

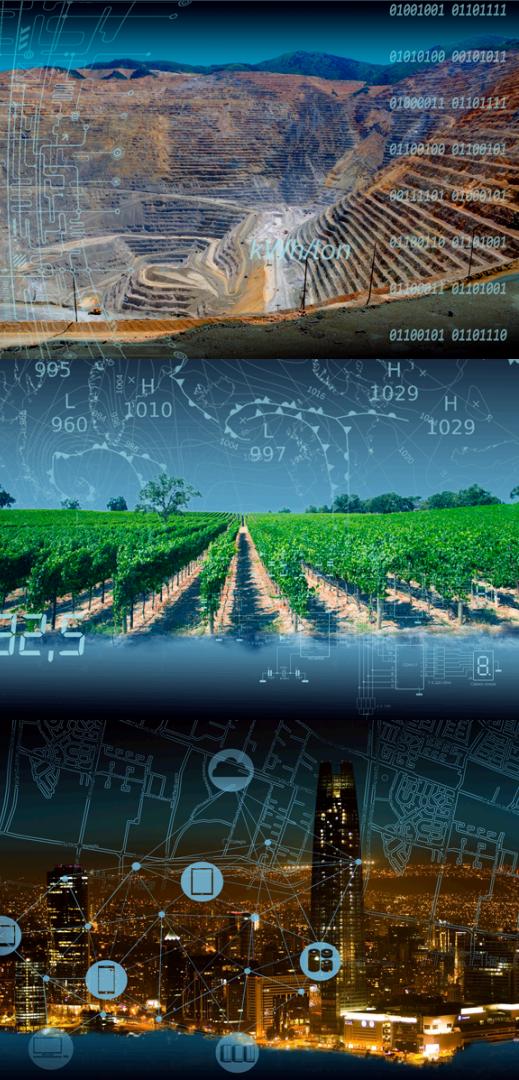
Analizando  
Terabytes de  
datos de  
movilidad  
anonimizada



# Agenda

- About.
- El problema.
- Los datos y el procesamiento.
- Los papers y desafíos para los devs.
- Performance.
- Lecciones aprendidas.

# About TI+D



# El equipo

- UX/UI
- PO
- Researchers
- Devs/QA



# Problema

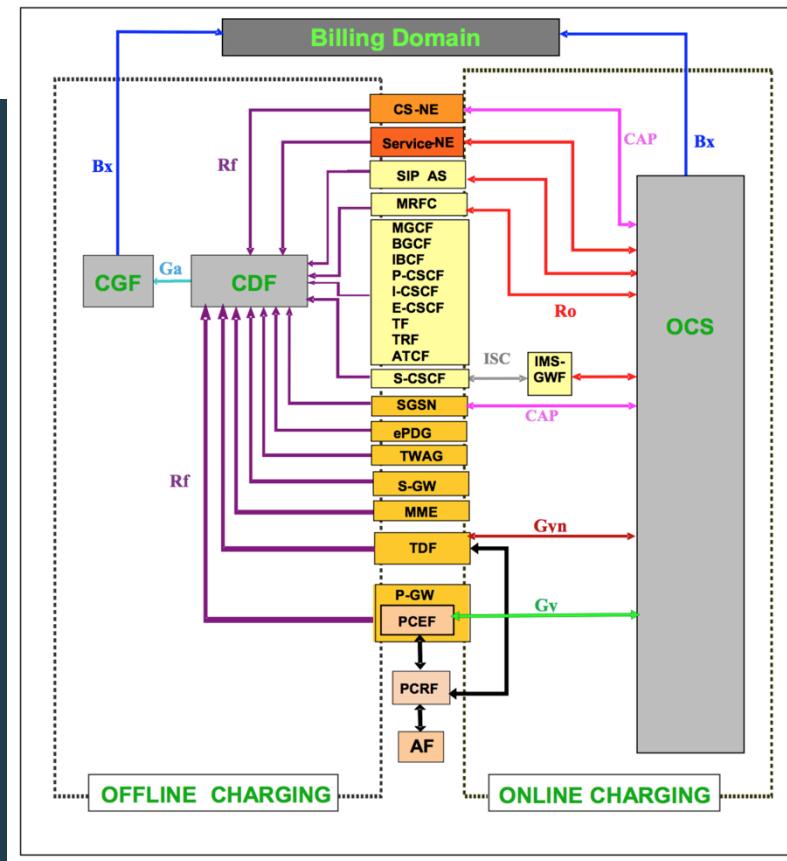
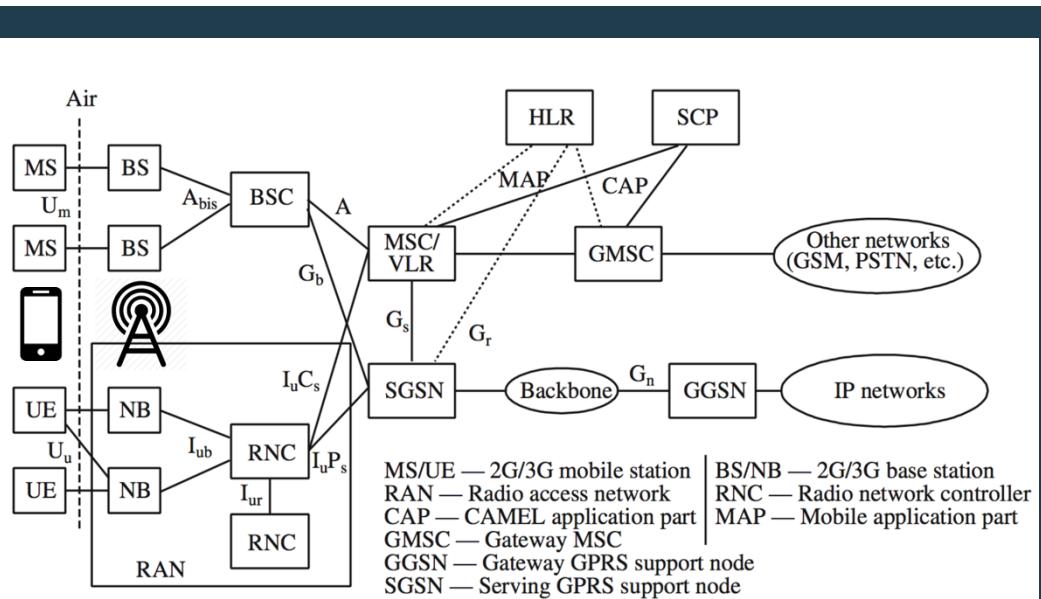
**¿Se pueden usar datos de telefonía para desarrollar aplicaciones útiles para transportistas y planificadores urbanos?**

**Si esto es posible, ¿qué desafíos técnicos encontraremos?**

# Datos

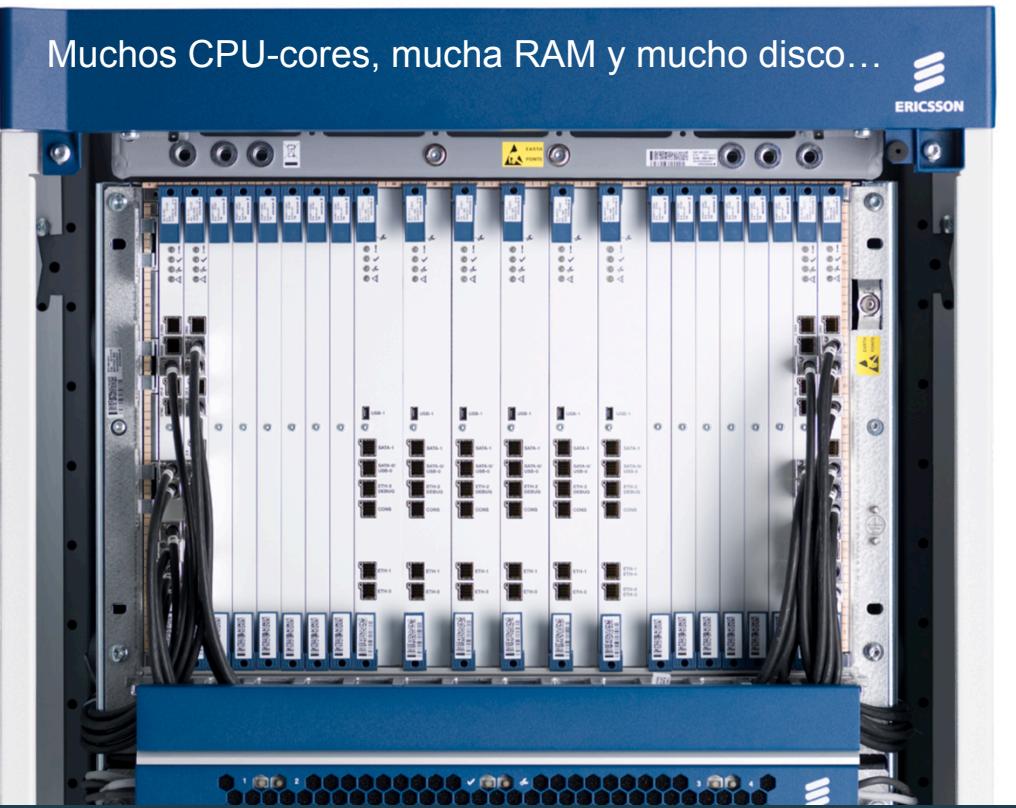
- CDR – Registros de facturación anónimos (SHA-256, métodos probabilísticos y agregación)
- Sectores o antenas 2G, 3G y 4G
- Datos públicos: censo, uso de suelo, matriz y zonas origen-destino

# CDR – Registros de facturación anónimos



# CDR – Registros de facturación anónimos

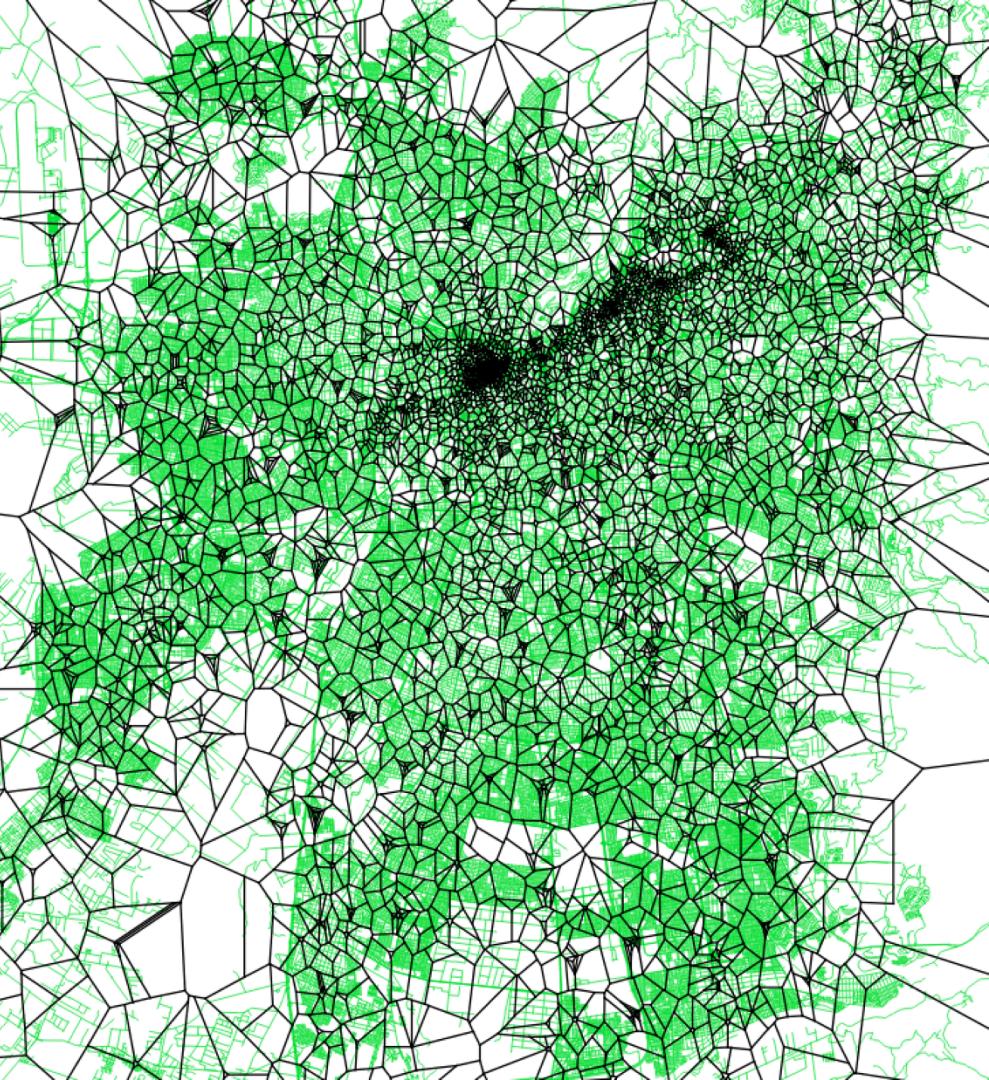
Muchos CPU-cores, mucha RAM y mucho disco...



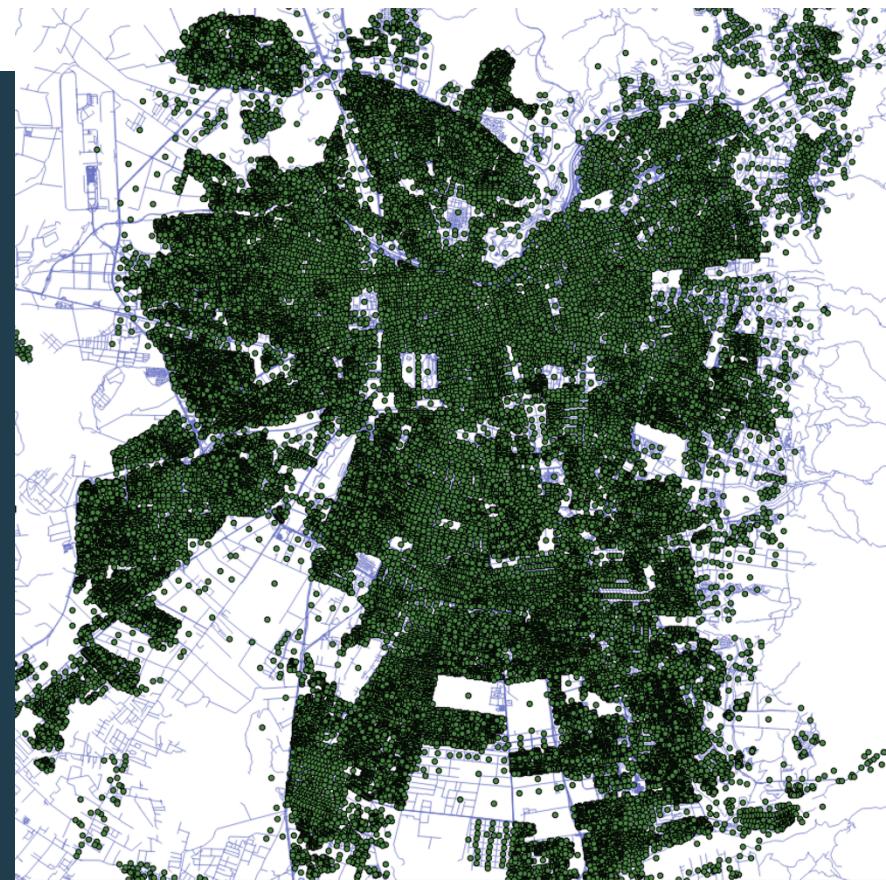
# Antenas 2G/3G/4G



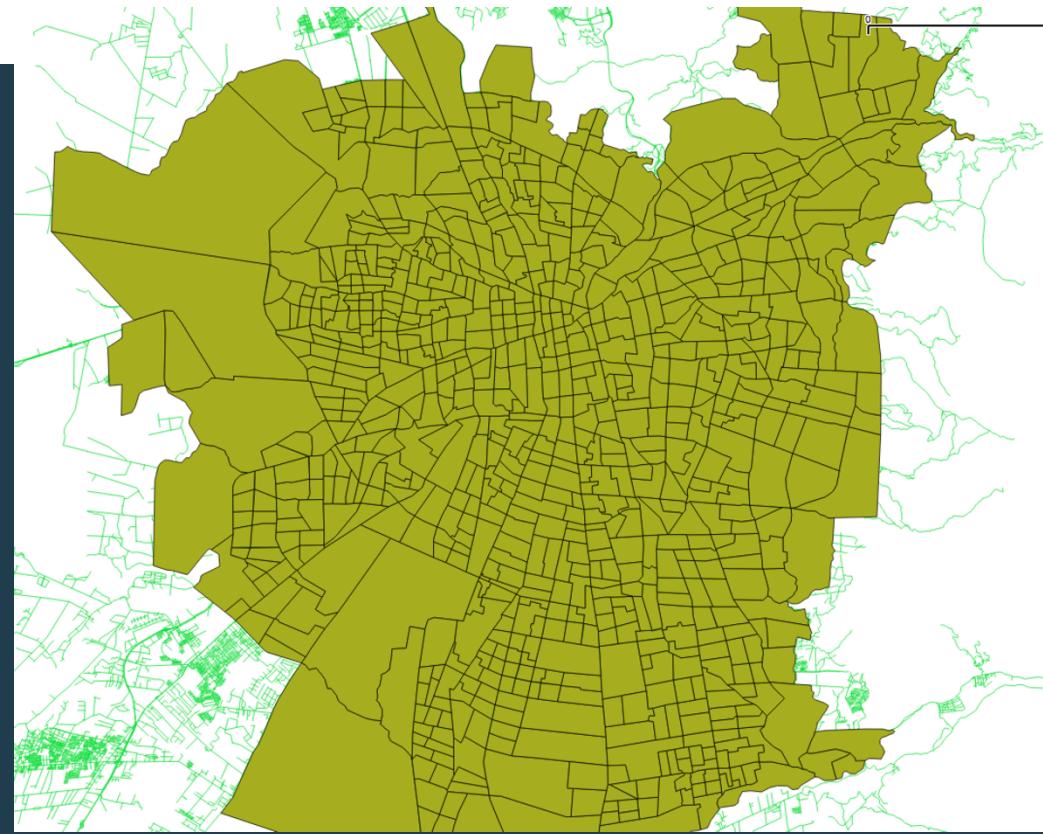
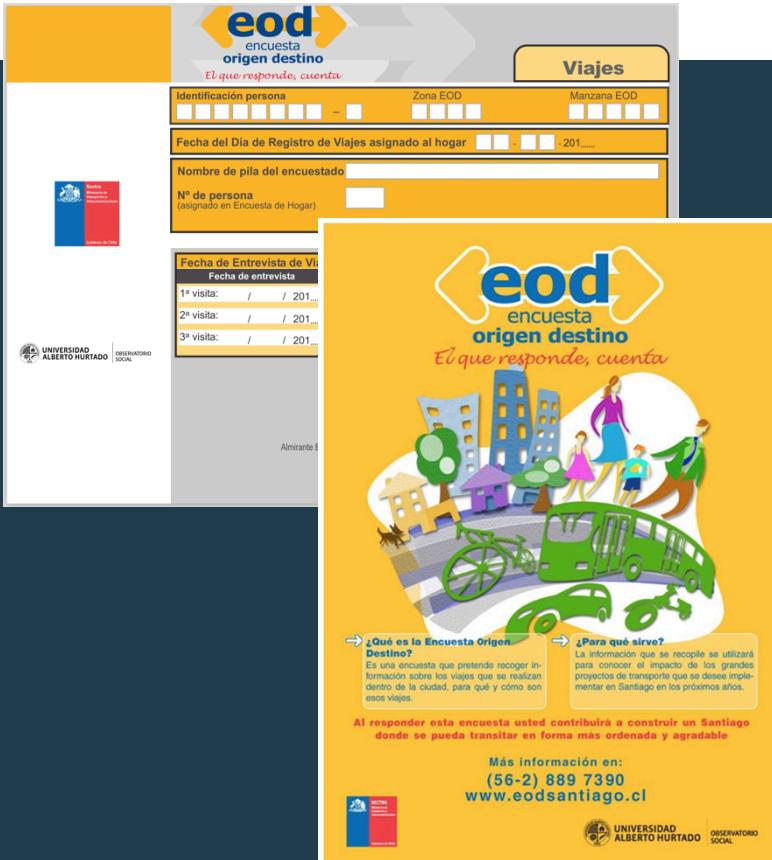
# Antenas 2G/3G/4G



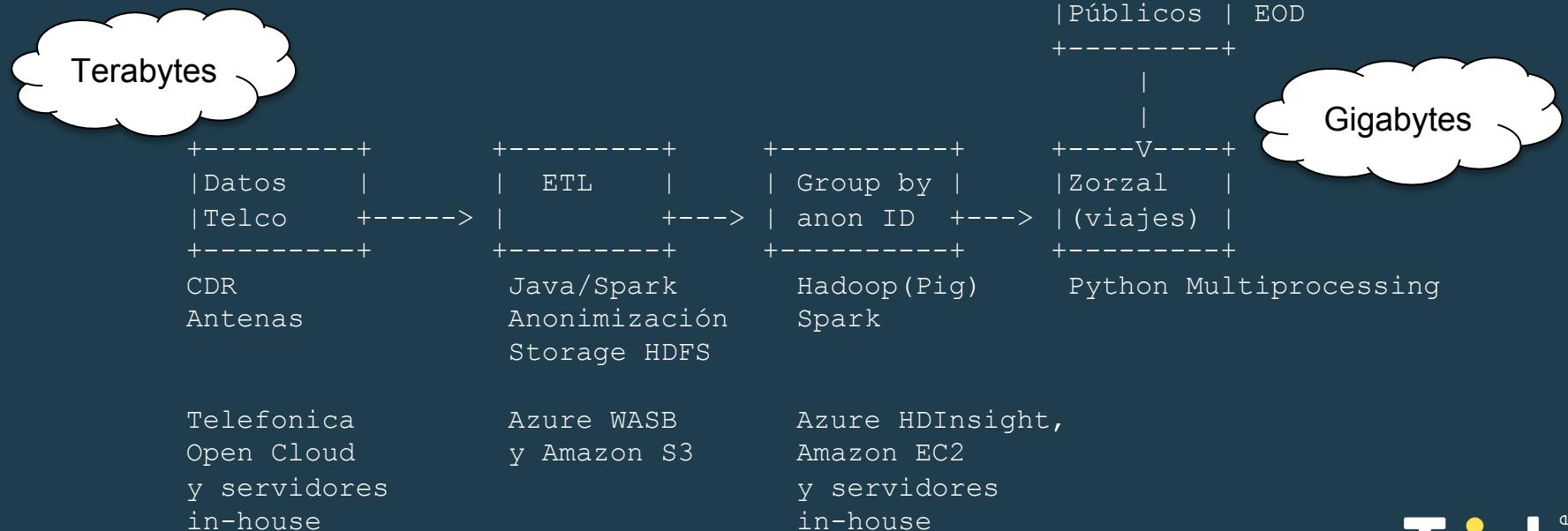
# Censo / Uso de suelo



# Matriz y zonas OD



# Arquitectura de datos



# Las publicaciones.

## Probabilistic Mobile Phone Loca

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Telefónica I+D  
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Article

## Sensing Urban Patterns with Antenna Mappings: The Case of Santiago, Chile <sup>†</sup>

Eduardo Graells-Garrido <sup>1,2,\*</sup>, Oscar Peredo <sup>2</sup> and José García <sup>2</sup>

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<sup>†</sup> This paper is an extended version of a paper published in "Graells-Garrido, E.; García, J. Visual Exploration of Urban Dynamics Using Mobile Data. In *Ubiquitous Computing and Ambient Intelligence. Sensing, Processing, and Using Environmental Information*, Proceedings of the 9th International Conference (UCAmI 2015), Puerto Varas, Chile, 1–4 December 2015; Springer International Publishing: Cham, Switzerland, 2015; pp. 480–491".

Academic Editors: Vladimir Villareal and Carmelo R. García

Received: 5 May 2016; Accepted: 4 July 2016; Published: 15 July 2016

**Abstract:** Mobile data has allowed us to sense urban dynamics at scales and granularities not known before, helping urban planners to cope with urban growth. A frequently used kind of dataset are Call Detail Records (CDR), used by telecommunication operators for billing purposes. Being an already extracted and processed dataset, it is inexpensive and reliable. A common assumption with respect to geography when working with CDR data is that the position of a device is the same as the Base Transceiver Station (BTS) it is connected to. Because the city is divided into a square grid, or by coverage zones approximated by Voronoi tessellations, CDR network events are assigned to corresponding areas according to BTS position. This geolocation may suffer from non negligible error in almost all cases. In this paper we propose "Antenna Virtual Placement" (AVP), a method to geolocate mobile devices according to their connections to BTS, based on decoupling antennas

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tion about urban mo-  
Our main contribution is a method to detect these disaggregated daily journeys using *Call Detail Records* (CDRs). Our approach



## Urban Dynamics Estimation using Mobile Phone logs and Locally Varying Anisotropy

Oscar F. Peredo<sup>1</sup>, José A. García<sup>1</sup>, Ricardo Stuven<sup>1</sup> and Julián M. Ortiz<sup>2</sup>

**Abstract** In telecommunications, the billing data of each telephone, denoted Call Detail Records (CDR), are a large and rich database with information that can be geo-located. By analyzing the events logged in each antenna, a set of time series can be constructed measuring the number of voice and data events in each time of the day. One question that can be addressed using these data involves estimating the movement or flow of people in the city, which can be used for prediction and monitoring in transportation or urban planning. In this work, geostatistical estimation techniques such as kriging and inverse distance weighting are used to numerically estimate the flow of people. In order to improve the accuracy of the model, secondary information is included in the estimation. This information represents the locally varying anisotropy (LVA) field associated with the major streets and roads in the city. By using this technique, the flow estimation can be obtained with a better quantitative and qualitatively interpretation. In terms of storage and computing power, the volume of raw information is extremely large, for that reason Big Data technologies are mandatory to query the database. Additionally, if high-resolution grids are used in the estimation, High Performance Computing techniques are necessary to speed up the numerical computations using LVA codes. Case studies are shown, using voice/data records from more than 1 million clients of Telefónica Movistar in Santiago, capital of Chile.

## Introduction

The usage and ubiquity of mobile phones in all countries and social groups are generating an unprecedented amount of behavioral data. According to the International Telecommunications Union [1], by the end of 2015 there are more than 7 billion mobile cellular subscriptions, corresponding to a penetration rate of 97%, up from 738 million in the year 2000. Accompanying this large pool of users

**Abstract**—A probabilistic method to infer mobile location is presented. By using street maps and travel time values as prior information, probability maps are constructed in the coverage areas of the cell sectors (a). The probability maps are used to generate simulated locations of each mobile phone inside the coverage area with precision. The models can be improved by adding GPS Strength Signal measurements in the area. A case study using event-driven mobile phone data sets is presented, par-  
using Charging Data Records and Internet usage to mid-size and large-size cities of Chile.

**Keywords**—GPS simulation; Anonymization; Event-driven mobile phone data;

## I. INTRODUCTION

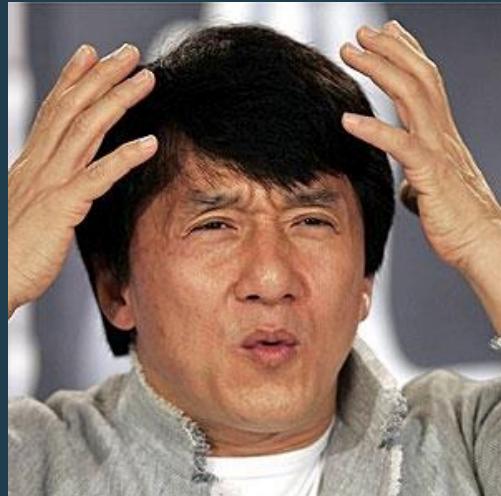
Telecommunication cell sectors, commonly known as antennas, are widely deployed in almost every city in the largest portion of the world. Seven billion people (95% of global population) live in an area that is covered by a network with GSM or modern technologies [1]. Some telecom operators are starting to use their subscribers as a proxy of urban mobility, increasing interest ha-

**I HAVE NO IDEA  
WHAT I'M DOING**

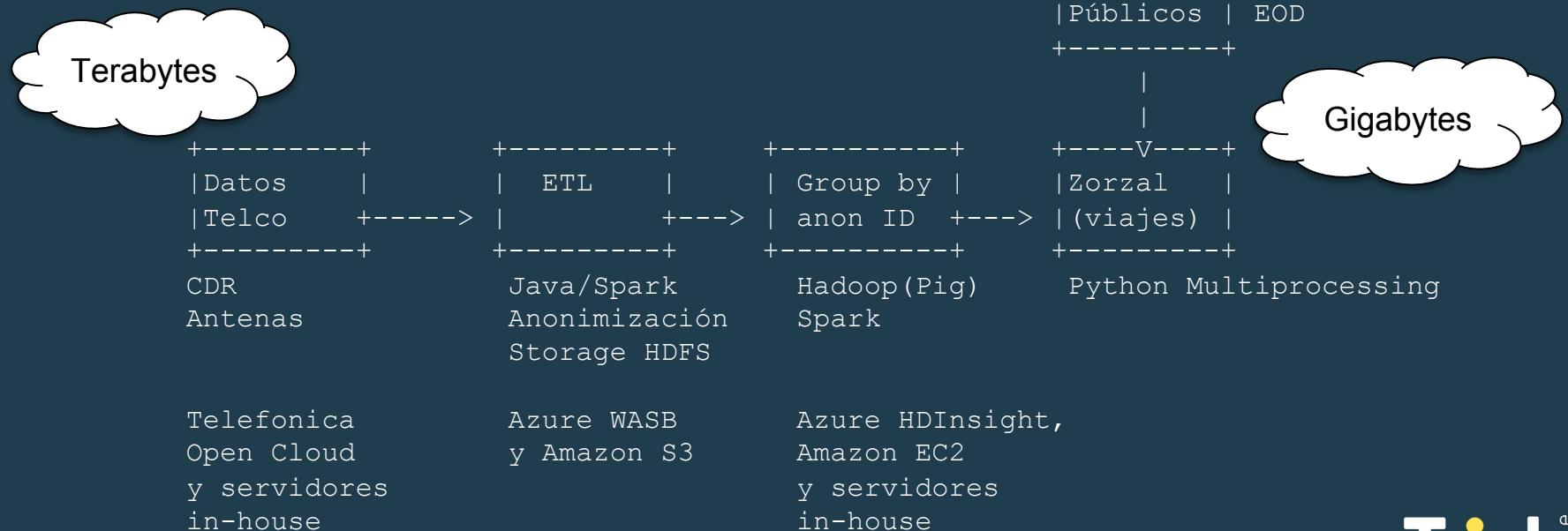


# Expectativas vs Realidad

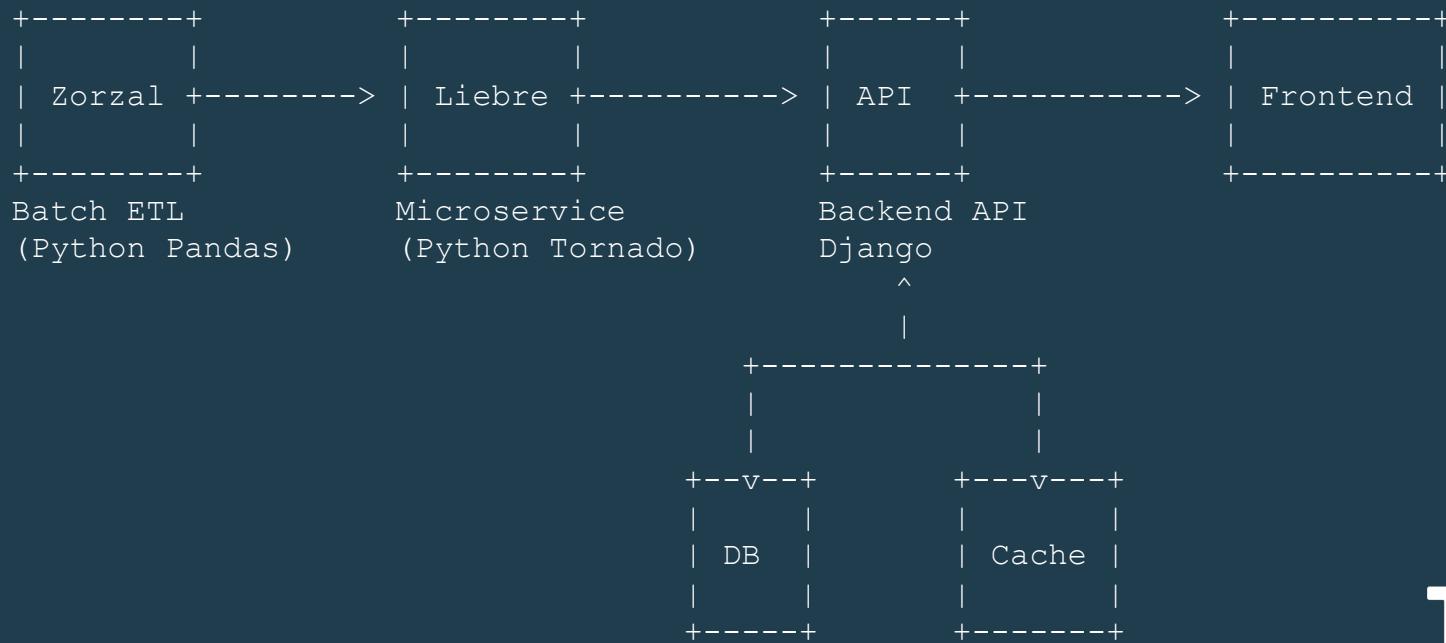
- Data sample vs data real.
- Aplicaciones vs notebooks de Jupyter.
- ¿Cuándo tenemos el MVP? (Product Owner).



# Arquitectura de datos

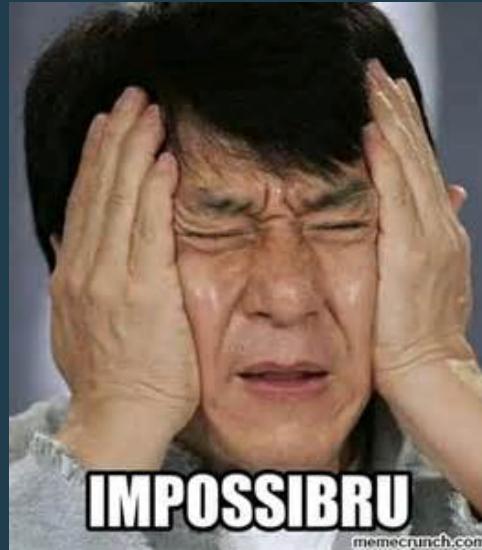


# Arquitectura v.1 Muvio



# Nuevo dataset - Santiago

- **Tiempos respuesta > 2 min. (400M registros).**
- **Nuevas agregaciones y filtros.**



# Arquitectura v.2 Muvio



[Limpiar todos los filtros](#)[Crear consulta](#)

Consulta sin título

## Lugar

[Elegir origen y destino](#)

## Fechas

03/10/2016 09/10/2016

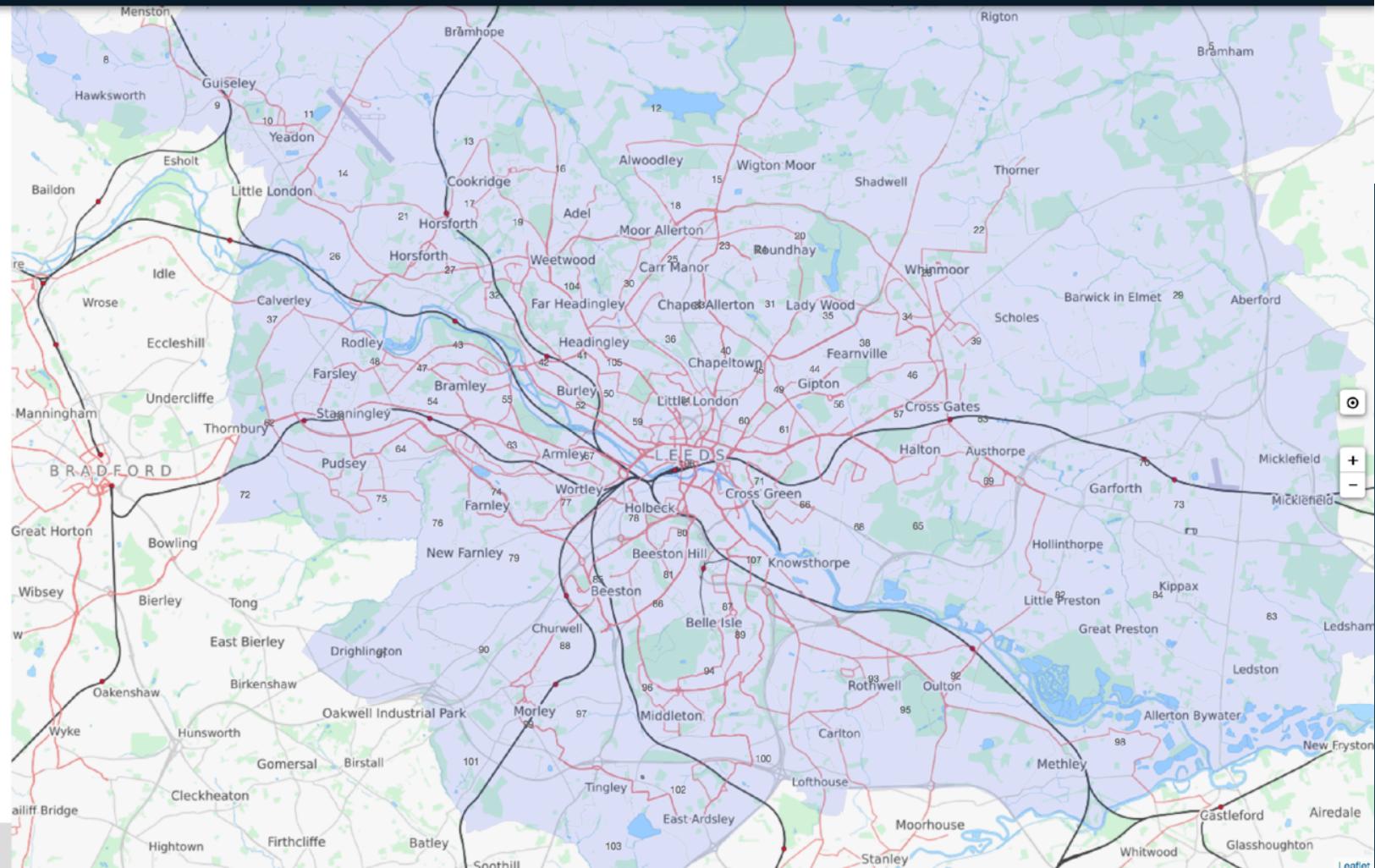
## Días laborales

 Lun  Mar  Mié  Jue  Vie

## Fin de semana

 Sáb  Dom

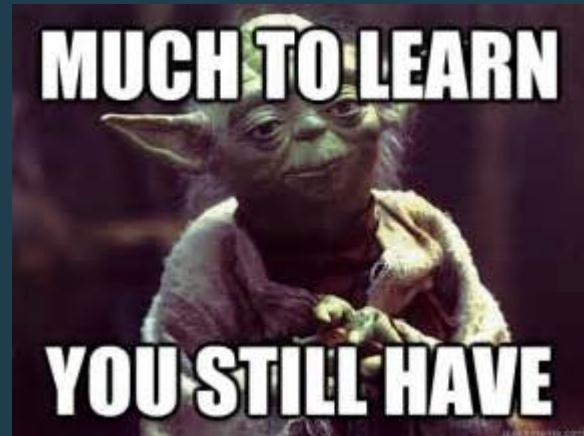
## Horario

Inicio  Fin [Realizar consulta](#)

Ti d  
Chile

# Lecciones Aprendidas (Devs)

- ¿Optimizo antes, durante o después?
- Pandas != High performance
- Formatos de archivos en storage.



DEMO

Gracias por tu tiempo!  
Tienes Preguntas?

<https://muvio.cl/>