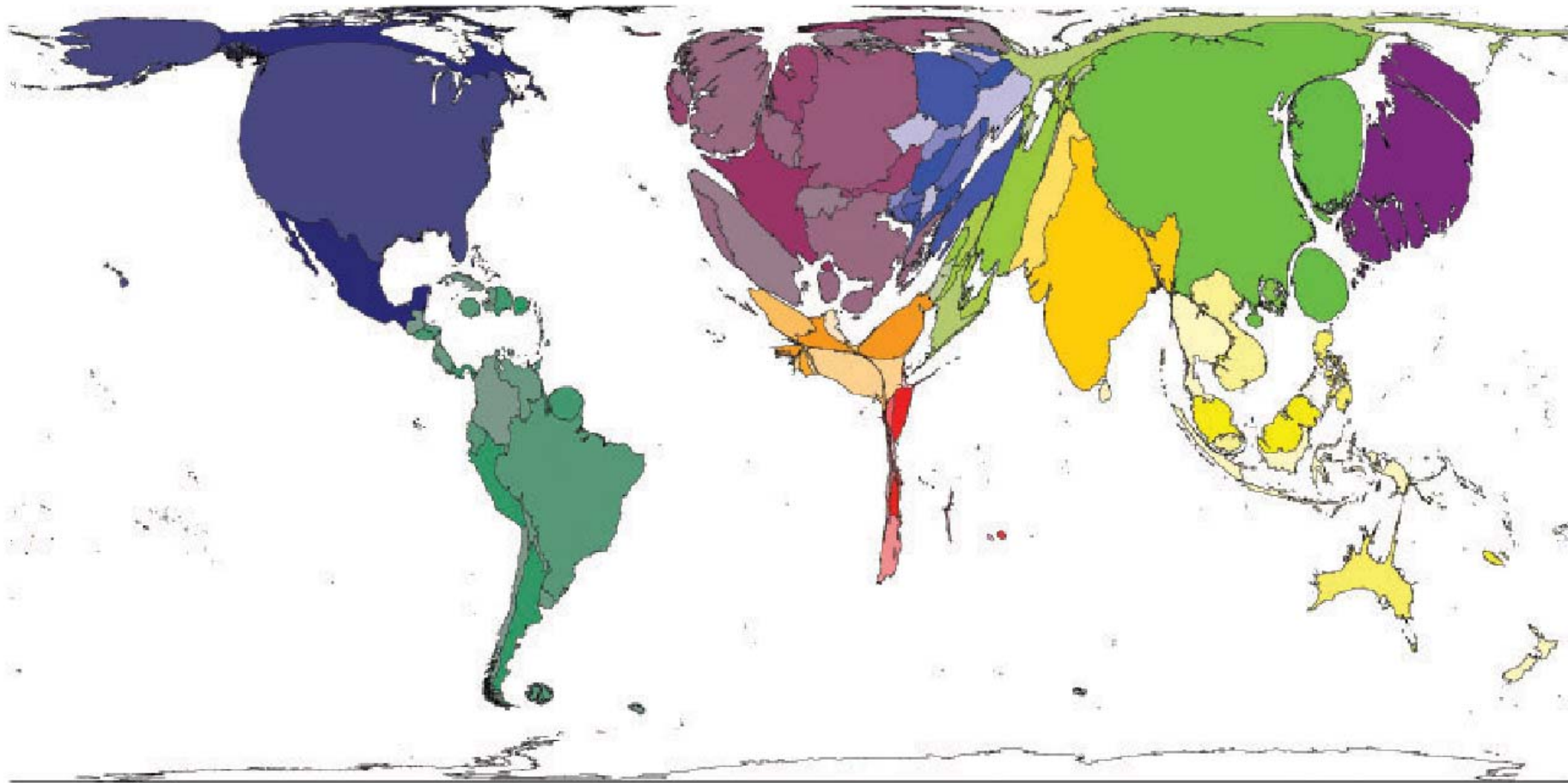


# Measuring digital development for policy-making: Models, stages, characteristics and causes

Ismael Peña-López  
Internet Interdisciplinary Institute  
Universitat Oberta de Catalunya

PhD Thesis Defence  
Barcelona, September 8th, 2009



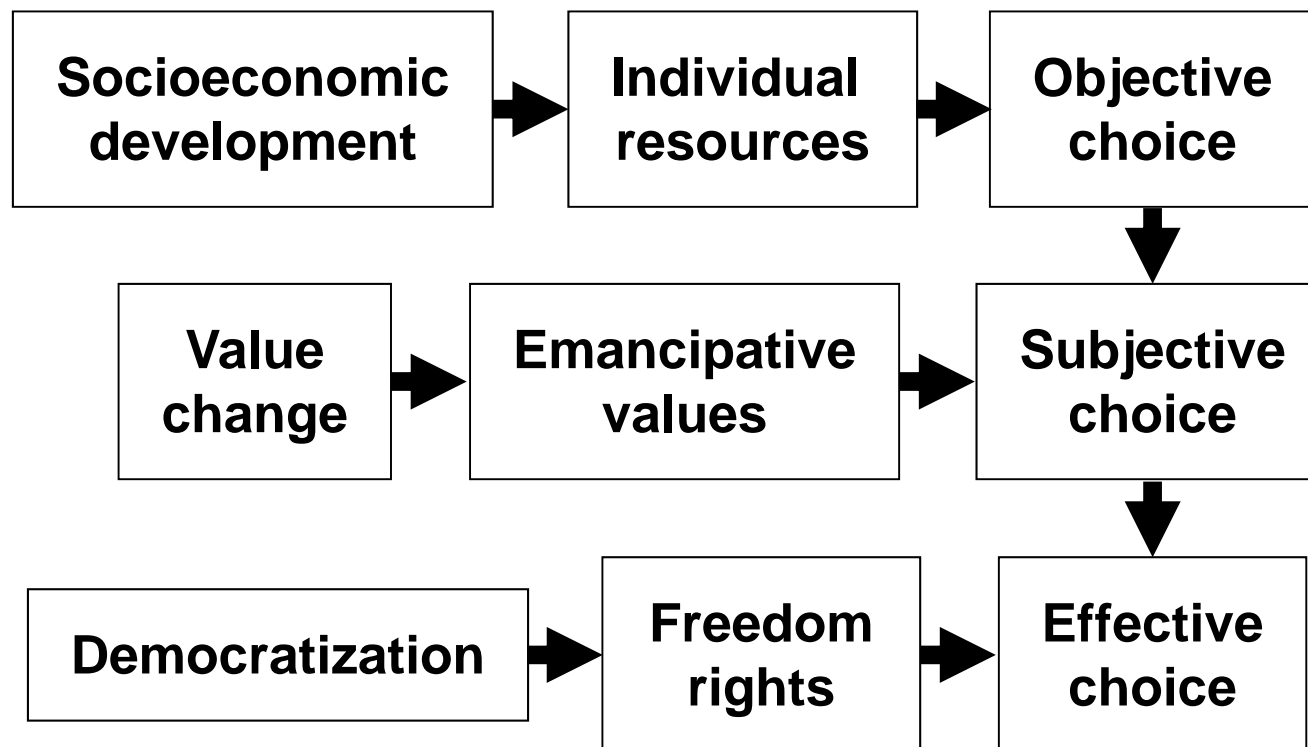
Internet Users Year 2007

# Index

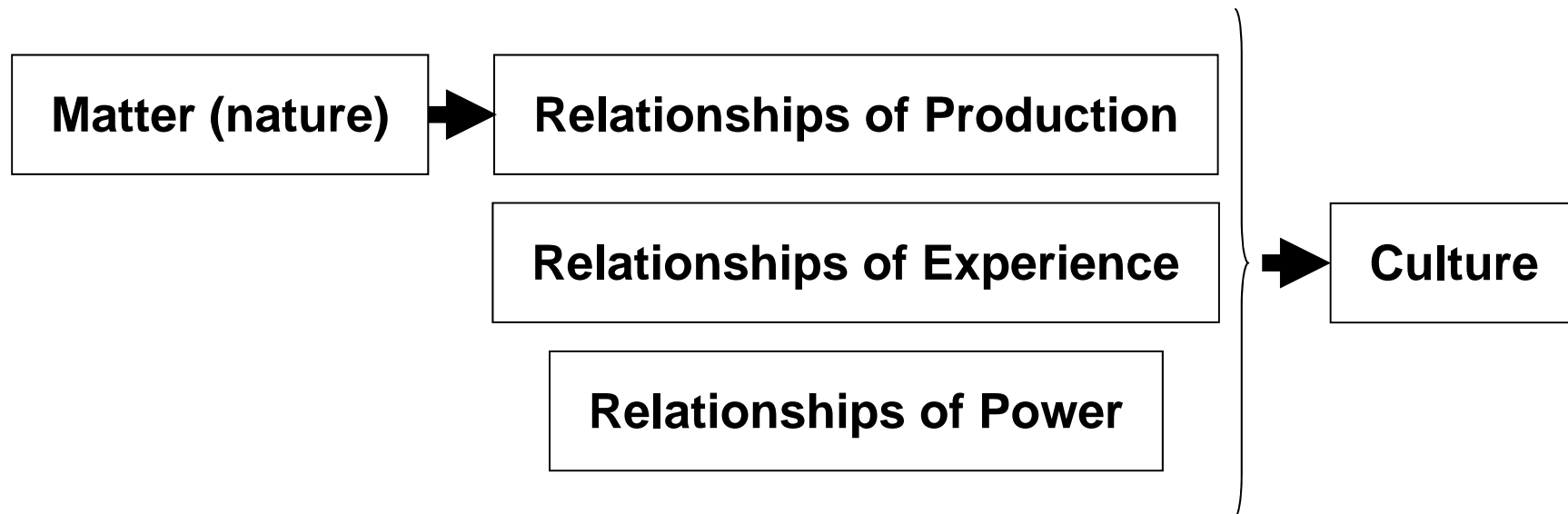
1. Why this research
2. Hypotheses
3. Methodology
4. Results
  - a) Qualitative analysis
  - b) Quantitative analysis
5. Conclusions
6. Future lines of research

# Why this research

# Components of human development



# Social structures (& Network Society)



## The Digital Economy as an enabler

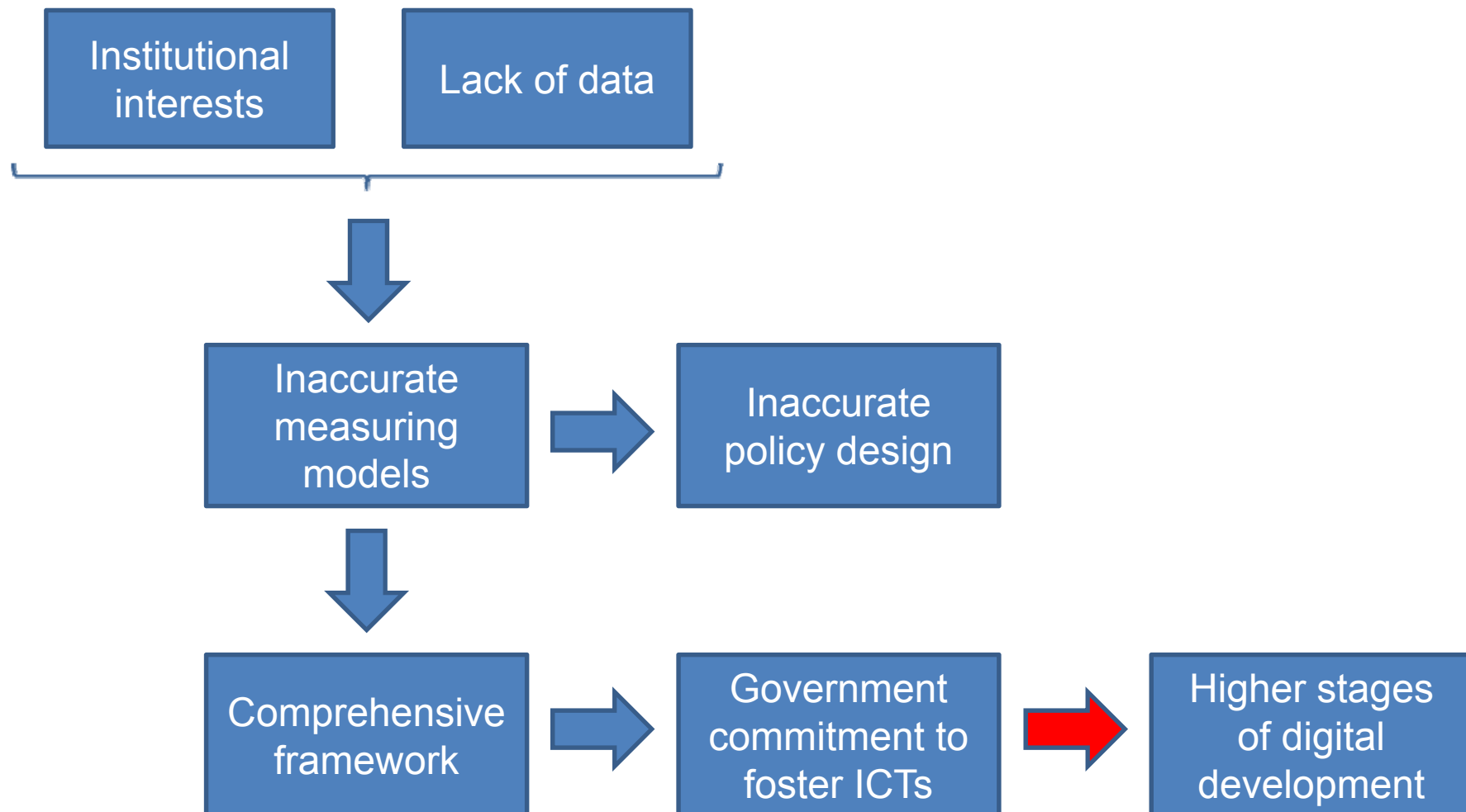
<b>Development</b>	<b>The Digital Economy</b>	<b>Network Society</b>
Socioeconomic Development (individual resources)	INFRASTRUCTURES	Matter (nature)
	ICT SECTOR	Production
Value Change (emancipative values)	(DIGITAL) LITERACY	Experience
Democratization (freedom rights)	LEGAL FRAMEWORK	Power
	USES (CONTENT & SERVICES)	Culture

## Fostering access to the Digital Economy

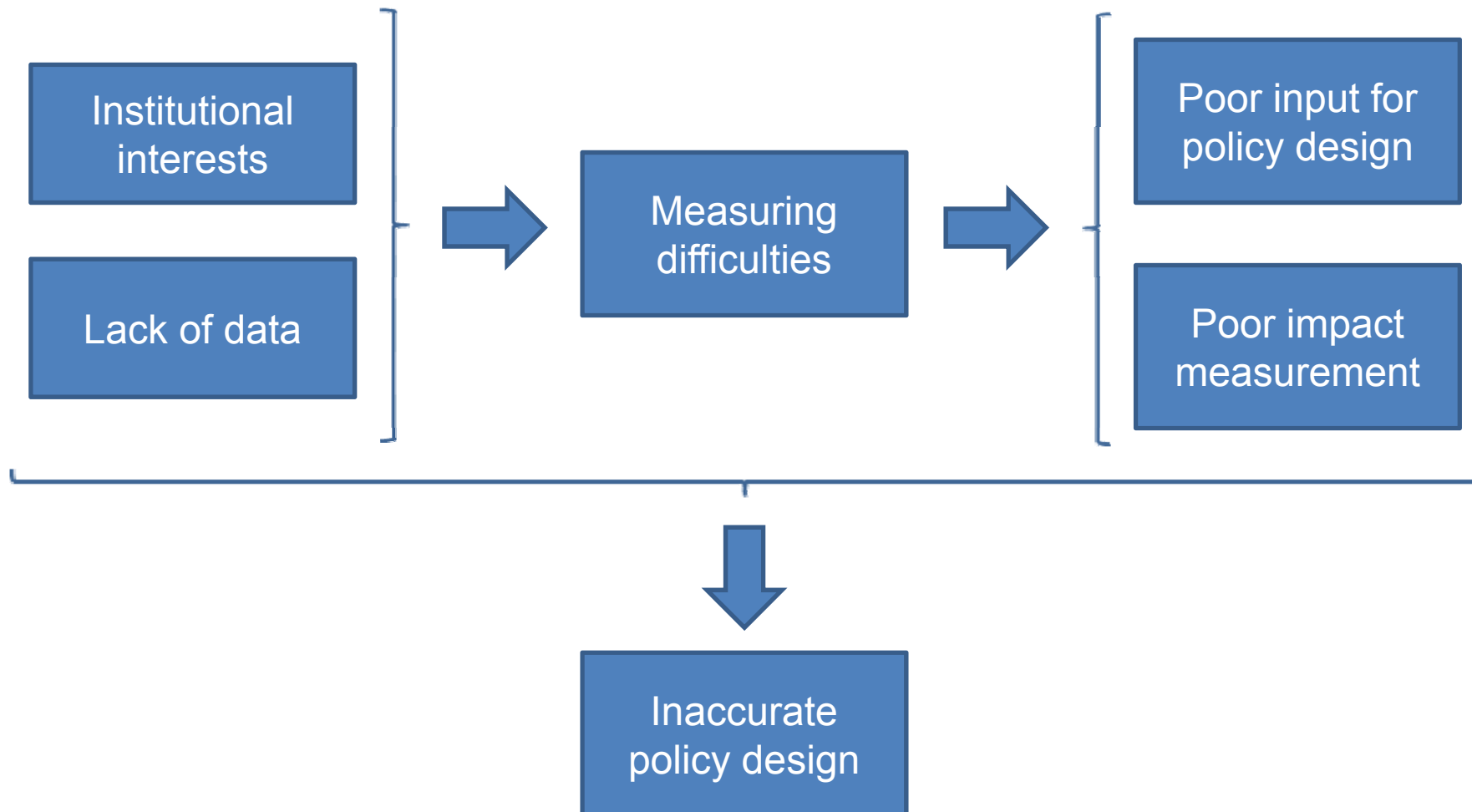
- **A Digital Revolution:** Mokyr (1997, 2000), Greenwood (1999), Boas et al. (2005), Zysman, J. & Newman (2006)
- **The Concept of Access:** Raboy (1995, 1998), ITU (1998-2009), WEF (2002-2009), Sciadas (2003), Gillwald and Stork (2007)
- **The Digital Divide:** NTIA (1999), Hargittai (2001), Bridges.org (2001), Warschauer (2003), Gunkel (2003), DiMaggio et al. (2004), Barzilai-Nahon (2006), Tibben (2007)
- **Policies of (universal) Access:** Hudson (1994), Albery (1995), Compaine & Weinraub (1997), OECD (2001b), Loader & Keeble (2004), ITU (2005e), Kenny and Keremane (2007)



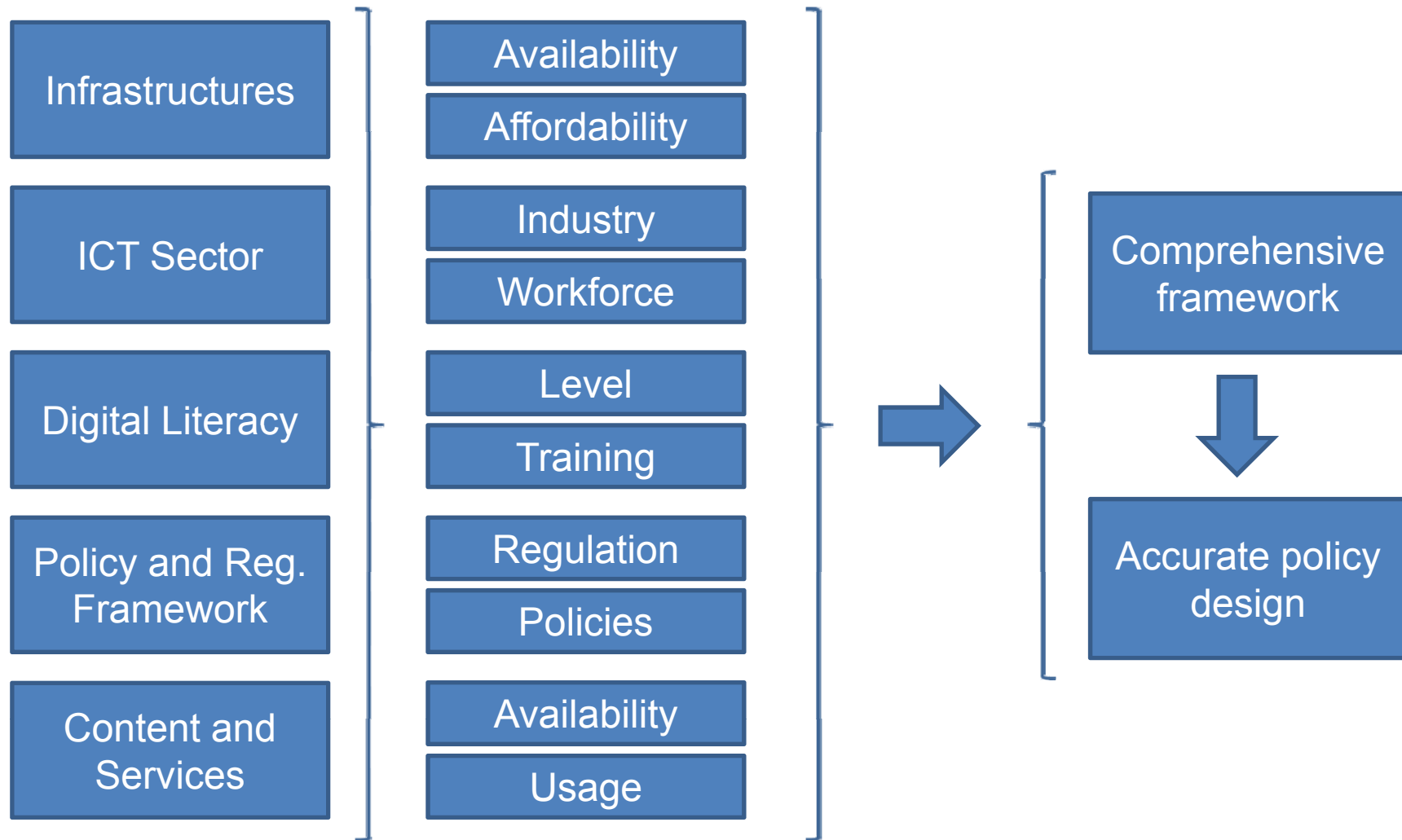
## General hypothesis



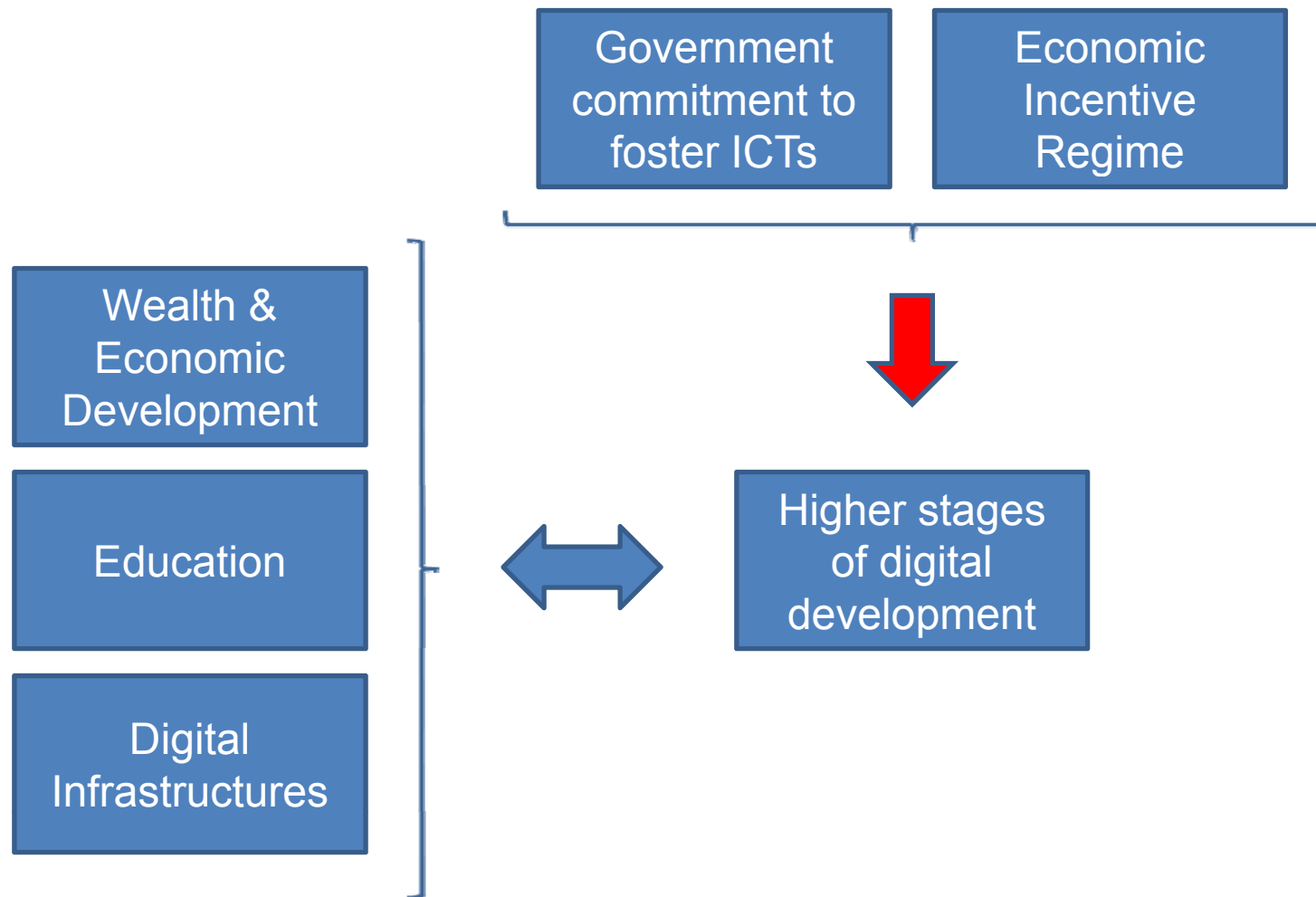
## Working hypothesis #1



## Working hypothesis #2

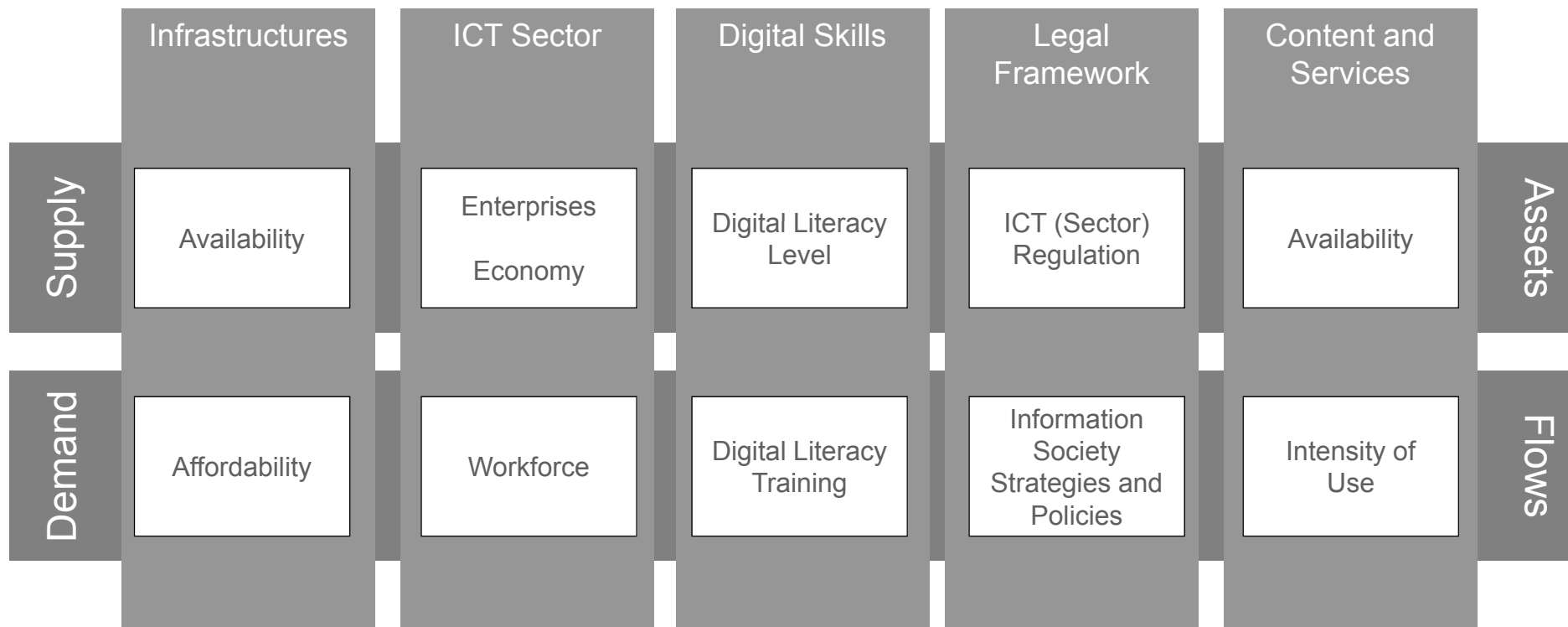


## Working hypothesis #3



# Methodology

# Proposed model: 360° Digital Framework



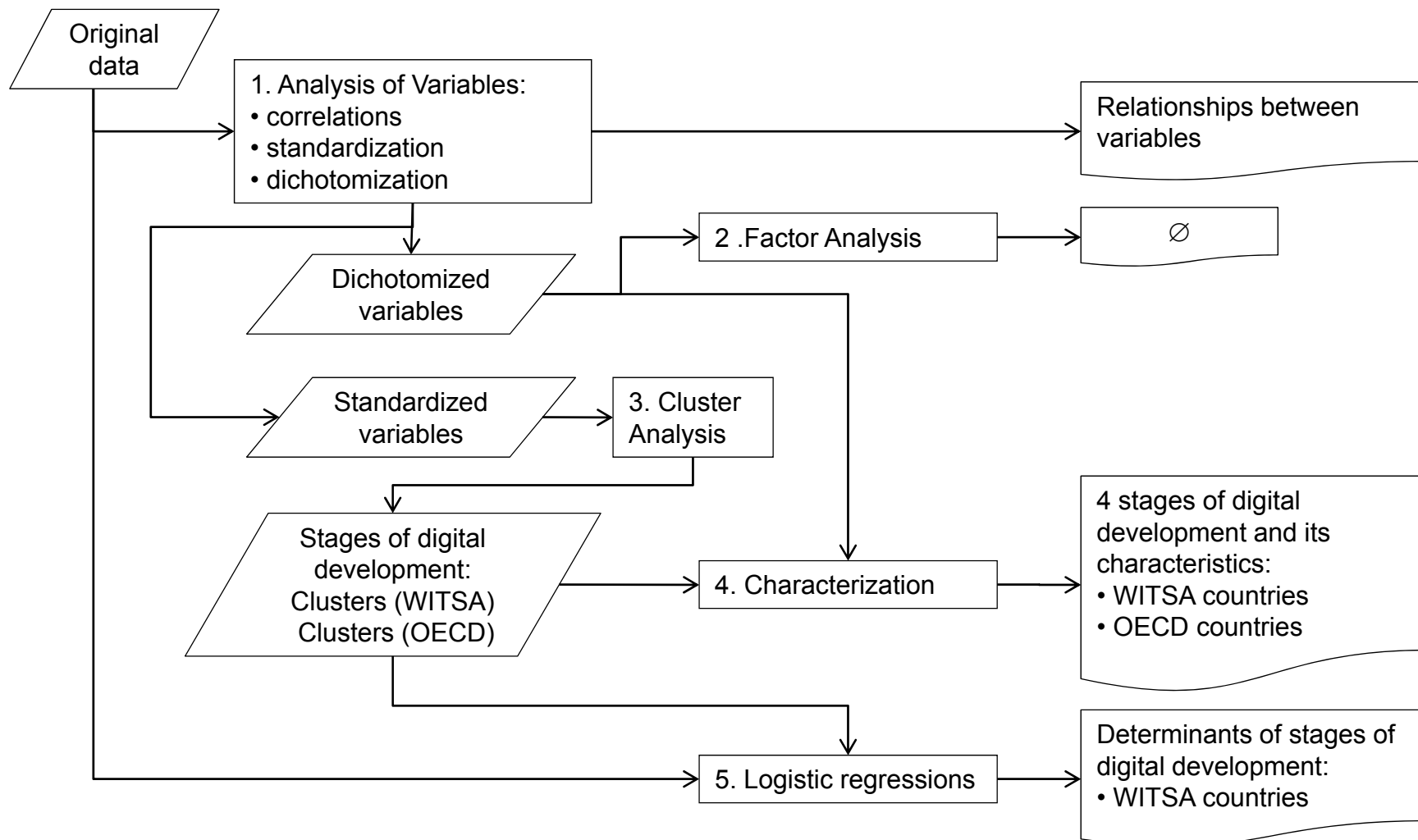
## Qualitative analysis

- 55 models of the Digital Economy: descriptive and theoretical models, composite indices, sets of indicators
- Count of different indicators used (1578) and number of time series
- Identification of categories and iterative category reallocation of indicators

For each model:

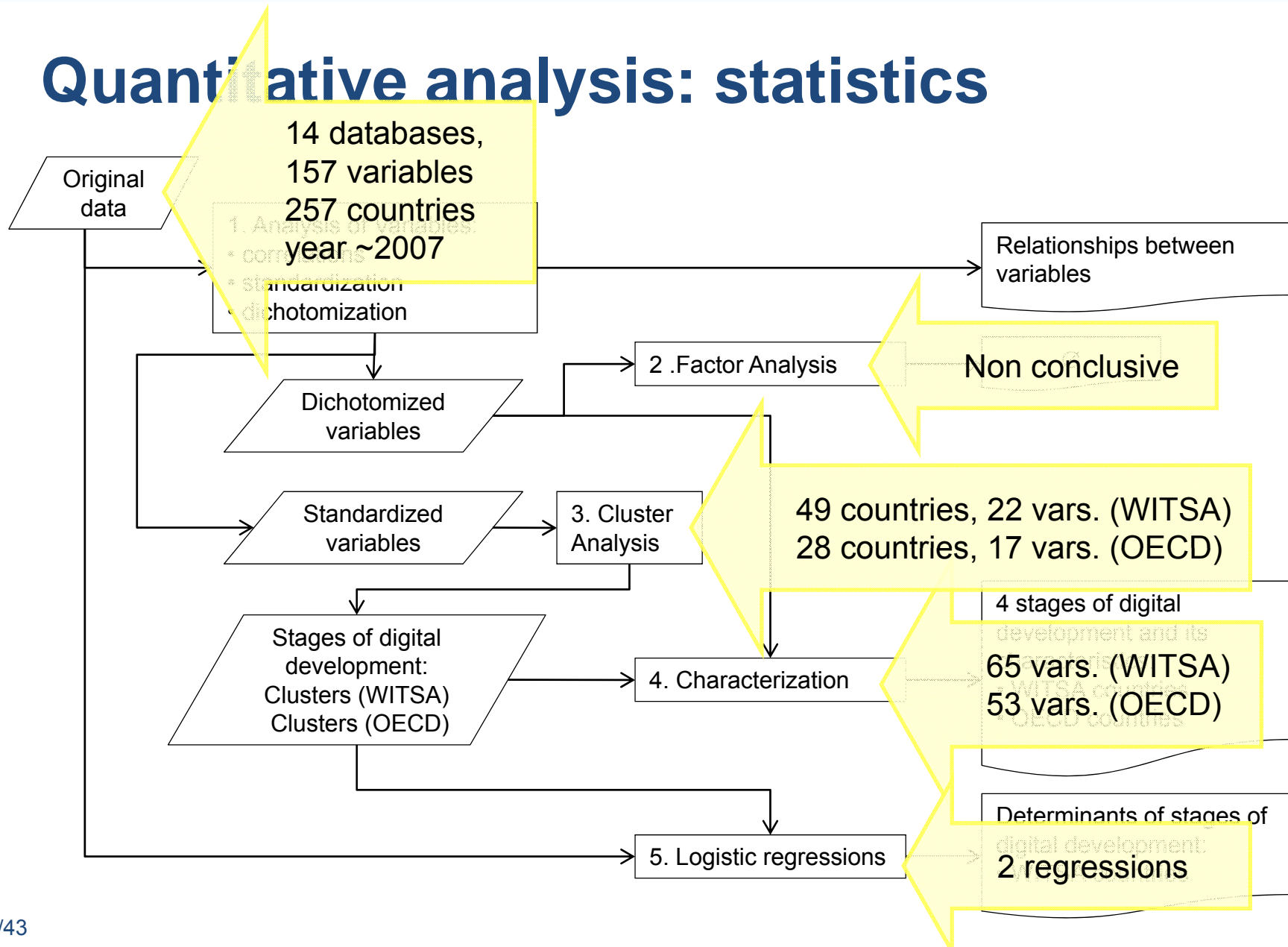
- Description: who, when, where, why, how
- Main publications
- Distribution of indicators by category
- Fitness of model in 360° Digital Framework
- Critique

# Quantitative analysis: statistics





# Quantitative analysis: statistics



## Bridging theory and practice

	<b>Infrastructures</b>	<b>ICT Sector</b>	<b>Digital Skills</b>	<b>Policy and Regulatory Framework</b>	<b>Content and Services</b>
<b>Supply/Assets</b>	6	1	1	2	3
<b>Demand/Flows</b>	1	1	1	1	5

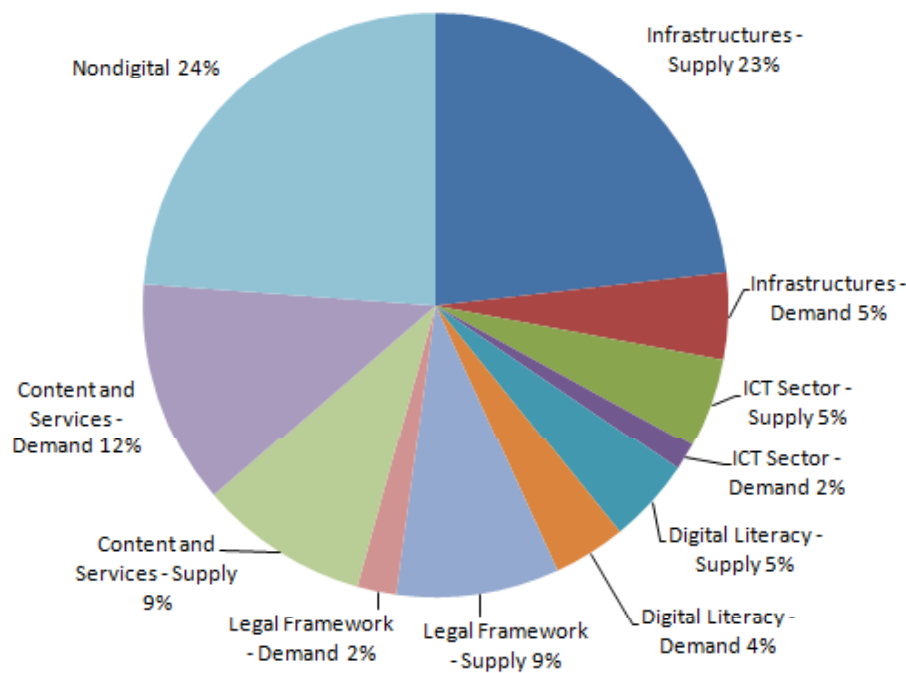
Indicators (then variables) used to build the clusters (WITSA)

	<b>Infrastruct.</b>	<b>ICT Sector</b>	<b>Digital Skills</b>	<b>Policy and Regulatory Framework</b>	<b>Content and Services</b>	<b>Nondigital</b>
<b>Supply/Assets</b>	8	2	2	3	5	27
<b>Demand/Flows</b>	5	4	1	2	6	

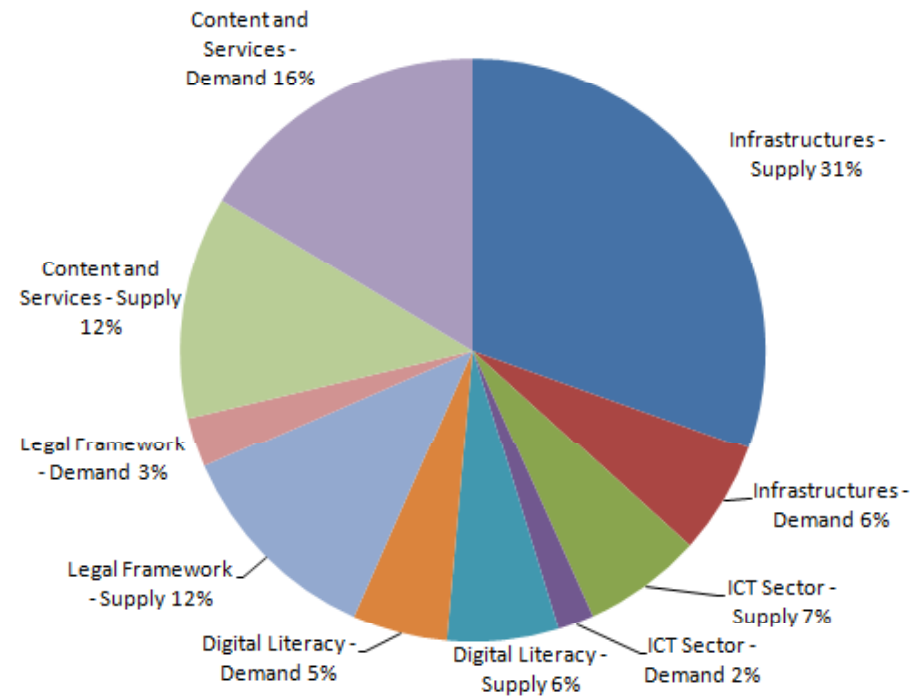
Indicators (vars.) used to characterize the stages of digital development (WITSA)

# Results

# The state of world indicators and indices (I)



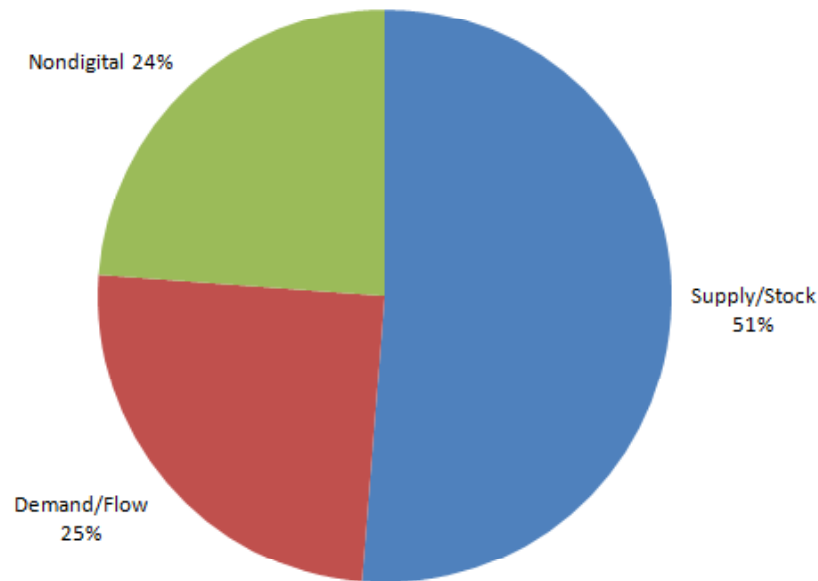
Distribution of the extended aggregate categories – including analogue indicators



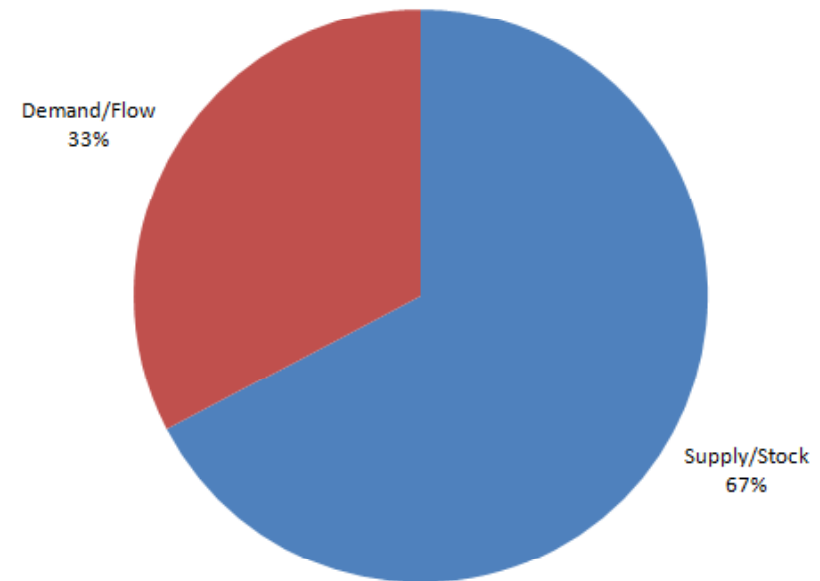
Distribution of the extended aggregate categories – excluding analogue indicators

Charts show the number of indicators (%) in all Digital Economy models within each category

## The state of world indicators and indices (II)



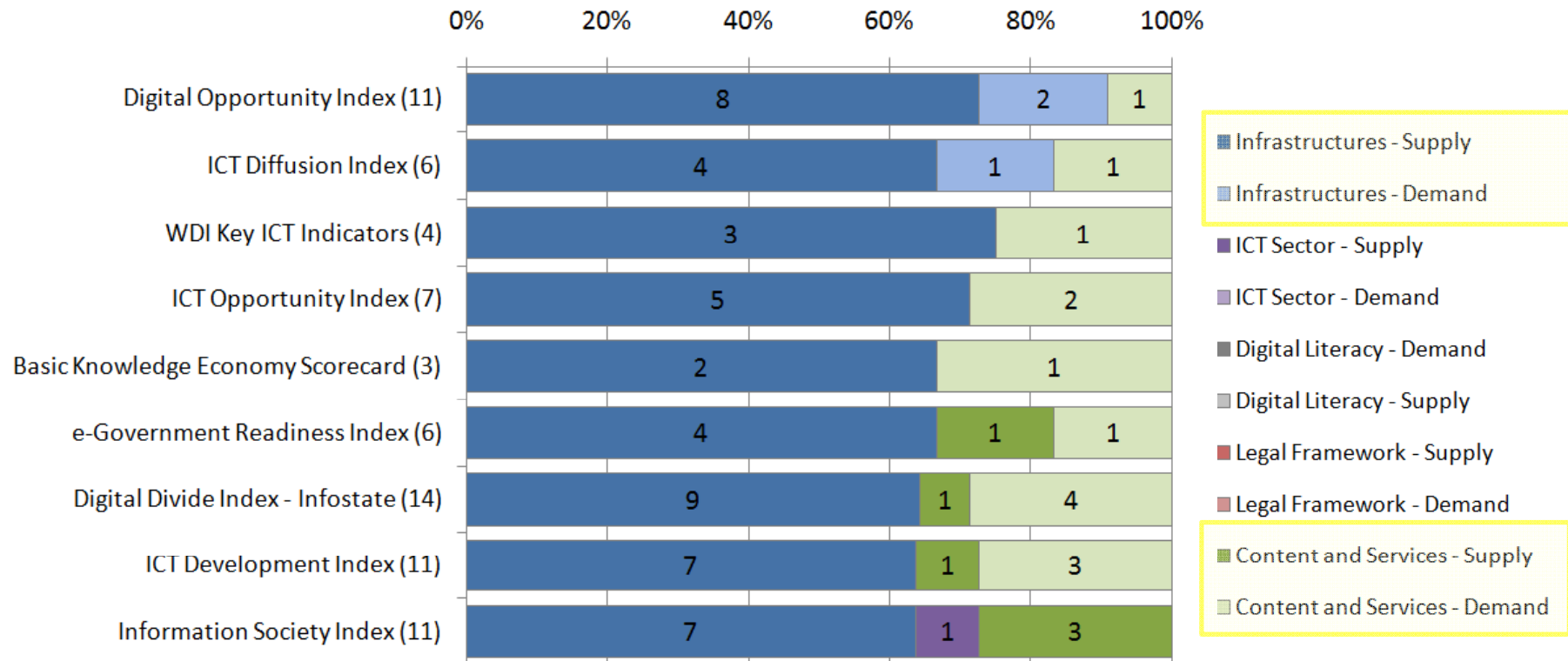
Distribution of the aggregate categories  
– including analogue indicators



Distribution of the aggregate categories  
– including analogue indicators

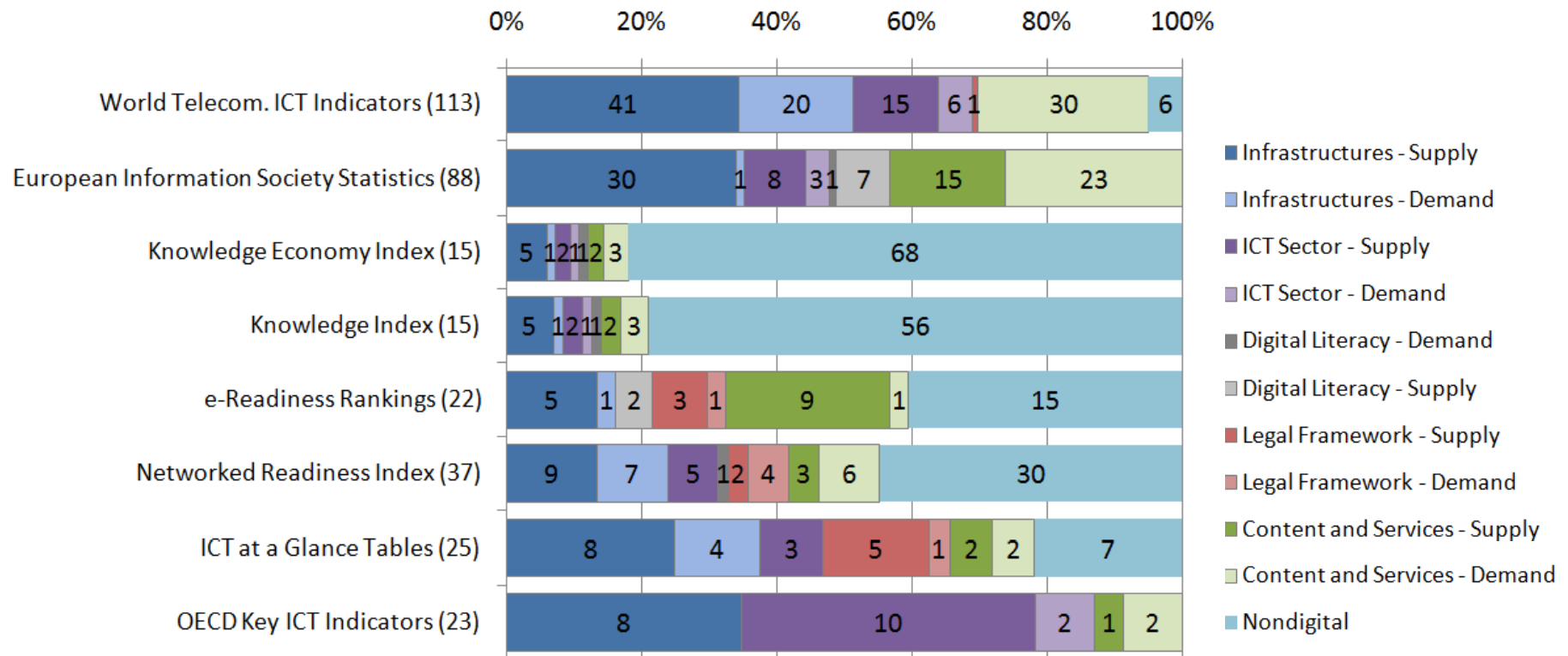
Charts show the number of indicators (%) in all Digital Economy models within each category

# The Telecom Approach



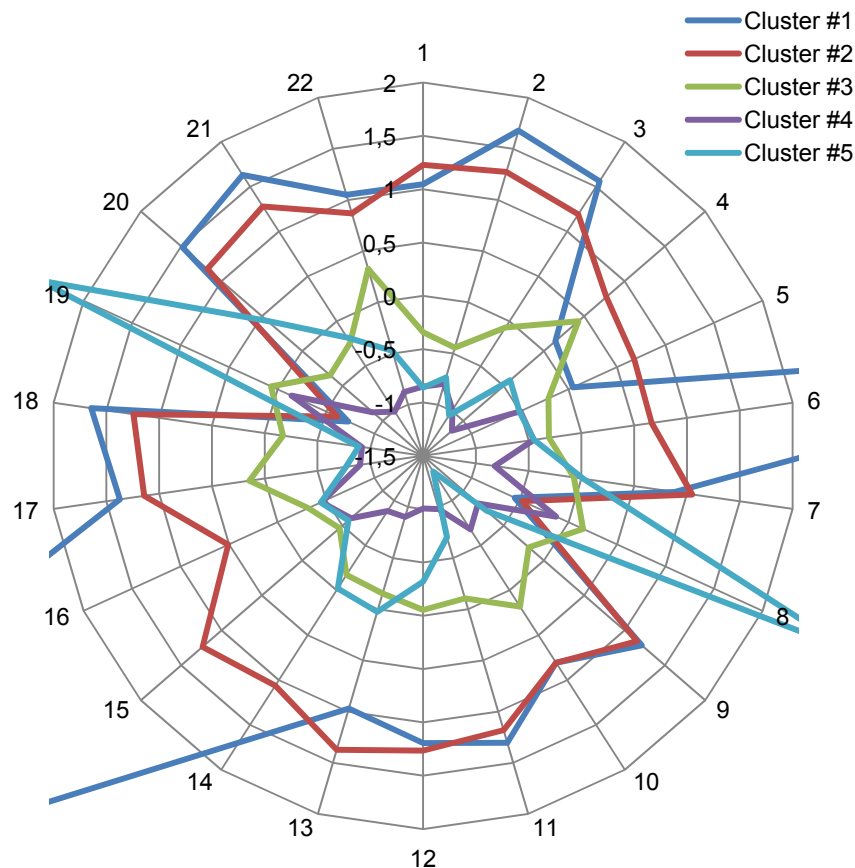
Charts show the number of indicators in selected Digital Economy models within each category

# The Broadcasting/e-Readiness approach



Charts show the number of indicators in selected Digital Economy models within each category

# Cluster centre values for WITSA countries



- 1 - Broadband subscribers (per 100 people)
- 2 - Personal computers (per 100 people)
- 3 - Telephone mainlines (per 100 people)
- 4 - Mobile phone subscribers (per 100 people)
- 5 - International Internet bandwidth (bits per person)
- 6 - Internet Hosts (per 10000 people)
- 7 - Price basket for residential fixed line (US\$ per month)
- 8 - Telecommunications revenue (% GDP)
- 9 - GDP per Telecom Employee (US Dollars)
- 10 - Human Capital
- 11 - Internet Access in Schools
- 12 - Laws relating to ICT
- 13 - Intellectual property protection
- 14 - Gov't procurement of advanced tech products
- 15 - Secure Internet servers (per 1 million people)
- 16 - Total Domains (per 100 people)
- 17 - Availability of government online services
- 18 - Internet users (per 100 people)
- 19 - Total ICT Spending, Consumer (% of GDP)
- 20 - Firm-level technology absorption
- 21 - Extent of business Internet use
- 22 - ICT use and government efficiency

Non-hierarchical K-means cluster analysis.  
Significance of F in ANOVA for *all* variables:  $p < 0.001$



## Stages of digital development (WITSA)

- **Digital leaders (clusters #1 & #2; n = 1+14):**

USA, Australia, Austria, Finland, France, Germany, Ireland, Japan, Rep. of Korea, New Zealand, Norway, Singapore, Sweden, Switzerland, UK

- **Digital strivers (cluster #3; n = 17):**

Brazil, Bulgaria, Chile, Greece, Hungary, Italy, Jamaica, Mexico, Panama, Portugal, Romania, Saudi Arabia, Spain, Thailand, Tunisia, Uruguay, United Arab Emirates

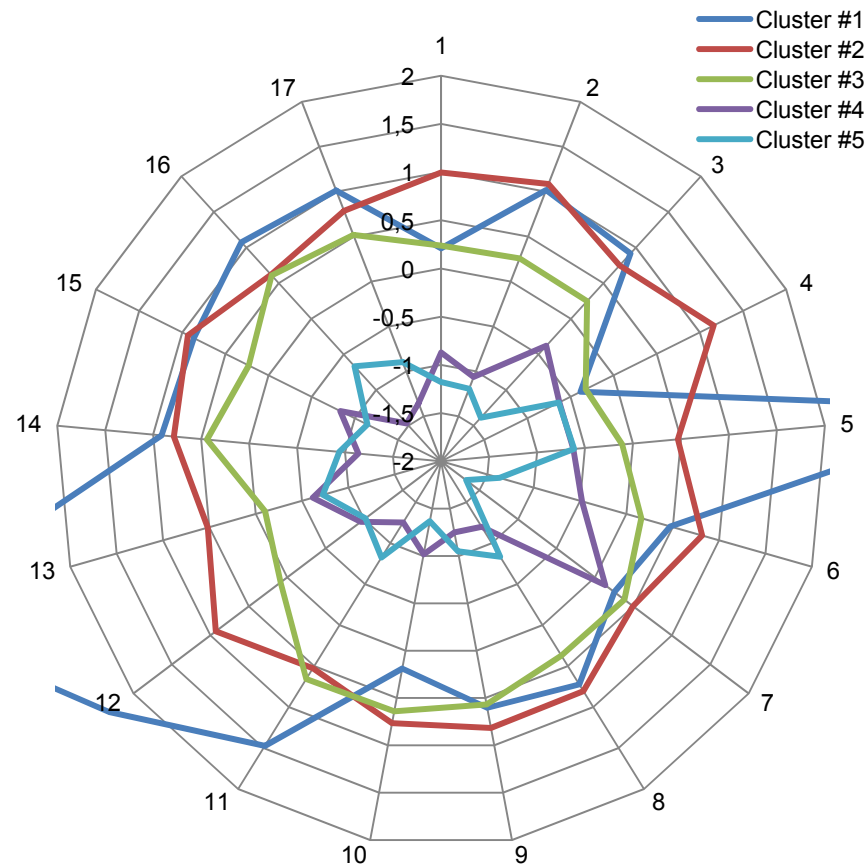
- **Digital laggards (cluster #4; n = 14):**

Argentina, Bolivia, Ecuador, Egypt, India, Indonesia, Pakistan, Peru, Philippines, Sri Lanka, Algeria, Cameroon, Vietnam, Zimbabwe

- **Digital leapfroggers (cluster #5; n = 3):**

Jordan, South Africa, Senegal

# Cluster centre values for OECD countries



- 1 - Broadband subscribers (per 100 people)
- 2 - Personal computers (per 100 people)
- 3 - Telephone mainlines (per 100 people)
- 4 - International Internet bandwidth (bits per person)
- 5 - Internet Hosts (per 10000 people)
- 6 - GDP per Telecom Employee (US Dollars)
- 7 - Human Capital
- 8 - Internet Access in Schools
- 9 - Laws relating to ICT
- 10 - Intellectual property protection
- 11 - Gov't procurement of advanced tech products
- 12 - Secure Internet servers (per 1 million people)
- 13 - Total Domains (per 100 people)
- 14 - Availability of government online services
- 15 - Internet users (per 100 people)
- 16 - Firm-level technology absorption
- 17 - Extent of business Internet use

Non-hierarchical K-means cluster analysis.  
Significance of F in ANOVA for *all* variables:  $p < 0.001$

## Stages of digital development (OECD)

- **Primary digital leaders (clusters #1 & #2; n = 1 + 8):**

USA, Australia, Canada, Denmark, Netherlands, Norway, Sweden, Switzerland, UK

- **Secondary digital leaders (cluster #3; n = 8):**

Austria, Finland, France, Germany, Ireland, Japan, Rep. of Korea, New Zealand

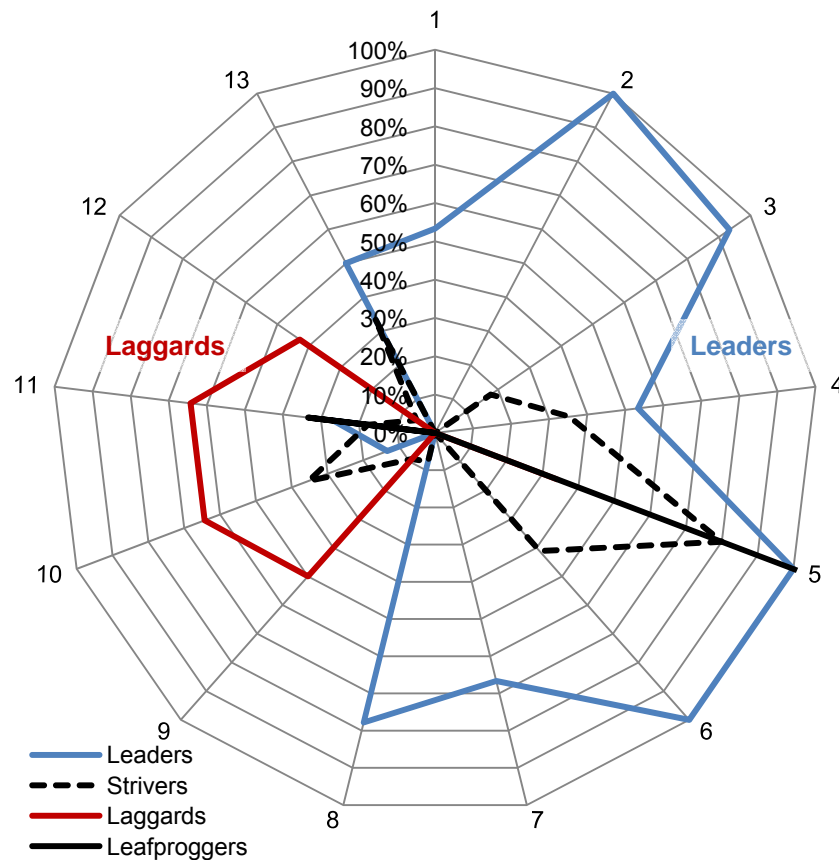
- **Primary digital strivers (cluster #4; n = 5):**

Greece, Hungary, Italy, Poland, Spain

- **Secondary digital strivers (cluster #5; n = 5):**

Czech Republic, Mexico, Portugal, Slovak Republic, Turkey

# Infrastructures



1 - Broadband subscribers (per 100 people) (\*)

2 - Personal computers (per 100 people) (\*)

3 - Telephone mainlines (per 100 people) (\*)

4 - Mobile phone subscribers (per 100 people) (\*)

5 - Population covered by mobile telephony (%) (\*)

6 - International Internet bandwidth (bits per person) (\*)

7 - Internet Hosts (per 10000 people) (\*)

8 - Internet subscribers (per 100 inhabitants) (\*)

9 - Residential monthly telephone subscription (US\$) (\*\*)

10 - Price basket for Internet (US\$ per month) (\*\*)

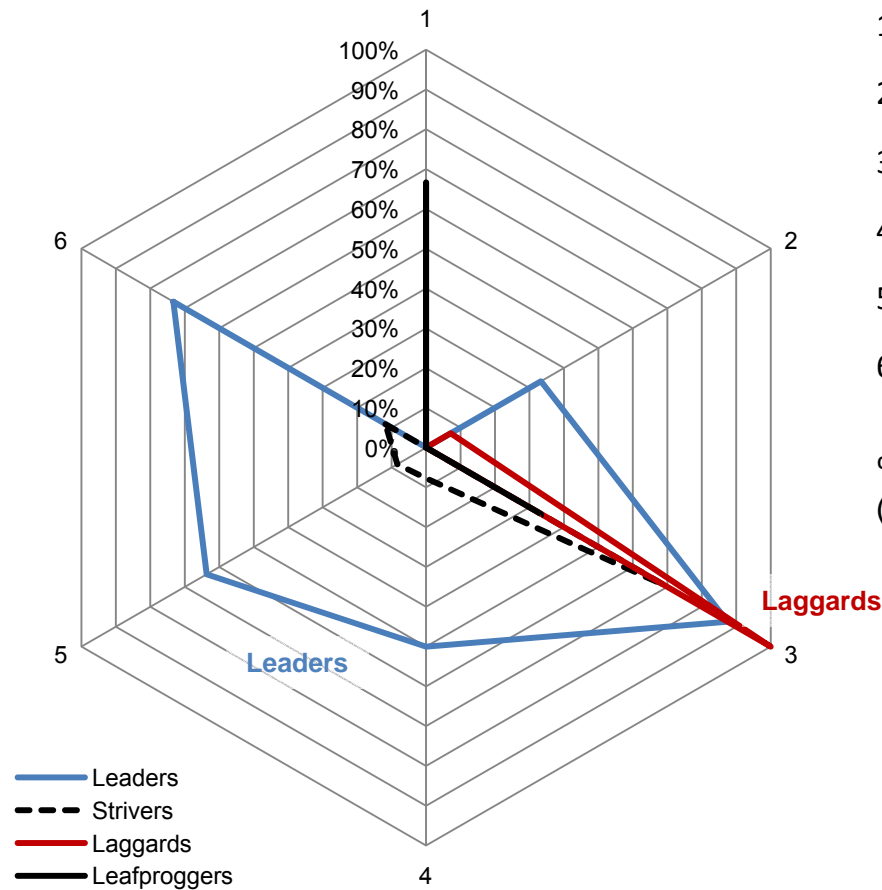
11 - Price basket for mobile (US\$ per month) (\*\*)

12 - Price basket for residential fixed line (US\$ per month) (\*)

13 - Telephone average cost of call to US (US\$ per three minutes) (\*\*\*)

% of countries that scored "high" on indicator per cluster  
 (\*): p<0.01    (\*\*): p<0.05    (\*\*\*): p<0.1

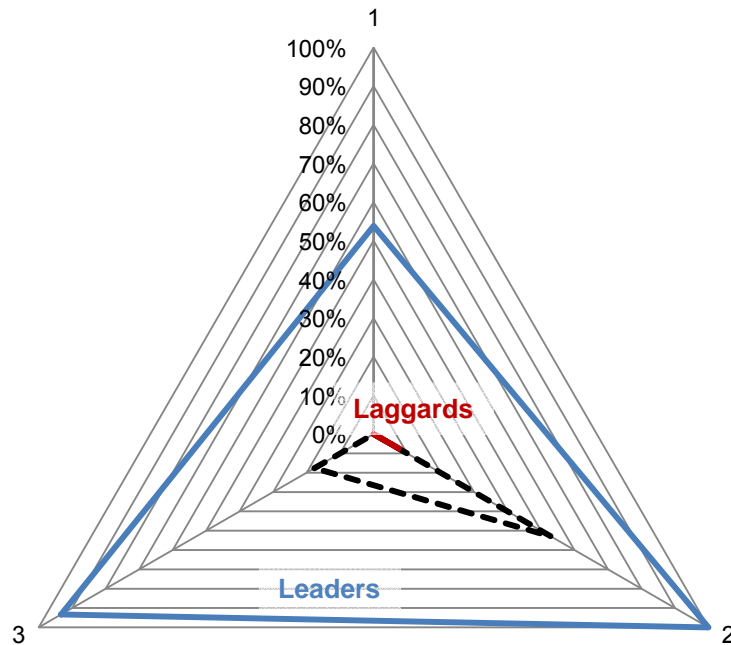
# ICT Sector



- 1 - Telecommunications revenue (% GDP) (\*)
- 2 - High-technology exports (% of manufactured exports) (\*\*)
- 3 - Telephone subscribers per employee (\*\*\*)
- 4 - Telephone employees (per 100 people) (\*\*)
- 5 - Total full-time telecommunications staff (per 100 people) (\*)
- 6 - GDP per Telecom Employee (US Dollars) (\*)

% of countries that scored "high" on indicator per cluster  
 (\*):  $p < 0.01$     (\*\*):  $p < 0.05$     (\*\*\*) :  $p < 0.1$

# Digital Literacy



1 - Enrolment in science. Tertiary. (per 100 people) (\*)

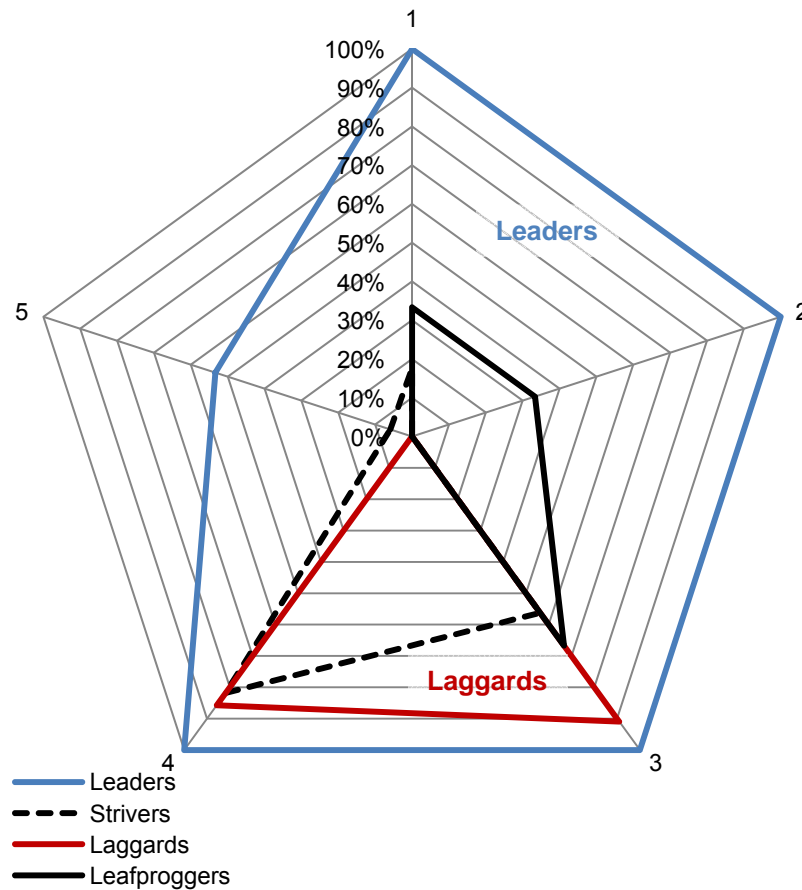
2 - Human Capital (\*)

3 - Internet Access in Schools (\*)

% of countries that scored "high" on indicator per cluster  
 (\*):  $p < 0.01$  (\*\*):  $p < 0.05$  (\*\*\*) :  $p < 0.1$

- Leaders
- - - Strivers
- Laggards
- Leafprogrgers

# Policy and regulatory framework



1 - Laws relating to ICT (\*)

2 - Intellectual property protection (\*)

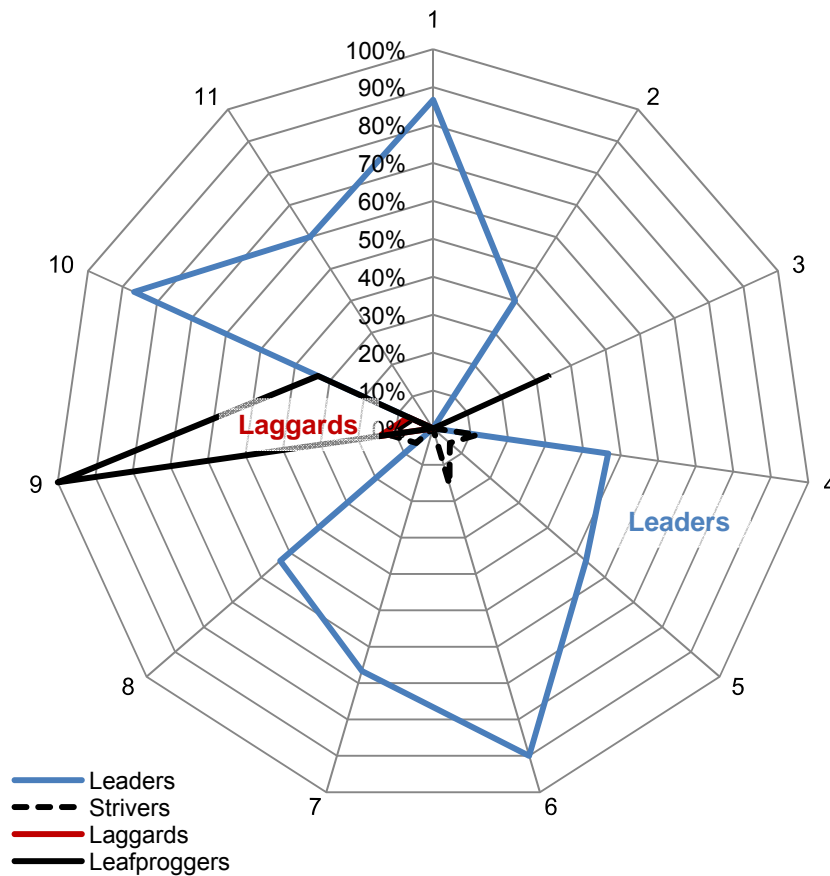
3 - Level of competition - DSL (\*\*)

4 - Level of competition - Cable modem (\*\*)

5 - Gov't procurement of advanced tech products (\*)

% of countries that scored "high" on indicator per cluster  
 (\*):  $p < 0.01$     (\*\*):  $p < 0.05$     (\*\*\*) :  $p < 0.1$

# Usage

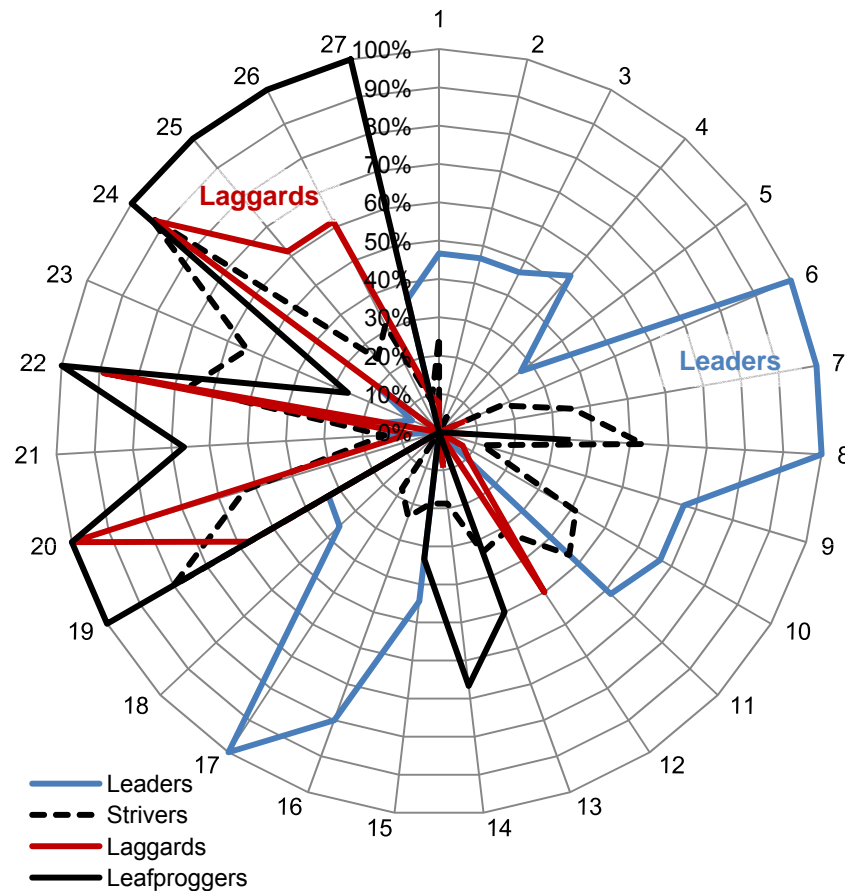


- 1 - Secure Internet servers (per 1 million people) (\*)
- 2 - Total Domains (per 100 people) (\*)
- 3 - Total ICT Spending, Retail Trade (% of GDP) (\*)
- 4 - Web Measure (\*)
- 5 - Availability of government online services (\*)
- 6 - International outgoing telephone traffic (minutes) (per 100 people) (\*)
- 7 - Internet users (per 100 people) (\*)
- 8 - E-Participation (\*)
- 9 - Total ICT Spending, Consumer (% of GDP) (\*)
- 10 - Firm-level technology absorption (\*)
- 11 - Extent of business Internet use (\*)

% of countries that scored "high" on indicator per cluster  
 (\*):  $p < 0.01$     (\*\*):  $p < 0.05$     (\*\*\*) :  $p < 0.1$



# Analogue indicators



% of countries that scored "high" on indicator per cluster  
 (\*):  $p < 0.01$     (\*\*):  $p < 0.05$     (\*\*\*) :  $p < 0.1$

- 1 - GDP (\*\*\*)
- 2 - GDP Capita (\*)
- 3 - GDP per capita, PPP (current international \$) (\*)
- 4 - GNI per capita, Atlas method (current US\$) (\*)
- 5 - GNI per capita, PPP (current international \$) (\*\*)
- 6 - HDI (\*)
- 7 - Life expectancy at birth, total (years) (\*)
- 8 - Improved water source (% of population with access) (\*)
- 9 - Health Public Expenditure (% of govt. expenditure) (\*)
- 10 - Health Public Expenditure (% of total Health expend.) (\*)
- 11 - School enrollment, primary (% net) (\*\*\*)
- 12 - School enrollment, primary (% gross) (\*\*)
- 13 - Education Public Expenditure (% of govt. expenditure) (\*\*\*)
- 14 - Gross National Expenditure (% of GDP) (\*\*)
- 15 - General Govt. final consumption expend. (% of GDP) (\*\*\*)
- 16 - Economic Incentive Regime (\*)
- 17 - Innovation (\*)
- 18 - Population in urban agglom. > 1 million (% of total pop.) (\*)
- 19 - Inequality-10 (\*\*)
- 20 - Mortality rate, infant (per 1,000 live births) (\*)
- 21 - Population growth (annual %) (\*\*\*)
- 22 - Interest payments (% of GDP) (\*)
- 23 - Present value of debt (% of GNI) (\*\*)
- 24 - GDP deflator (base year varies by country) (\*)
- 25 - Inflation, consumer prices (annual %) (\*)
- 26 - Inflation, GDP deflator (annual %) (\*)
- 27 - Tax revenue (% of GDP) (\*\*)

## Determinants: digital leaders

$$\text{logit}(\text{ZCLUSTER54\_CB}) = \beta_1 \cdot \text{GEN30} + \beta_2 \cdot \text{GEN05} + \beta_3 \cdot \text{GEN07} + \beta_4 \cdot \text{GEN08} + \beta_5 \cdot \text{LEGAL\_D\_04} + \varepsilon$$

Binary logistic regression with digital leaders (1 is a digital leader, 0 is not a digital leader) as the dependent variable.

	B	S.E.	Wald	df	Sig.	Exp(B)
Life expectancy at birth, total (GEN30)	-.399	.208	3.664	1	.056	.671
Inequality-20 (GEN05)	-1.066	.578	3.403	1	.065	.344
Urban Population (%) (GEN07)	.138	.079	3.030	1	.082	1.148
Economic Incentive Regime (GEN08)	1.671	.877	3.628	1	.057	5.317
Government prioritization of ICT (LEGAL_D_04)	2.869	1.737	2.727	1	.099	17.611

N	46		
Correctly predicted cases	95.7%	96.8% (leaders)	93.3% (rest)
-2 Log likelihood	15.970		
Cox & Snell R-square	.646		
Nagelkerke R-square	.862		
Chi-Square (sig)	47.799	(.000)	
Hosmer and Lemeshow Test Chi-Square (sig)	1.546	(.981)	

## Determinants: digital laggards

$$\text{logit}(\text{ZCLUSTER54\_CBL}) = \beta_0 + \beta_1 \cdot \text{GEN06} + \beta_2 \cdot \text{GEN14} + \beta_3 \cdot \text{INF\_S\_06} + \beta_4 \cdot \text{LEGAL\_D\_01} + \varepsilon$$

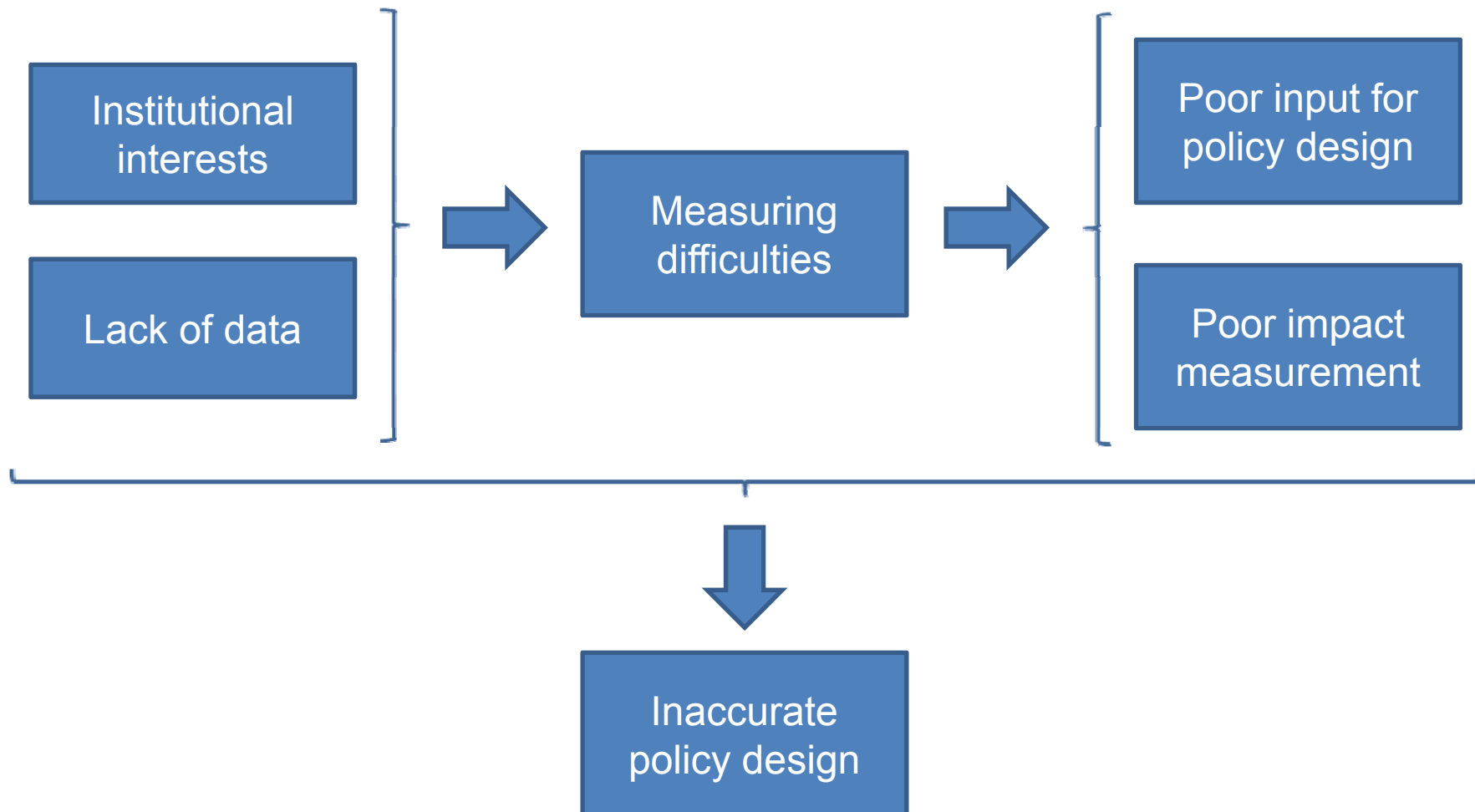
Binary logistic regression with digital leaders (1 is a digital laggard, 0 is not a digital laggard) as the dependent variable.

	B	S.E.	Wald	df	Sig.	Exp(B)
Constant	38.214	16.958	5.078	1	.024	3.945 · 10 <sup>16</sup>
Inequality-10 (GEN06)	-.235	.138	2.909	1	.088	.790
Health Public Expenditure (% of total Health expenditure) (GEN14)	-.176	.081	4.665	1	.031	.839
Population covered by mobile telephony (%) (INF_S_06)	-.100	.050	3.936	1	.047	.905
Importance of ICT to government vision of the future (LEGAL_D_01)	-4.304	2.239	3.696	1	.055	.014

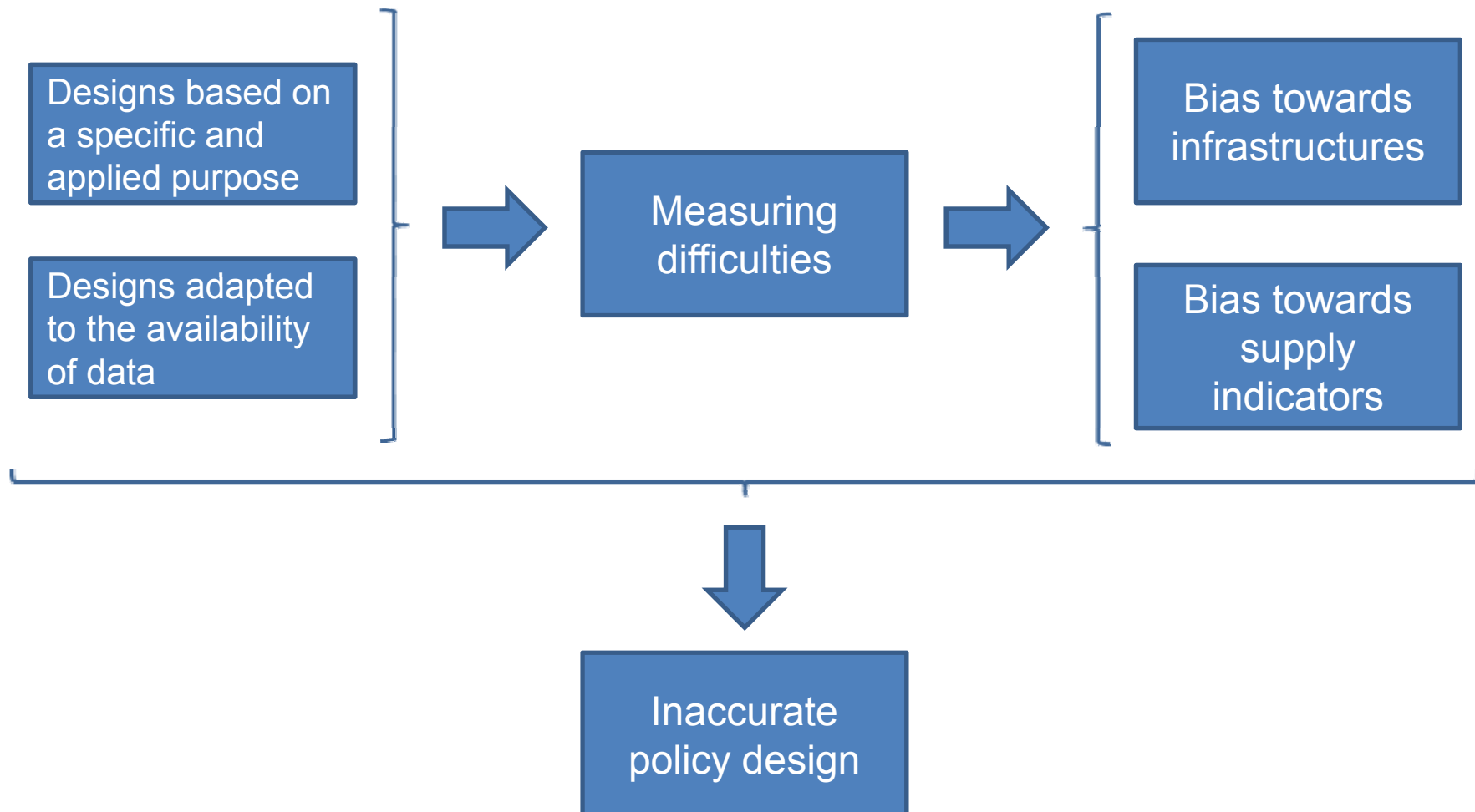
N	47					
Correctly predicted cases	94.6%	96.4% (laggards)	88.9 % (rest)			
-2 Log likelihood	11.391					
Cox & Snell R-square	.551					
Nagelkerke R-square	.823					
Chi-Square (sig)	29.663	(.000)				
Hosmer and Lemeshow Test Chi-Square (sig)	3.684	(.815)				

# Conclusions

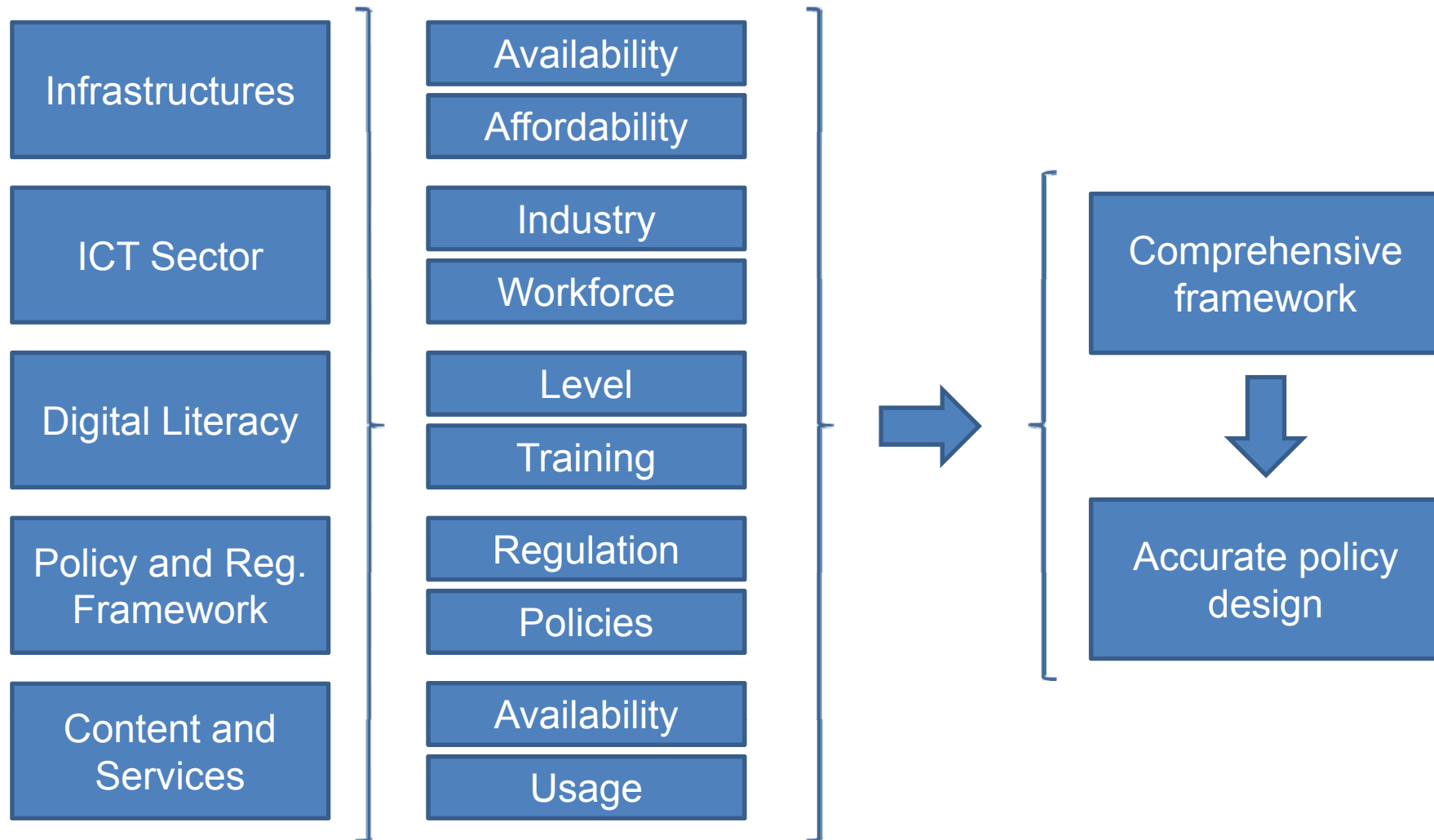
## Working hypothesis #1



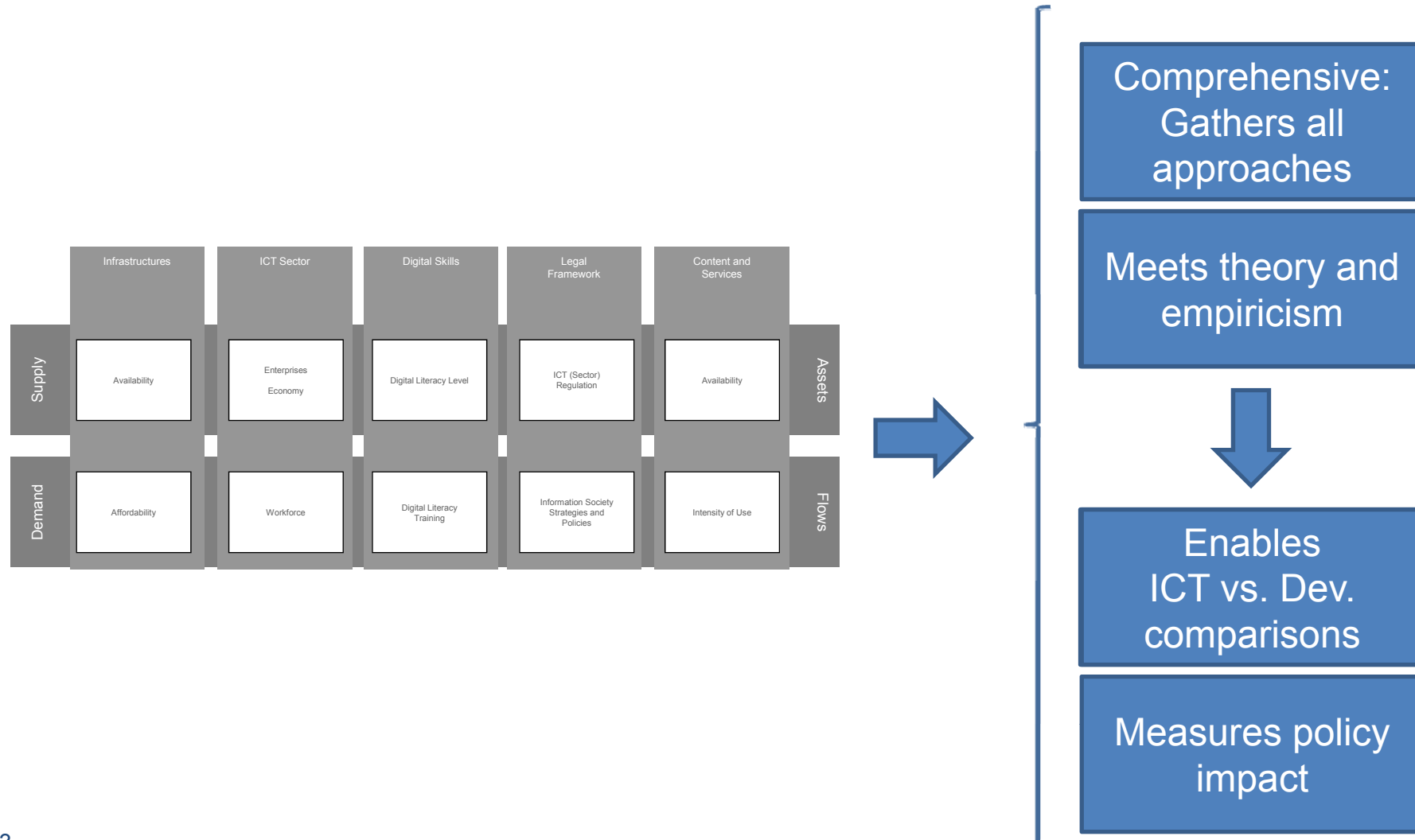
## Working hypothesis #1



## Working hypothesis #2

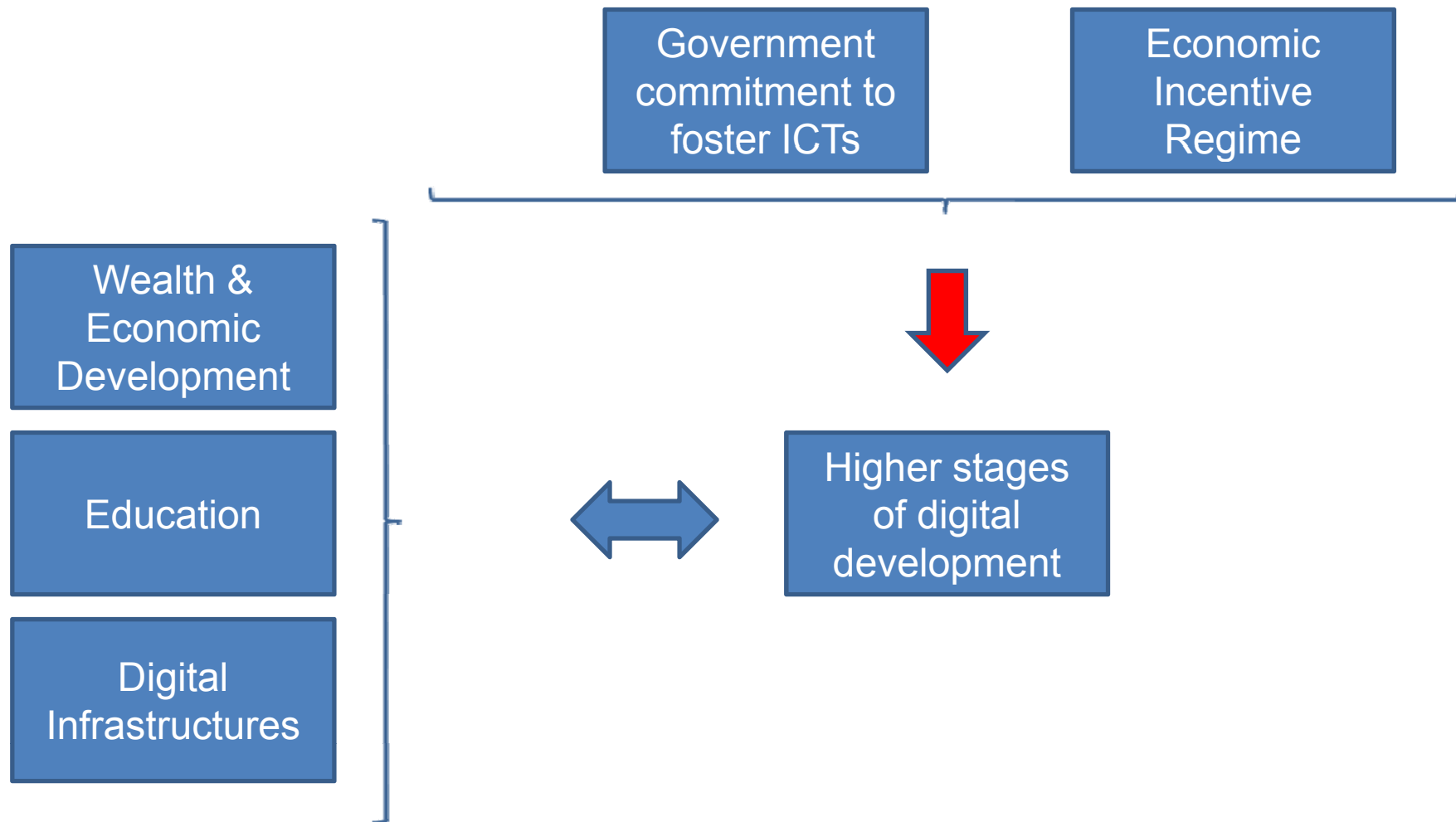


## Working hypothesis #2

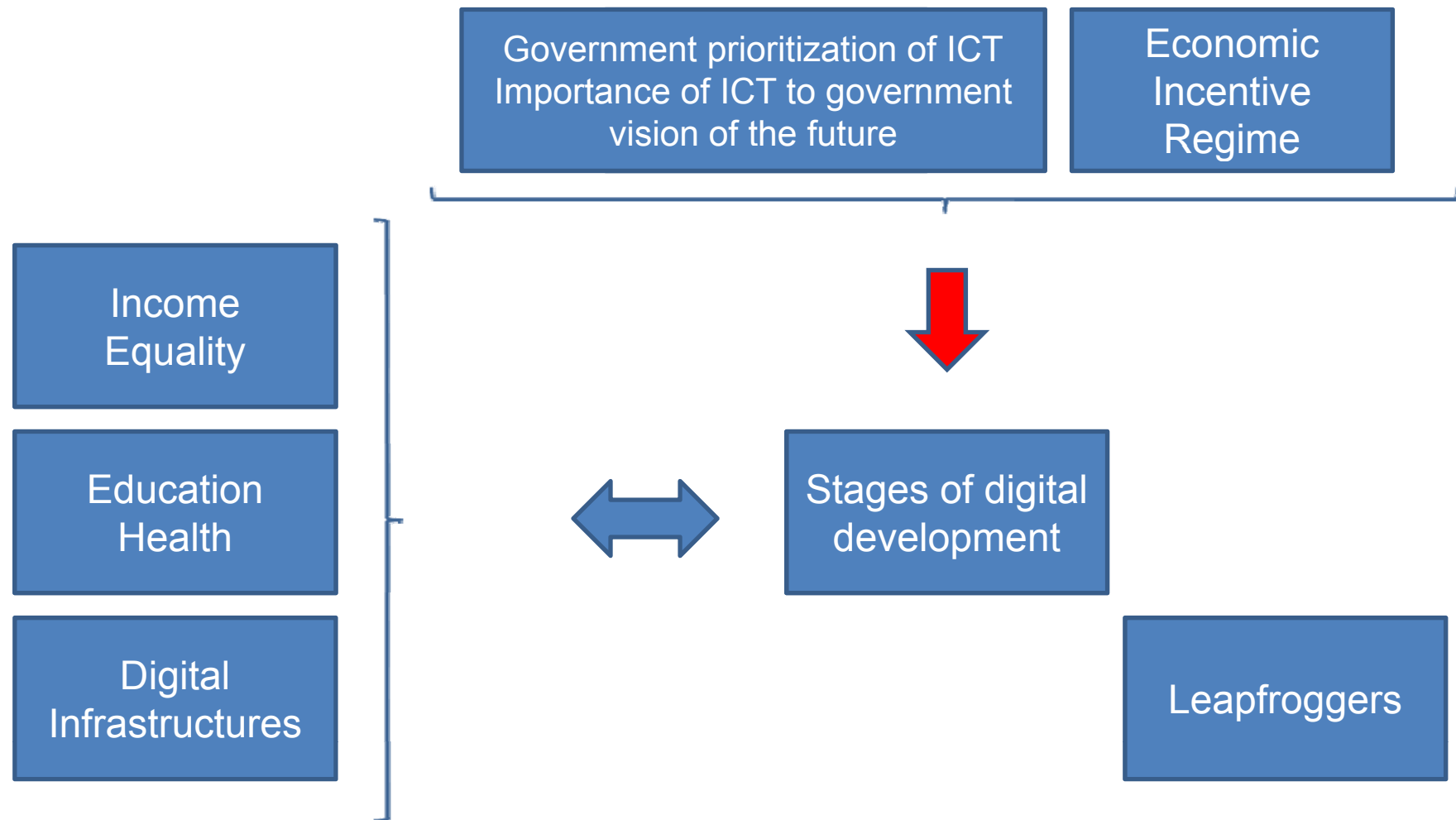




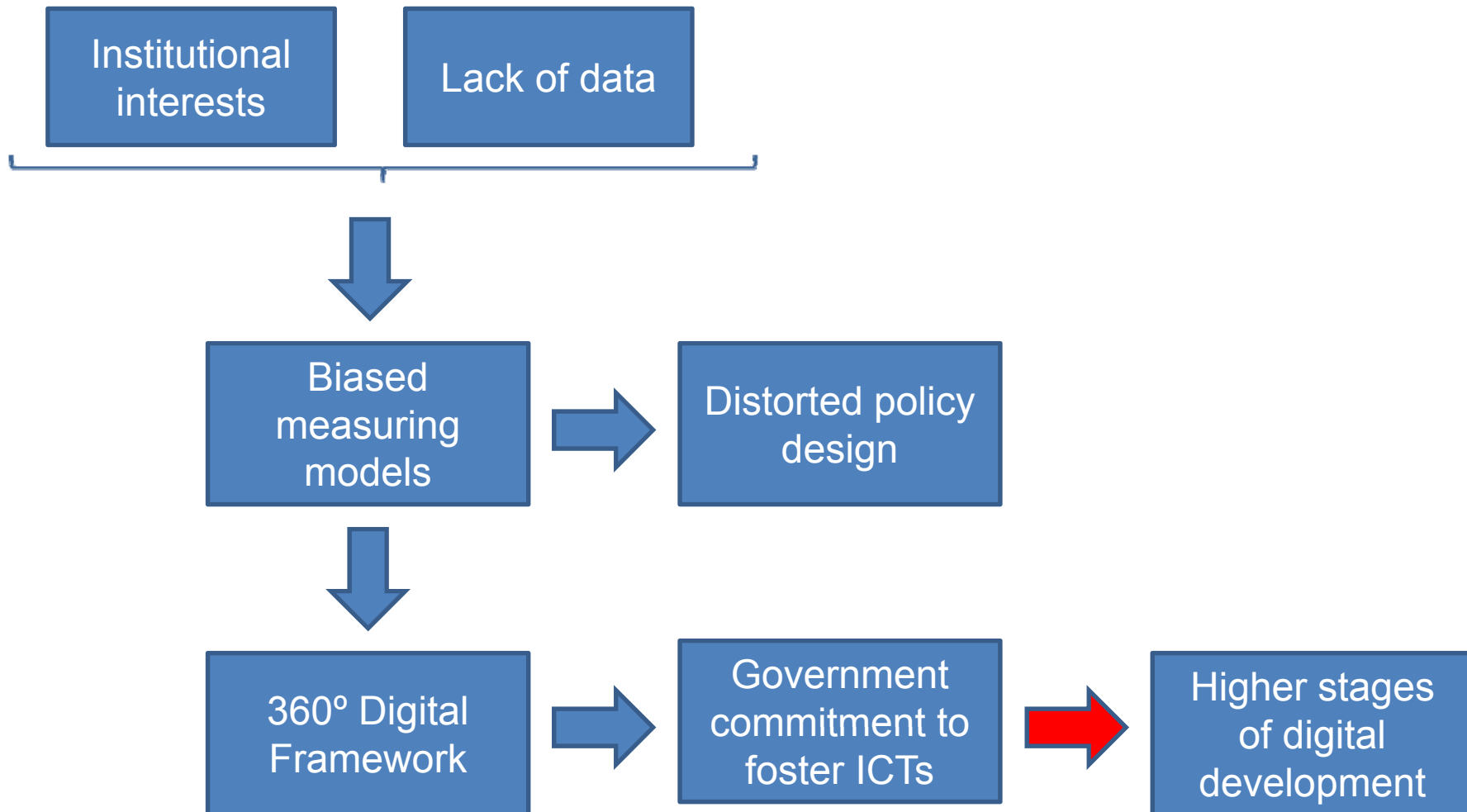
## Working hypothesis #3



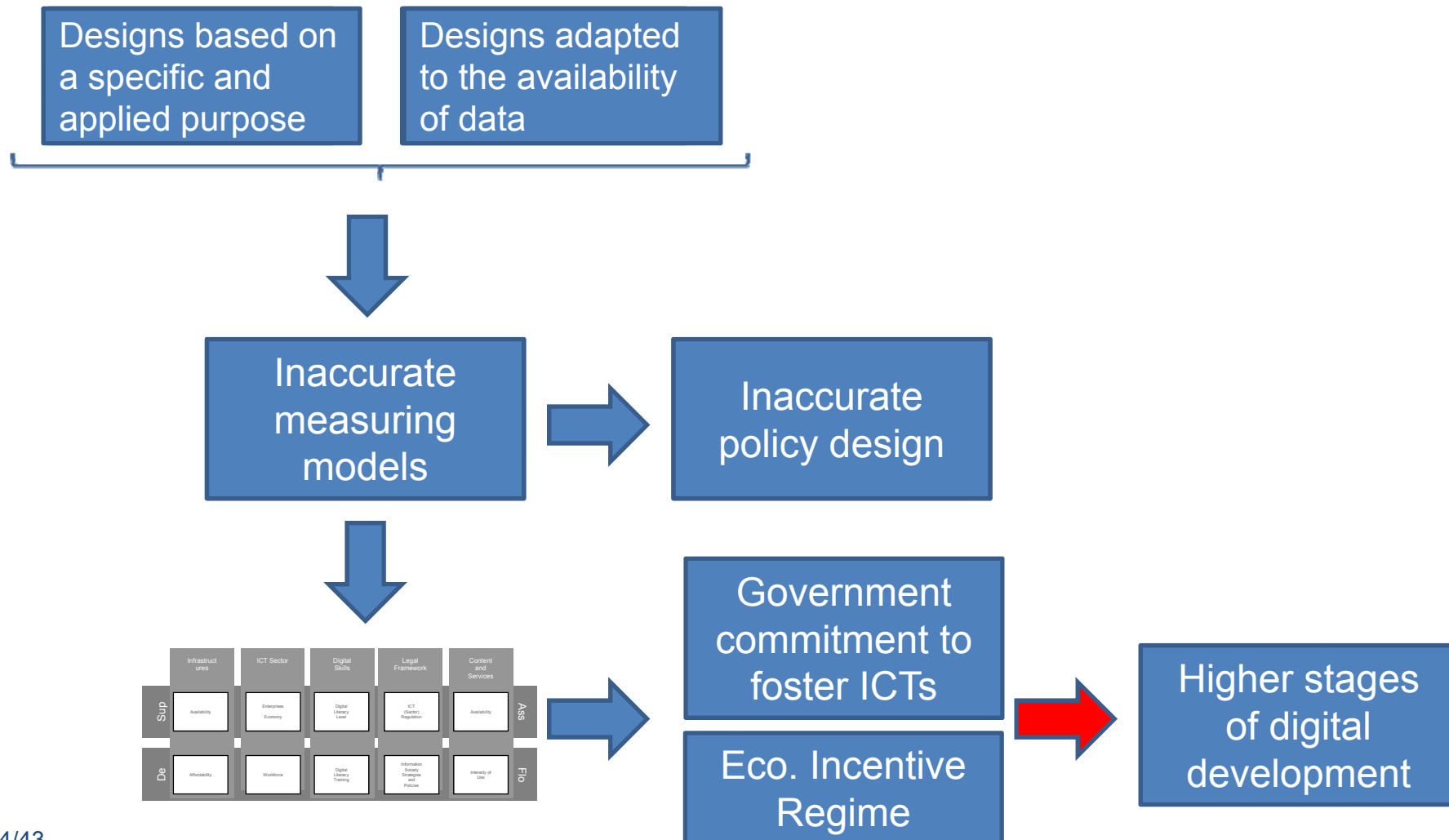
# Working hypothesis #3



# General hypothesis



# General hypothesis



## Limitations of the research

- Theoretical framework to be improved: pros and cons of multidisciplinary research, theory vs. practice
- Quality of data: coverage, soft data, lack of data
- Quantity of data: time series, geographic coverage, loss of detail due to aggregation
- Significance of models

# Future lines of research

## Future lines of research

- Strengthen the links between theory and practice
  - Towards multidisciplinary frameworks
- *Übercomprehensive* model: Structural equation modelling
  - Simultaneousness, complex systems, network effects
  - Dynamic (time) analysis
- How and *why* Leapfrogging
- Design of Public policies to foster the Information Society

Barcelona, September 8th, 2009. PhD Thesis Defence

**To cite this work:**

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**References used in this presentation:**

<http://ictlogy.net/bibciter/reports/bibliographies.php?idb=2>

**Special thanks:** Tim Kelly, Pilar López, Ismael Peña Sr., Pere Fabra, Mercè Guillén

**To contact the author:**

<http://ismael.ictlogy.net>



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