



Per Nymand-Andersen Adviser, European Central Bank

Big data: A strategic asset for central banks policies



"Learning never exhausts the mind" Leonardo da Vinci

Pretty Big Data - Reflections for policy purposes



2

Paradigm shifts - Moving to micro level & granular data



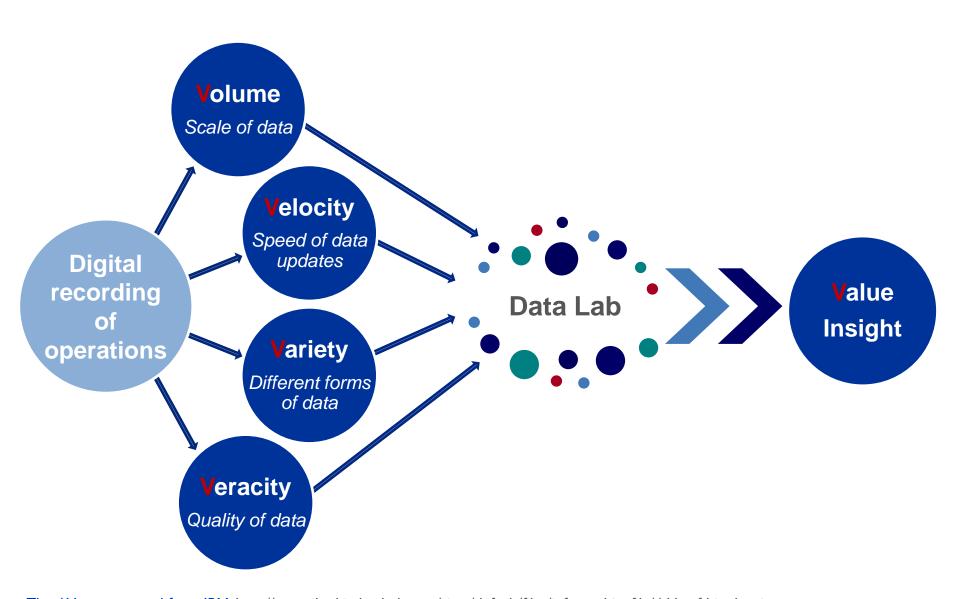
3

Discovery

- Collaboration and partnership



<u>Disclaimer</u>: The opinions expressed in this presentation are not necessarily those of the European Central Bank (ECB) or the European System of Central Banks (ESCB)



2017 This Is What Happens In An Internet Minute



Sources for digital exploration

- Accessing
- Structuring datasets
- Linking data sets
- Slice & dice across time and datasets
- Performing querying

Staying fit with Heraklit

Which preparations are needed today to have the capacity and functionality needed in 5 years time?

- From experimenting to central banking tool kits?
- Linking current and past data
- Querying variety of formats
- Technical independent

Source: Cumulus Media,

E- trade



Settlement systems



Credit cards



Mobile transaction



Lending & financing



Big data





- Fintech
- •DLT



- D-coins
- •S-contracts



Price scans



Data Scientist



Data Analytics



Data lab



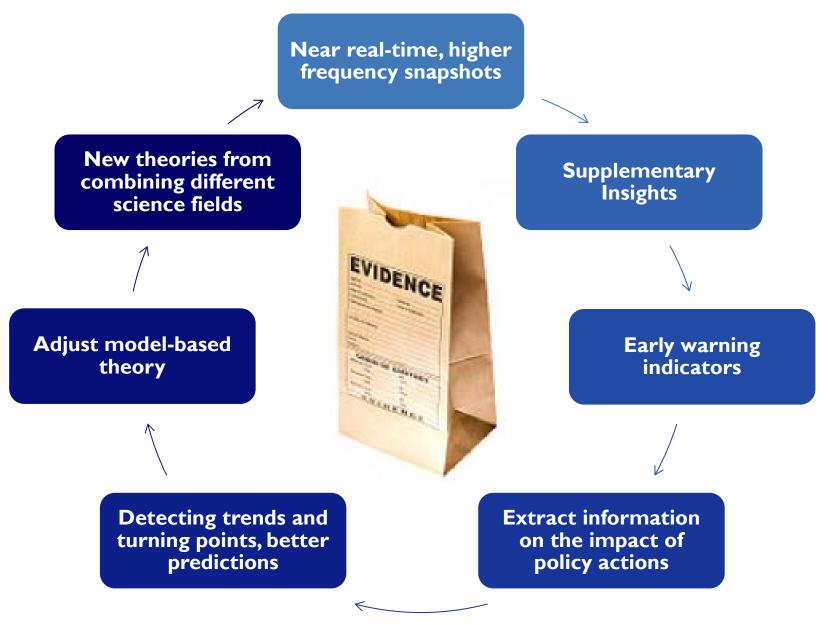
Systematic acquire, Process, summarize



Statistical algorithm and data explorations

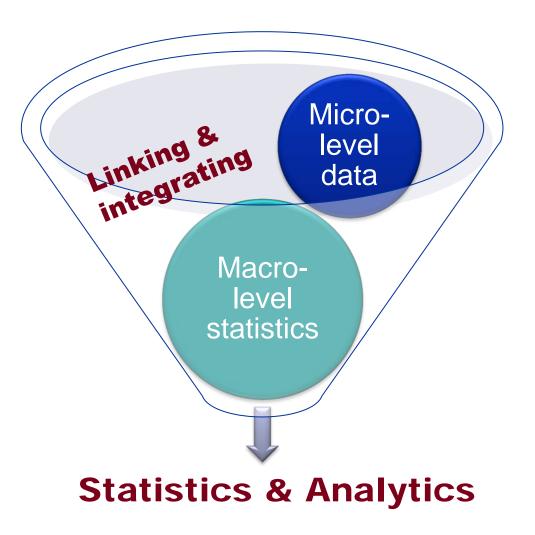


Packaging data for Insights & business



Source: "Big data: The hunt for timely insights and decision certainty - Central banking reflections on the use of big data for policy purposes, IFC working Paper No 14, 2016, Per Nymand-Andersen

Paradigm shift - Moving to micro level/granular data ECB-UNRESTRICTED

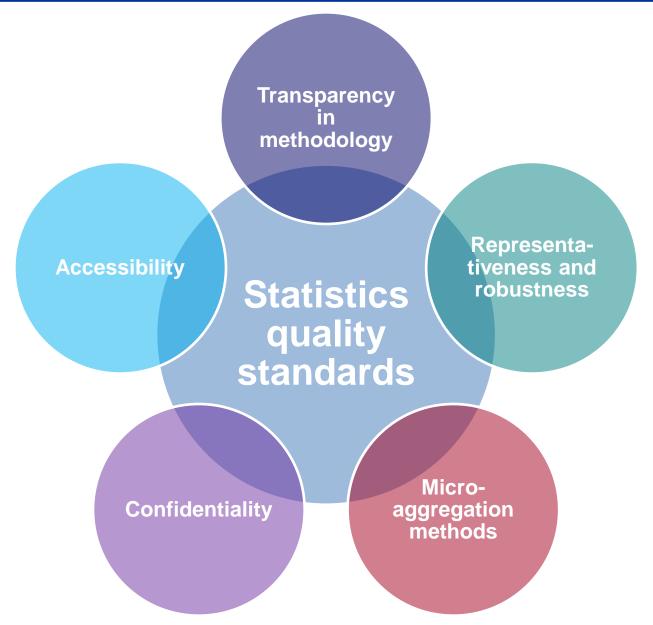


Micro-level statistics

- Security-by-security statistics
- Holdings of individual securities
- Money market transactions (MMSR)
- Loans by loans register (Ana Credit)
- Register of Financial Institutions
- Individual bank supervisory data

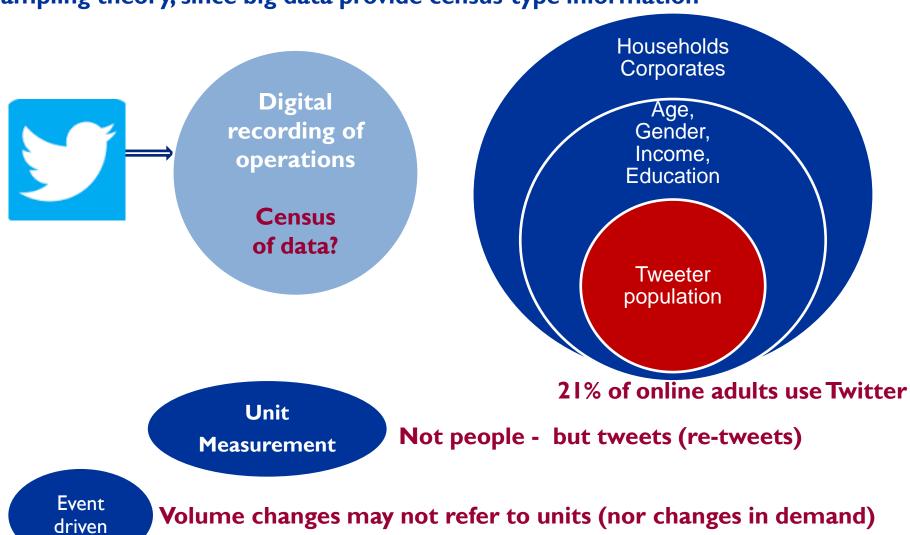
Macro-level statistics

- Balance sheet statistics
- Monetary aggregates (MI M3)
- Securities issues
- Banks interest rates
- Government finance
- Euro area financial accounts

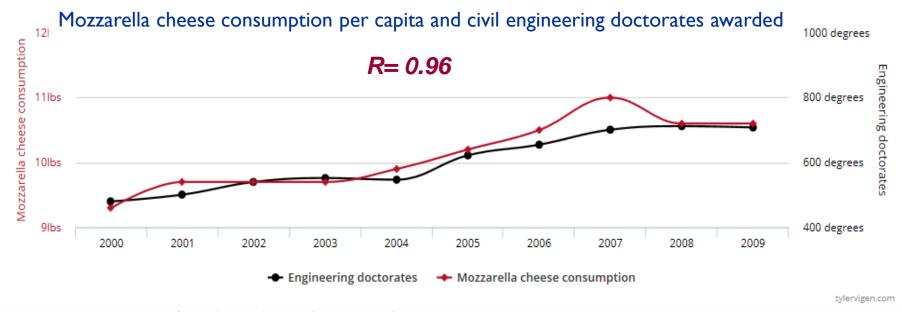


Big Data analytics - from experimenting to tool-kits

One <u>misperception</u> of big data is that we **do not need** to worry about sample bias and representativeness, as large volumes of information supersede standard sampling theory, since big data provide census-type information



Correlation is not (necessary) causation



Data sources: U.S. Department of Agriculture and National Science Foundatio

No conclusion can be drawn simply on the basis of correlations between two variables. The similarity is a coincidence. We **should** say that there is no causation



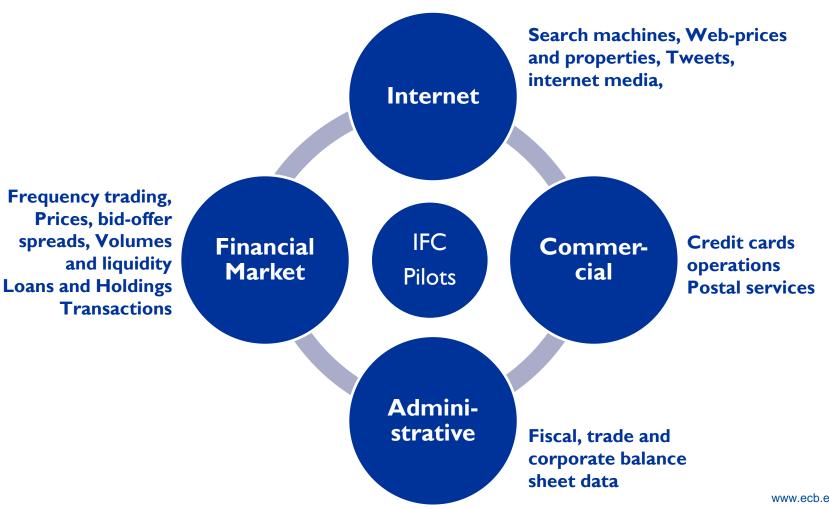
"The invalid assumption that correlation implies cause is probably among the two or three most serious and common errors of human reasoning"

Stephen Jay Gould, American evolutionary biologist and author, 1981

Discovery, collaboration and partnership

Irving Fisher Committee – Collaboration among central banks

Skills, tools and insights



There is a business case within economics and finance



2

Moving to micro level data does not challenge our statistics quality concepts



3

Call for collaboration, enhancing skills to create value



Thank you for your attention



Any questions?

Annex: ECB Paper Series as an outlet for big data research



ECB STATISTICS PAPER SERIES

Gaining insights - Growing understanding - Spreading knowledge



The *ECB Statistics Paper Series* is a channel for statisticians, economists, researches and other professionals to publish innovative work undertaken in the area of statistics and related methodologies of interest to central banks.

Check out the paper series on the **ECB website:** www.ecb.europa.eu

Or contact us: statisticspaperseries@ecb.europa.eu

- An outlet for big data research:
 - "Nowcasting GDP with electronic payments data" by Galbraith J & Tkacz G.
 - Electronic payment transactions can be used in nowcasting current gross domestic product growth
 - finds that debit card transactions contribute most to forecast accuracy
 - "Social media sentiment and consumer confidence" by Daas P & Puts M
 - Relationships between the changes in consumer confidence and Dutch public social media?
 - Could be used as an indicator for changes in consumer confidence and as an early indicator
 - "Quantifying the effects of online bullishness on international financial markets" by Mao H & Counts S, Bollen J.
 - Develops a measure of investor sentiment based on Twitter and Google search queries
 - Twitter and Google bullishness are positively correlated to investor sentiment