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# The Digital Divide in Europe in the 21<sup>st</sup> Century: a new methodological challenge for comparative social research

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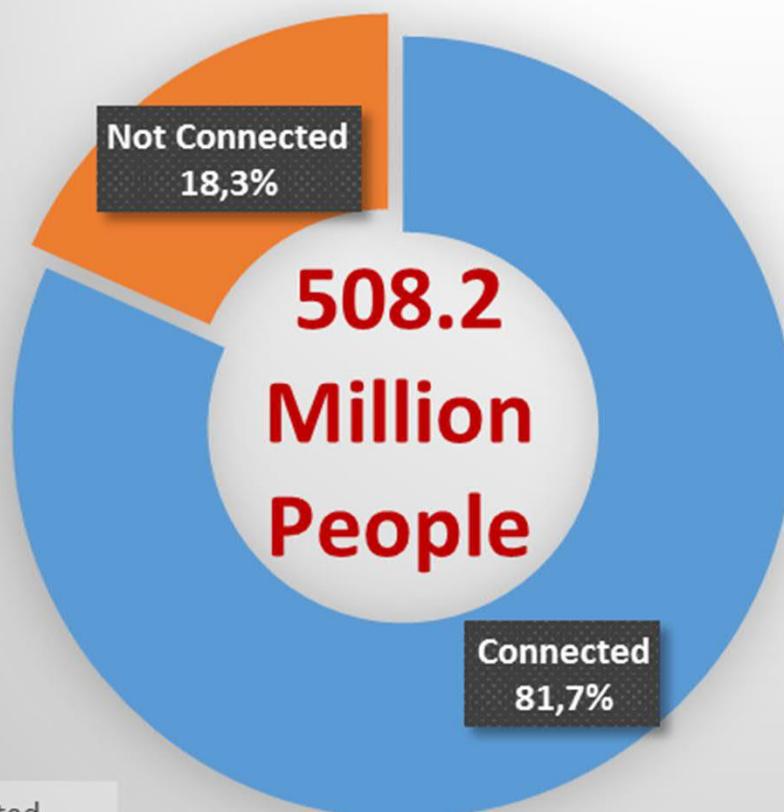
University of Porto



UT Austin | Portugal  
INTERNATIONAL COLLABORATORY FOR EMERGING TECHNOLOGIES, CoLAB



## EU INTERNET ACCESS (2016)



### Internet Penetration

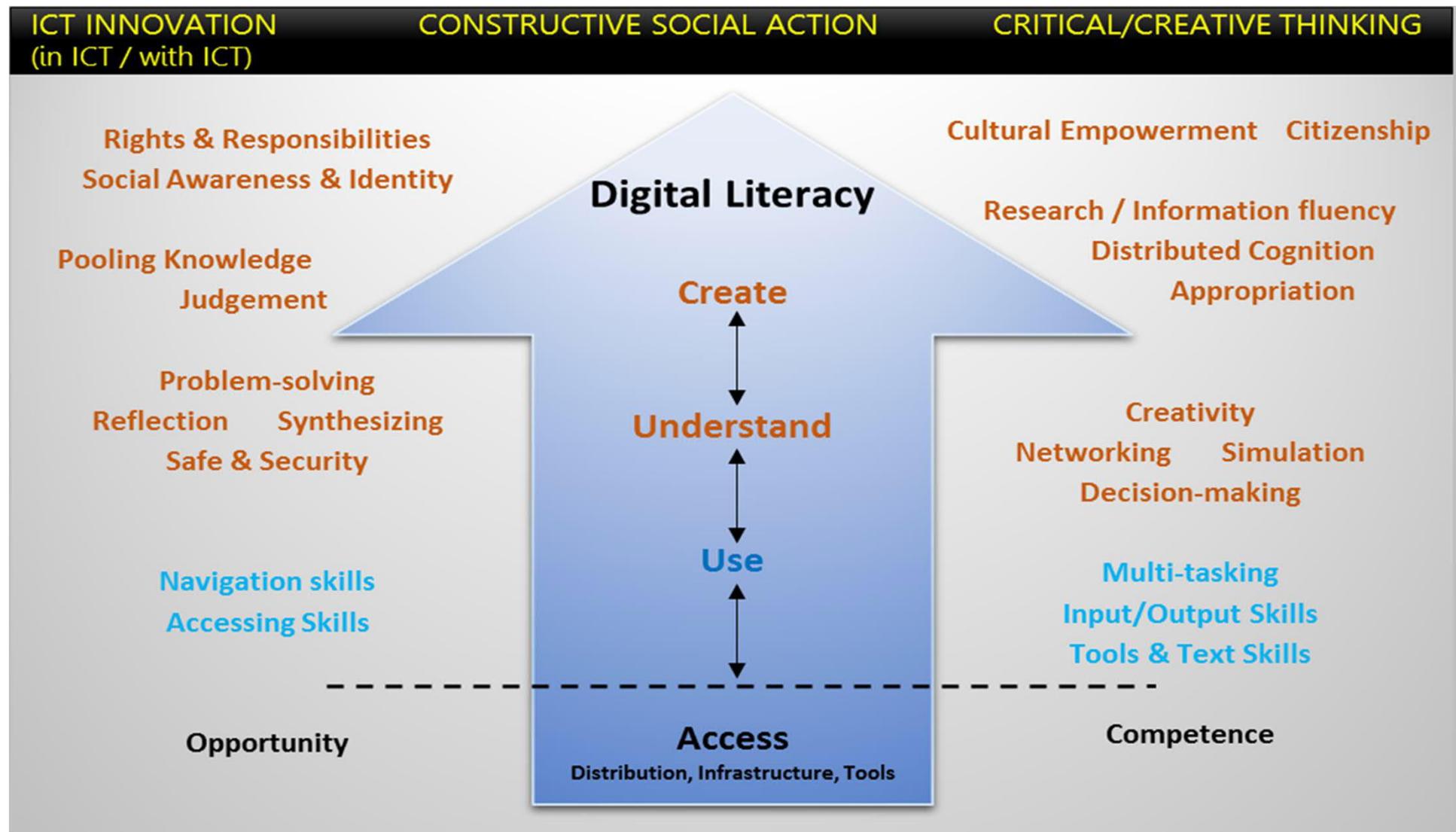
- . At least 9 out of every 10 individuals in DK, LU, NL, SE, FI, UK and DE used the internet.
- . Less than two thirds of all individuals aged 16 to 74 used the internet in PT, EL, LT, BG and RO.
- . 14% of the EU-28's population never used the internet.

% of all individuals in the EU-28, aged between 16 and 74 years, used the internet (at least once within three months prior to the survey date).  
Source: <http://ec.europa.eu/>

## Objectives of the study

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. Analyze the Digital Divide state in European Union and how it has evolved in the last few years (2008-2015)



This figure is based on models from the "Report of the Digital Britain Media Literacy Working Group" (March 2009), "DigEuLit - a European Framework for Digital Literacy" (2005), and Jenkins et al. (2006) "Confronting the Challenges of Participatory Culture: Media Education for the 21st Century".

## Research questions

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**RQ1:** What is the current state of the Digital Divide among the European Union countries?

(Digital Divide Index - Chi-square Test - CATPCA)

**RQ2:** How did the Digital Divide evolved within the European Union in the last few years?

(Time-distance Methodology)

## Methodology / research framework

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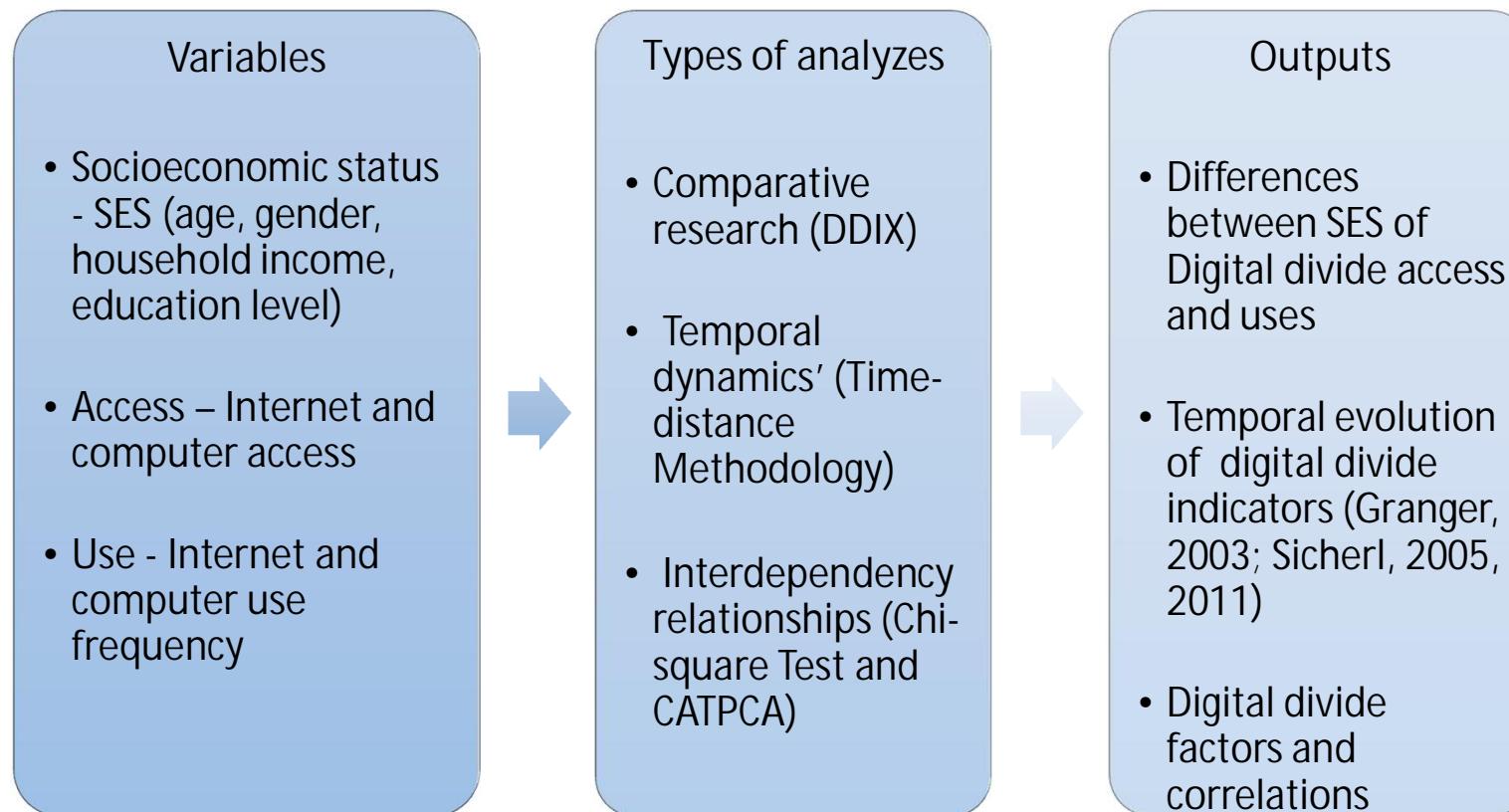


Fig. 2 – Digital Divide research framework: A multi-model approach (Centering on the 'user')

## Methodology / sample

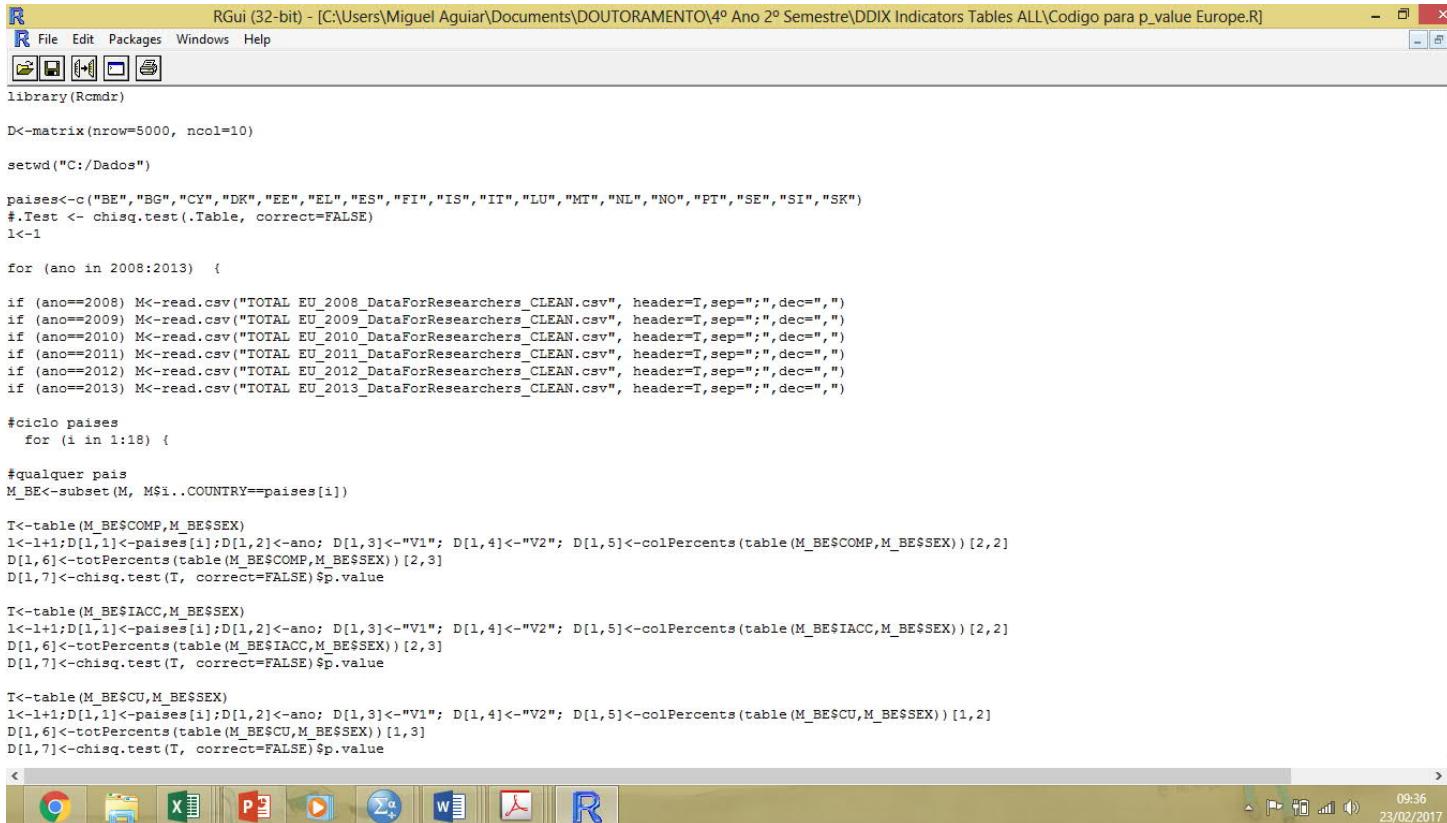
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Eurostat's Community survey on ICT usage in households and by individuals (2008-2015) micro-data.

The 2013 survey covered 148 290 households with at least one person aged 16-74, and 220 436 individuals aged 16-74 in the EU.

Source: [http://epp.eurostat.ec.europa.eu/statistics\\_explained/index.php/Information\\_society\\_statistics](http://epp.eurostat.ec.europa.eu/statistics_explained/index.php/Information_society_statistics)

# Methodology / sample



The screenshot shows the RGui interface (32-bit) running on a Windows operating system. The title bar reads "RGui (32-bit) - [C:\Users\...].R". The menu bar includes File, Edit, Packages, Windows, and Help. The toolbar contains icons for file operations like Open, Save, and Print. The main window displays the following R code:

```
R
Rgui (32-bit) - [C:\Users\...].R
File Edit Packages Windows Help
[Icons]
library(Rcmdr)

D<-matrix(nrow=5000, ncol=10)

setwd("C:/Dados")

países<-c("BE","BG","CY","DK","EE","EL","ES","FI","IS","IT","LU","MT","NL","NO","PT","SE","SI","SK")
#Test <- chisq.test(.Table, correct=FALSE)
l<-1

for (ano in 2008:2013) {

  if (ano==2008) M<-read.csv("TOTAL EU_2008_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")
  if (ano==2009) M<-read.csv("TOTAL EU_2009_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")
  if (ano==2010) M<-read.csv("TOTAL EU_2010_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")
  if (ano==2011) M<-read.csv("TOTAL EU_2011_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")
  if (ano==2012) M<-read.csv("TOTAL EU_2012_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")
  if (ano==2013) M<-read.csv("TOTAL EU_2013_DataForResearchers_CLEAN.csv", header=T,sep=";",dec=",")

  #ciclo países
  for (i in 1:18) {

    #qualquer país
    M_BE<-subset(M, M$Country==países[i])

    T<-table(M_BESCOMP,M_BESSEX)
    l<-1+l;D[l,1]<-países[i];D[l,2]<-ano; D[l,3]<-"V1"; D[l,4]<-"V2"; D[l,5]<-colPercents(table(M_BESCOMP,M_BESSEX))[2,2]
    D[l,6]<-totPercents(table(M_BESCOMP,M_BESSEX))[2,3]
    D[l,7]<-chisq.test(T, correct=FALSE)$p.value

    T<-table(M_BESIACC,M_BESSEX)
    l<-1+l;D[l,1]<-países[i];D[l,2]<-ano; D[l,3]<-"V1"; D[l,4]<-"V2"; D[l,5]<-colPercents(table(M_BESIACC,M_BESSEX))[2,2]
    D[l,6]<-totPercents(table(M_BESIACC,M_BESSEX))[2,3]
    D[l,7]<-chisq.test(T, correct=FALSE)$p.value

    T<-table(M_BESCU,M_BESSEX)
    l<-1+l;D[l,1]<-países[i];D[l,2]<-ano; D[l,3]<-"V1"; D[l,4]<-"V2"; D[l,5]<-colPercents(table(M_BESCU,M_BESSEX))[1,2]
    D[l,6]<-totPercents(table(M_BESCU,M_BESSEX))[1,3]
    D[l,7]<-chisq.test(T, correct=FALSE)$p.value
  }
}
```

The code performs a loop from 2008 to 2013, reading CSV files for each year and performing a chi-square test on the data. The results are stored in matrices D for each year, where columns represent variables and rows represent countries.

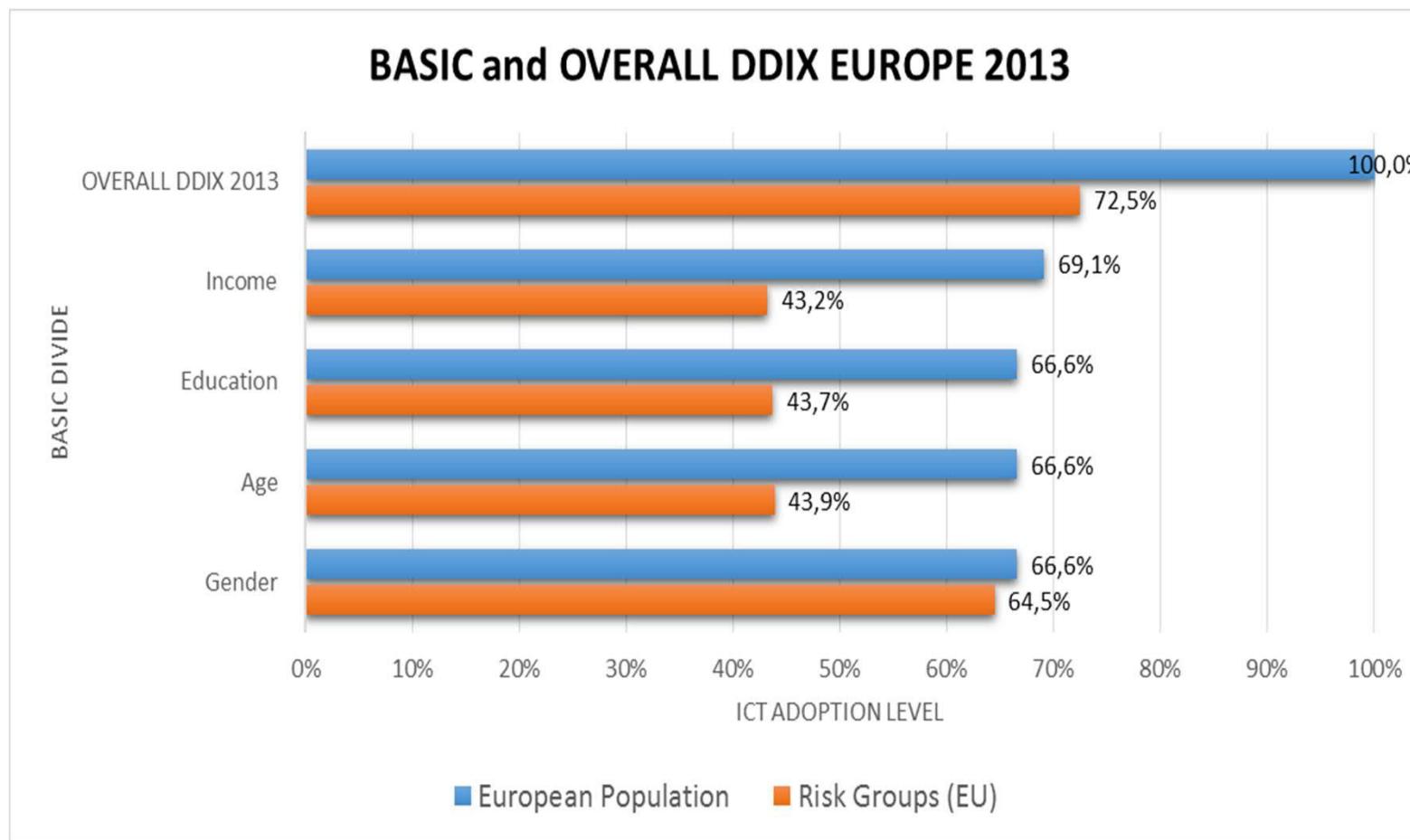
Table 3 - Chi-square Indendence Test - Risk Groups vs ICT Access Indicators (p-values)

Access and ICT use indicators	2008	2009	2010	2011	2012	2013
<b>Gender (female vs male)</b>						
A1: do you or anyone in the household have access to a computer at home?	0,0153 *	0,0000 **	0,0000 **	0,0371 *	0,0019 **	0,1597
A2: do you or anyone in the household have access to the internet at home? (by any device)	0,0028 **	0,0000 **	0,0000 **	0,2682	0,0724	0,5664
B1: when did you last use a computer (at home, at work any other place)? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
C1: when did you last use the internet? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
<b>Age (Individuals aged 54 or more vs others)</b>						
A1: do you or anyone in the household have access to a computer at home?	0,0000 **	0,0005 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
A2: do you or anyone in the household have access to the internet at home? (by any device)	0,0000 **	0,0001 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
B1: when did you last use a computer (at home, at work any other place)? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
C1: when did you last use the internet? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
<b>Education (Lower education level vs others)</b>						
A1: do you or anyone in the household have access to a computer at home?	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
A2: do you or anyone in the household have access to the internet at home? (by any device)	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
B1: when did you last use a computer (at home, at work any other place)? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
C1: when did you last use the internet? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
<b>Income (Lowest quartile vs others)</b>						
A1: do you or anyone in the household have access to a computer at home?	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
A2: do you or anyone in the household have access to the internet at home? (by any device)	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
B1: when did you last use a computer (at home, at work any other place)? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **
C1: when did you last use the internet? Within the last 3 months	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **	0,0000 **

\*significant at the 5% level; \*\*significant at the 1% level

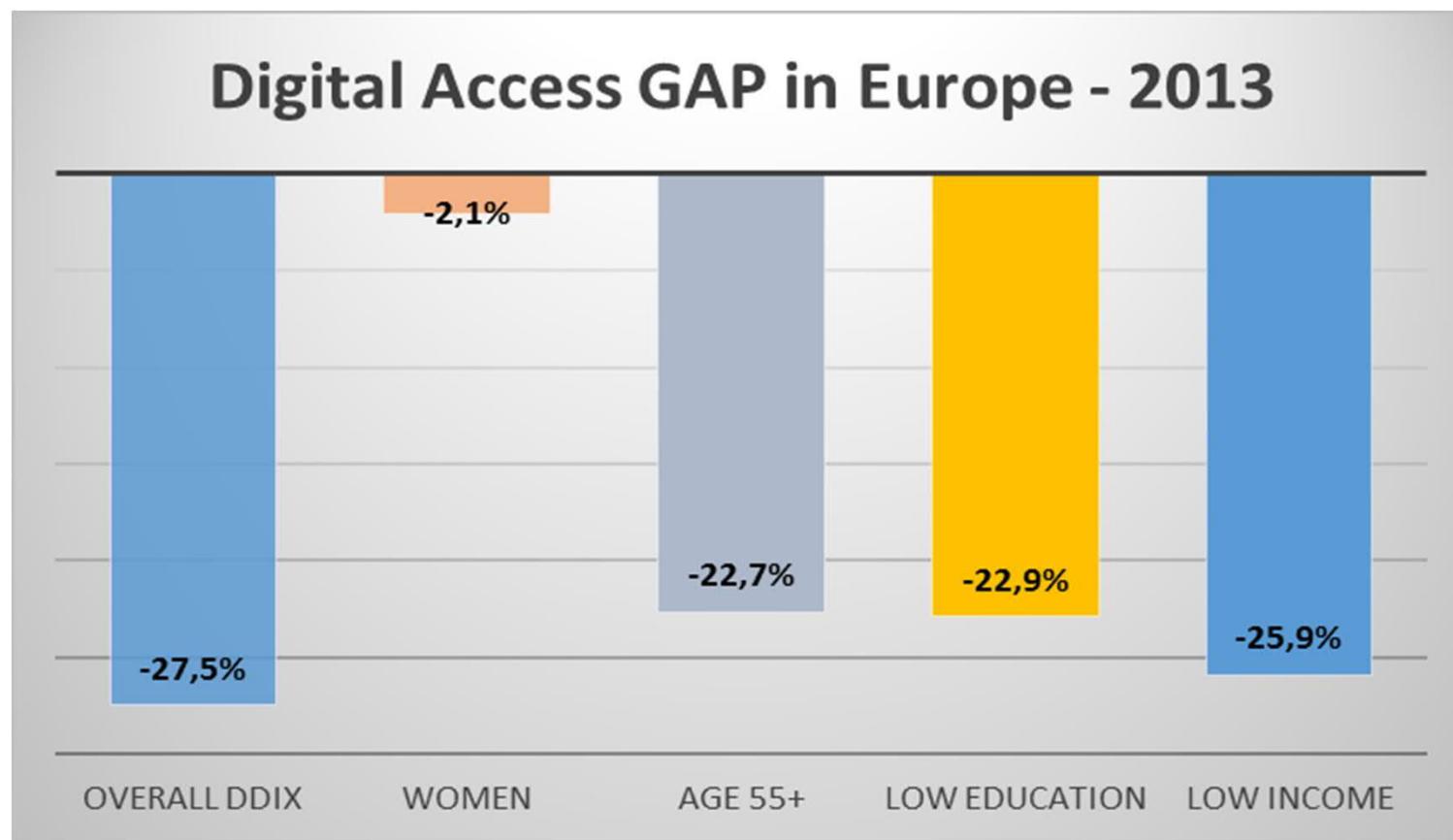
## Methodology / results

Comparative research: Digital Divide Index (DDIX)



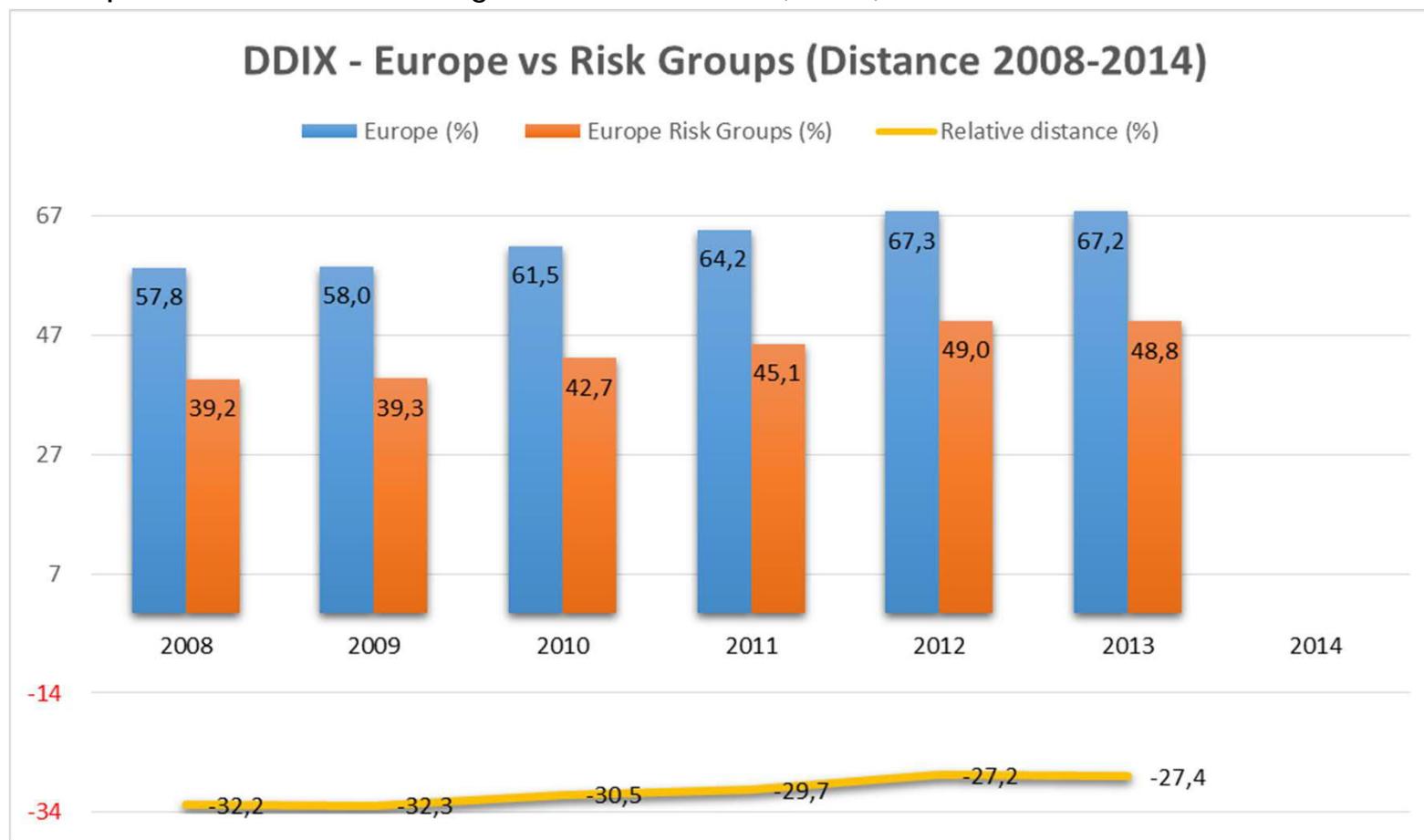
## Methodology / results

Comparative research: Digital Divide Index (DDIX)



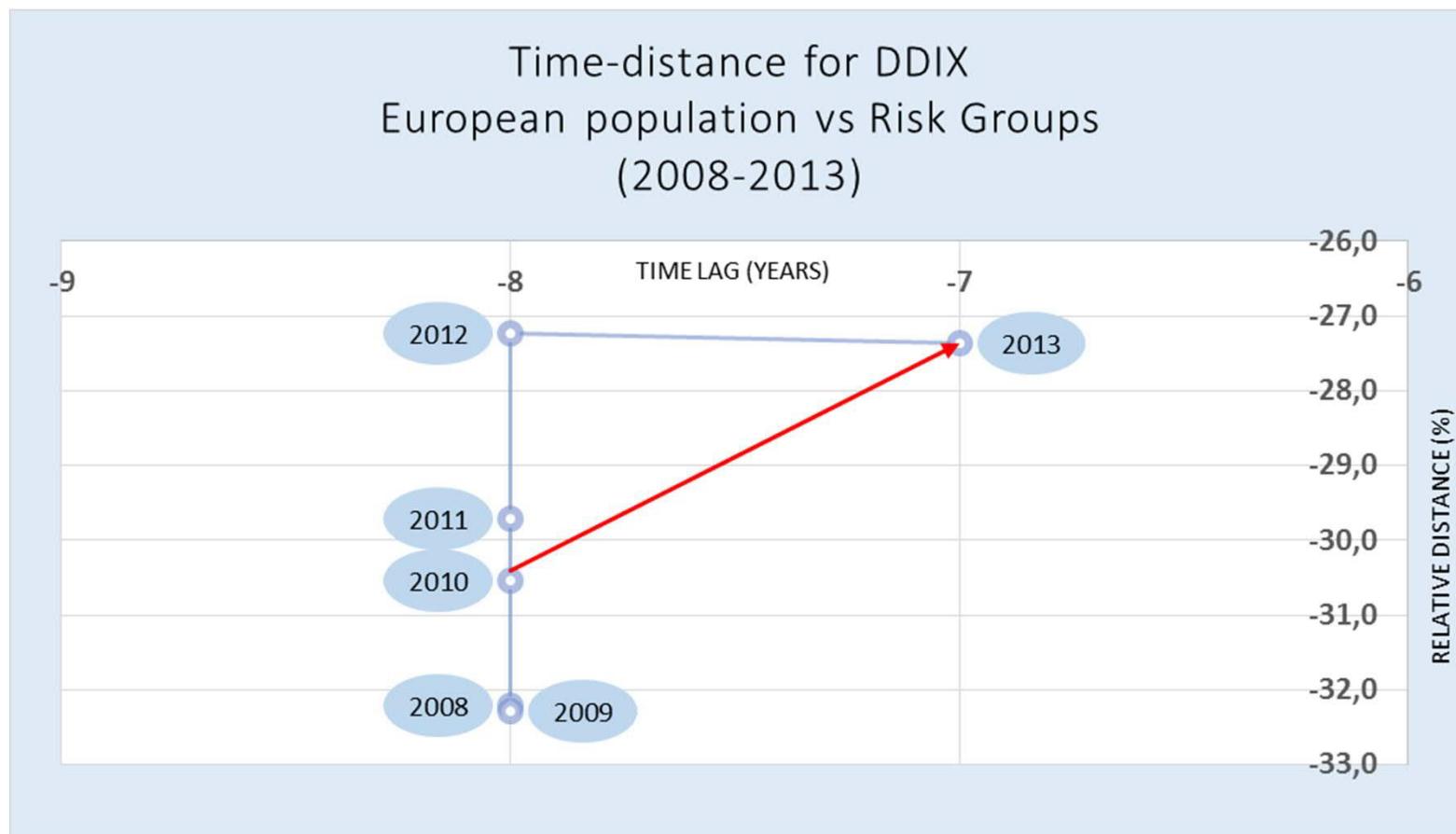
## Methodology / results

Comparative research: Digital Divide Index (DDIX)



## Methodology / results

### Temporal dynamics': Time-distance methodology



## Methodology / CATPCA

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### . CATPCA - Principal Components Analysis for Categorical Data

**Case Processing Summary**

Valid Active Cases	245867921,0
Active Cases with Missing Values	121982705,7
Supplementary Cases	0
Total	367850626,7
Cases Used in Analysis	367850626,7

Cases Weighted by INDIVIDUAL WEIGHT.

**Model Summary**

Dimension	Cronbach's Alpha	Variance Accounted For
		Total (Eigenvalue)
1	,859	4,020
2	,179	1,186
Total	,923 <sup>a</sup>	5,206

a. Total Cronbach's Alpha is based on the total Eigenvalue.

## Methodology / CATPCA

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**Component Loadings**

	Dimension	
	1	2
HOUSEHOLD INCOME QUARTILE	-,325	,207
AGE CLASSES	,591	,528
SEX	,134	,591
EDUCATIONAL LEVEL	-,589	,343
EMPLOYMENT SITUATION	,646	,560
B1: WHEN DID YOU LAST USE A COMPUTER (AT HOME, AT WORK ANY OTHER PLACE)?	,954	-,162
C1: WHEN DID YOU LAST USE THE INTERNET?	,971	-,167
C2: ON AVERAGE HOW OFTEN DID YOU USE THE INTERNET IN THE LAST 3 MONTHS?	,965	-,173

Variable Principal Normalization.

## Methodology / CATPCA

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Component Loadings

	Dimension	
	1	2
HOUSEHOLD INCOME QUARTILE	-,325	,207
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Variable Principal Normalization.

## Discussion | Contributions

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1. The role of digital inclusion and digital literacy;
2. The conceptual and methodological improvement of several social sciences concepts to better understand a renewed public sphere;
3. Advanced methods that are crucial for digital divide measurements (and also for any type and level of divides).
4. Data limitations: no data available for Germany; many missing values for the income variable; delay in the delivery of data (2014-2015)

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Thank You!

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