

# Aula 1 - Introduction to Computational Social Science

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## 0. What is Computational Social Science?

The new field of Computational Social Science can be defined as the interdisciplinary investigation of the social universe on many scales, ranging from individual actors to the largest groupings, through the medium of computation.

CIOFFI-REVILLA, C. Introduction to Computational Social Science: Principles and Applications. [s.l.] Springer, 2017.

# 1. Introduction

# 1.1 An ink blot

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## REPORT



# Predicting poverty and wealth from mobile phone metadata

Joshua Blumenstock<sup>1,2</sup>, Gabriel Cadamuro<sup>2</sup>, Robert On<sup>3</sup>

• See all authors and affiliations

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Article

Figures & Data

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## Predicting unmeasurable wealth

In developing countries, collecting data on basic economic quantities, such as wealth and income, is costly, time-consuming, and unreliable. Taking advantage of the ubiquity of mobile phones in Rwanda, Blumenstock *et al.* mapped mobile phone metadata inputs to individual phone subscriber wealth. They applied the model to predict wealth throughout Rwanda and show that the predictions matched well with those from detailed boots-on-the-



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*“window into the future of social research” (p.2)*

## 1.2 Welcome to the digital age

*“the digital age creates new opportunities for social research” (p.2)*

## 1.2 Welcome to the digital age

*“when you think about social research in the digital age you should not just think online, you should think everywhere”  
(p.2)*

## 1.2 Welcome to the digital age

*“Apesar de todas as diferenças, ciências sociais computacionais, métodos digitais e big data compartilham uma convicção subjacente: novas fontes de dados e novas técnicas para armazenamento e análise de dados podem levar à próxima mudança de paradigma nas ciências sociais”  
(JUNGHERR, 2015, p.34)*

## 1.3 Research design

*“links questions and answers” (p.6)*



## 1.3 Research design

*“observing behavior, asking questions, running experiments, and collaborating with others” (p.6)*

## 1.4 Themes of this book

*“Repurpose”/“Reproveitar”*

## 1.4 Themes of this book

*“readymade” OR/AND “customade” (blending)*

## 2. Observing behavior

## 2.1 Introduction

*In the analog age, collecting data about behavior (...) was expensive, and therefore relatively rare. Now, in the digital age, the behaviors of billions of people are recorded, stored, and analyzable. (p.13)*

## 2.1 Introduction

“Digital trace data”:

1. São dados encontrados (mesmo os extraídos), ao invés dados de produzidos para a pesquisa (ad hoc) através de instrumentos de pesquisa;
2. São dados relacionados/baseados em eventos ao invés de dados resumidos ou sintetizados;
3. Como os eventos ocorrem em um período de tempo, são dados dados longitudinais.

Howison et al. 2011, p. 769

## 2.1 Introduction

*“big data is observational data” (p.13)*

## 2.2 Big Data

*3, 5 or 7 “Vs”*

*5 Ws: “Who, What, Where, When, and Why” (p.14)*



## 2.2 Big Data

*“which kinds of research questions big data sources have attractive properties and for which kinds of questions they might not be ideal” (p.15)*

## 2.2 Big Data

*“big data is more than online behavior” (p.15)*

## 2.2 Big Data

- ▶ Epistemological debate: “Raw data is an oxymoron”
- ▶ Dataset ideal-típico
- ▶ Hybrid is the best!

## 2.3 Ten common characteristics of big data

## 2.3.1 Big

- ▶ “Large datasets are a means to an end; they are not an end in themselves”

## 2.3.1 Big



Figure 1: Systematic errors: “Big data is not about the data”

## 2.3.2 Always-On (Sempre ligado!)

- ▶ *travel back in time*
- ▶ real-time estimates
- ▶ fast response
- ▶ (drift!)

### 2.3.3 Nonreactive (Não-reativo!)

- ▶ reactivity (Webb et al. 1966): “people can change their behavior when they know that they are being observed by researchers”



### 2.3.3 Nonreactive (Não-reativo!)

*“Digital Data Traces das interações com serviços on-line não permitem inferências sobre os reais interesses dos usuários, mas apenas sobre a fatia de seus interesses que querem que seja visto publicamente” (JUNGHERR, 2015, p.44)*

## 2.3.4 Incomplete

- ▶ big data sources are incomplete: demographic information, behavior on other platforms, and data to operationalize theoretical constructs (p.24)
- ▶ validity of construct: “match between theoretical constructs and data” (p.25)
- ▶ “more data IS NOT a scape”
- ▶ imputation + record linkage
- ▶ danger zone: “database of ruin”

## 2.3.5 Inaccessible

- ▶ “legal, business, and ethical barriers” (p.27)
- ▶ most large companies—are very risk-averse

## 2.3.6 Nonrepresentative

- ▶ “within-sample comparisons” and “out-of-sample generalizations”
- ▶ generalization -> transportability
- ▶ “lots of nonrepresentative data is still non-representative”
- ▶ “more within-sample comparisons in many nonrepresentative groups”

## 2.3.7 Drifting

- ▶ population (change in who is using them)
- ▶ behavioral (change in how people are using them)
- ▶ system (change in the system itself)

## 2.3.8 Algorithmically confounded

- ▶ ex: Facebook 20 friends
- ▶ big data IS NOT natural behavior!
- ▶ ex: People in casino

## 2.3.9 Dirty

- ▶ big data = big mess = big trash
- ▶ “for” and Bot effect!
- ▶ SPAM

## 2.3.10 Sensitive

- ▶ “de-identification”



Conclusion (2.3.3 - 2.3.10):

## Conclusion (2.3.3 - 2.3.10):

*“incomplete, inaccessible, nonrepresentative, drifting, algorithmically confounded, inaccessible, dirty, and sensitive—come from the fact that these data were not collected by researchers for researchers” (p.41)*

## 2.4 Research strategies

## 2.4.1 Counting things



Figure 2: What things are worth counting? (Que coisas valem a pena contar?)

## 2.4.2 Forecasting and nowcasting

### 2.4.3 Approximating experiments

## 2.5 Conclusion