## Data: The frontier beyond Dynamic Spectrum



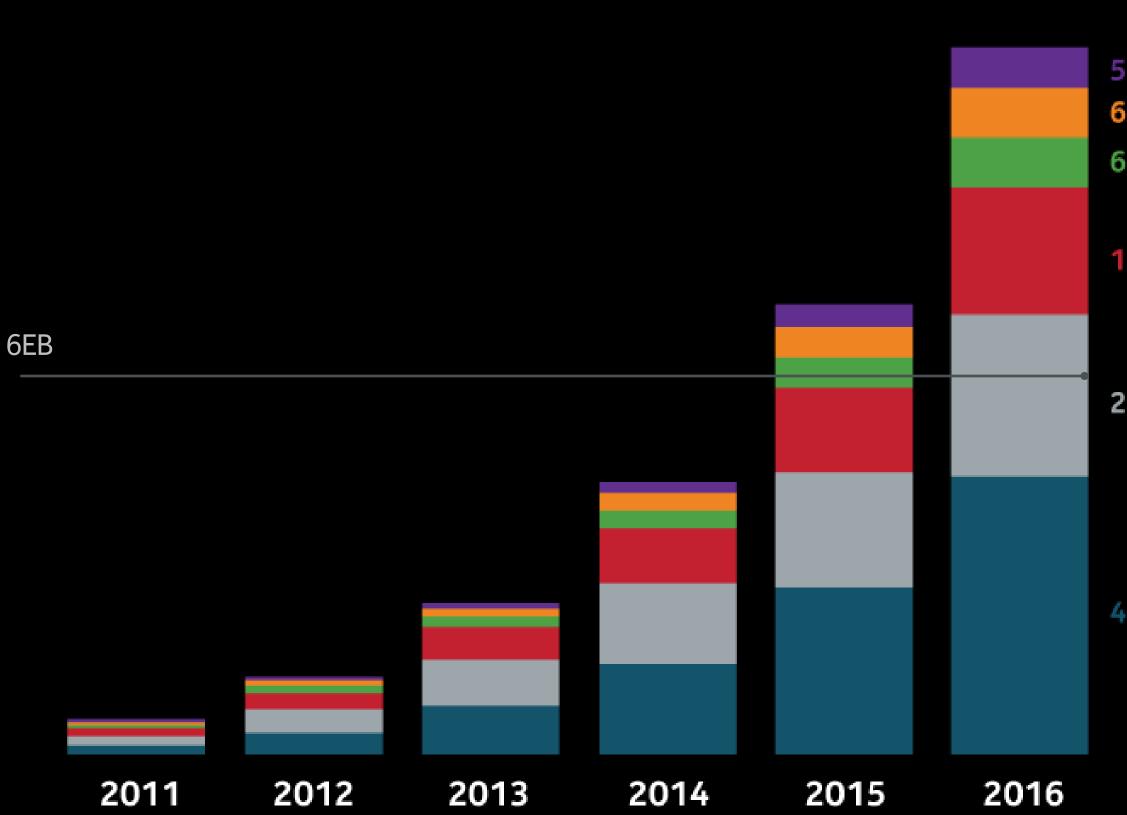
Henry Tirri

Nokia & University of California Berkeley

# Capacity Spectrum sensing as a sensor data source

### Capacity: The rise of mobile data

12EB



Source: Cisco VNI Mobile 2012

- 5.88% Middle East and Africa
- 6.54% Central and Eastern Europe
- 6.83% Latin America
- 18.18% North America
- 22.56% Western Europe

40.01% Asia-Pacific

## Bits eat Atoms.



## Inside Google-bits index What (documents).



## Inside CERN- bits index Physics (Particle events).

+

## Social Media Users

## Inside Facebook - bits index Who (social networks).





# Inside Nokia L&C - bits index

# Where (navigation & location).



# Why would Bits not index Spectrum ?.

# Index **Analytics Business**

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"Money is made from information difference". Henry's adaptation from Fortune's Formula by William Poundstone

### Sensors (& antennas) in smartphones today

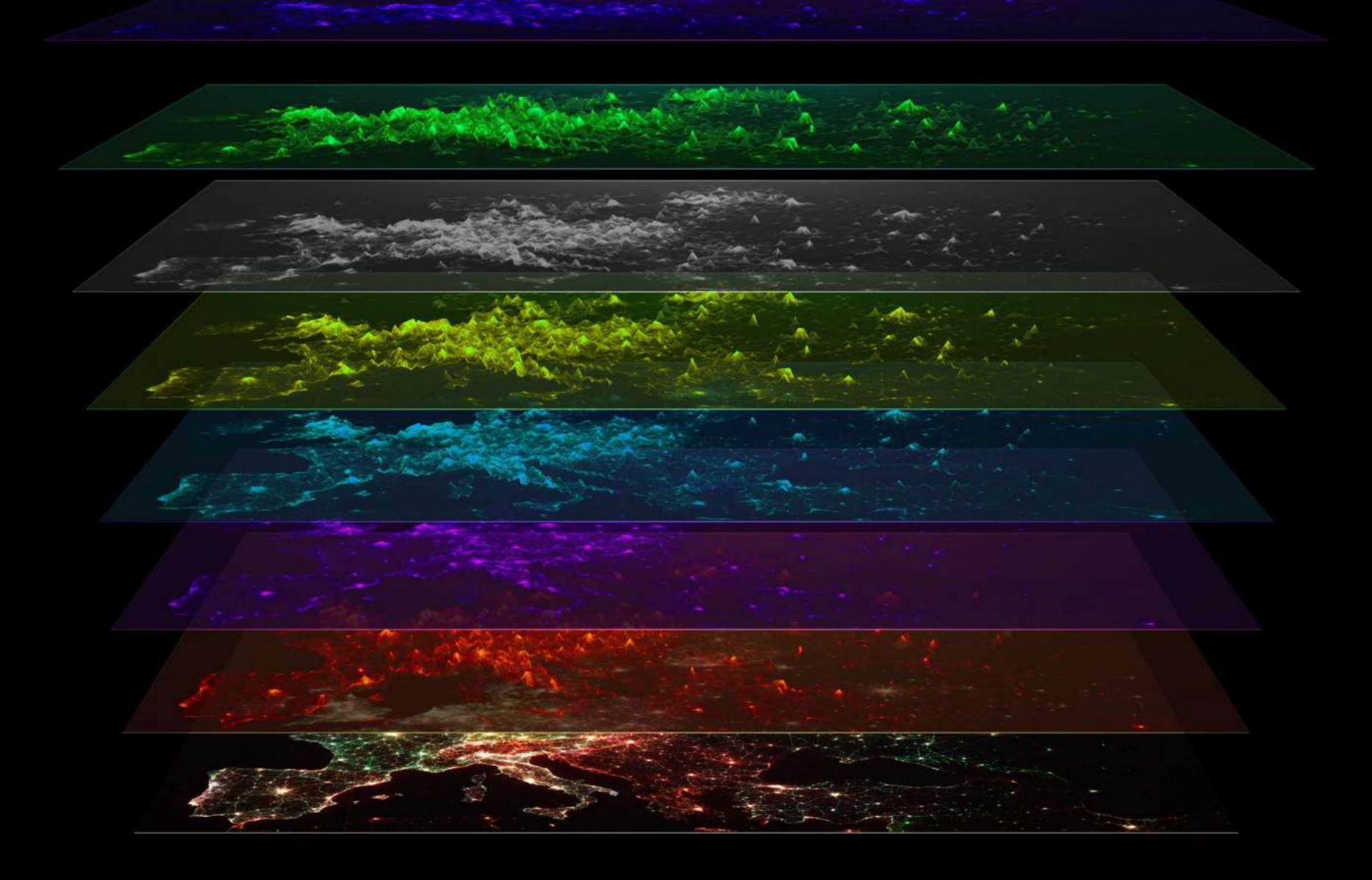


- Gyroscope, inside camera module
- Proximity sensor, ambient light sensor
- Magnetometer
- Accelerometer
- Microphones
- Main cellular antennas
- Cellular diversity antennas
- CWS antennas (Bluetooth, WLAN)
- GPS antenna
- Wireless charging coil
- NFC coil

ra module nt light sensor

as h, WLAN)





# $1Zettabyte \approx$ Sextilion (10<sup>21</sup>)

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## **Radio** sensing in handsets 2012.

GSM 850, 900, 1800, 1900

## WCDMA 850, 1800, 1900

#### Wireless Charging

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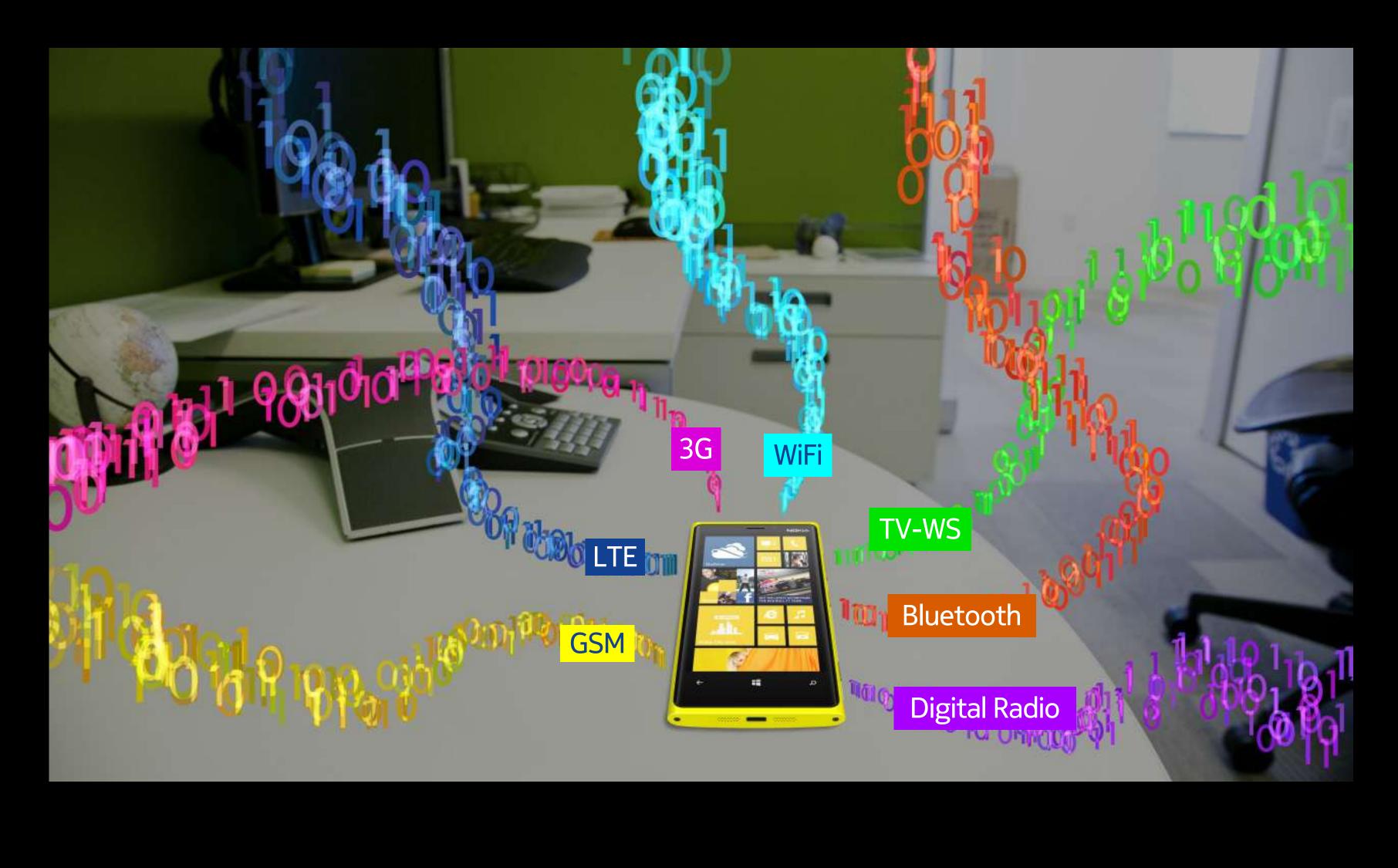
Ah.

GPS

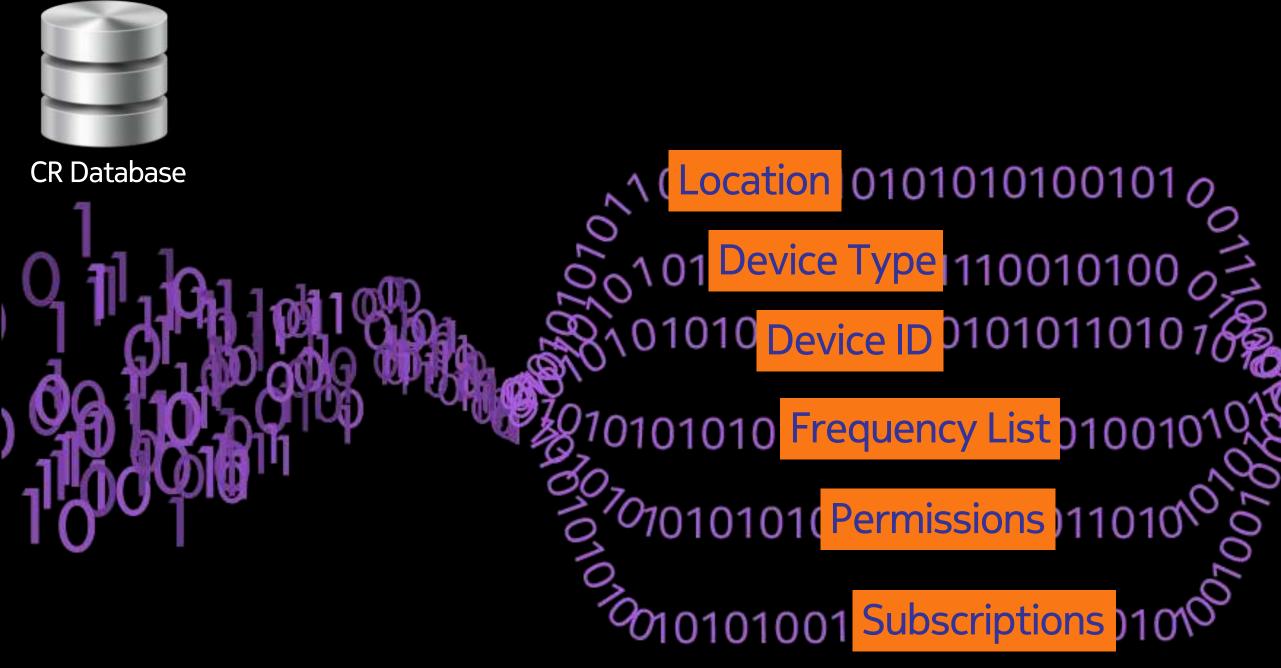
### Bluetooth 4.0

#### NFC





### Example: Utilizing the CR data





- Location Based Advertising
- Opt-in advertising
- Location driven access
- Demographics
- Routing to spectrum
- Service priority







CR Database

(Location 0101010100101 101 Device Type 110010100 101010 Device ID 010101101076

Uhe

870101010 Frequency List 01001010

2707010101(Permissions)11010

010101001 Subscriptions )100





## Spectrum information requests indexed by location.

(supervised and unsupervised) Density estimation in a grid in time and space (variants: granularity, non-iid)

What type of environments trigger spectrum queries

Associations of places in "spectrum sense"

Collaborative Filtering for recommendations based on spectrum behavior

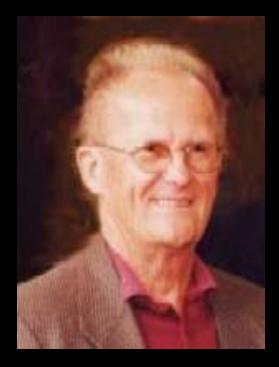
# Modeling considered to be difficult.

- Curse of dimensionality is real
  - Context data is high-dimensional
  - Even discrete (binary) vectors suffer from sparseness
- Scale often rules out lots of traditional algorithms (like standard O(n^2) SVMs, brute force k-means, ...).
- "Too much data" the model (family) is too simple

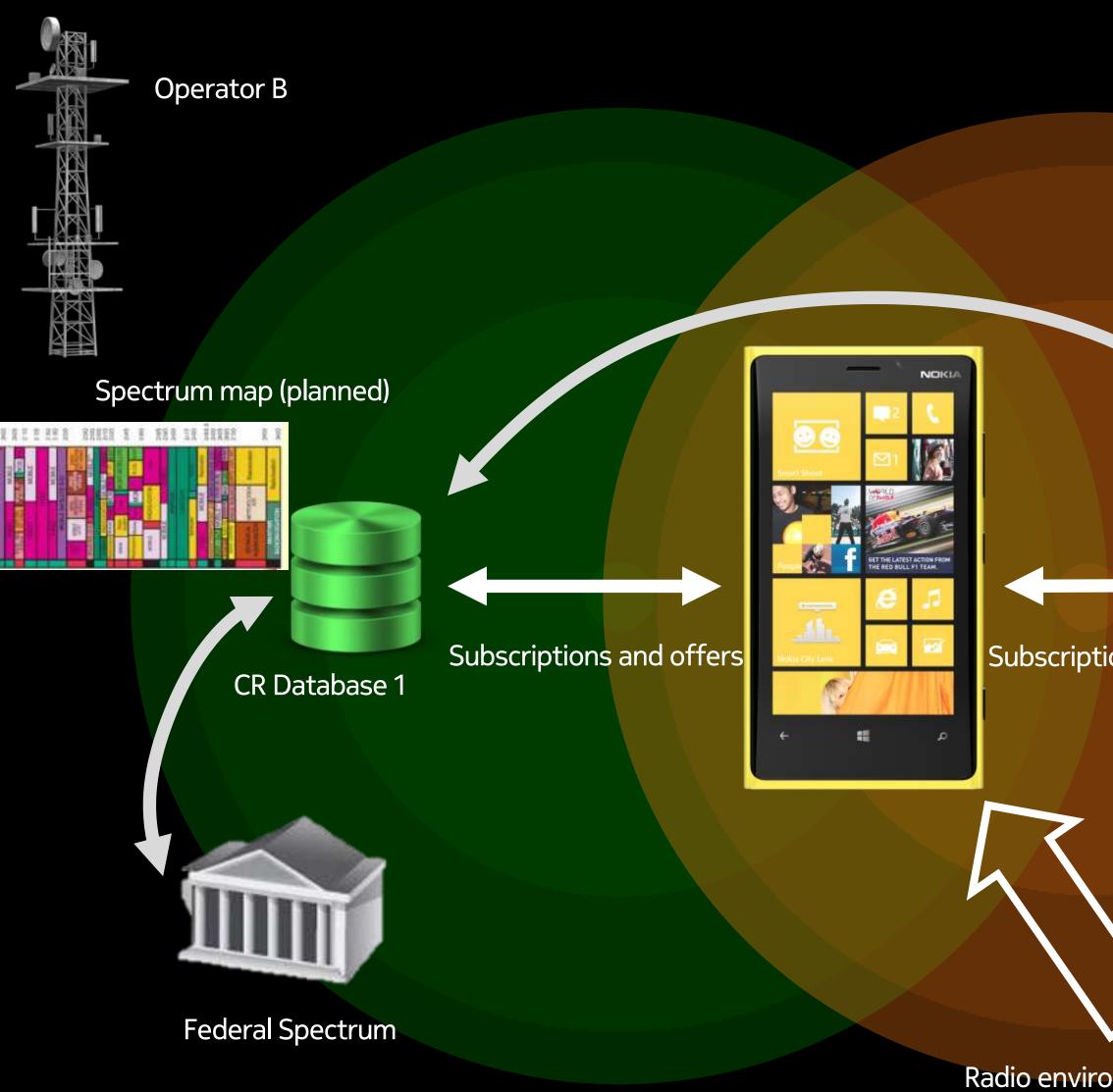


### sparseness algorithms (like eans, ...). too simple

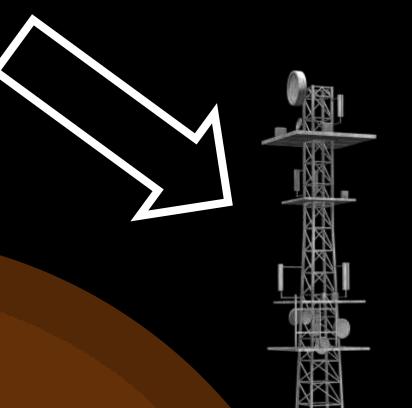




## Negotiauctions



#### Radio environment (measured)





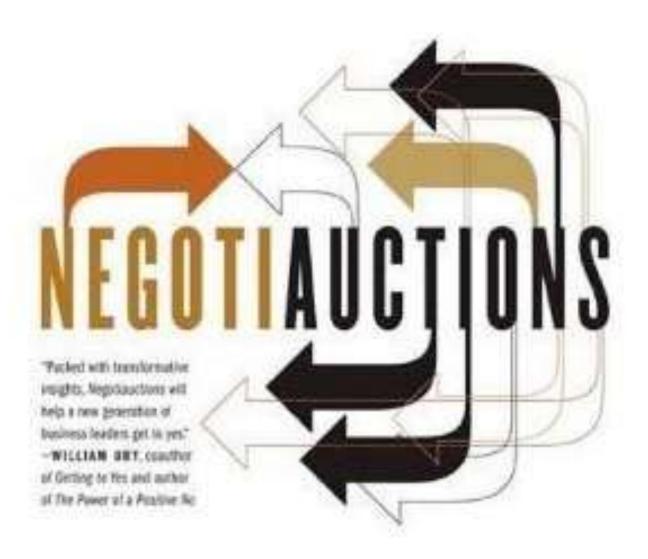
#### Subscriptions and offers

#### CR Database 2

Radio environment (measured)

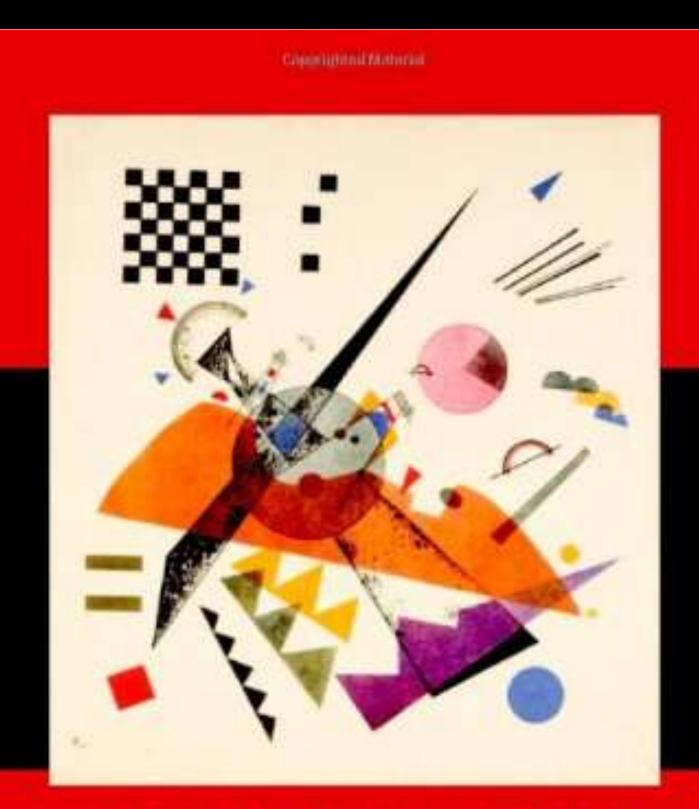
TV - WS

#### NEW DEALMAKING STRATEGIES FOR A COMPETITIVE MARKETPLACE



#### GUHAN SUBRAMANIAN

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# "Bits" approach needs algorithmic Game Theory

Nisan, Noam; Ronen, Amir (1999), "Algorithmic mechanism design", Proceedings of the 31st ACM • Symposium on Theory of Computing (STOC '99), pp. 129–140, doi:10.1145/301250.301287

#### **Algorithmic Game Theory**

Edited by Noam Nisan, Tim Roughgarden, Eva Tardos, and Vijay V. Vazirani

Foreword by christos H. Papadimitriou

Constantial in case

Committeet Studentisk

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With what other data spectrum sensing data should be combined with?

Analytics for spectrum sensing – Déjà vu or novelty?

**Energy implications?** 



## Black Swans Rexist.