### Don't be stressed overseer: we have stress indicators Work in progress

Ron Berndsen, Ronald Heijmans and Richard Heuver

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### Outline

### Introduction

- 2 Research question
- 3 How to develop stress indicators?
- 4 Some examples of indicators



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### Motivation of analysis

- FMI transaction level data (often) available or can become available.
  - At least to central banks.
- Currently, little quantitative information available for overseers/operators.
- Data provides crucial information to overseers/operators.



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 How to derive stress indicators from the Principle for Financial Market Infrastructures by using FMI transaction level data?

In other words:



### Principles for Financial Market Infrastructures (24)



Legend: completely new raising the bar basically unchanged

Berndsen, Heijmans, Heuver (DNB)

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### Principles for Financial Market Infrastructures (24)

| PFMI<br>nr           | Description   | relevant for quanti-<br>tative oversight |
|----------------------|---|--|
| 1<br>2<br>3<br>4     | Legal basis<br>Governance<br>Framework for the comprehensive management of risks<br>Credit risk   | -<br>-<br>*                              |
| 5<br>6<br>7<br>8     | Collateral<br>Margin<br>Liquidity risk<br>Settlement finality   | * *                                      |
| 9<br>10<br>11<br>12  | Money settlements<br>Physical deliveries<br>CSD's securities safekeeping<br>Settlement of two linked obligations  | *<br>*<br>-                              |
| 13<br>14<br>15<br>16 | Participants-default rules and procedures<br>Segregation and portability<br>General business risk<br>Custody and investment risks   | *<br>-<br>*                              |
| 17<br>18<br>19<br>20 | Operational risk<br>Access and participation requirements<br>Tiered participation arrangements<br>FMI links   | *<br>-<br>*                              |
| 21<br>22<br>23<br>24 | Efficiency and effectiveness<br>Communication procedures and standards<br>Disclosure of rules - key procedures - and market data<br>Disclosure of market data by trade repositories | -<br>-<br>-<br>-                         |

• We focus in this paper on 1) operational, 2) liquidity and 3) FMI Links.

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### Data

- As a proof of concept we use TARGET2 transaction level data.
- Data ranging from June 2008 until May 2016.

### Basic concept

- Stress indicators should be easy to understand by a none-scientist (e.g. overseer, operator or manager)
- We propose a traffic light approach:
  - green: no stress.
  - yellow: increased stress.
  - red: high stress.

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### Be aware of this creature:



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Is not equal to a:





### What is true?

A Kiwi:

- can run faster than Usain Bolt.
- 2 can fly.
- Iays the largest eggs of all birds relative to its body size.
- has the shortest beak of all birds.
- has good vision.

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### How to proceed?

- Develop time series from which indicators can be derived.
- Potentially combine several time series to make one indicator.
- Check for seasonality, other repetitive cycles and trends.
- Check with end users (e.g. an overseer) for usability.

Watch out for the Kiwi. Confusion of tongues not unlikely!

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### Which quantitative measure(s) to use?

- Legislation/supervision quantitative measure.
- Quantitative (external) guideline.
- Based on its own history (absolute/relative change).

### The third measure can be a bit tricky (think of the Kiwi).

### Service level agreement (legal)

- Provider of TARGET2 guarantees a certain nr of transactions X<sub>max</sub> per day and hour.
  - A red light should e.g. be given when:

$$X_{settled} >= X_{max}$$
 (1)

And a yellow light when:

$$X_{settled} >= X_{max} - threshold$$
 (2)

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 The overseer will initially only see the traffic light for a given month (or the last couple of months):

|                       | June 2009 | December 2012 | October 2015 |
|-----------------------|-----------|---------------|--------------|
|                       |           |               |              |
| Above 100%            | 3         | 0             | 0            |
| Above 100% - $\sigma$ | 4         | 2             | 0            |
| Traffic light         | Red       | Yellow        | Green        |

### Throughput guidelines (external guideline)

• A certain percentage of transactions (value) has to be settle before a certain time (UK LVPS CHAPS, see e.g. Ball et al. (2011)).

Transferred value before 14.30 hours <=75% (3) Transferred value before 12.00 hours <=50% (4)



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### Under investigation

- Network indicators:
  - basic properties: such as degree, connectivity
  - advanced properties: such as Hub/authority centrality (see e.g. thesis Carlos Leon).
  - combined properties: combine (similar) network properties to one overall indicator.
  - for different payment types (interbank, customer, etc).
- Links to other payment systems (FMI-links or interdependencies).
- Look for cyclical patterns you may have to correct for (based on Van Ark, Heijmans and Heuver in progress).

### What else? What are your ideas?

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### Preliminary conclusions

- First results look very promising, but we are not there yet.
- Interpretation is a challenge when there is no clear/external bench mark for stress.
- General warning: Don't be KIWI-ed!

• Data handling and processing speed essential in development of indicators: well functioning data warehouse is a prerequisite.

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# **Oversight Stress Indicators**

# Data warehouse implementation of TARGET2 payment system data using a dimensional model approach

# Data warehouse definition

# A data warehouse is a copy of transaction data specifically structured for query and analysis

(Ralph Kimball)

# Different purpose...

| <b>Transaction Processing</b>  | Analysis  |
|--|---|
| <ul> <li>One transaction at a time</li> </ul>                              | <ul> <li>A large data-range at a time</li> </ul>                      |
| e.g.<br>- storage of one settlement  | e.g.<br>- daily number of settlements<br>within the whole month       |
| <ul> <li>Limiting history in order to<br/>keep high performance</li> </ul> | <ul> <li>History is important</li> </ul>                              |
| e.g.<br>- max of 5 day online,<br>older days in archive                    | e.g.<br>- compare current years<br>to pre-crisis situation<br>in 2007 |

# Current TARGET2 data

- Is stored as an archive
- Contains detailed data on each transaction
- Has many character key fields (account, payment type, date)

- Huge storage size
- Not suited for analytics
- Desire to integrate:
  - Furfine output (money market transactions)
  - BIC condolidation
  - MFI integration

# Purpose of the TARGET2 data warehouse

• Researchers

that aim to perform analysis spanning multiple years and yet desire granularity

- Some examples:
  - Stress indicators
  - Network analysis
  - Multiple year simulations using BoF Simulator

# You win some - you lose some...

- Win:
  - Performance
  - Flexibility
  - Integration of other data sources

- Lose:
  - some columns (e.g. priority)
  - some granularity (e.g. quarter of the hour)

# What is a dimensional approach

- First define the core facts
  - Value of payments
  - Number of payments
  - Account balance, Credit Limit
- Then define the key dimensions
  - Sending Participant, receiving Participant
  - Time, day, month
  - Payment Type

# **Dimensional Model - Star Schema**



# How to achieve DWH performance

- Fact tables are "lean and mean", containing
  - key facts
  - keys pointers to dimensions (integers)

- Dimension tables
  - are accessible through key pointers
  - contain character fields / details

# Stylized example: - Archive of payment transactions

| Day<br>ch 10 | BIC db<br>ch 11 | BIC cr<br>ch 11 | Transaction Type<br>ch 18 | Amount<br>nd 8 |
|--------------|-----------------|-----------------|---------------------------|----------------|
| 2016-01-01   | ABNANL2AXXX     | RABONL2UXXX     | Bank payment              | 100.000,25     |
| 2016-01-01   | INGBNL2AXXX     | GILLNL2AXXX     | Client payment            | 12.807.342,31  |
| 2016-01-01   | ABNANL2UXXX     | FLORNL2ACUR     | CB-deposit                | 1.250,17       |
| 2016-01-02   | KABANL2AXXX     | ABNANL2UXXX     | Client payment            | 2.187.024,37   |
| 2016-01-02   | ABNANL2UXXX     | INNDNL2UDDE     | Settlement Equens         | 200.000,00     |
| 2016-01-02   | RABONL2UXXX     | ABNANL2UXXX     | Bank payment              | 507,17         |
| 2016-01-02   | INGBNL2AXXX     | RABONL2UXXX     | Bank payment              | 204.057.018,33 |

Line width is: 10+11+11+18+8 = 58 bytes. Table is large and contains redundance. Table contains many character columns --> not suited for a computer.

## Stylized example - Data Warehouse implementation

#### Fact table

| Day<br>ni 4 | Bank db<br>ni 2 | Bank cr<br>ni 2 | Ttype.nr<br>ni 1 | Amount<br>ni 6 |
|-------------|-----------------|-----------------|------------------|----------------|
| 20160101    | 1               | 2               | 1                | 100.000        |
| 20160101    | 7               | 3               | 2                | 12.807.342     |
| 20160101    | 1               | 5               | 3                | 1.250          |
| 20160102    | 4               | 1               | 2                | 2.187.024      |
| 20160102    | 1               | 6               | 4                | 200.000        |
| 20160102    | 2               | 1               | 1                | 507            |
| 20160102    | 7               | 2               | 1                | 204.057.018    |

### **Dimension table "Bank"**

| ↓<br>↓<br>↓    |                    |
|----------------|--------------------|
| Banknr<br>ni 2 | Bank name<br>ch 11 |
| 1              | ABNANL2AXXX        |
| 2              | RABONL2UXXX        |
| 3              | GILLNL2AXXX        |
| 4              | KABANL2AXXX        |
| 5              | FLORNL2ACUR        |
| 6              | INNDNL2UDDE        |
| 7              | INGBNL2AXXX        |



Line Width is: 4+2+2+1+6 = 15 bytes. This is a 75% decrease. Fact table contains numbers only. --> much better suited for a computer.

# First implementation in TARGET2



### First impression on performance



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# Future work

- Indexes
- Final tests
- Documentation
  - Paper
  - Technical documentation
  - User manual