

# Big Data for Measuring the Information Society



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INTERNATIONAL TELECOMMUNICATION UNION

BIG DATA PROJECT - INNOVATIVE WAYS TO UTILIZE BIG DATA AS A NEW  
DATA SOURCE FOR ICT INDICATORS

MARGUS TIRU. PROJECT COORDINATOR, ITU CONSULTANT

# The Objective

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Demonstrate how Big Data can be used for ICT measurement – to produce new and existing ICT indicators to enhance data availability, benchmarks and methodologies to measure the information society

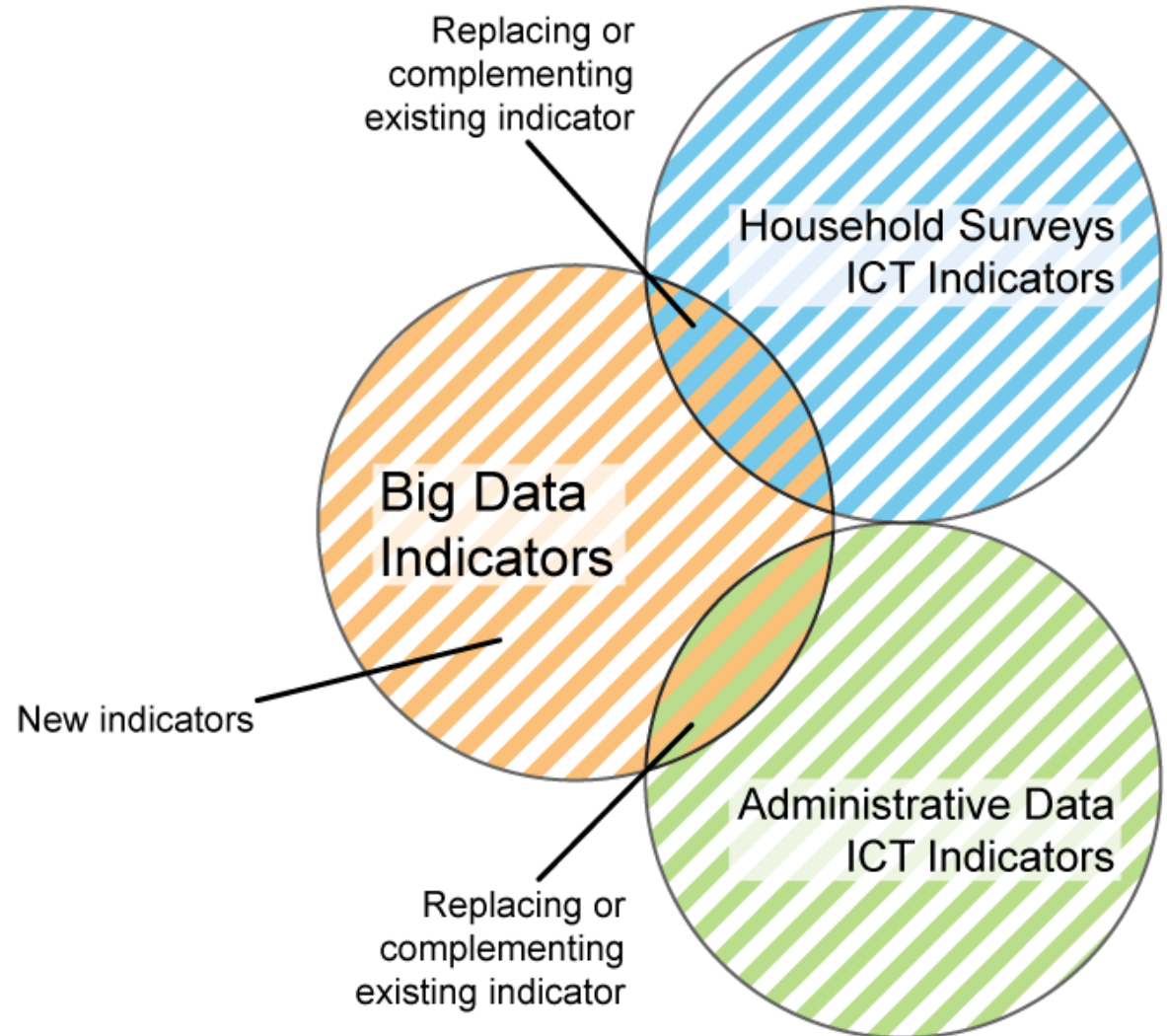


# Big Data Indicators

Replace existing indicators

Complement existing indicators  
(granularity, disaggregation)

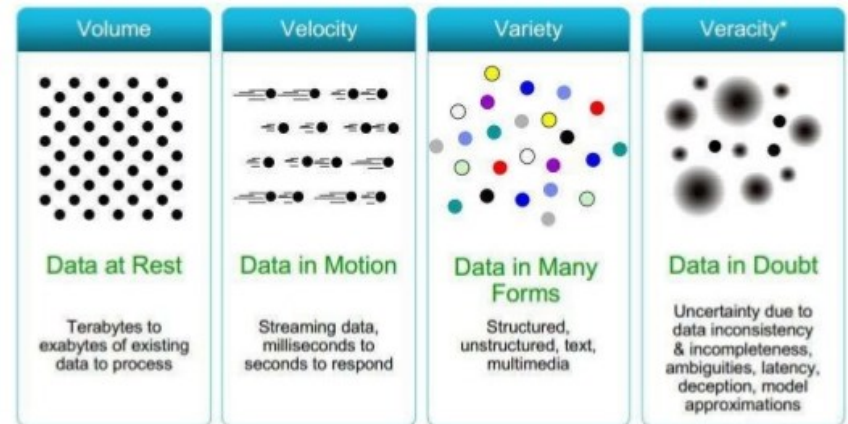
New indicators



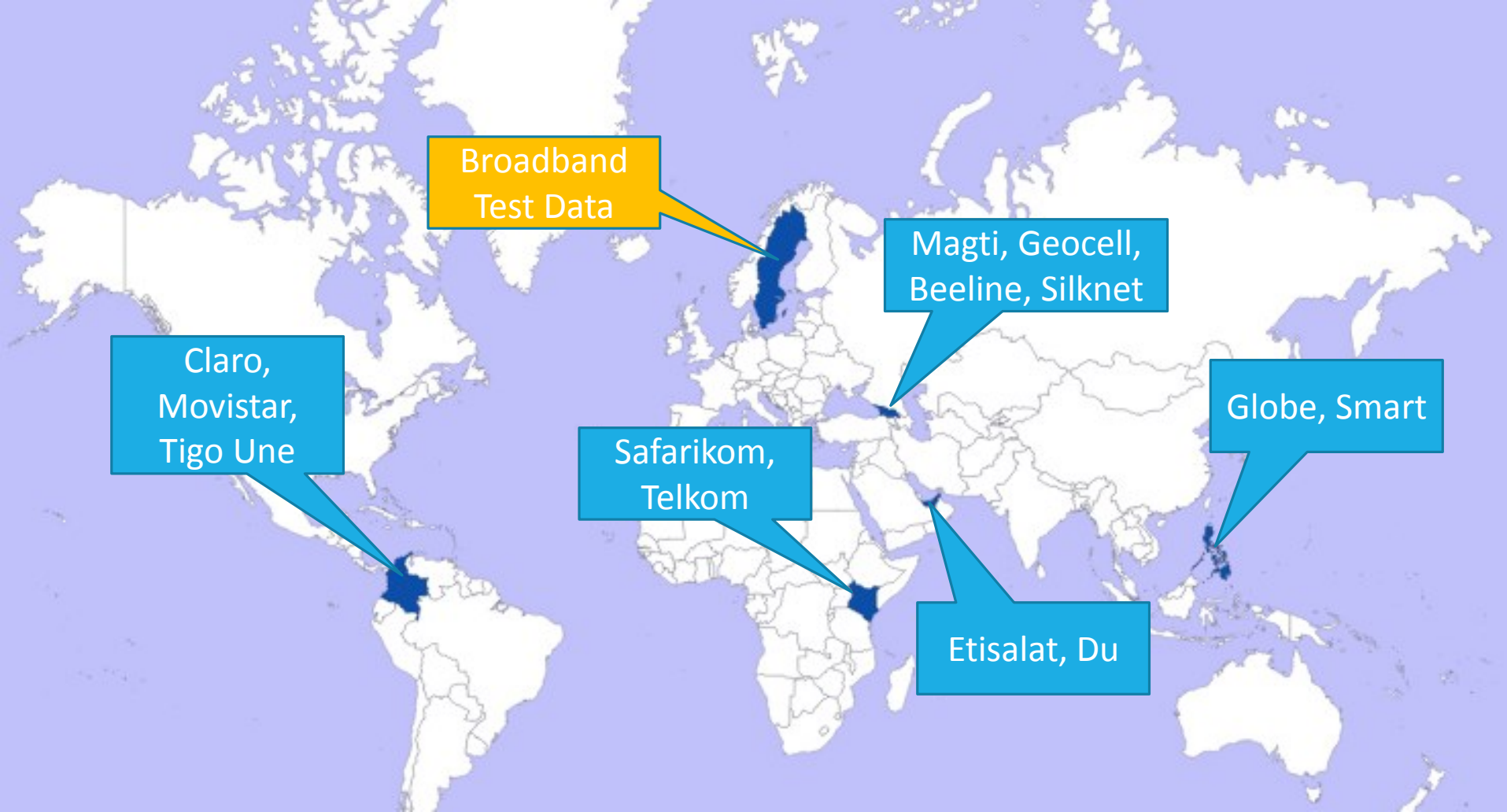
# Big Data

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In this project we consider Big Data sources from **Mobile Network Operators (MNO)** and **Internet Service Providers (ISP)**, who possess valuable residual data from the aspect of ICT



Source: <http://well-managed-business-intelligence.blogspot.in/2012/06/big-data-fourth.html>



## 6 Pilot Countries

The Philippines, Georgia, Colombia, Kenya, UAE, Sweden



# Local Stakeholders

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Telecommunication regulator / ICT Ministry

National Statistical Institutes

Data protection commission/agency

MNOs and ISPs – data providers:

- Globe, Smart, Magti, Geocell, Beeline, Silknet, Claro, Movistar, Tigo Une, Safarikom, Telkom, Etisalat, Du

# Pilot Studies' Challenges

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## Access to the data

- Legal clearance (regulations)
- Administrative aspects
- Data protection (DPA)
- What source data are collected and available

## Processing and analysis of large data sets

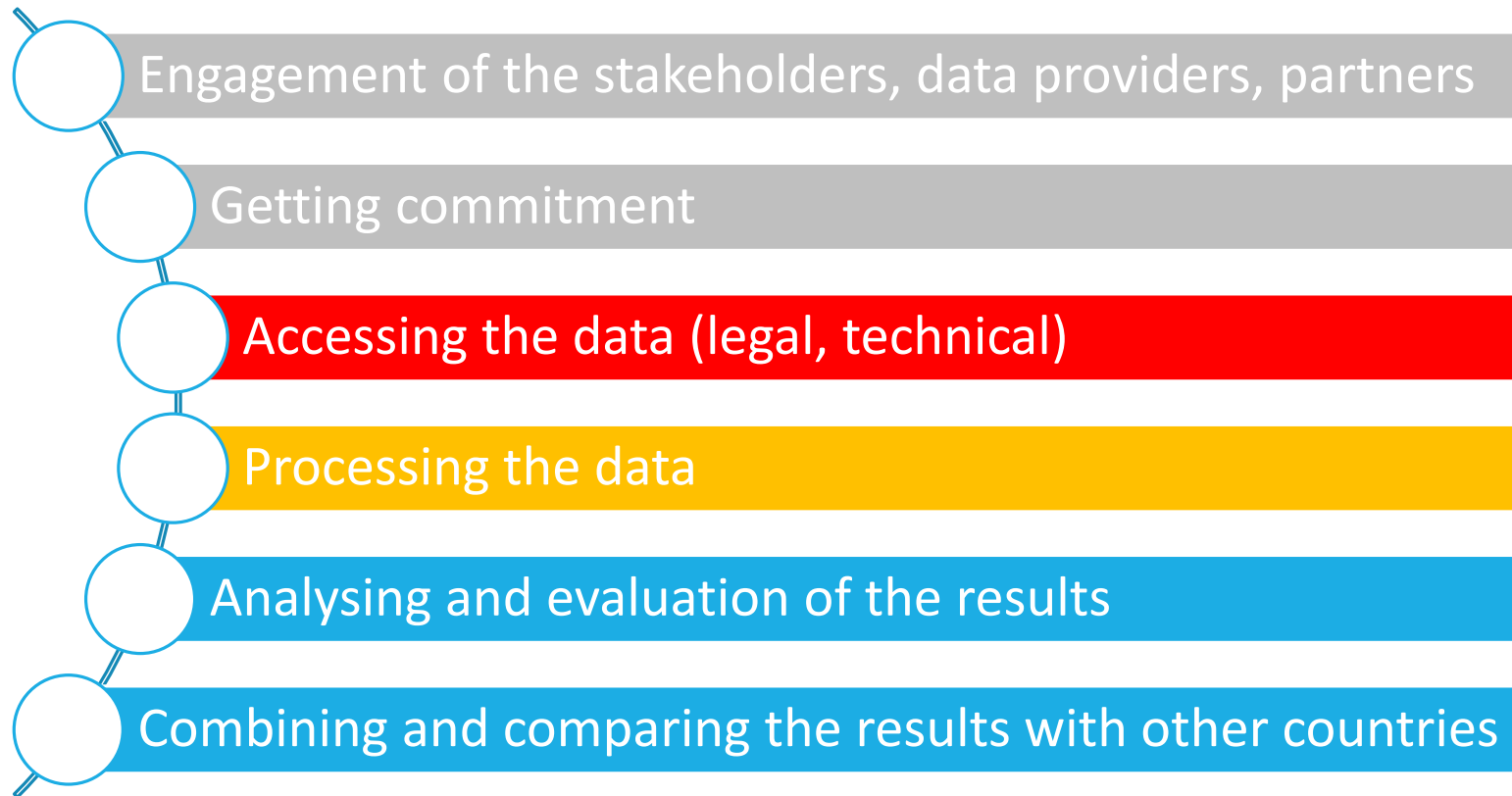
- Location of the processing
- Methodology for processing, quality of the data and indicators

## What indicators can be calculated?

- Are the resulting indicators valuable and usable for policy and investment decisions?
- Is the data comparable nationally, internationally, over the time?

# Status

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Country	Status overview	Location of the processing	Expected data scientist's visit	Country report ready
Sweden	Needs resolving contract issues and privacy obfuscation	ITU	December	January
Philippines	Waiting for legal go from data providers	Data providers	January	February
Georgia	Data request from data providers, preparations from data providers to send data, GNCC to process data	GNCC	February	March
Colombia	Providers committed, but lack of resources and time now, 2017 Q2 expected	Mixed	March-April	April
Kenya	Ready, need to resolve some aspects of data processing and administrative questions	Data providers	January	February
UAE	Official request made from TRA, data providers preparing for processing of the data	Data providers	January	February

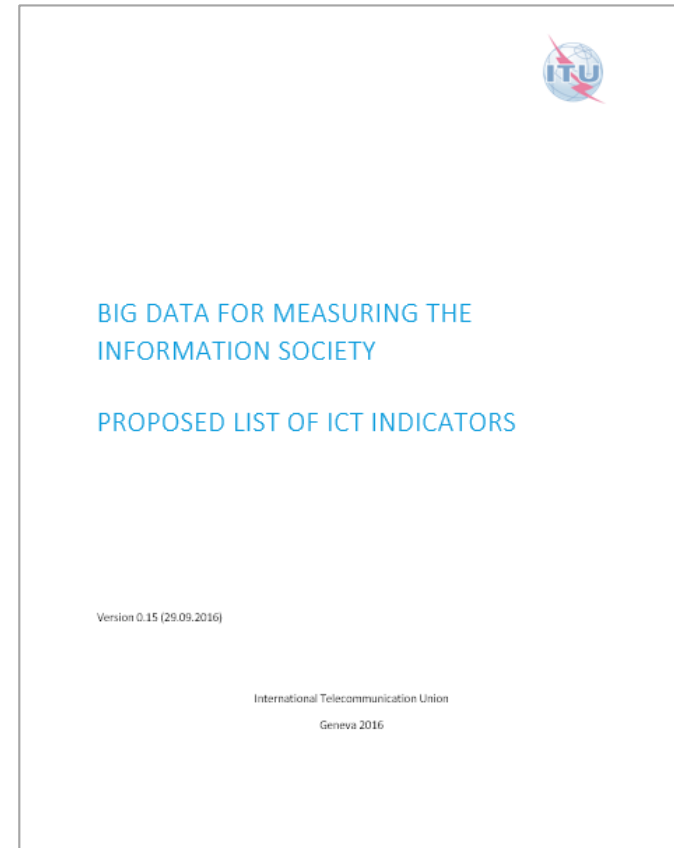
# Methodology

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## Methodology document

- Proposed indicators
- Data source description
- Processing methodology
- Disaggregation
- The purpose and value of the indicator

Draft document to be complemented and amended during the project



# Proposed Big Data Indicators

- BD01: Percentage of the Land Area C
- BD02: Percentage of the Population C
- BD03: Usage of Mobile-Cellular Netw
- BD04: Usage of Mobile-Cellular Netw
- BD05: Number of Subscriptions with
- BD06: Active Mobile Voice and Broad
- BD07: Average Number of Active Mo
- BD08: Active Mobile Devices
- BD09: IMEI Conversion Rate
- BD10: Fixed Domestic Broadband Tra
- BD11: Mobile Domestic Broadband T
- BD12: Mobile International Broadbar
- BD13: Inbound Roaming Subscription
- BD14: Fixed Broadband Subscriptions
- BD15: Fixed Broadband Subscriptions
- BD16+: any proposed indicators from



**BD01: Percentage of the Land Area Covered by Mobile-Cellular Network, by Technology**

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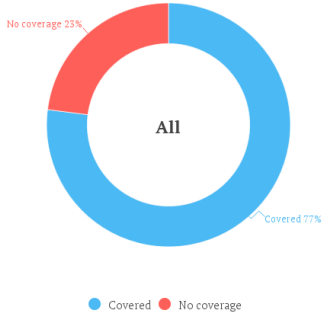
**BD01: Percentage of the Land Area Covered by Mobile-Cellular Network, by Technology**

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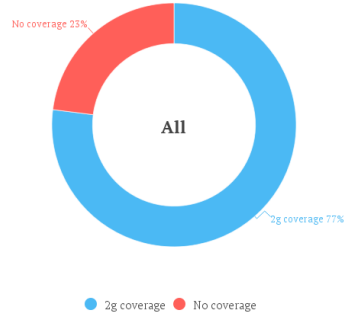
**All Technologies**

All



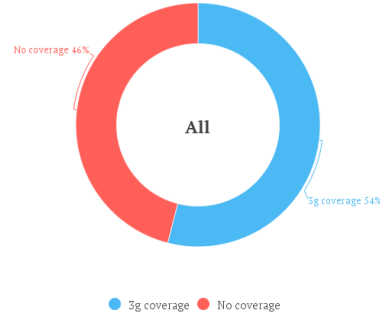
**2G**

All



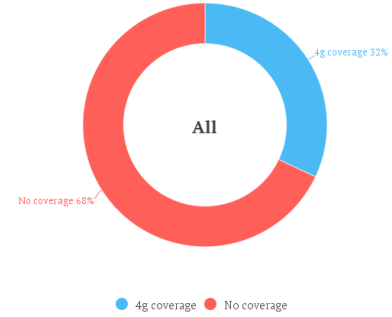
**3G**

All

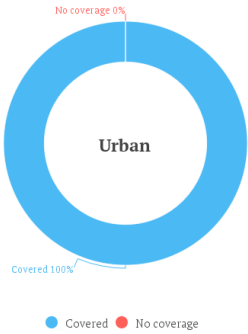


**4G**

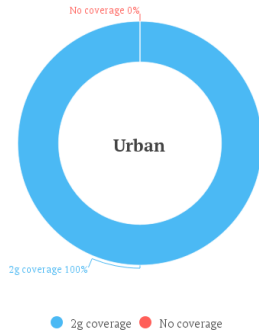
All



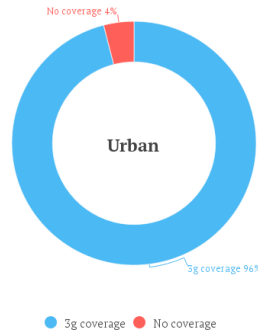
**Urban**



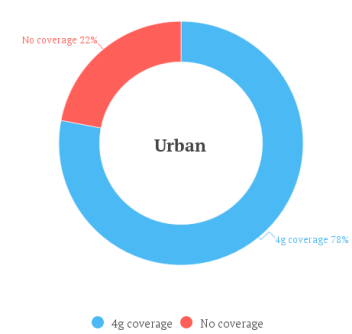
**Urban**



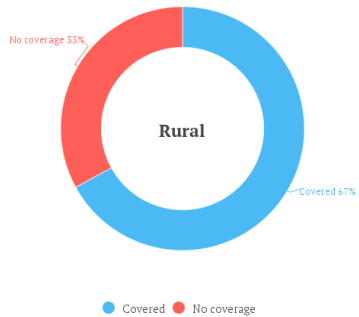
**Urban**



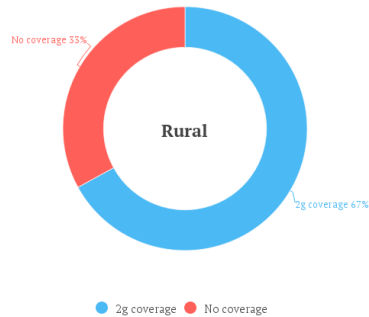
**Urban**



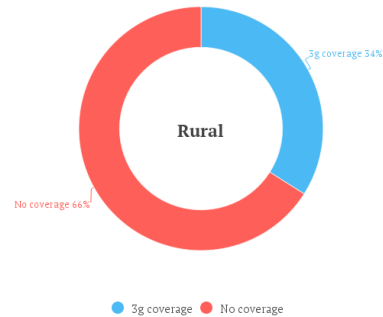
**Rural**



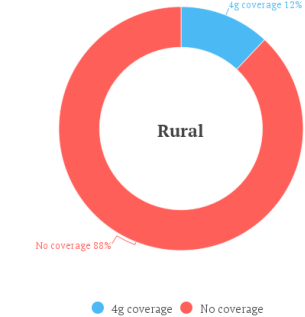
**Rural**



**Rural**



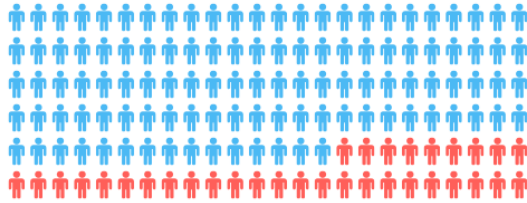
**Rural**



# BD01: Percentage of the Land Area Covered by Mobile-Cellular Network, by Technology

All Technologies

All



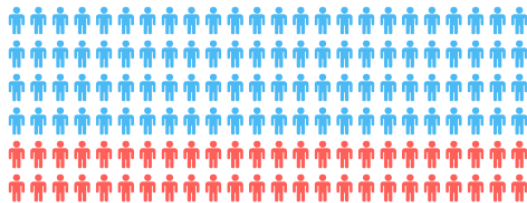
● Covered ● No coverage

Urban



● Covered ● No coverage

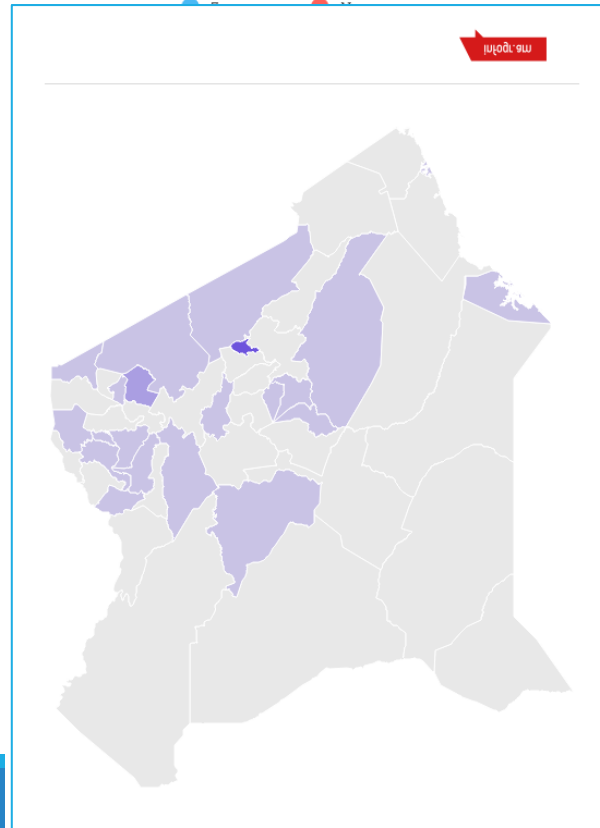
Rural



● Covered ● No coverage

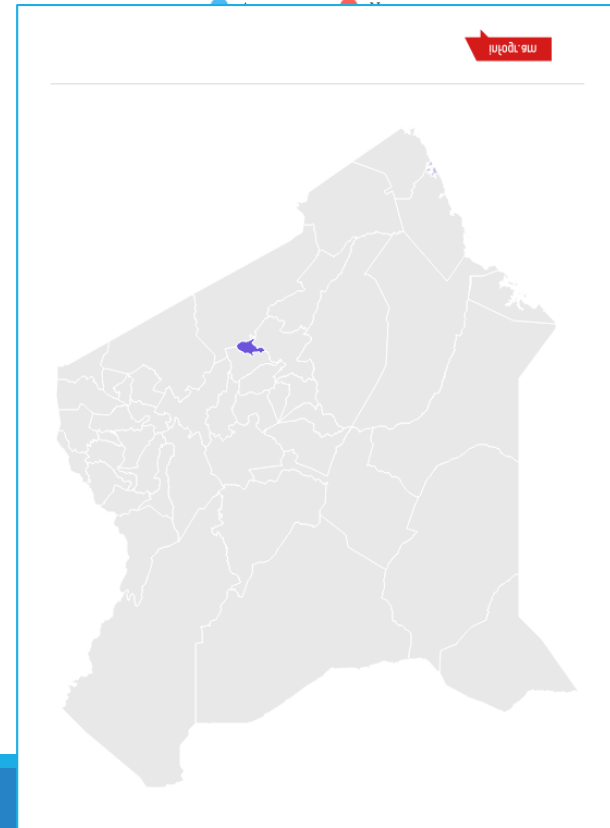
# 3G

All

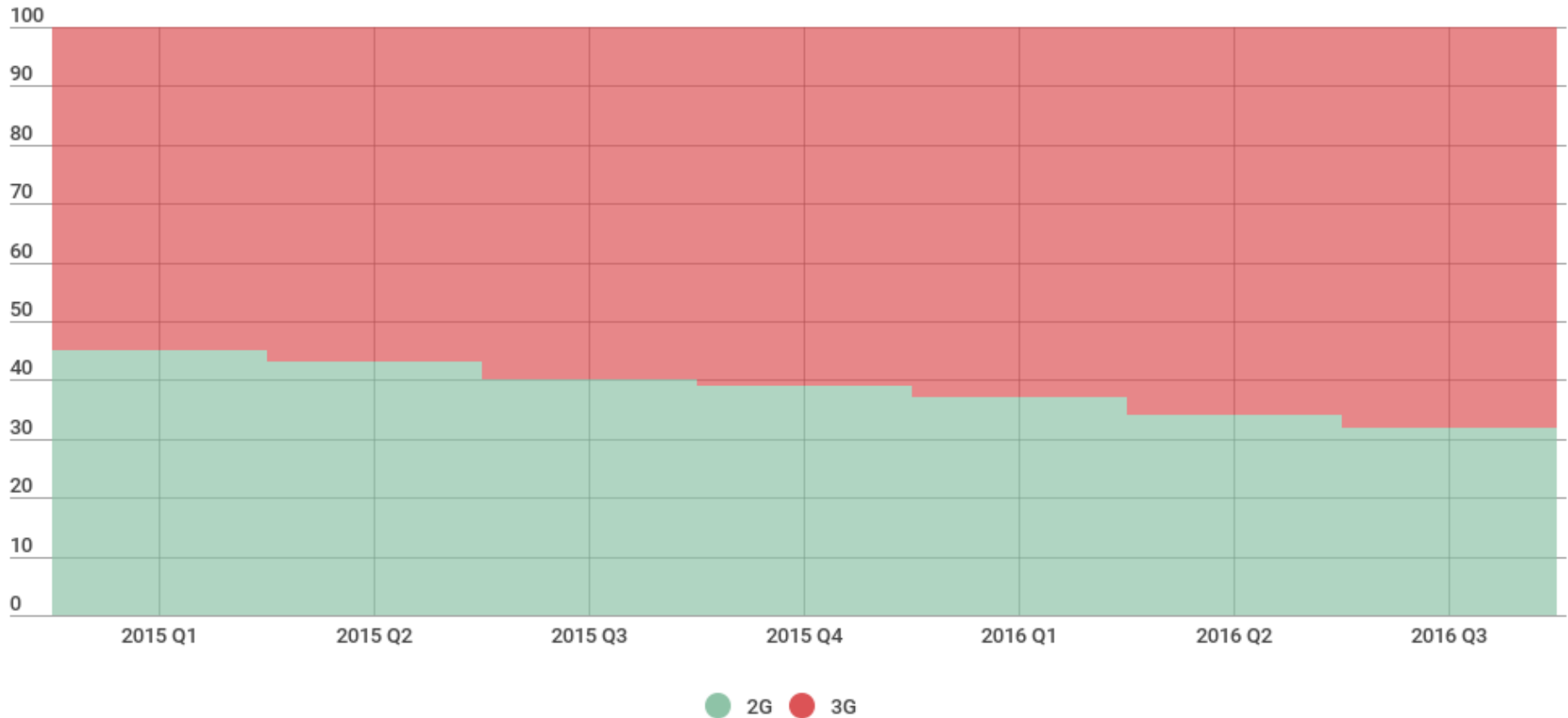


# 4G

All

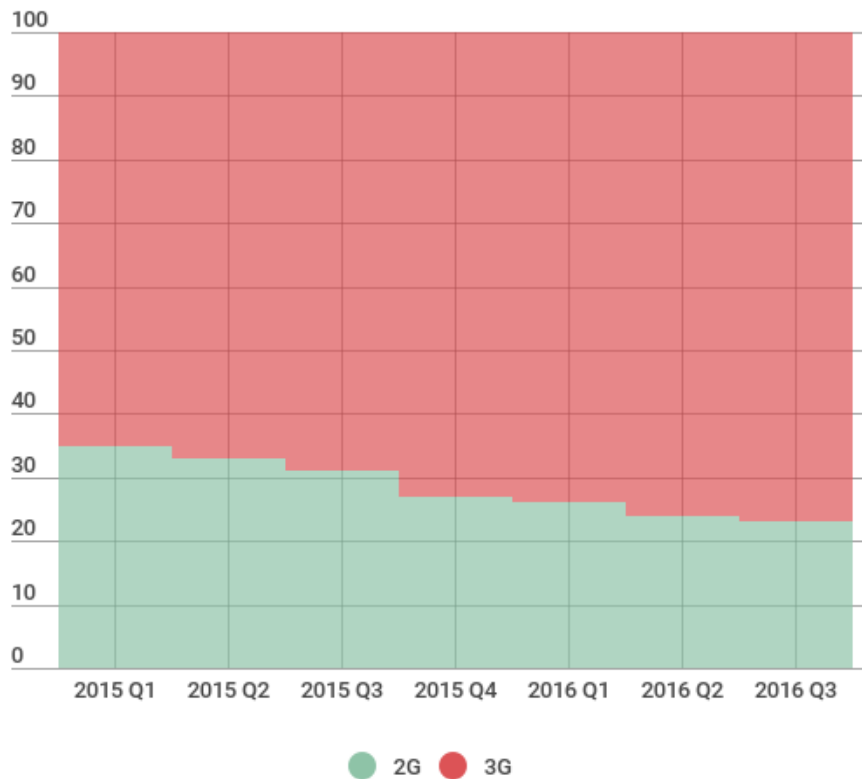


# BD03: Usage of Mobile-Cellular Networks for non-IP Related Activities, by Technology

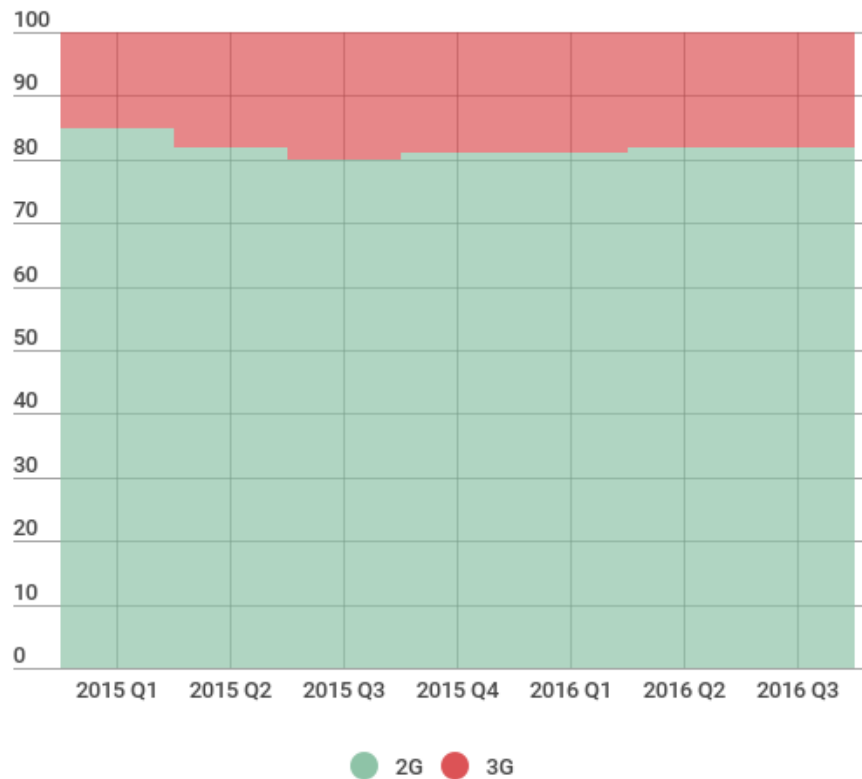




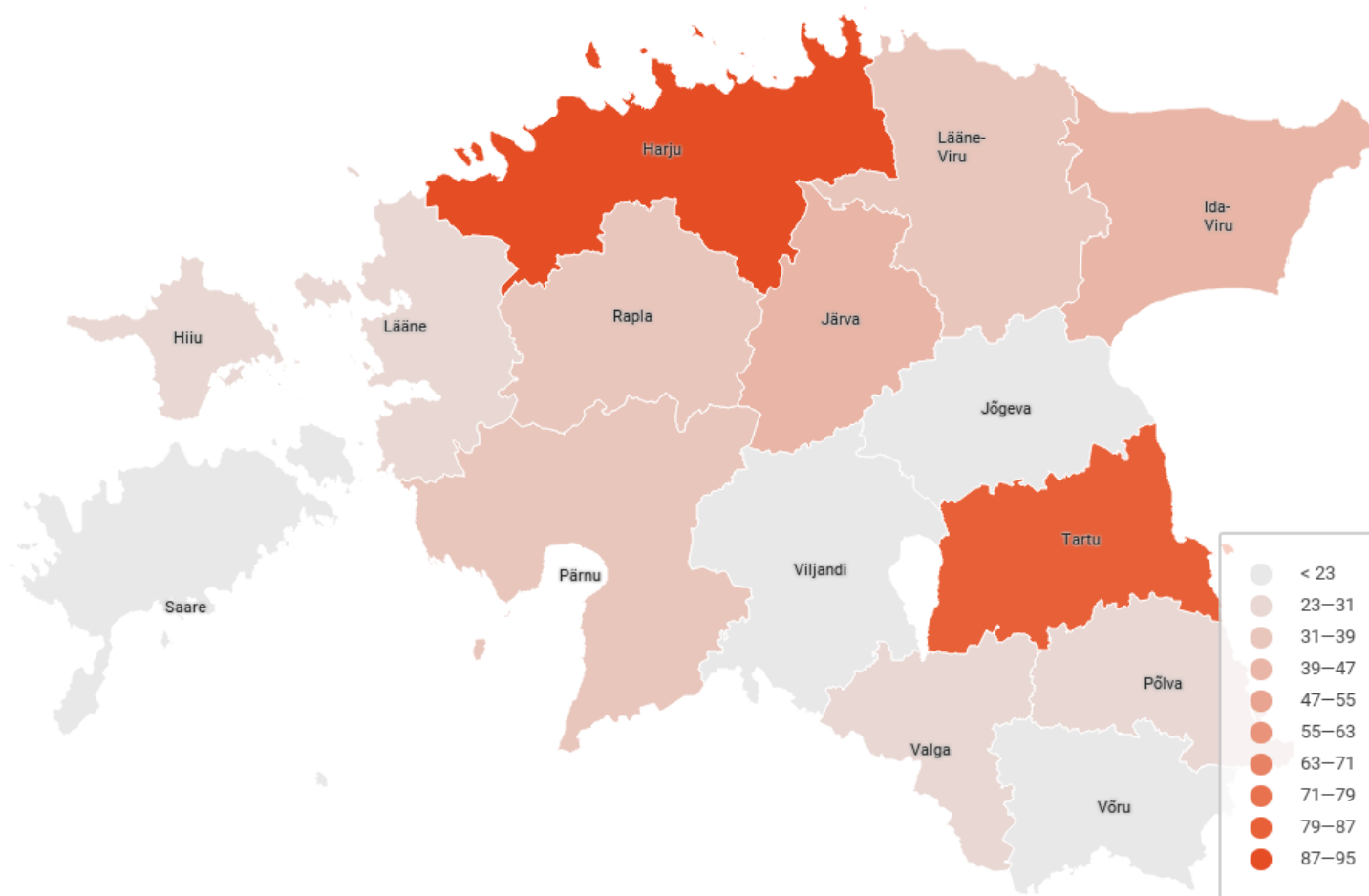
## BD03: Urban Areas



## BD03: Rural Areas

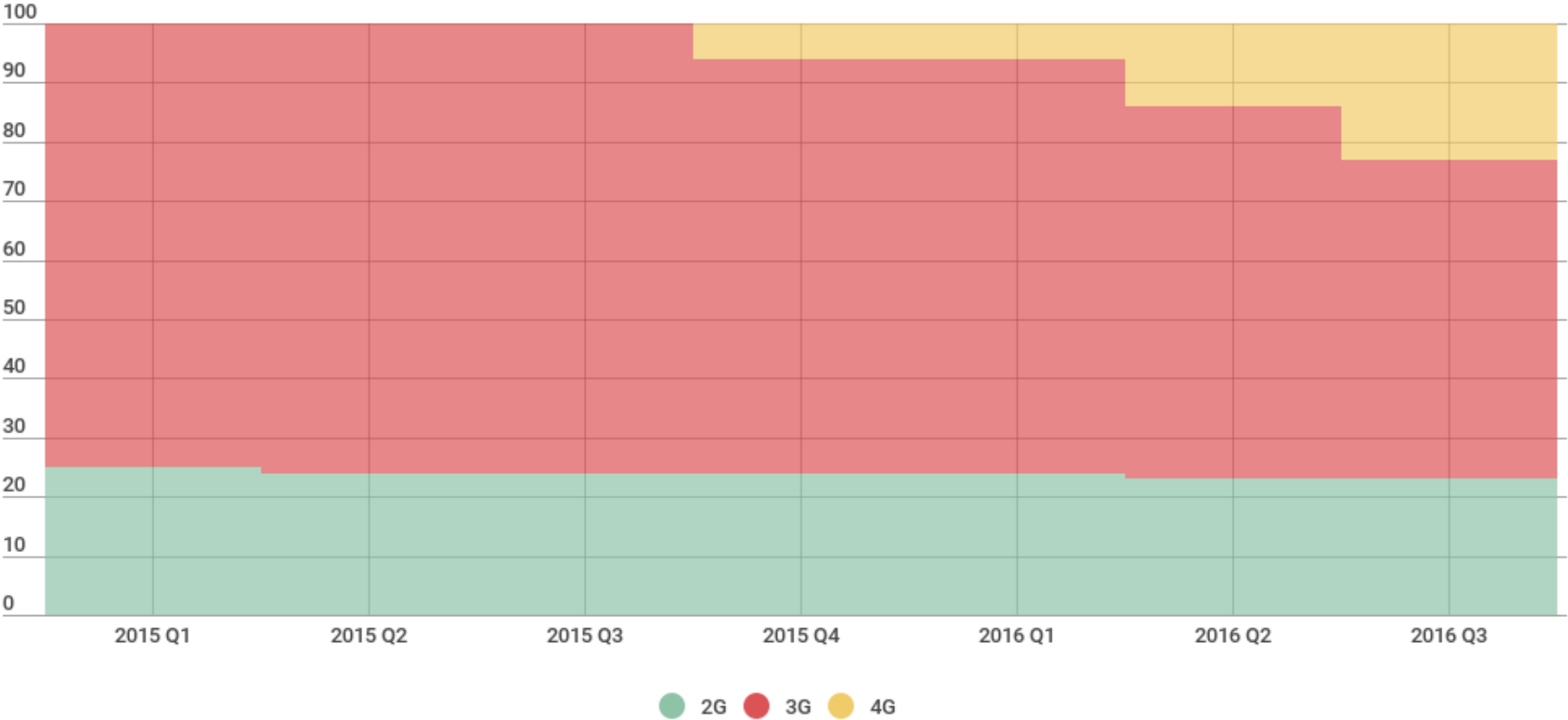


# By Regions



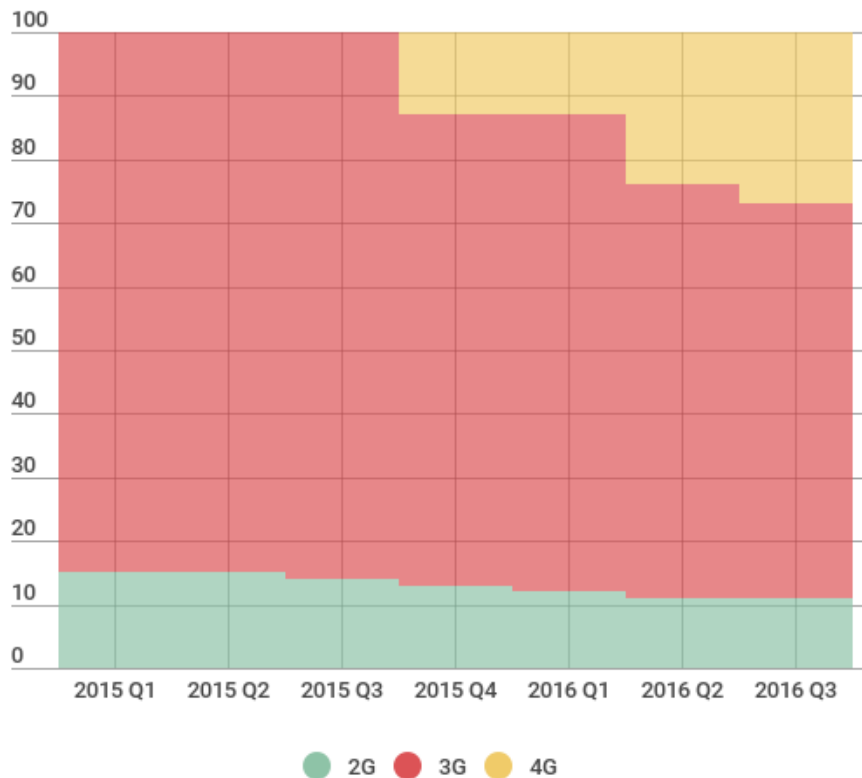


# BD04: Usage of Mobile-Cellular Networks for Internet Access, by Technology

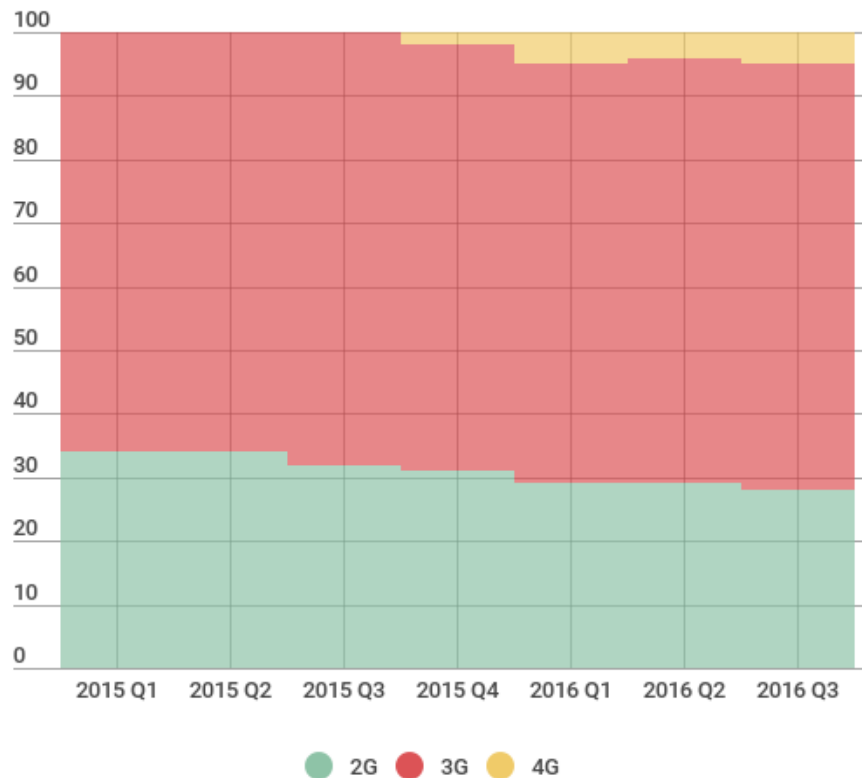




## BD04: Urban Areas



## BD04: Rural Areas



# COMMERCIAL/PRIVATE CONTRACTS VS 4G USAGE (BD06-BD04)

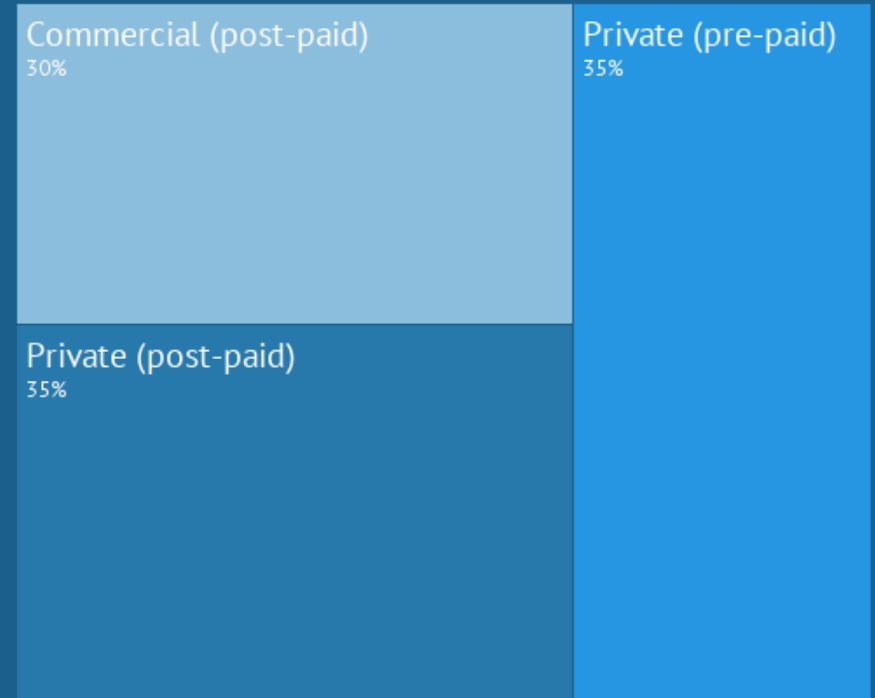
## Number of Subscribers (BD06)



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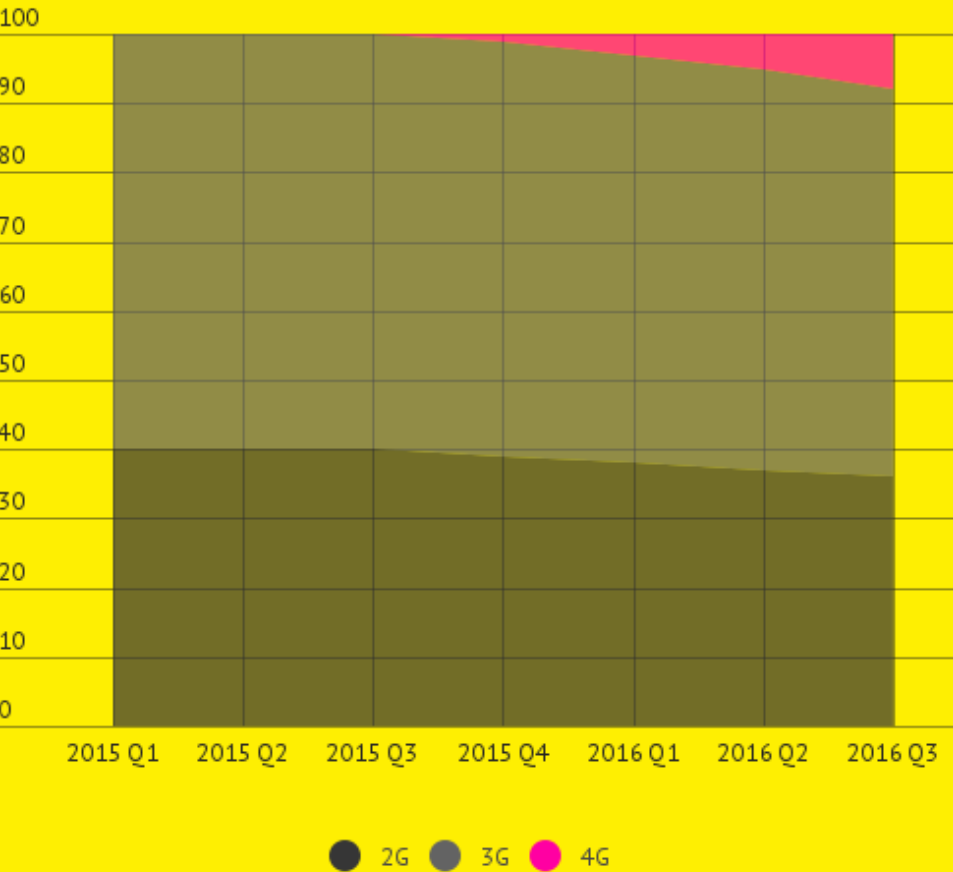
# COMMERCIAL/PRIVATE CONTRACTS VS 4G USAGE (BD06-BD04)

## Proportion of 4G Usage (BD04)



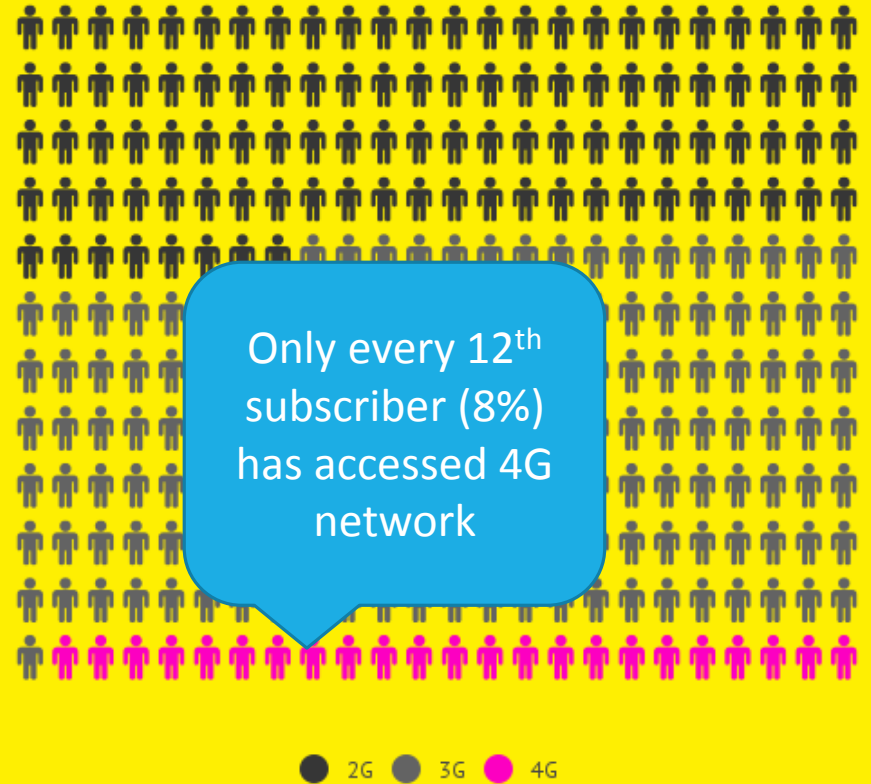
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# BD05: NUMBER OF SUBSCRIPTIONS WITH ACCESS TO TECHNOLOGY



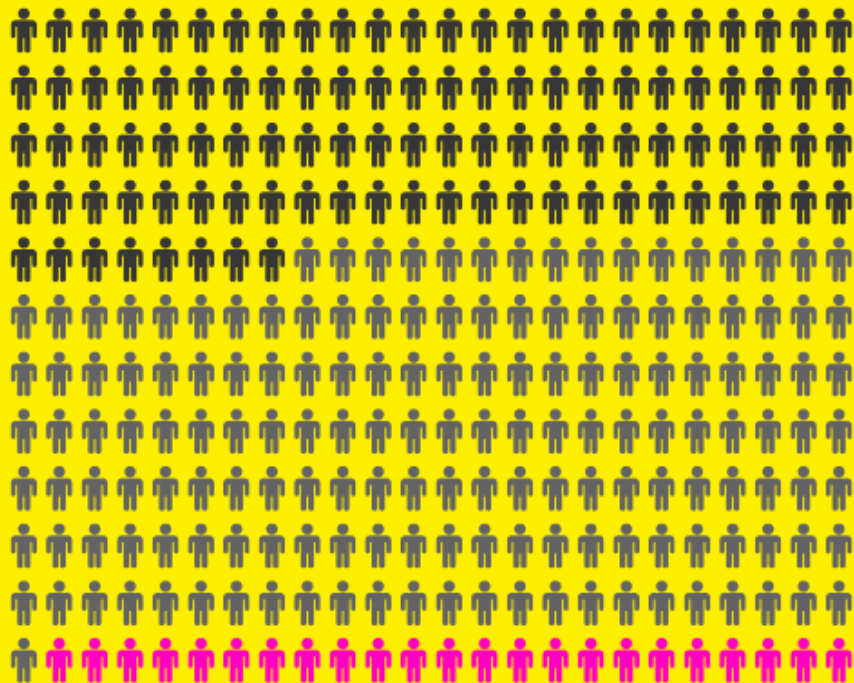
# BD05: NUMBER OF SUBSCRIPTIONS WITH ACCESS TO TECHNOLOGY

2016 Q3



# BD05: NUMBER OF SUBSCRIPTIONS WITH ACCESS TO TECHNOLOGY

2016 Q3



● 2G ● 3G ● 4G

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# BD05: NUMBER OF SUBSCRIPTIONS WITH ACCESS TO TECHNOLOGY

Now



Objective

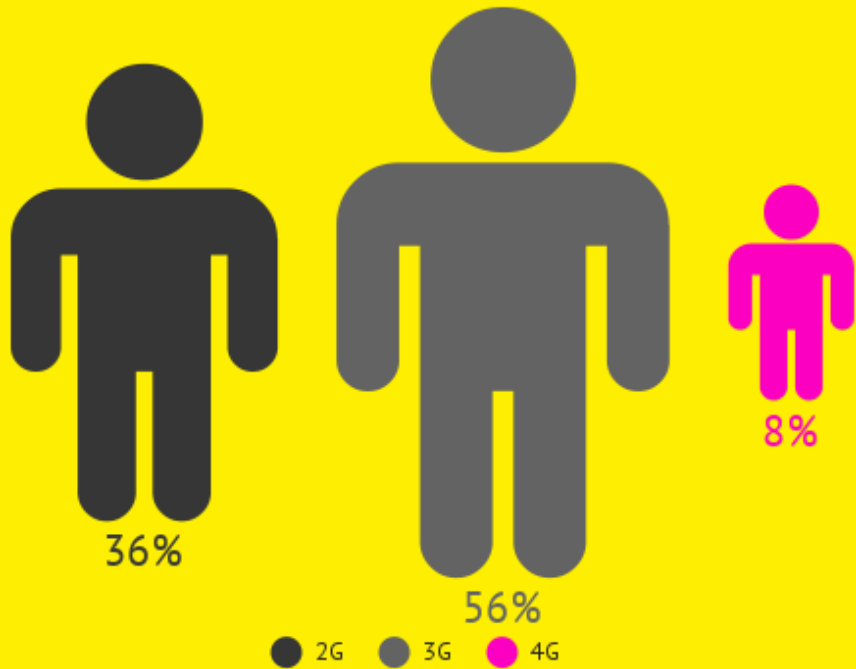


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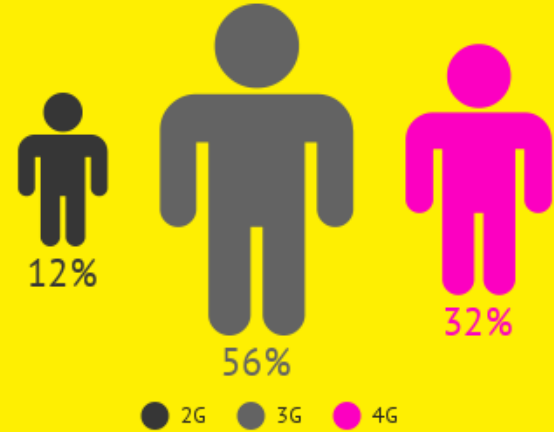


# BD05: NUMBER OF SUBSCRIPTIONS WITH ACCESS TO TECHNOLOGY

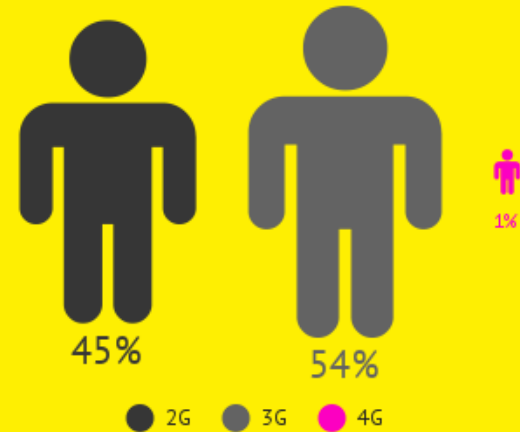
2016 Q3



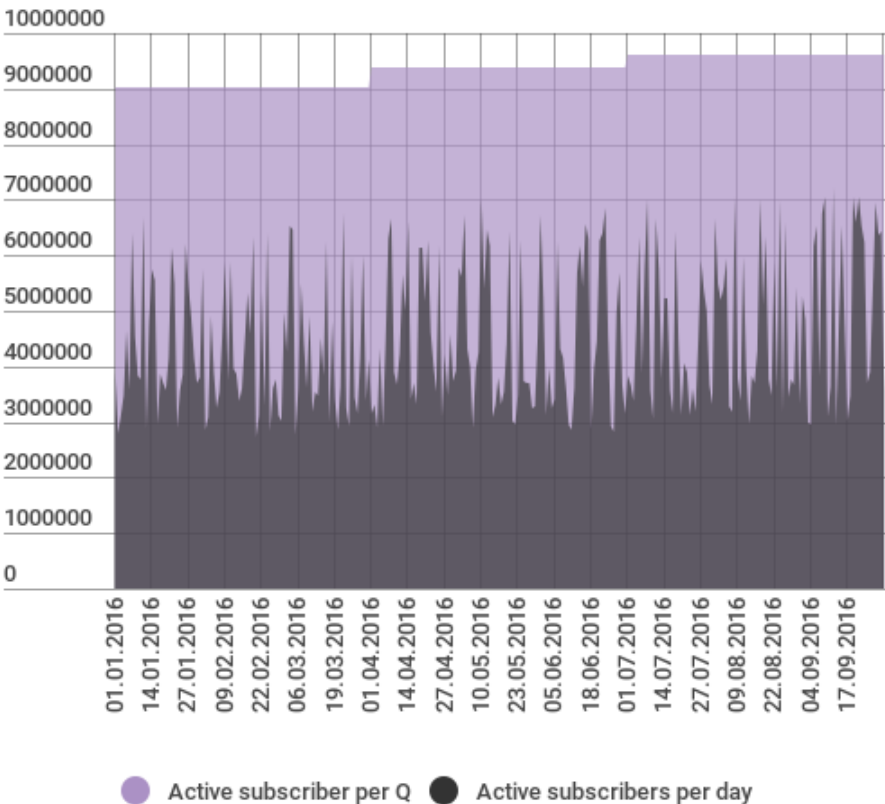
Urban



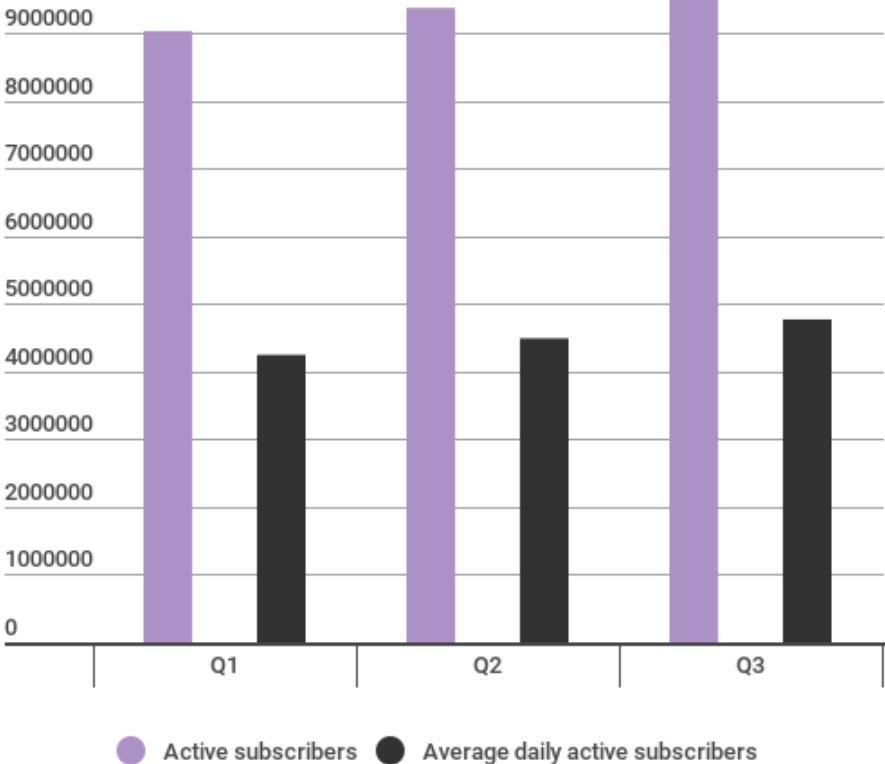
Rural



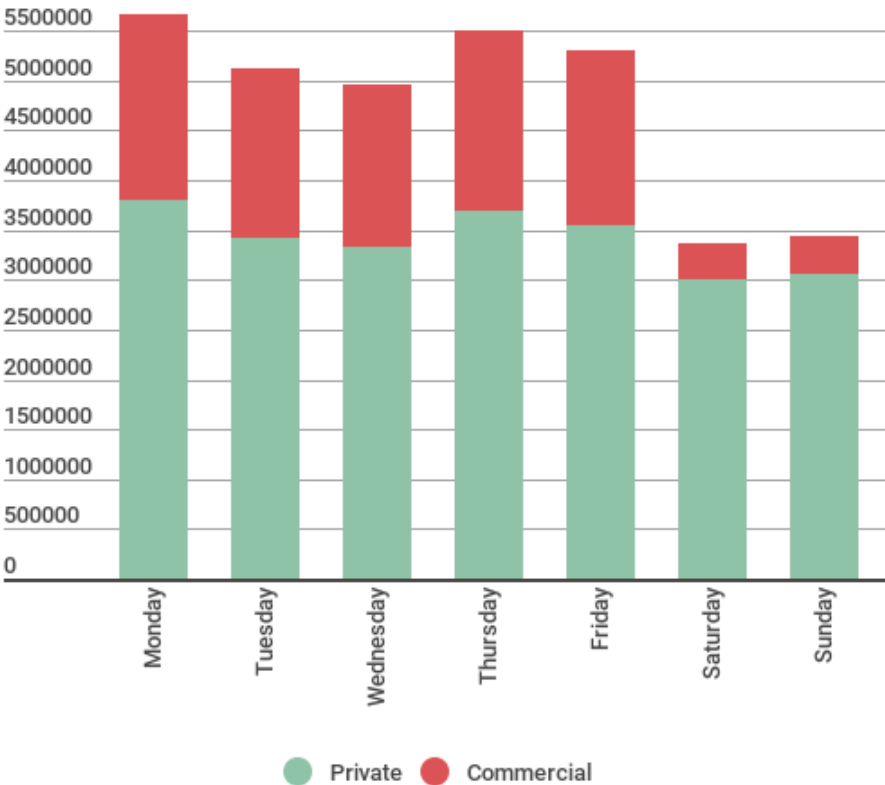
# BD07: Average Number of Active Mobile Subscriptions per Day, by Contract Type



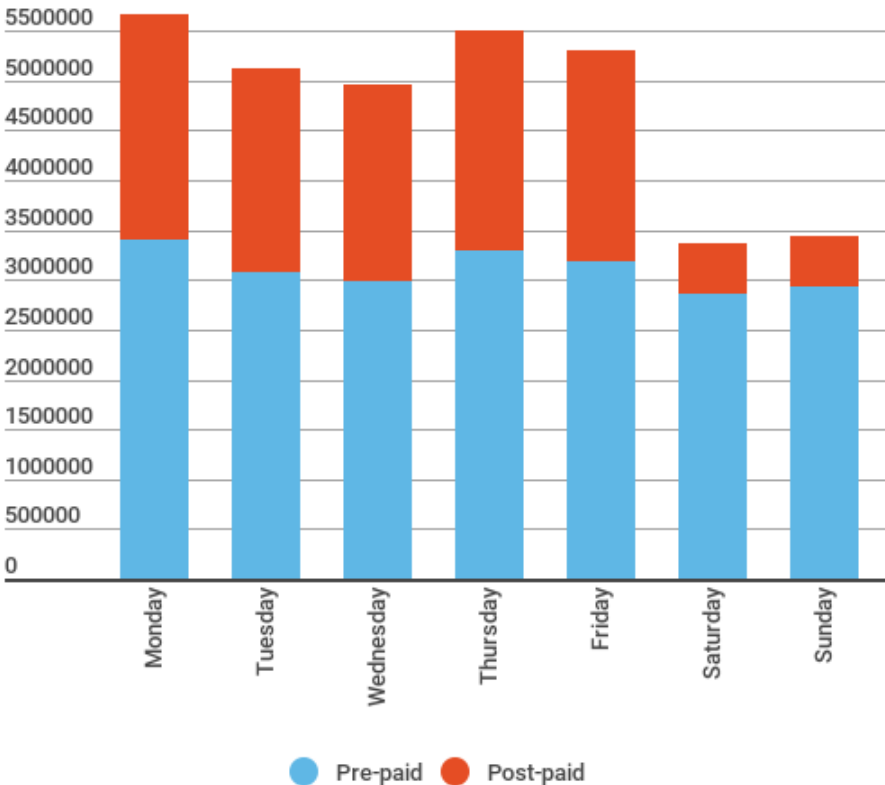
# BD07: Average Number of Active Mobile Subscriptions per Day, by Contract Type



# BD07: Average Number of Active Mobile Subscriptions per Day, by Contract Type



# BD07: Average Number of Active Mobile Subscriptions per Day, by Contract Type





# BD08: ACTIVE MOBILE DEVICES; BD09: IMEI CONVERSION RATE



13,089,334

Number of active subscriptions  
2016\_Q3



25,262,406

Number of active devices 2016\_Q3

## Subscribers



● 1 device ● 2 or more devices



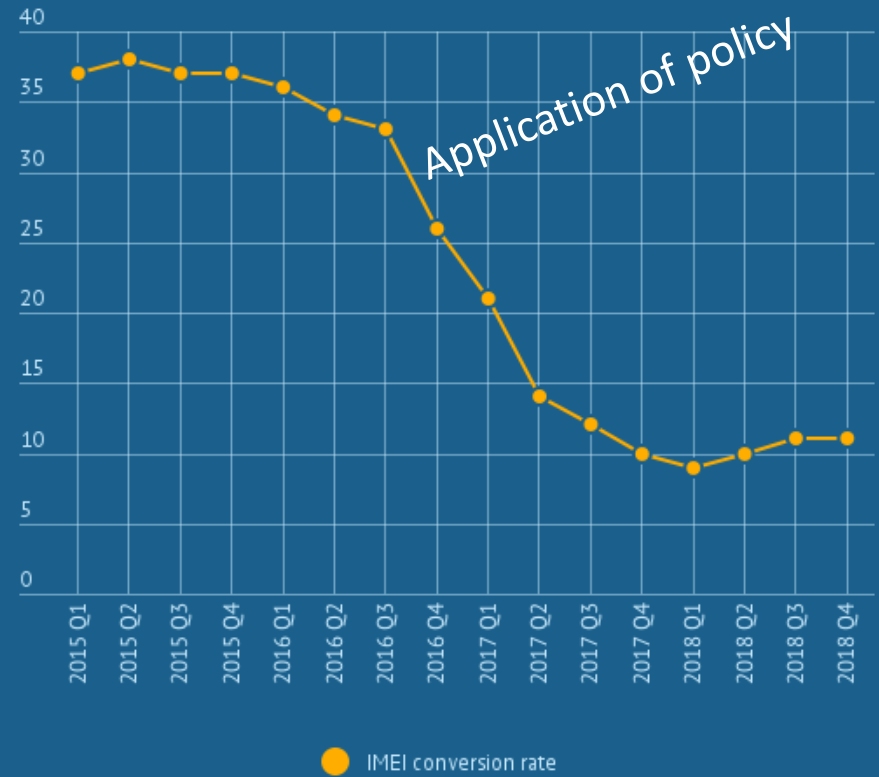
33%

Every third subscriber uses two or more devices with one SIM card. This suggests there is a "black market" for stolen devices.



10%

Normal IMEI conversion rate would indicate how many subscribers obtain new phone per quarter.



2016 Q3

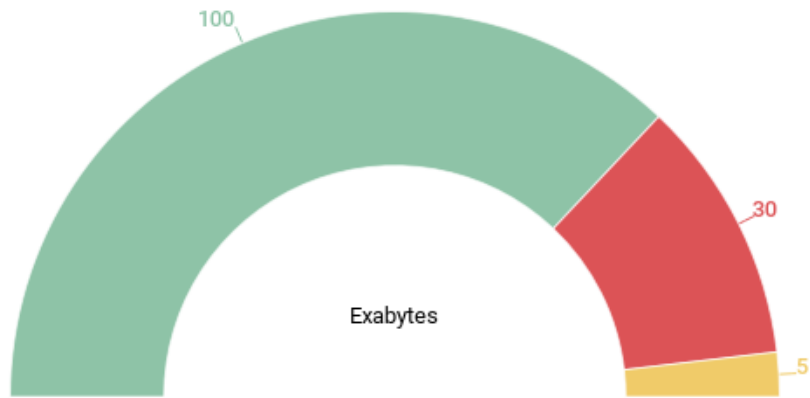


● 33%

2017 Q4



● 10%



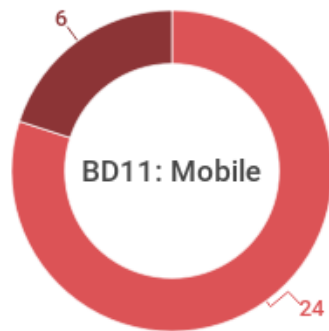
- BD10: Fixed Domestic Broadband Traffic
- BD11: Mobile Domestic Broadband Traffic
- BD12: Mobile International Broadband Traffic

### BD10: Fixed



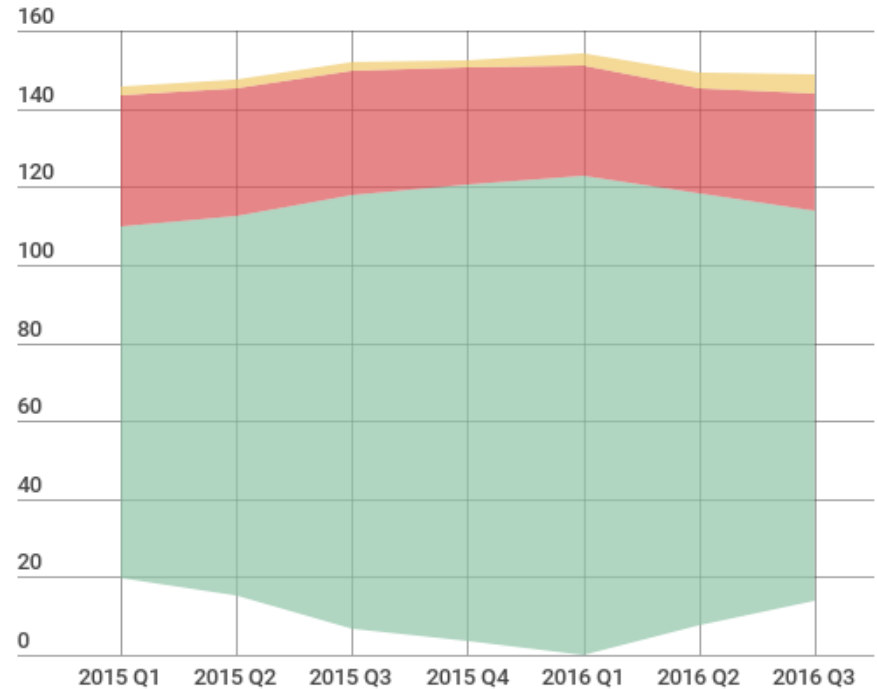
- Urban areas
- Rural areas

### BD11: Mobile



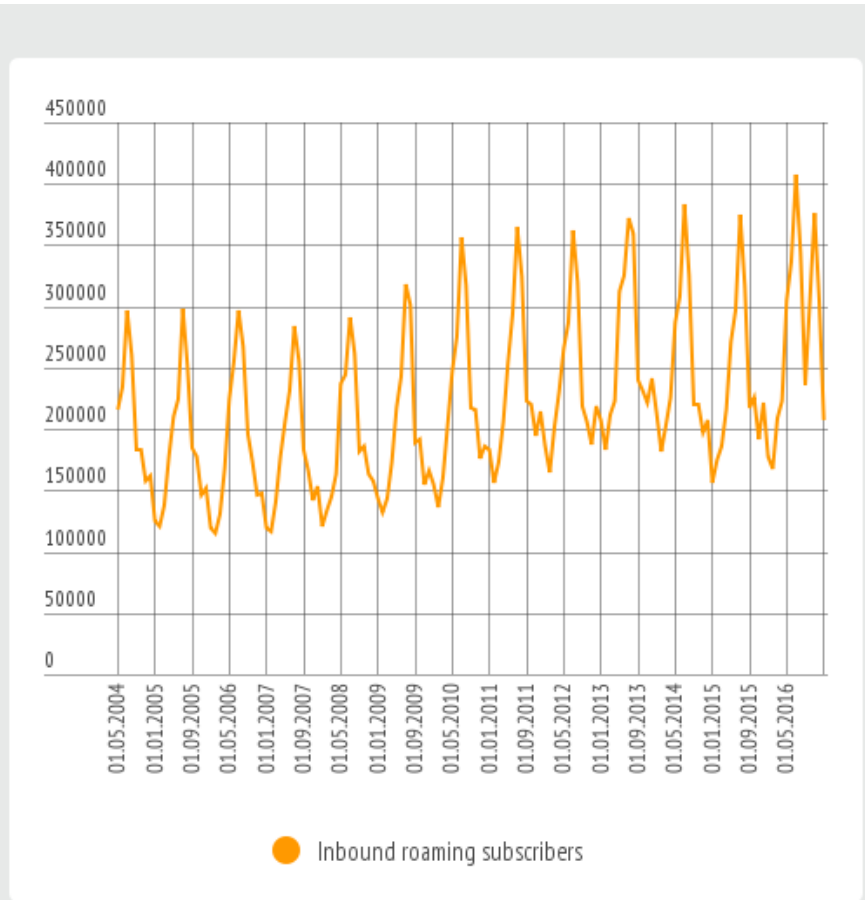
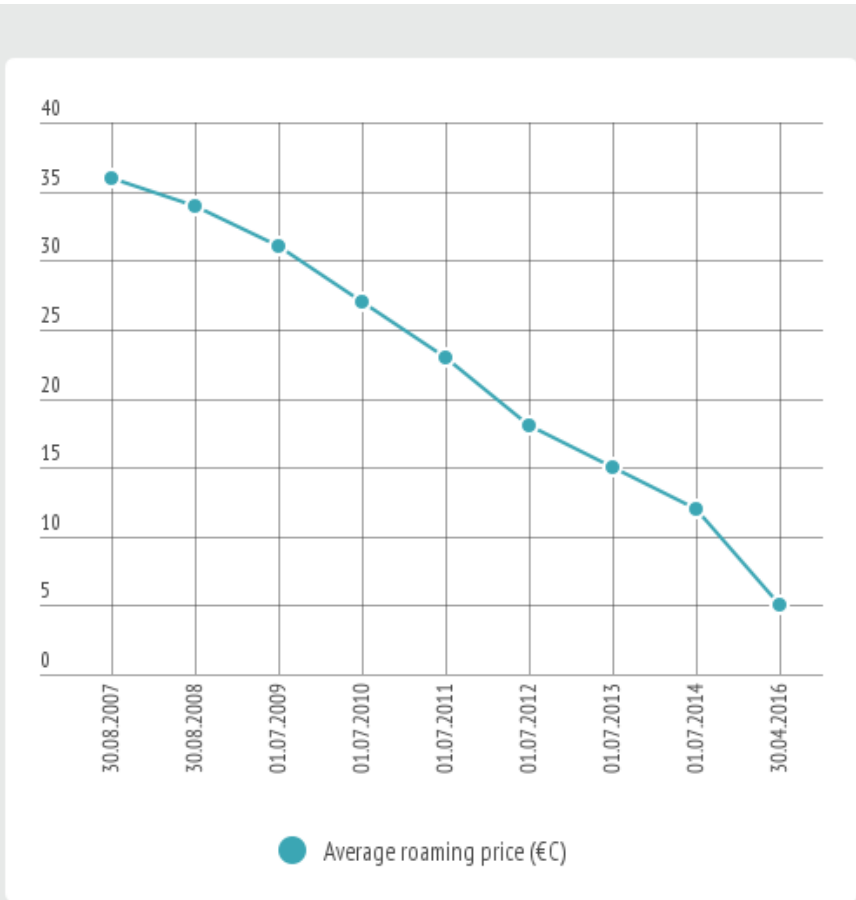
- Urban areas
- Rural areas

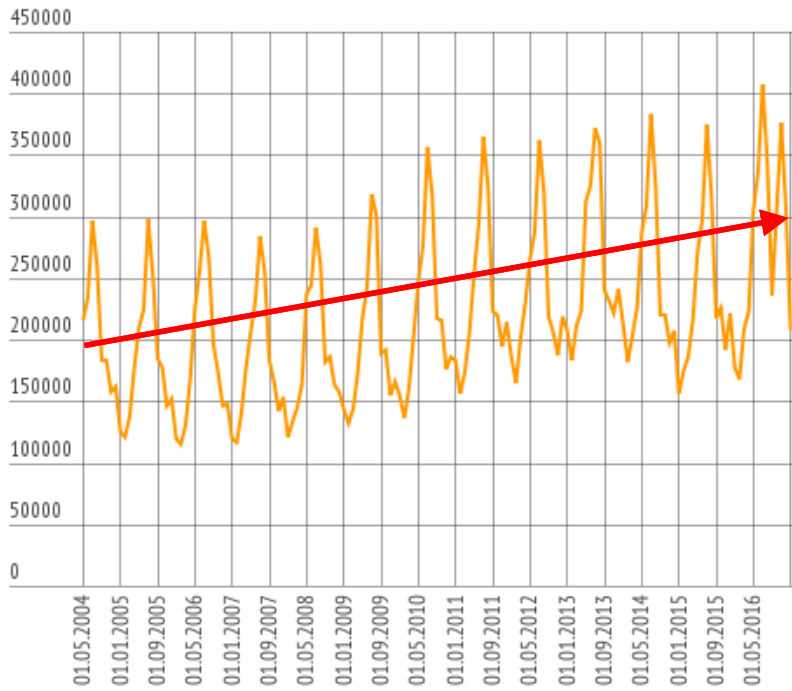
## BD10, BD11, BD12: Broadband Traffic



- BD10: Fixed Domestic Broadband Traffic
- BD11: Mobile Domestic Broadband Traffic
- BD12: Mobile International Broadband Traffic

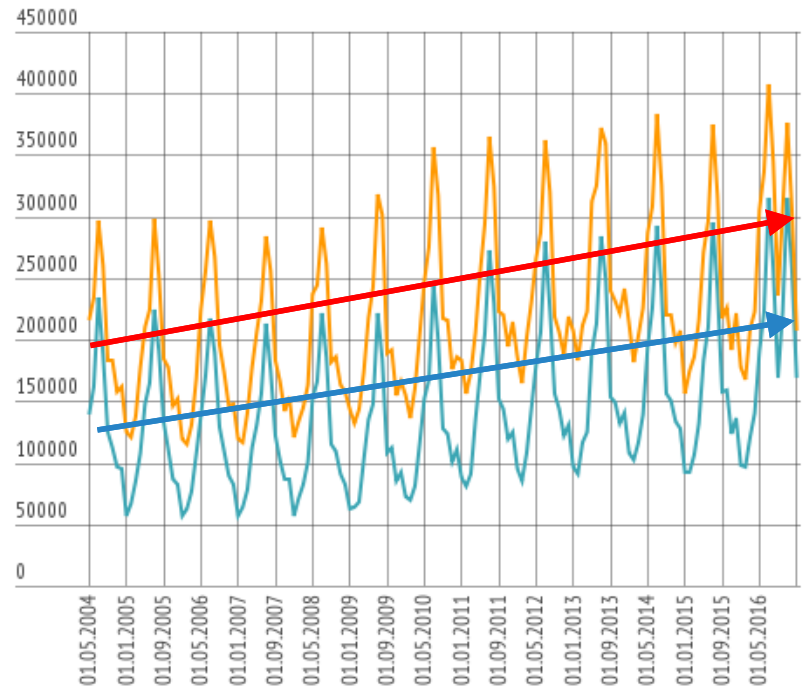
# BD13: Inbound Roaming Subscriptions per Foreign Tourist. Effect of the Roaming Regulations





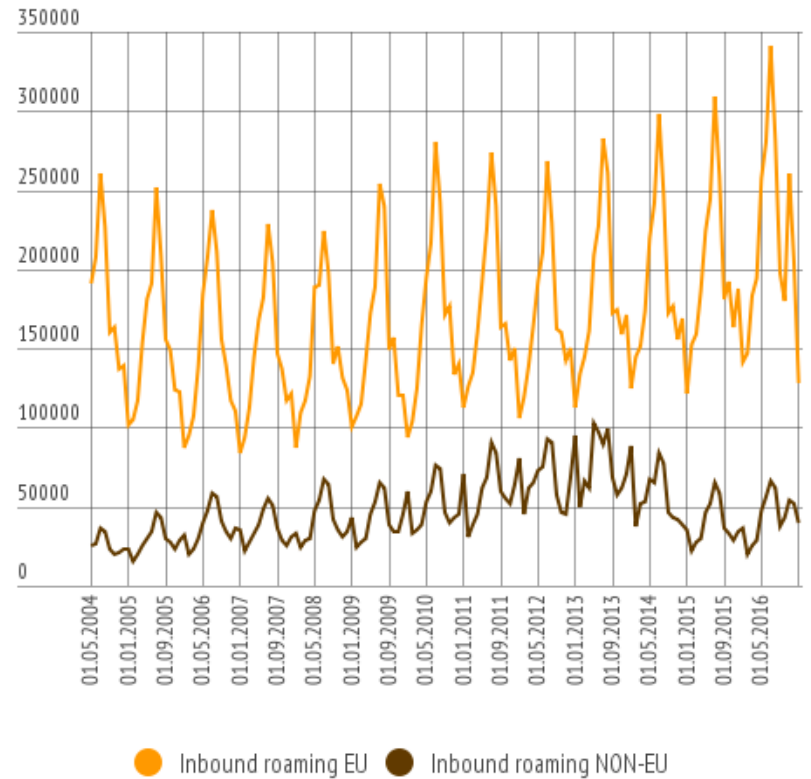
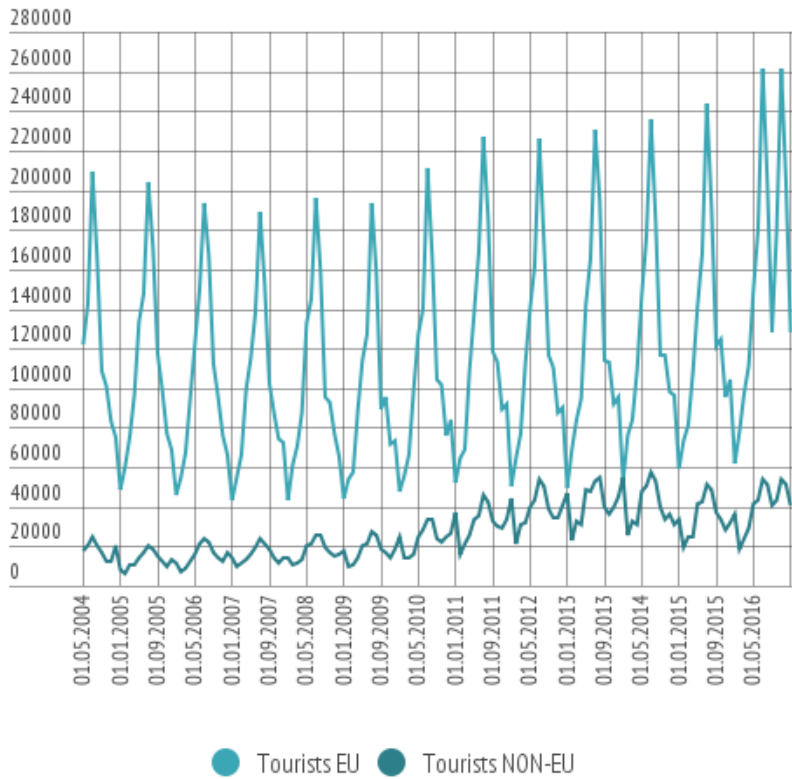
● Inbound roaming subscribers

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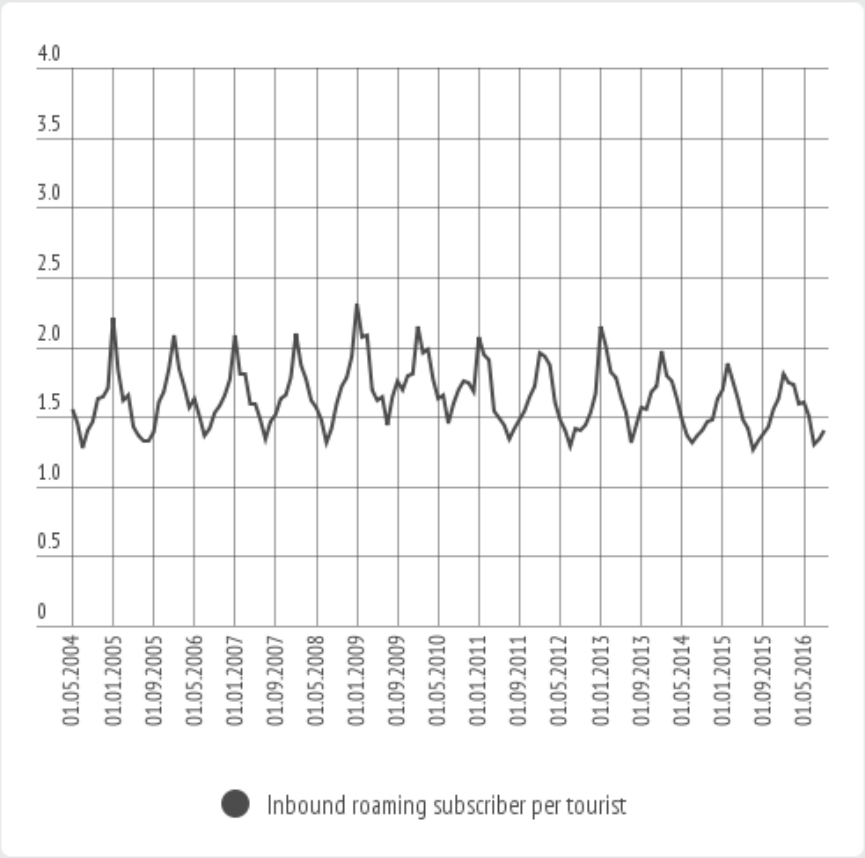


● Tourists ● Inbound roaming subscribers

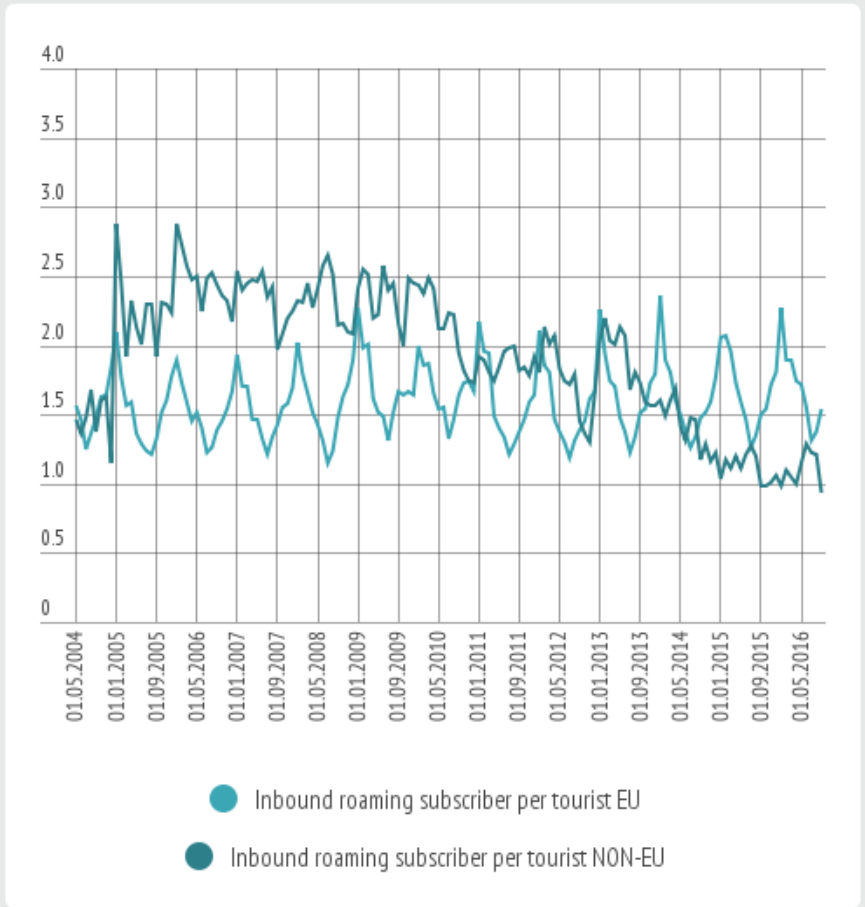
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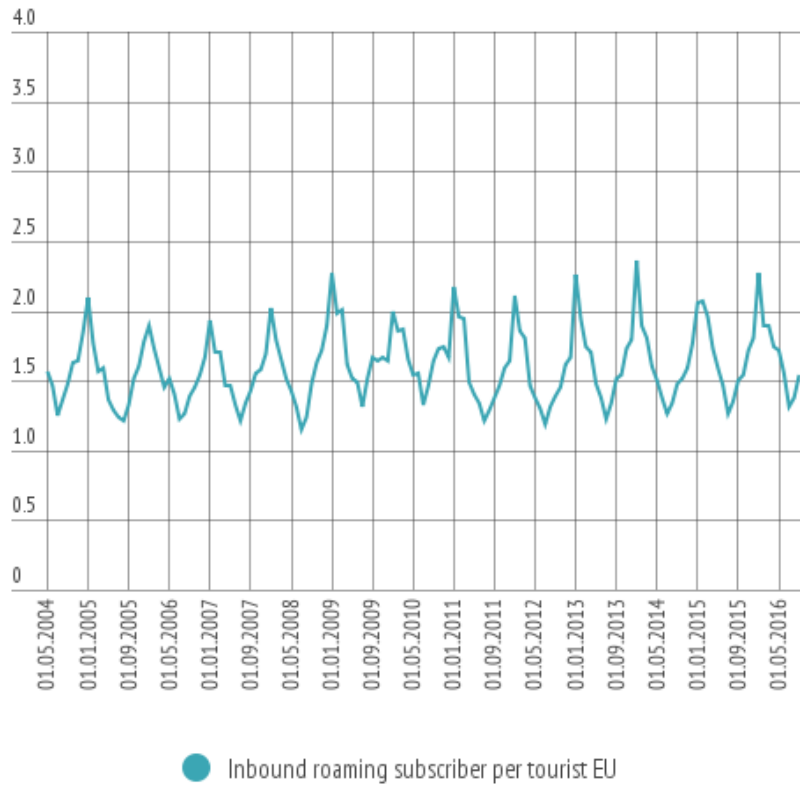
# BD13: Inbound Roaming Subscriptions per Foreign Tourist



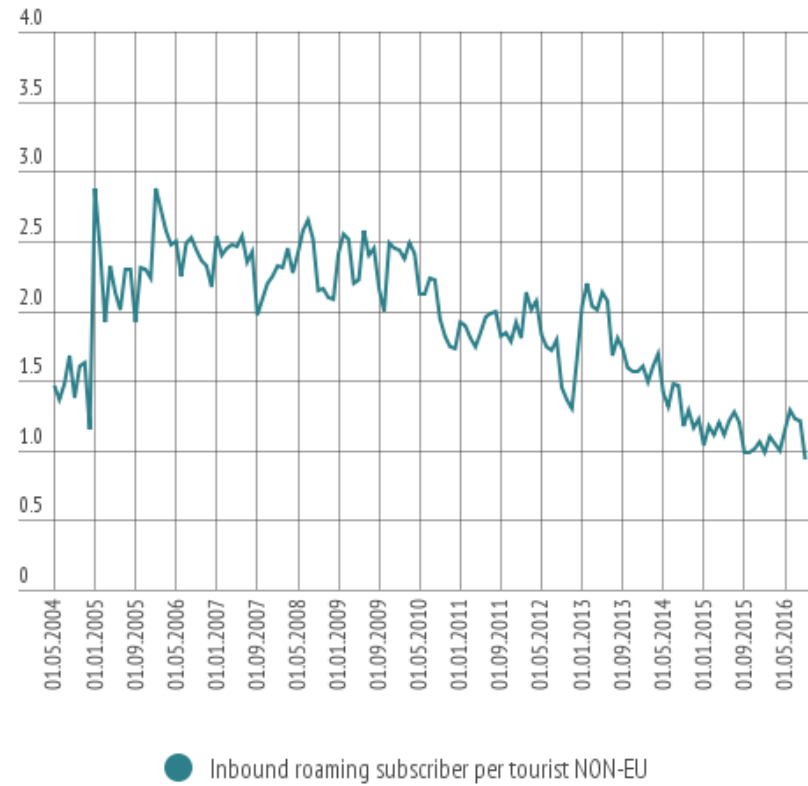
# BD13: Inbound Roaming Subscriptions per Foreign Tourist



# BD13: Inbound Roaming Subscriptions per Foreign Tourist



# BD13: Inbound Roaming Subscriptions per Foreign Tourist





# BD16+

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Pilot countries have an option to include additional indicators that are relevant to the country:

- Kenya: Including indicators on Mobile Money
- UAE: Interested in some data mining and machine learning approaches
- Colombia: Density of population census block level
- Stakeholders in other countries welcome to include indicators that they feel are necessary from the point of view of their country and globally



Indicator



Indicator



Indicator



Indicator



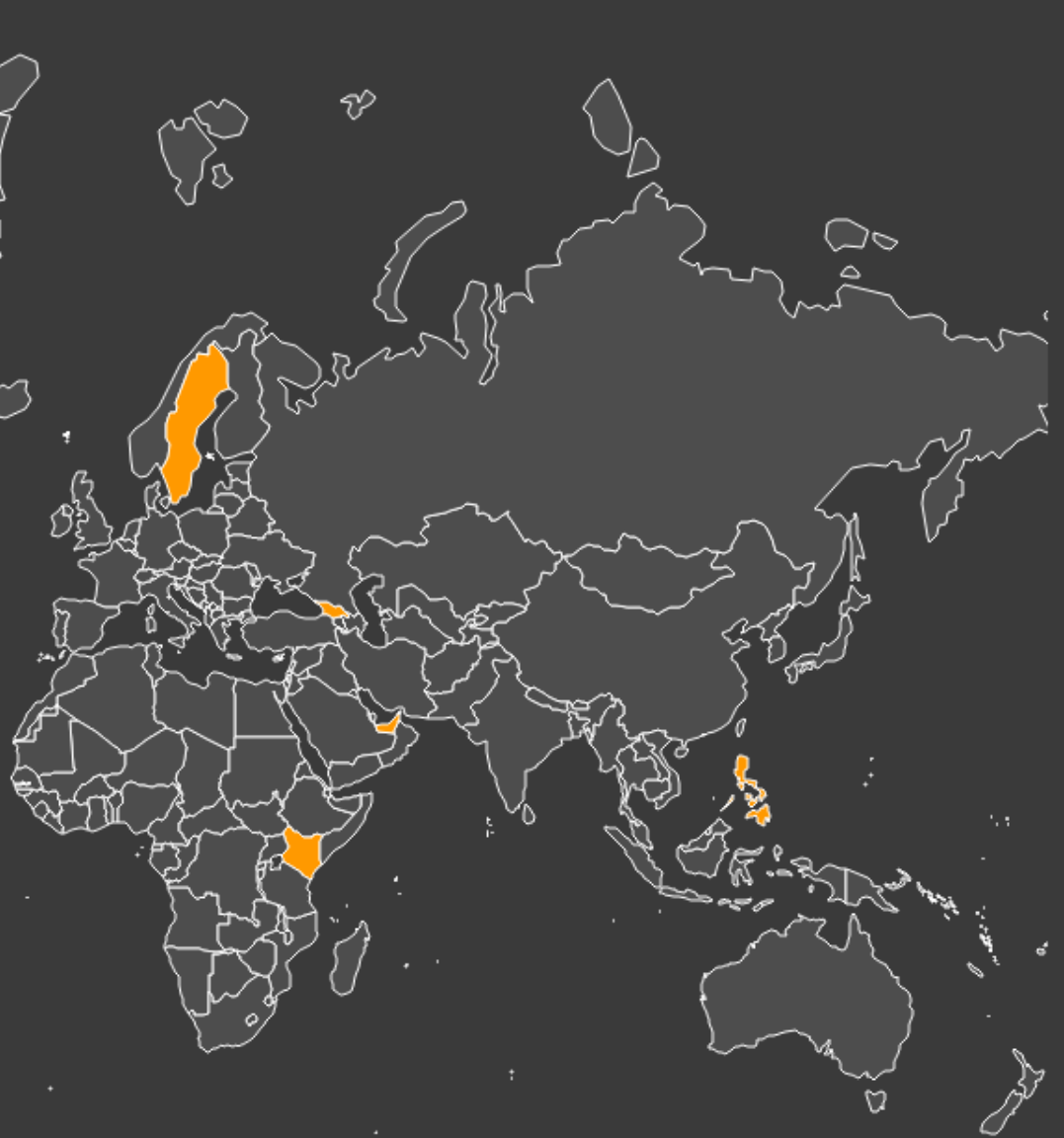
Indicator



Indicator



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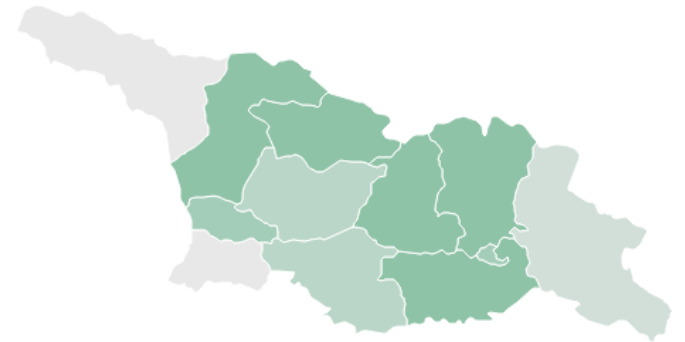


Internationally comparable indicators

# Difference with Current Reporting System

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- Breakdown
  - Geographical: Local Administrative Units 1-2-3
  - Urban/Rural breakdown
  - Contract type: private/commercial; pre-paid/post-paid; voice/data
  - Socio-demographics: gender, age, language
  - Mobile technology generation: 2G, 3G, 4G
  - Fixed technology: cable, DSL, fibre, etc.
  - Fixed advertised speed
  - Device based on IMEI/TAC
  - Event type (call, message, incoming, outgoing, IP)
  - Data volume
- Data providers don't simply report summarised indicators, but need to calculate and aggregate using Big Data tools





# Comments from the Country Stakeholders

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Excited that this project has started and they are looking for the results and want to commit to the project

Asking if the project will also have influence on the timeliness of the reporting and publication of the ICT indicators locally and globally (via ITU)

Although the pilot project is a starting point and therefore limited by its scope, stakeholders expect more big data related activities initiated locally and on global scale in terms of tools, possibilities of big data, capacity building, and development of the resources:

- Data mining, data discovery
- Machine learning
- Improvements of ICT, SDG, eliminating digital divide, poverty
- Capacity building, academic research

# Data Scientist

To assist pilot countries to process the data

Combining the data providers' indicators into country indicators

Analyse the indicators for the countries

Visualisation and country reports

## MODERN DATA SCIENTIST

Data Scientist, the sexiest job of 21st century requires a mixture of multidisciplinary skills ranging from an intersection of mathematics, statistics, computer science, communication and business. Finding a data scientist is hard. Finding people who understand who a data scientist is, is equally hard. So here is a little cheat sheet on who the modern data scientist really is.

### MATH & STATISTICS

- ☆ Machine learning
- ☆ Statistical modeling
- ☆ Experiment design
- ☆ Bayesian inference
- ☆ Supervised learning: decision trees, random forests, logistic regression
- ☆ Unsupervised learning: clustering, dimensionality reduction
- ☆ Optimization: gradient descent and variants



### PROGRAMMING & DATABASE

- ☆ Computer science fundamentals
- ☆ Scripting language e.g. Python
- ☆ Statistical computing package e.g. R
- ☆ Databases SQL and NoSQL
- ☆ Relational algebra
- ☆ Parallel databases and parallel query processing
- ☆ MapReduce concepts
- ☆ Hadoop and Hive/Pig
- ☆ Custom reducers
- ☆ Experience with xaaS like AWS

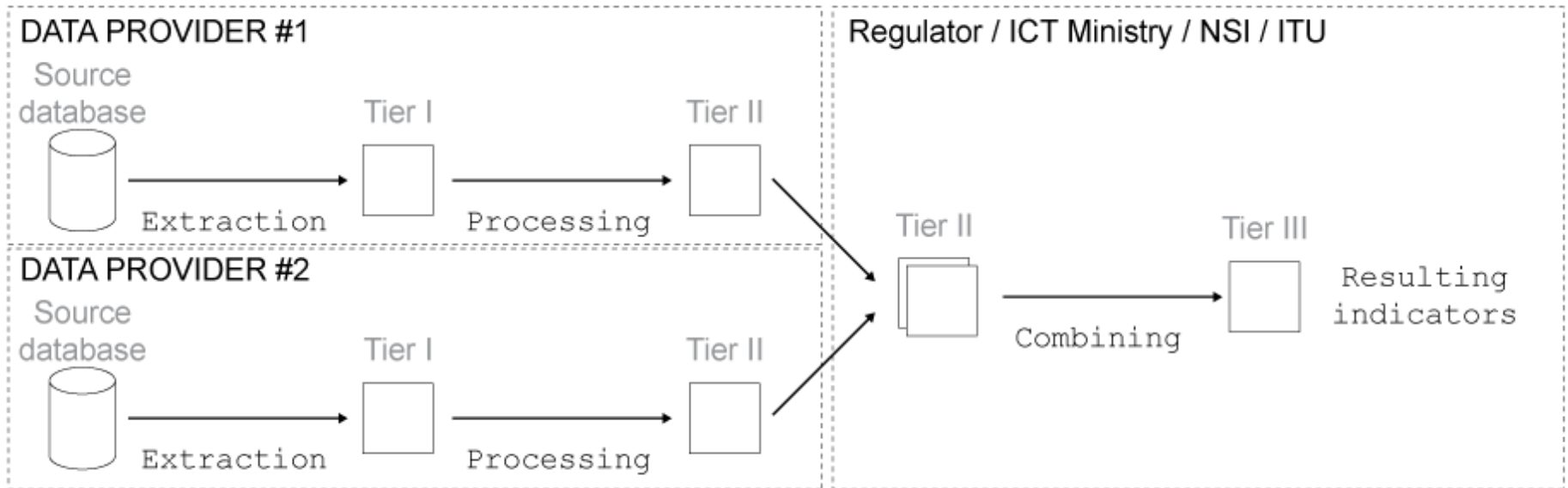
### DOMAIN KNOWLEDGE & SOFT SKILLS

- ☆ Passionate about the business
- ☆ Curious about data
- ☆ Influence without authority
- ☆ Hacker mindset
- ☆ Problem solver
- ☆ Strategic, proactive, creative, innovative and collaborative

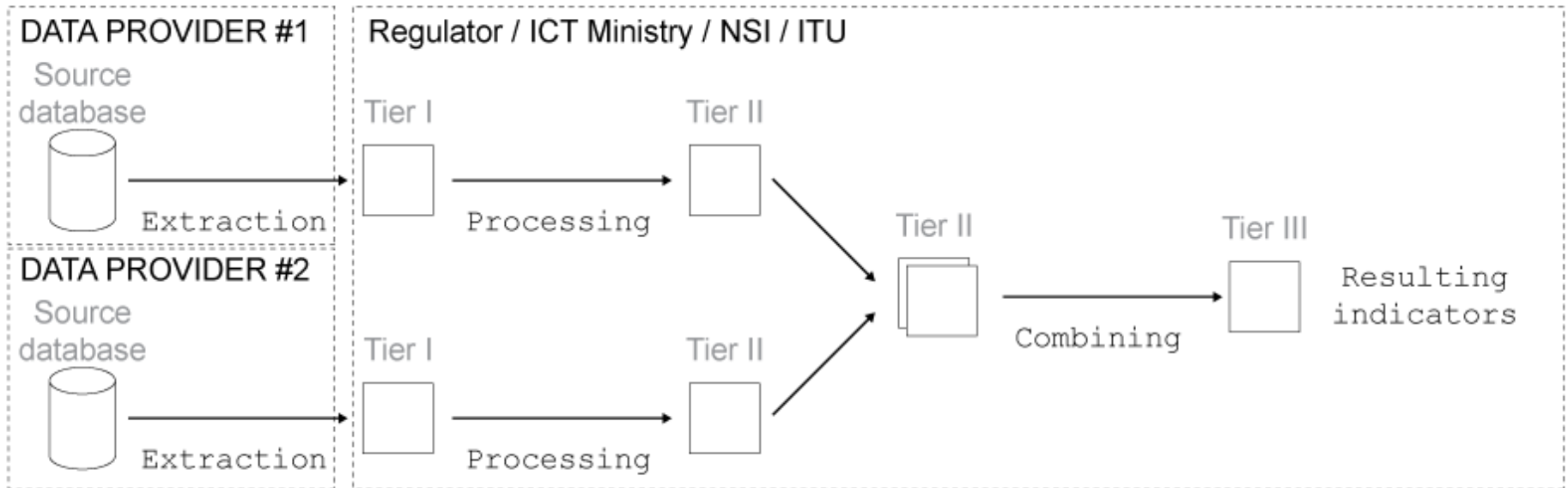
### COMMUNICATION & VISUALIZATION

- ☆ Able to engage with senior management
- ☆ Story telling skills
- ☆ Translate data-driven insights into decisions and actions
- ☆ Visual art design
- ☆ R packages like ggplot or lattice
- ☆ Knowledge of any of visualization tools e.g. Flare, D3.js, Tableau

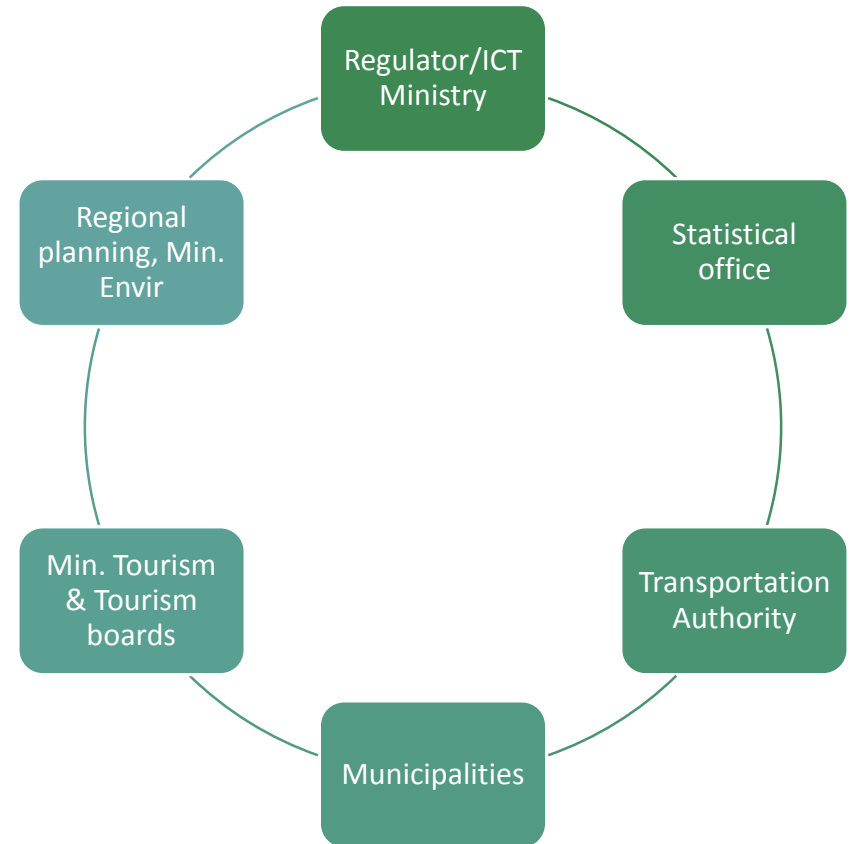
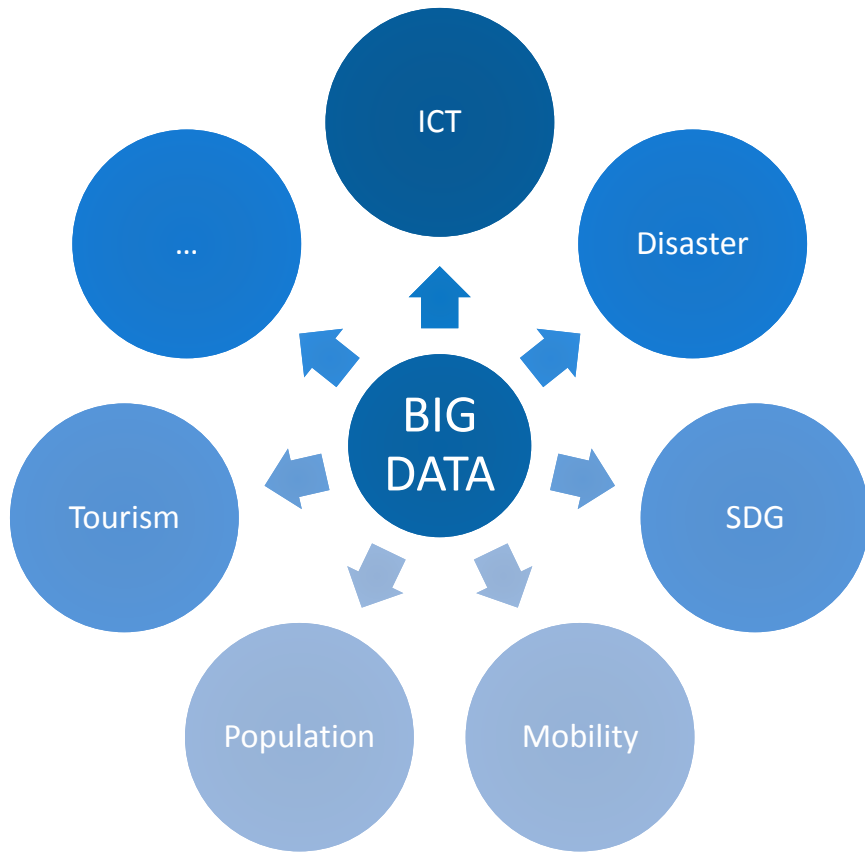
# Processing Location: Option 1



# Processing Location: Option 2



# Possibility of common use of the big data sources for





# Project Results

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The expected results of the project are:

- 6 country reports
- Concrete ICT indicators database on each pilot country
- Description of the source data and methodology for processing of the data
- Possibilities and limitations of the data source and indicators
- How the indicators can be used for policy and investment decisions
- Project final report

Based on the pilot studies, further discussion about using such indicators globally will continue, Phase II

Presentation of project:

- EGH, EGTI meetings October 2016
- WTIS 2016 - World Telecommunication/ICT Indicators Symposium November 2016
- Next conferences on ICT and big data





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