate economic and social value

Accomplishments by Seven Leading ICT Firms

Noteworthy accomplishments initiated by the seven leading global ICT firms	Samsung	"User experiences through smart design and technology" Inspire the world, create future design and technology innovation (smartphones, art-frame TV, smart appliances)
	Intel	"Empowering the technologies of the future dream" Makes possible the most amazing experiences of the future (Transforming businesses and accelerating the use of artificial intelligence)
	Google	"Enabling overdraw of information through search" "One-click" access to the world's information (Internet search, advertising, OS and platforms, Google apps)
	Microsoft	"Harnessing the utmost gratification of consumer delight" (Productivity and platform company for mobile-first and cloud-first world)
	Huawei	"Building a better connected world" Driving ICT transformation through innovation and transformation
	Apple	"Personalized user experiences through top-quality products" To be the face of the earth to make great products (Simple, user-friendly and better design; focus on innovation, collaboration, excellence)
	Amazon	"Fusing physical and digital" Merging physical and digital "Brick and mortar"

Fig. 13. Transformative direction of trust-based ICT-driven disruptive business models with consolidated challenge to social demand.

5. Conclusion

This analysis focused on the increasing significance of the restructuring of business models in the global ICT firms toward an IoT-based society, the dynamism emerging this transformation, and optimal digital business strategies corresponding to this dynamism.

An empirical analysis was conducted by evaluating digital business solutions in 500 global ICT firms over the period 2005–2016 with special attention to their specific features initiated by particular gigantic "mutation" firms.

5.1. Noteworthy findings include

- R&D-intensive firms have fallen into a trap in ICT advancement resulting in declining their marginal productivity of ICT and suggest a new productivity paradox in the digital economy.
- This can be considered a consequence of two-faced nature of ICT, which, together with people's preference shift to supra-functionality beyond economic value, leads to increasing dependency on uncaptured GDP.
- To counterchallenge such situation these firms endeavor to activate the self-propagating function that induces functionality development sublimating sophisticated digital business strategies.
- This activation can be achieved by harness the vigor of soft innovation resources.
- This dynamism can be considered the soft value addition corresponding to uncaptured GDP.
- Firms with higher market value increase the self-propagating function efficiently which, in turn further increase their market value.

- This can generally be attributed to their sophisticated digital business strategies in increasing the high level of operating income to R&D.

These findings give rise to the following insightful suggestions to global ICT firms for transformation of their business models toward an IoT-based society:

- The significance of the transformation from traditional ICT-driven functionality development strategy to digital business strategy should be recognized.
- A trap in ICT advancement and subsequent increasing dependency on uncaptured GDP should be realized.
- High functionality development induced by a sophisticated self-propagating function should be endeavored by recognizing the consequences of uncaptured GDP.
- It should be noted that higher operating income corresponds to higher market value.
- Trust-based IDBM with CCSD should be realized corresponding to a business model inducing a sophisticated self-propagating function.
- Every effort should be focused on effective utilization of soft-innovation resources to correspond to the effects of uncaptured GDP.

This analysis explores a new insight for ICT firms for their transformative strategy toward an IoT-based society. Future work should focus on detailed case analyses on further exploring the soft-innovation resources beyond anticipation suggested by the success and failure of other firms in addition to the seven ICT firms examined in this paper. In this context, Amazon's unique business model which accomplishes extraordinary digital value notwithstanding limited R&D investment should be further elucidated.

The further identification of similar novel business concepts as suggested by the seven leading global ICT firms (e.g., “overdrawing information through search”, “merging net and real”, and “fusing art and technology”) should be made a priority.

The development of road maps toward the envisioned future would be another important responsibility and subject for future research. Challenge to the limitation of GDP in the digital economy would correspond to the current worldwide concerns.

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Appendix A. Influence of R&D-driven growth in global ICT firms

Given that sales (S) of the global ICT firms are governed by their ICT stock (T), their sales can be depicted as follows:

$$S = F(X, T) \quad (\text{A.1})$$

where X : production factors other than T .

This equation can be approximated as follows by conducting Taylor expansion to the first term

$$\ln S = a + b \ln X + c \ln T \quad (\text{A.2})$$

where a, b, c : coefficients.

Since X is governed by T in global ICT firms, it can be developed as follows:

$$X = F(T) \ln X = ax + bx \ln T \quad (\text{A.3})$$

where a_x, b_x : coefficients. By substituting equation (A3) for $\ln X$ in equation (A2), $\ln S = a + b(a_x + b_x \ln T) + c \ln T$.

$$\begin{aligned} &= (a + b \cdot a_x) + (b \cdot b_x + c) \ln T \\ &\equiv \alpha + \beta \ln T \end{aligned} \quad (\text{A.4})$$

where. $\alpha = a + b \cdot a_x, \beta = b \cdot b_x + c$

Since (T) can be approximated by R&D investment (R) as follows (see footnote 5):

$$T \approx \frac{R}{\rho + g} \quad (\text{A.5})$$

where ρ : rate of obsolescence of technology and g : increased rate of R&D investment at the initial stage.

Therefore, equation (A4) can be described as follows:

$$\ln S = \alpha + \beta \ln \frac{R}{\rho + g} \quad (\text{A.6})$$

$$= \alpha + \beta \ln R - \beta \ln(\rho + g)$$

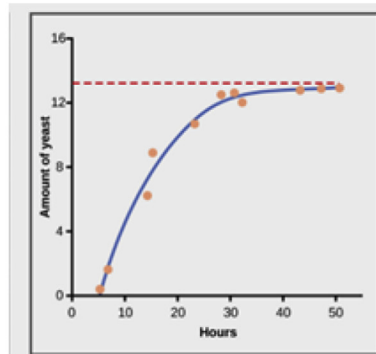
$$= [\alpha - \beta \ln(\rho + g)] + \beta \ln R$$

$$\equiv \alpha' + \beta \ln R$$

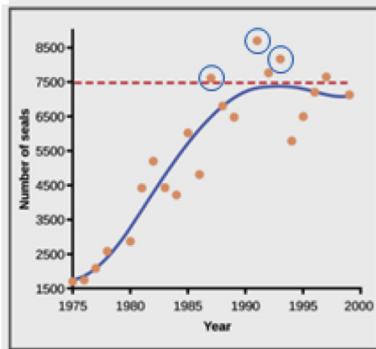
where. $\alpha' = \alpha - \beta \ln(\rho + g)$

With such understanding, correlation between (R) and (S) in 500 global ICT firms was analyzed in section 2.1.

Appendix B. SLG (simple logistic growth) estimate with dummy variables



(a)



(b)

(a) Yeast grown in ideal conditions in a test tube show a classical S-shaped logistic growth curve (SLG), whereas

(b) Natural population of seals shows real-world fluctuation.

(c) Population growth estimate avoiding bias by unusual level (c.f. outlier expansion of gigantic firms) by means of dummy variable treatment.

Sources

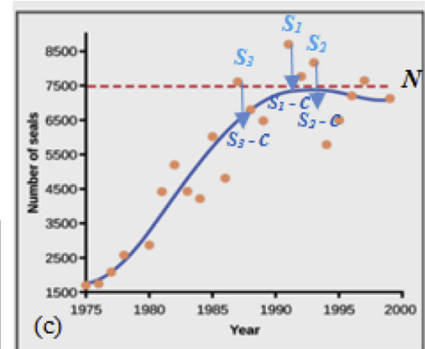
(a) and (b): Environmental limits to population growth by OpenStax College, Biology, CC BY 4.0.

(c): Authors interpretation and development

Treatment of bias avoidance by means of SLG with dummy variables

$$S = \frac{N}{1 + be^{-aR}} + cD$$

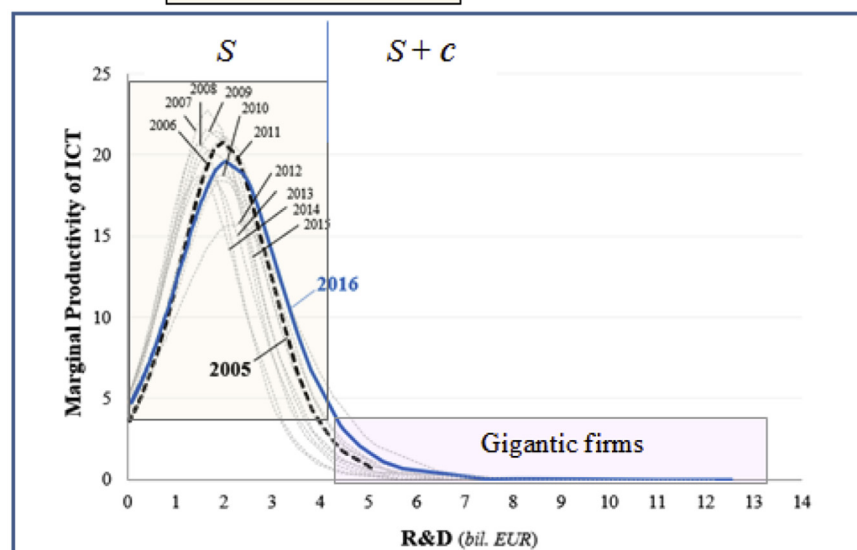
Un-usual	S	Dummy variable D			Others	Adjusted S
		X ₁	X ₂	X ₃		
X ₁	S ₁	1	0	0	0	S ₁ - c
X ₂	S ₂	0	1	0	0	S ₂ - c
X ₃	S ₃	0	0	1	0	S ₃ - c



(c)

Marginal productivity of ICT

$$\frac{\partial S}{\partial R} = aS \left(1 - \frac{S}{N} \right)$$



– Avoidance of Bias by Gigantic Firms in SLG Estimation

Appendix C. Dynamism in developing self-propagating function

Diffusion trajectory of innovative goods Y Simple Logistic Growth (SLG) with fixed carrying capacity (N)

$$\frac{dY(t)}{dt} = aY(t)\left(1 - \frac{Y(t)}{N}\right)$$

Particular innovation which create new N during the process of diffusion.

$$\frac{dY(t)}{dt} = aY(t)\left(1 - \frac{Y(t)}{N(t)}\right)$$

Carrying capacity increases as Y increases.

$$N(t) = Y(t) \left(\frac{1}{1 - \frac{1}{a} \cdot \frac{\Delta Y(t)}{Y(t)}} \right)$$

Step 2. Estimate a'_e , b'_e by using plausible $N_{\pm e}$

Estimate S in logistic growth with dynamic carrying capacity (LGDCC)

$$\bar{S} = \frac{N_{\pm e}}{1 + b'_e e^{-a'_e R}}$$

$$Y(t) = \frac{N}{1 + b e^{-at}}$$

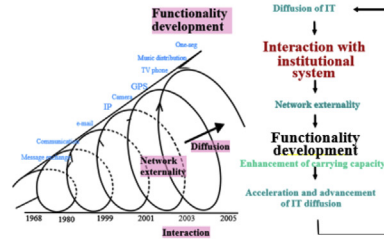
Logistic Growth within a Dynamic Carrying Capacity (LGDCC)

$$Y = \frac{N_k}{1 + b e^{-at} + \frac{b_k}{1 - a_k/a} e^{-a_k t}}$$

Functionality spirally increases as Y increases.

$$FD = \frac{N(t)}{Y(t)} = \frac{1}{1 - \frac{1}{a} \cdot \frac{\Delta Y(t)}{Y(t)}} \quad \Delta Y(t) = \frac{dY(t)}{dt}$$

Generate self-propagating dynamism



Appendix D. Three-step approximation approach of logistic growth within a dynamic carrying capacity

$$S = \frac{N_k}{1 + b e^{-aR} + \frac{b_k}{1 - \frac{a_k}{a} e^{-a_k R}}}$$

$$\approx \frac{N}{1 + b' e^{-a' R}}$$

$$a' = a \left(1 - \frac{b_k}{b} \right) < a,$$

$$b' = b \left(1 + \frac{b_k}{b} \cdot \frac{1}{1 - \frac{a_k}{a}} \right) > b$$

Source [43].

Step 1. Estimate simple logistic growth (SLG)

$$S_{(Actual)} = \frac{N_{\pm e}}{1 + b' e^{-a' R}}$$

Step 3. Estimate LGDCC by using \bar{S}

$$\bar{S} = \frac{N_k}{1 + b e^{-aR} + \frac{b_k}{1 - \frac{a_k}{a} e^{-a_k R}}}$$

Appendix A. Supplementary data

Supplementary data related to this article can be found at <https://doi.org/10.1016/j.techsoc.2017.11.003>

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