

# **Q3 RESEARCH UPDATE**

**26 SEPTEMBER 2023**



## ON TODAY'S CALL



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# **AGENDA**

**PUBLICATIONS**

**DATA AVAILABILITY**

**ADJUSTED DATABASE/ALL IN ONE DATABASE**

**LOAN PERFORMANCE**

**GUEST SPEAKERS**

- SAMUELE SEGATO: “COMPLEXITY AND THE DEFAULT RISK OF MORTGAGE-BACKED SECURITIES”**
- FRANCESCO BENVENUTI: “ASYMMETRIC INFORMATION IN LOAN CONTRACTS”**

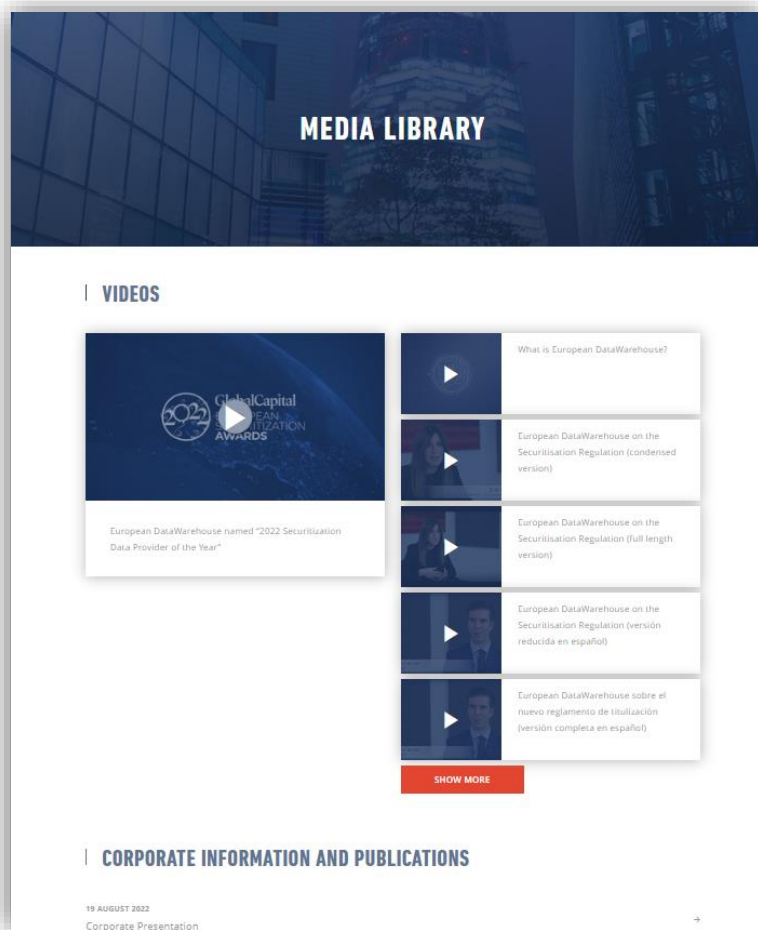
**Q & A**

# **PUBLICATIONS**

**LUDOVIC THEBAULT, EUROPEAN DATAWAREHOUSE**

# LIST OF RESEARCH PUBLICATIONS

Our own publications, plus third-party research Media Library - European DataWarehouse (eurodw.eu)

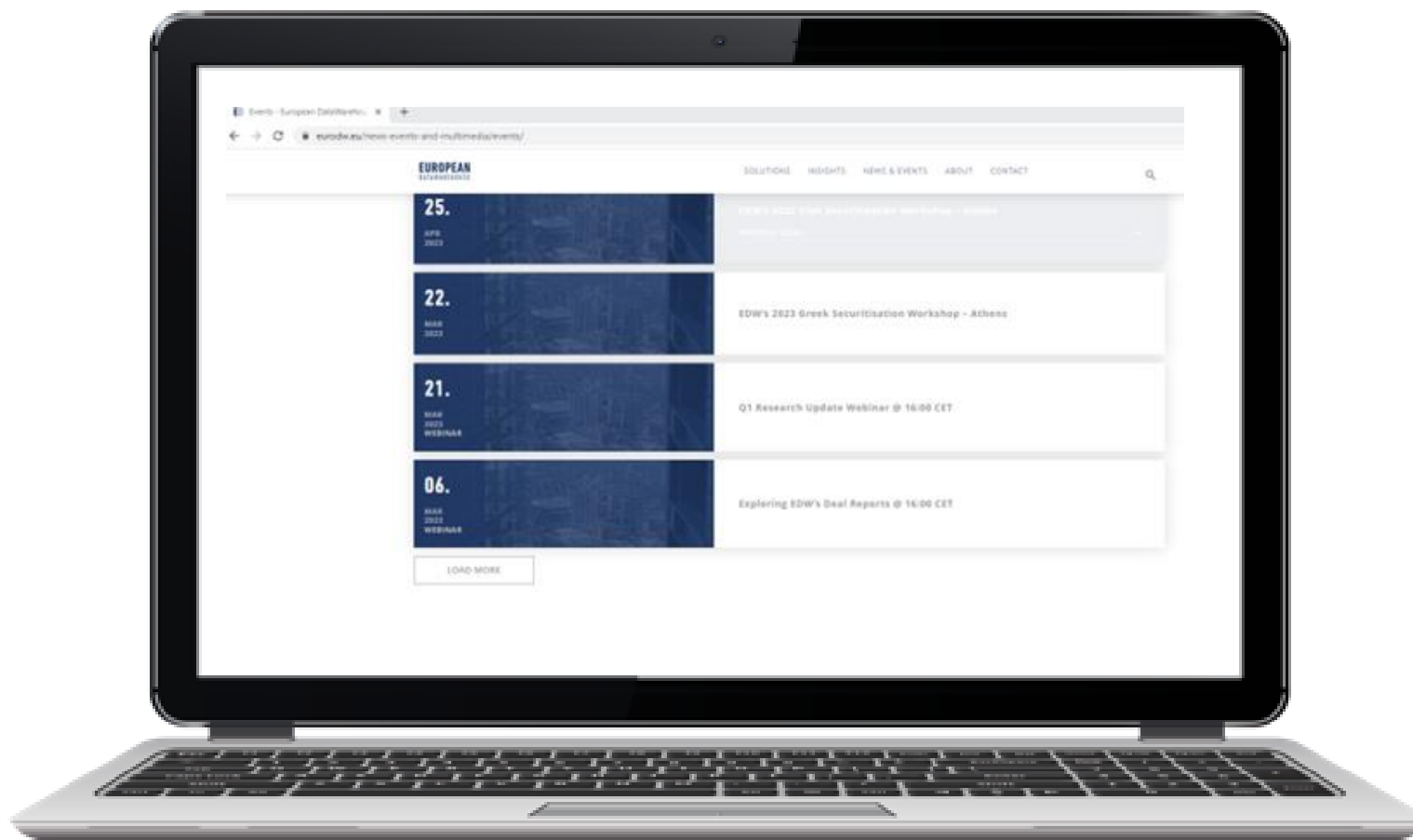


YEAR	MONTH	TITLE	PUBLISHER	PUBLICATION TYPE	KEYWORDS	ACCESSIBILITY	EDW/THIRD PARTY
2022	July	European Systems Risk Board (ESRB) Monitoring Systems, July	ESRB	Central bank publication	Systemic risk, securitisation	Direct	Central bank
2022	June	Spring 2022 Research Webinar	EDW (Guest speaker from University)	Webinar	Loan performance, data availability, energy performance, adjusted database	Direct	EDW
2022	June	Statistical Breakdown discussion paper on the implications	Deutsche Bundesbank	Central bank publication	ABS SME, involving investors	Direct	Central bank
2022	May	Moody's Investor Service: ESGs will cause data quality to	Moody's	Data comment	ESMA reporting standards	Restricted	Rating agency
2022	April	Introducing the EDW adjusted database	EDW	Webinar	Adjusted database	Direct	EDW
2022	February	New Year 2022 Research Webinar	EDW	Webinar	Loan performance, energy performance, adjusted database, COV	Direct	EDW
2022	February	APHE Report: ESG and climate finance increases 270% from	APHE	Data comment	ESG, sustainable finance, data availability	Direct	Others
2021	December	Winter 2021 Research Webinar	EDW (Guest speaker from European)	Webinar	Loan defaults, machine learning, RMBS prepayments, forecasting	Direct	EDW
2021	November	November 2021 - From the IMF-ECBC (European Mortgage Risk)	IMF-ECBC (EDW in HYPOSTAT)	COVID impact	COVID impact, mortgage, RMBS	Direct	Others
2021	October	Journal of Financial Economics: Forecasting Loan Defaults	Journal of Financial Economics	Academic publication	mortgage defaults, machine learning	Direct	Academic Publication
2021	September	September 2021 Research Webinar	EDW	Webinar	COVID, mortgage, credit risk and COVID	Direct	EDW
2022	May	Spring 2021 Research Webinar	EDW	Webinar	Data availability, COVID, Energy efficiency, payment holidays	Direct	EDW
2021	May	Journal of Real Estate Finance & Economics: Building Energy	The Journal of Real Estate Finance & Economics	Academic publication	mortgage defaults, energy efficiency	Direct	Academic Publication
2021	May	Data Availability Report Q4 2020	EDW	Data comment	Data availability	Direct	EDW
2021	March	Monitoring the Impact of COVID-19: Q1 2021 RMBS Report	EDW	COVID impact	COVID impact, mortgage, RMBS	Direct	EDW
2021	February	New Year 2021 Research Webinar	EDW (Guest speaker from European)	Webinar	COVID, RMBS performance, Loan amortisation, Cover your assets	Direct	EDW
2021	February	Monitoring the Impact of COVID-19: Q1 2021 RMBS Tracker	EDW	COVID impact	COVID impact, mortgage, RMBS	Direct	EDW
2020	December	COVID-19: Who Has Benefited Most from COVID-19? Auto Loan	EDW	COVID impact	COVID impact, auto loans, mortgages	Direct	EDW
2020	December	COVID-19: Safety of Payment Holiday Reporting Practices in the	EDW	COVID impact	COVID impact, mortgage	Direct	EDW
2020	November	Moody's Analytics COVID-19: 3M21 View of the Dutch Mortgage	Moody's	COVID impact	COVID impact, Netherlands mortgages	Restricted	Rating agency
2020	November	Moody's Analytics Comment Series of the U.S. Mortgage Market	Moody's	Credit research	COVID impact, mortgages	Restricted	Rating agency
2020	November	Monitoring the Impact of COVID-19: Q4 2020 AUTO Tracker	EDW	COVID impact	COVID impact, mortgage, auto loans	Direct	EDW
2020	September	Credit Performance Review	EDW	COVID impact	COVID impact, implied payment holidays	Direct	EDW
2020	August	Monitoring the Impact of COVID-19: Q3 2020 RMBS Tracker	EDW	COVID impact	COVID impact, mortgage, RMBS	Direct	EDW
2020	July	Martin-Holmes and Werner-DeGuerre: The Impact of the	Academic Publication	Academic publication	security design, asset-backed securities, retention, moral hazard	Direct	Academic Publication
2020	June	Thomas-Davies: Health Recaptulation and Bank Risk Taking	Academic Publication	Academic publication	TLTRO, Unconventional Monetary Policy, Credit Risk, Bank Capital	Direct	Academic Publication
2020	June	Monitoring the Impact of Covid-19: Q2 2020 report	EDW	COVID impact	First time delinquencies, auto, consumer, leases, RMBS	Direct	EDW
2020	February	Data Testing and Timeliness	EDW	Data comment	Reporting lag, data timeliness	Direct	EDW
2019	December	Gap analysis version 3.0 and 3.1	EDW	Data comment	ESMA data in ECB data	Direct	EDW
2019	November	BSM Index Insights from European DataWarehouse	EDW	Data comment	BSM Index Spain	Direct	EDW
2019	November	Index SME Index	EDW	SME performance	SME, SME performance	Direct	EDW
2019	October	ECB: The Impact of Lending Standards on Default Rates of	ECB	Central bank publication	loan defaults, lending standards, residential real estate, loan-loss	Direct	Central bank

<https://eurodw.eu/about-us/media-library/>

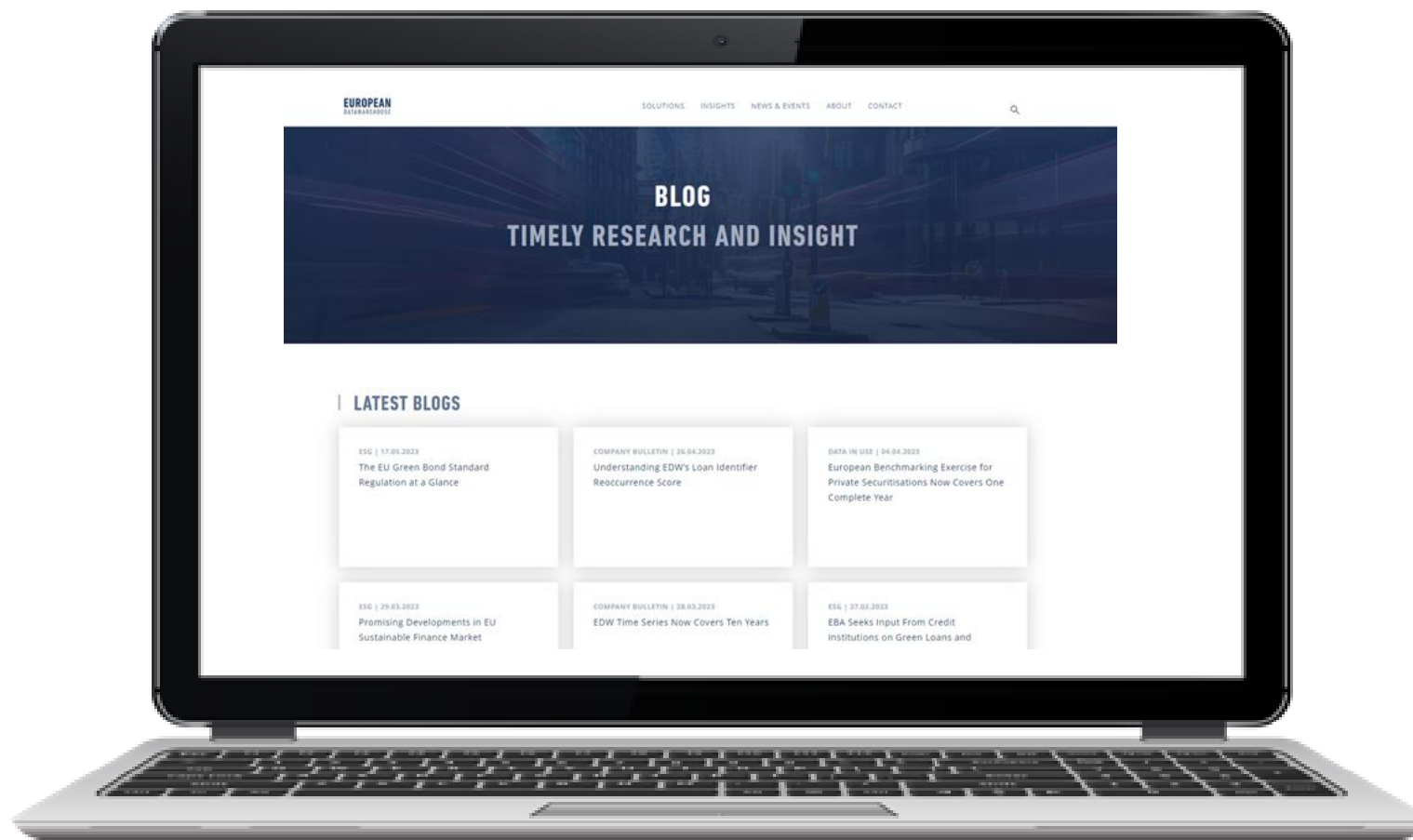
# WEBINARS

The slides and recordings of our webinars <https://eurodw.eu/news-events-and-multimedia/events/>



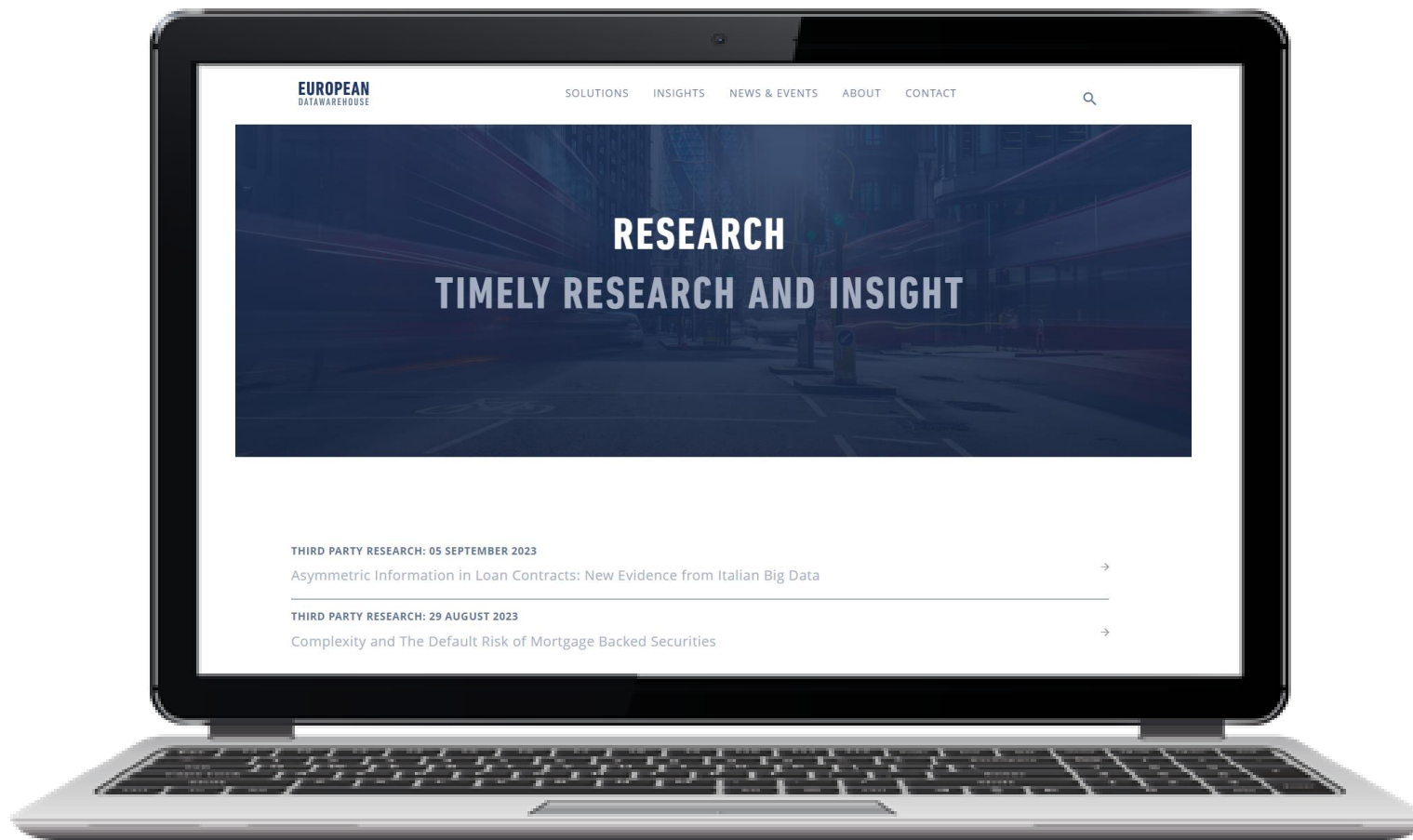
# BLOG

Short articles on current topics <https://eurodw.eu/knowledge/magazine//>



# RESEARCH SECTION

Our own publications, plus third-party research <https://eurodw.eu/knowledge/research/>



<https://eurodw.eu/knowledge/magazine/>

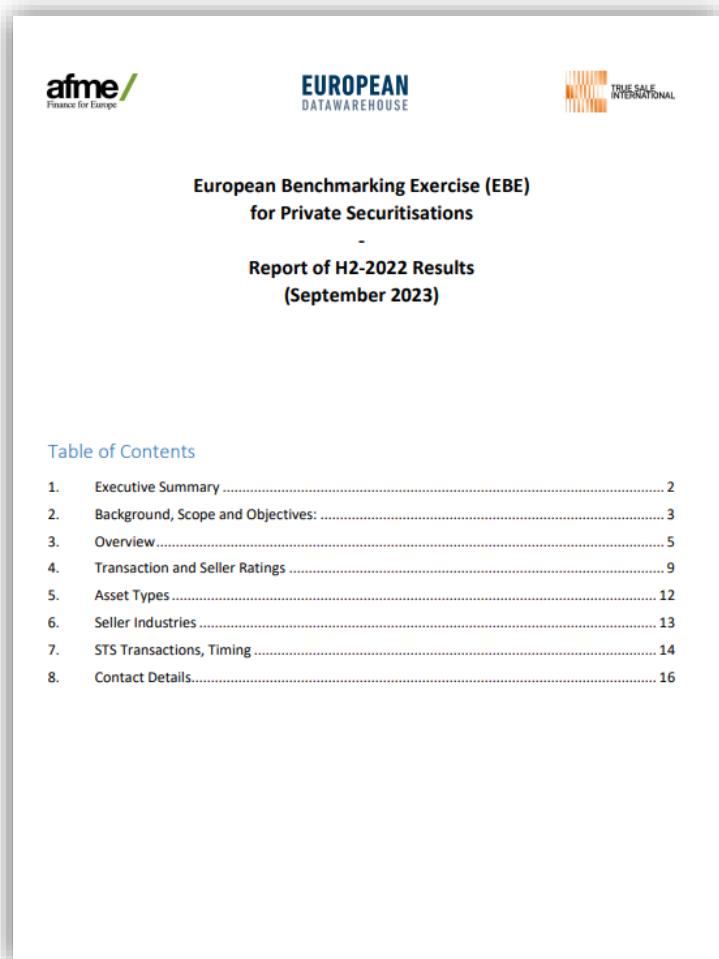


# **RECENTLY PUBLISHED**

**LUDOVIC THEBAULT, EUROPEAN DATAWAREHOUSE**

# EUROPEAN BENCHMARKING EXERCISE – UPDATED REPORT ON PRIVATE DEALS (1)

The European Benchmarking Exercise was updated and is posted on our website (joint publication AFME/TSI/EDW)



		End of 2022								
End of 2021	# Commitments	AAA	AA	A	BBB	BB	NR	ND	Dropped	Total
	AAA	60	8	3	1	-	-	-	13	85
	AA	22	138	16	-	-	-	-	13	189
	A	1	16	119	8	-	-	-	10	154
	BBB	-	1	6	51	1	-	-	9	68
	BB	-	-	-	-	5	-	-	1	6
	NR	-	-	-	-	-	18	-	3	21
	ND	-	-	-	-	-	3	1	-	4
	New in 2022	18	27	12	16	-	5	-	-	78
	2022	101	190	156	76	6	26	1	49	

## EUROPEAN BENCHMARKING EXERCISE – UPDATED REPORT ON PRIVATE DEALS (2)

The European Benchmarking Exercise was updated and is posted on our website

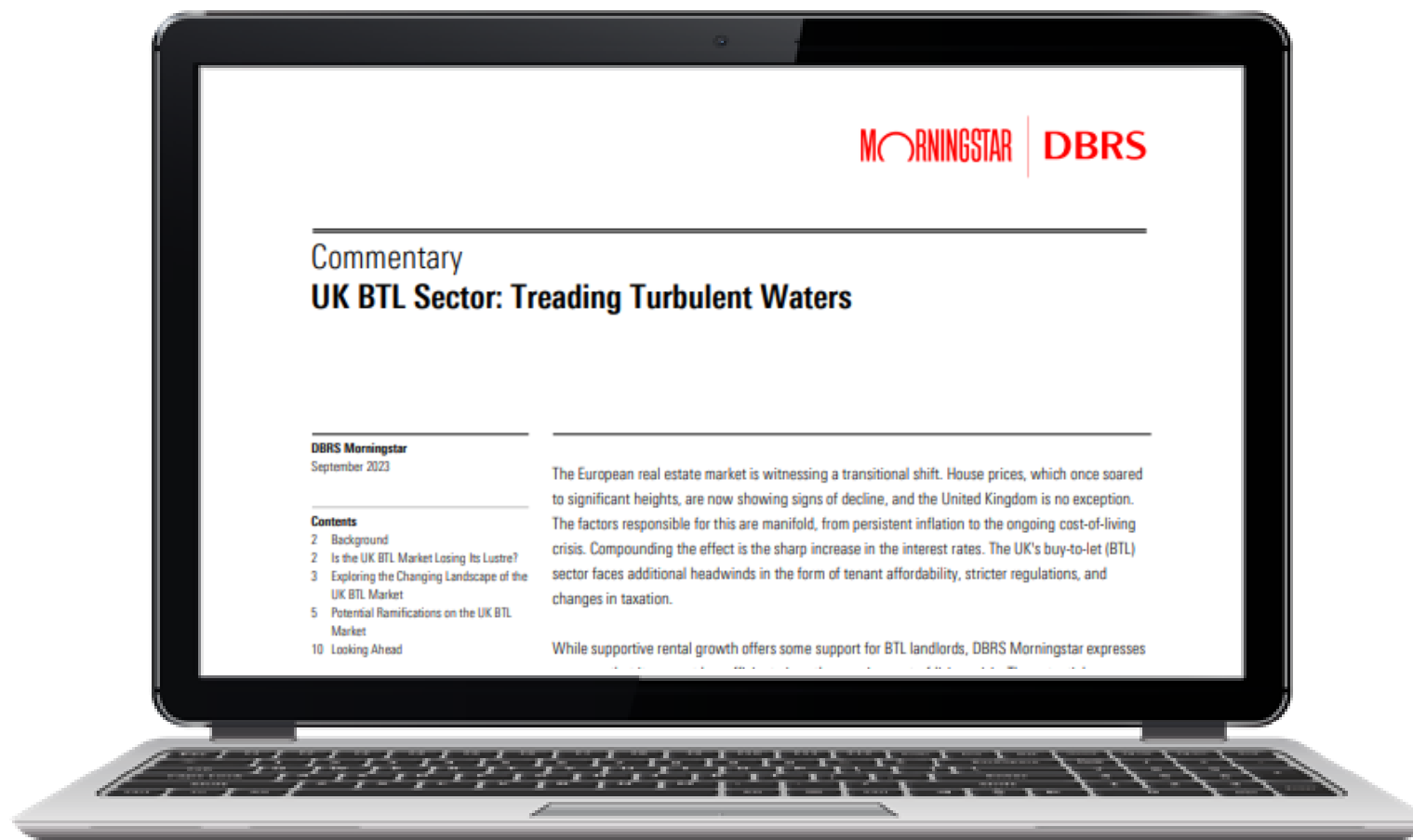
- Report co-authored with AFME and TSI
- Data provided in aggregated form by 12 banks from 6 EU countries
- Data received accounts for €73 billions in commitments (from €67 b. Previously)
- We estimate the amount of assets of private deals exceeds €196 billion
- Trade Receivables and Auto make up around 73% of the market, of which 36% and 91% respectively are funded through syndicated transactions
- Over 72% of private securitisation fund sellers in the EU
- Over 72% fund the real economy (the non-financial sectors of the economy)

Of all transactions by volume, 87% were undertaken by sellers with ratings of BBB and below at inception. In contrast, the average transaction rating is in the range A to AA. This shows that private cash securitisations provide a cost-effective means of financing for lower-rated sellers.

[https://eurodw.eu/wp-content/uploads/EBE\\_2022-H1\\_Report-2023-03-22\\_final-2.pdf](https://eurodw.eu/wp-content/uploads/EBE_2022-H1_Report-2023-03-22_final-2.pdf)

# RESEARCH SECTION

DBRS publication on the BTL sector (third party publication)



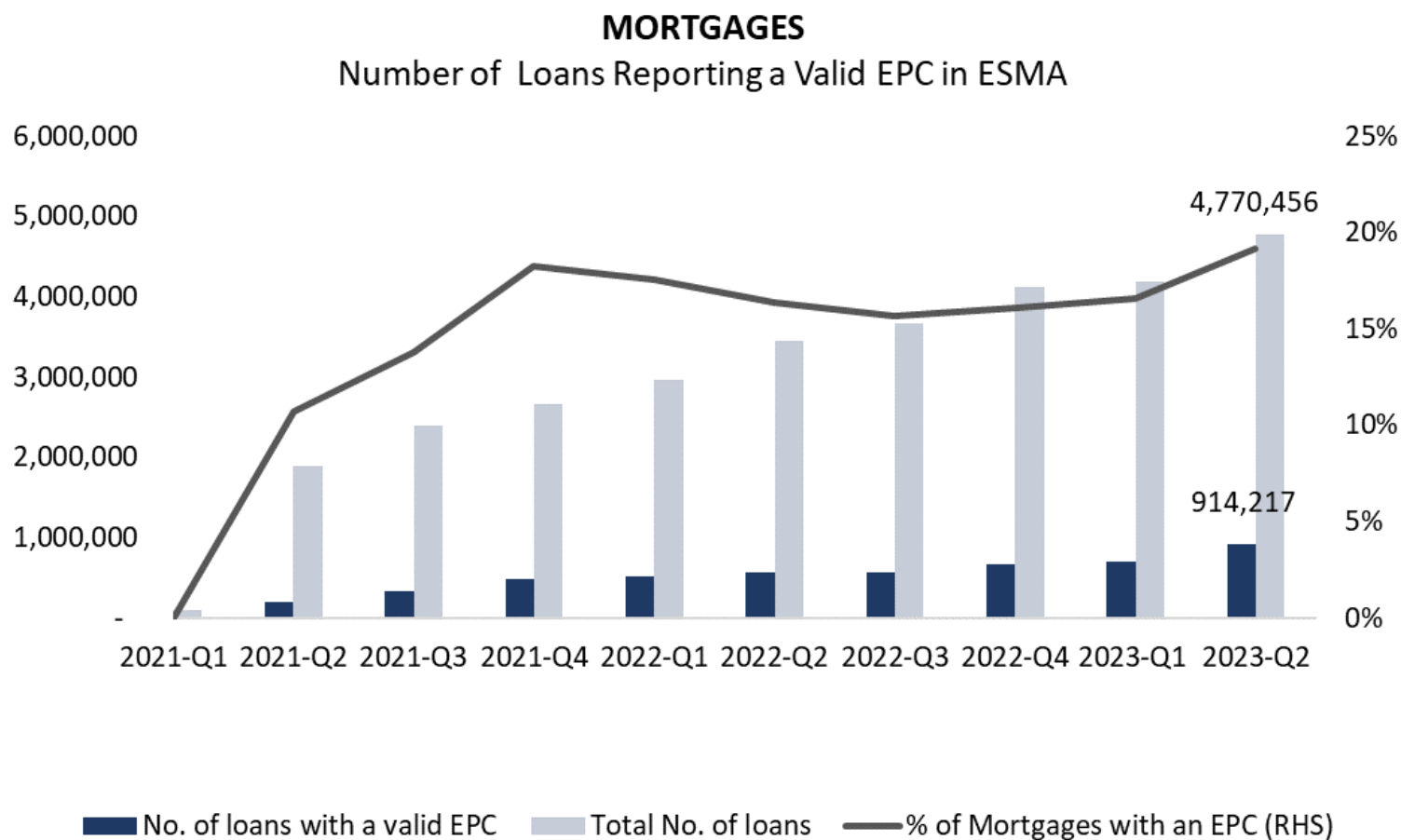
<https://www.dbrsmorningstar.com/research/420444>

# **DATA AVAILABILITY UPDATE**

**LUDOVIC THEBAULT, EUROPEAN DATAWAREHOUSE**

# EPC DATA AVAILABILITY

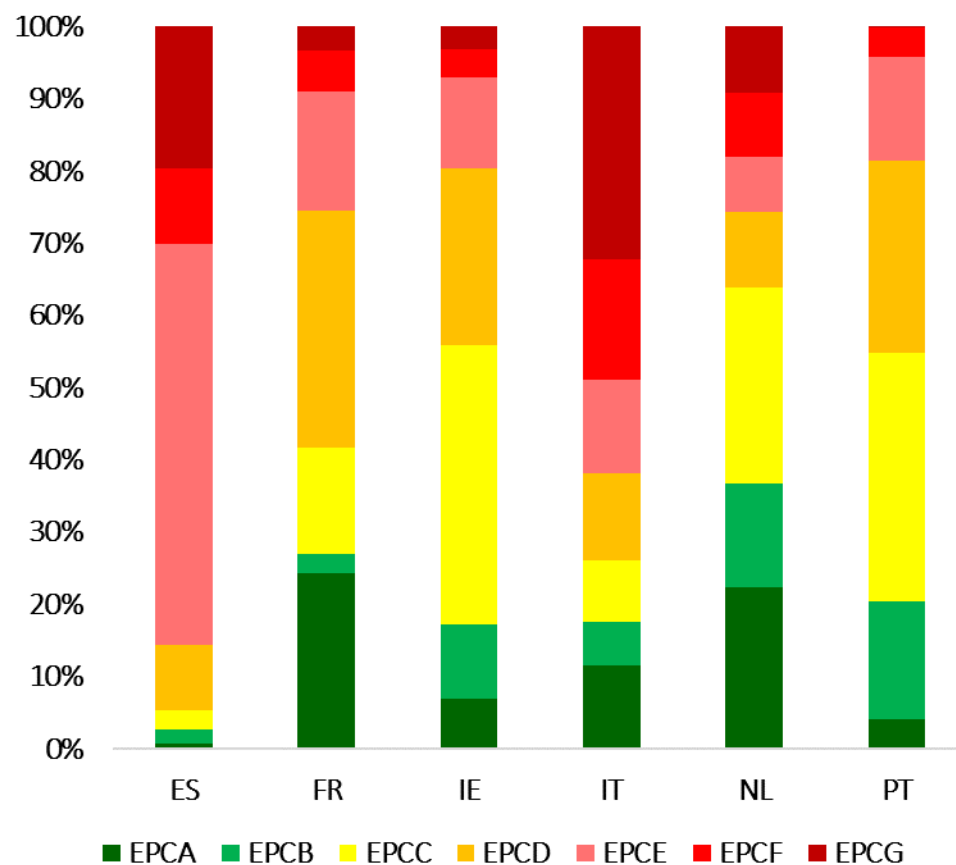
## Mortgages



# EPC DATA AVAILABILITY

## Mortgages

EPC distribution by Country using EDW data  
(based on number of loans)

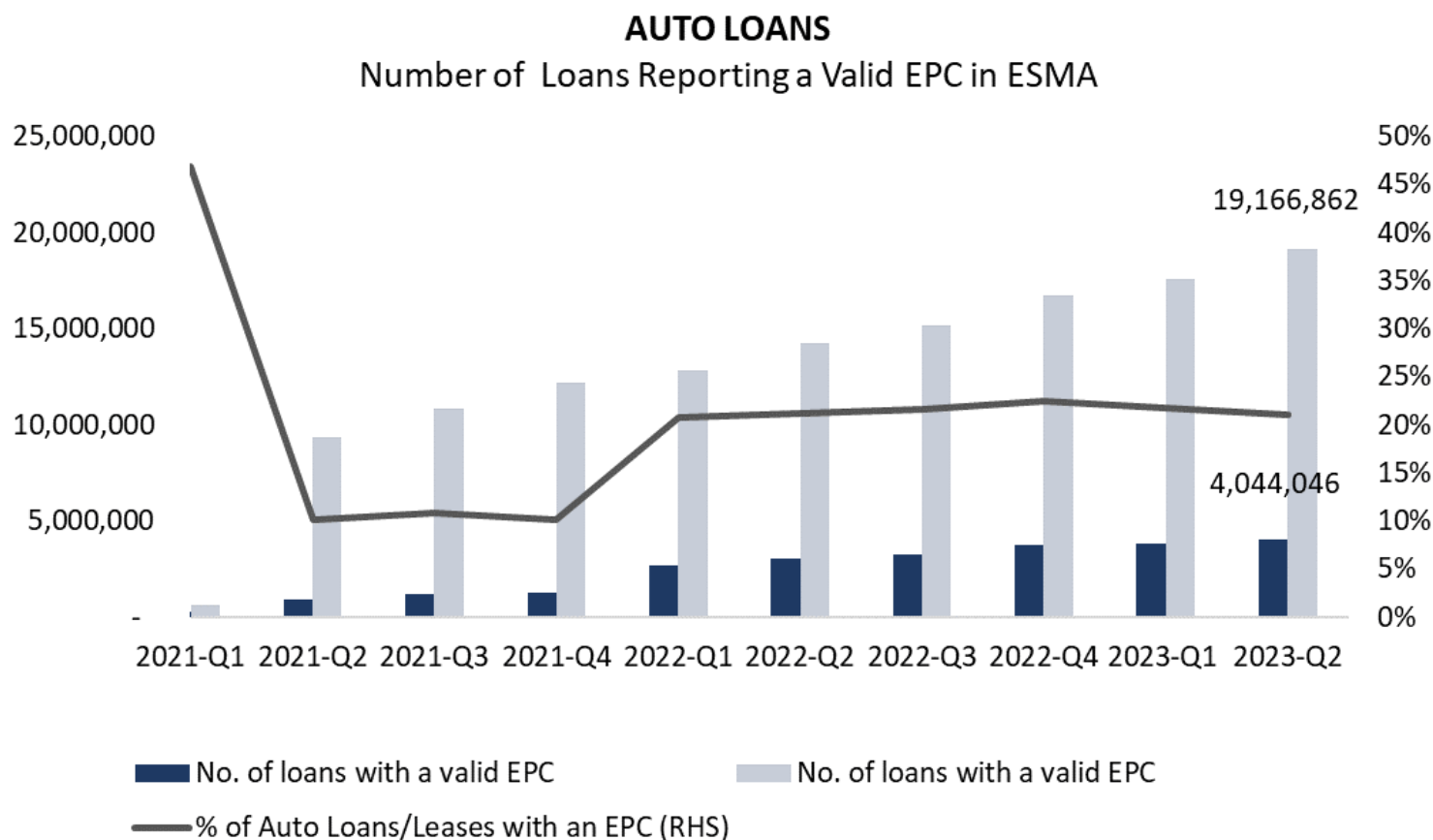


EPC thresholds by Country

kWh/m2/year	FR	DE	IE	IT	NL	PT	ES	UK
0-5								
5-10								
10-15		A+	A1			A+	A	A (<=32)
15-20				A4	A++			
20-25		A	A2			A	B	
25-30								
30-35								
35-40								
40-45								
45-50								
50-55		B	A3	A3	A+	B		B
55-60								
60-65		C		A2				
65-70			B1	A1	A (<=105)	B-	C (<=85.4)	
70-75								
75-80								
80-85								
85-90								
90-95								
95-100							D (<=111)	
100-110			B2 (<=125)	B	B (<=115)	C		
110-120		D			C		E	D (<=135)
120-130			B3	C				
130-140		E			D (<=145)			
140-150								
150-160			C1 (<=175)		E		F	E
160-170		F		D	F (<=175)			
170-180			C2					
180-190								
190-200								
200-210								
210-220		G	C3 (<=225)					
220-230				E		E		
230-240			D1					
240-250								
250-260			D2					
260-270								
270-280								
280-290								
290-300								
300-310								
310-320			E1					
320-330								
330-340								
340-350								
350-360								
360-370			E2					
370-380								
380-390								
400-425			F					
425-450								
>450	G		G					

# EPC DATA AVAILABILITY

## Auto loans

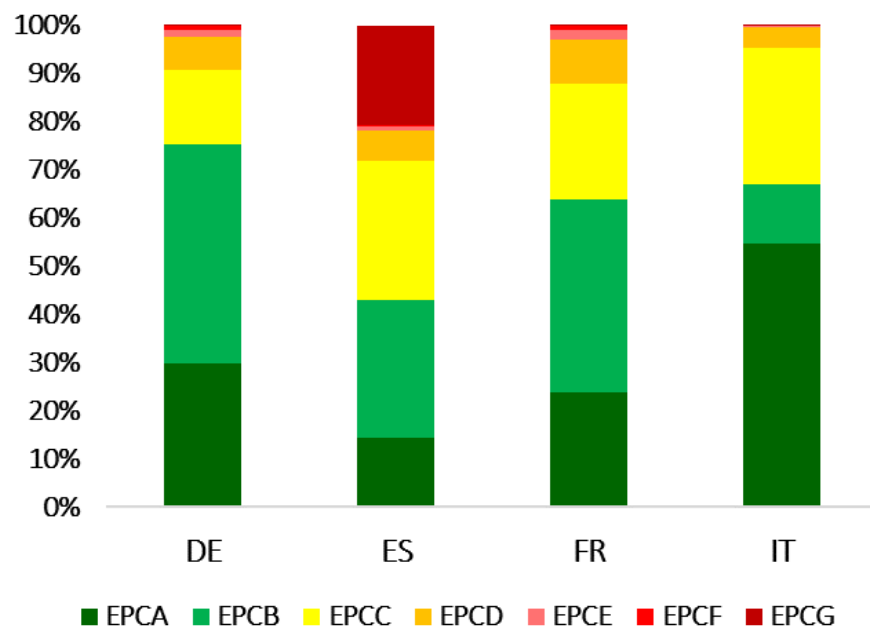




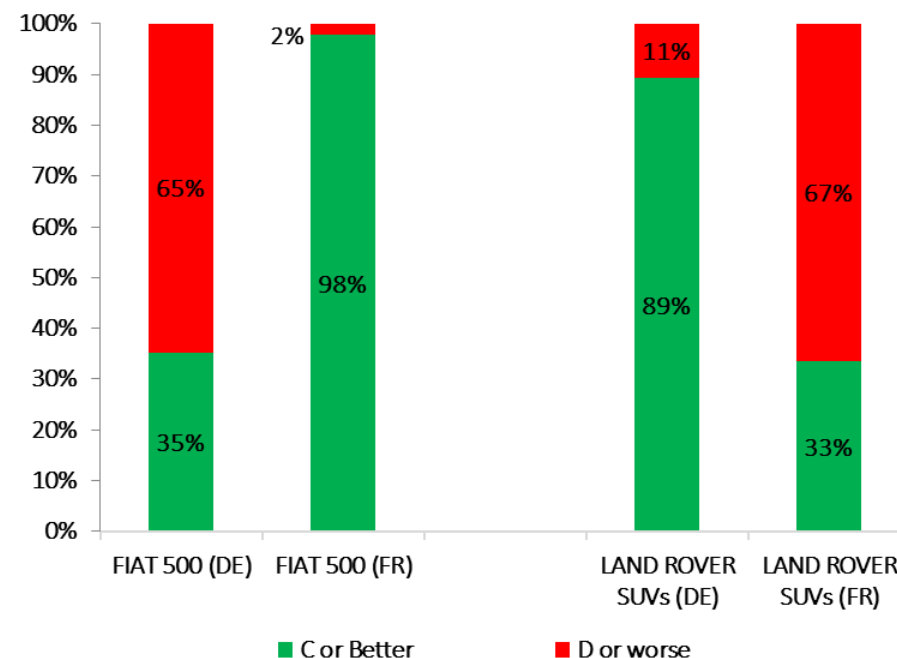
# EPC DATA AVAILABILITY

## Auto loans

EPC distribution by Country using EDW data  
(based on number of loans)



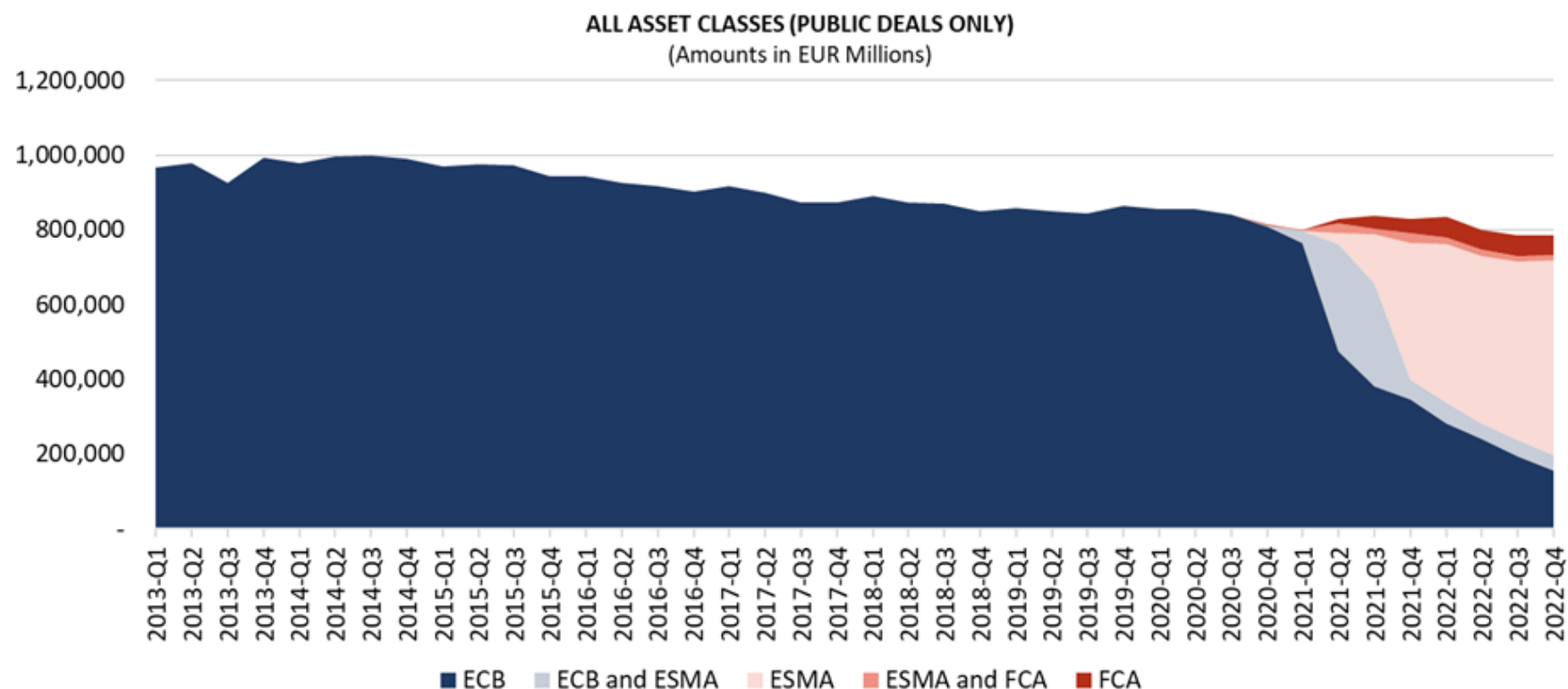
EPCs assigned to FIAT 500 and Land Rover SUVs -  
Germany vs France  
(Based on number of loans using EDW data)



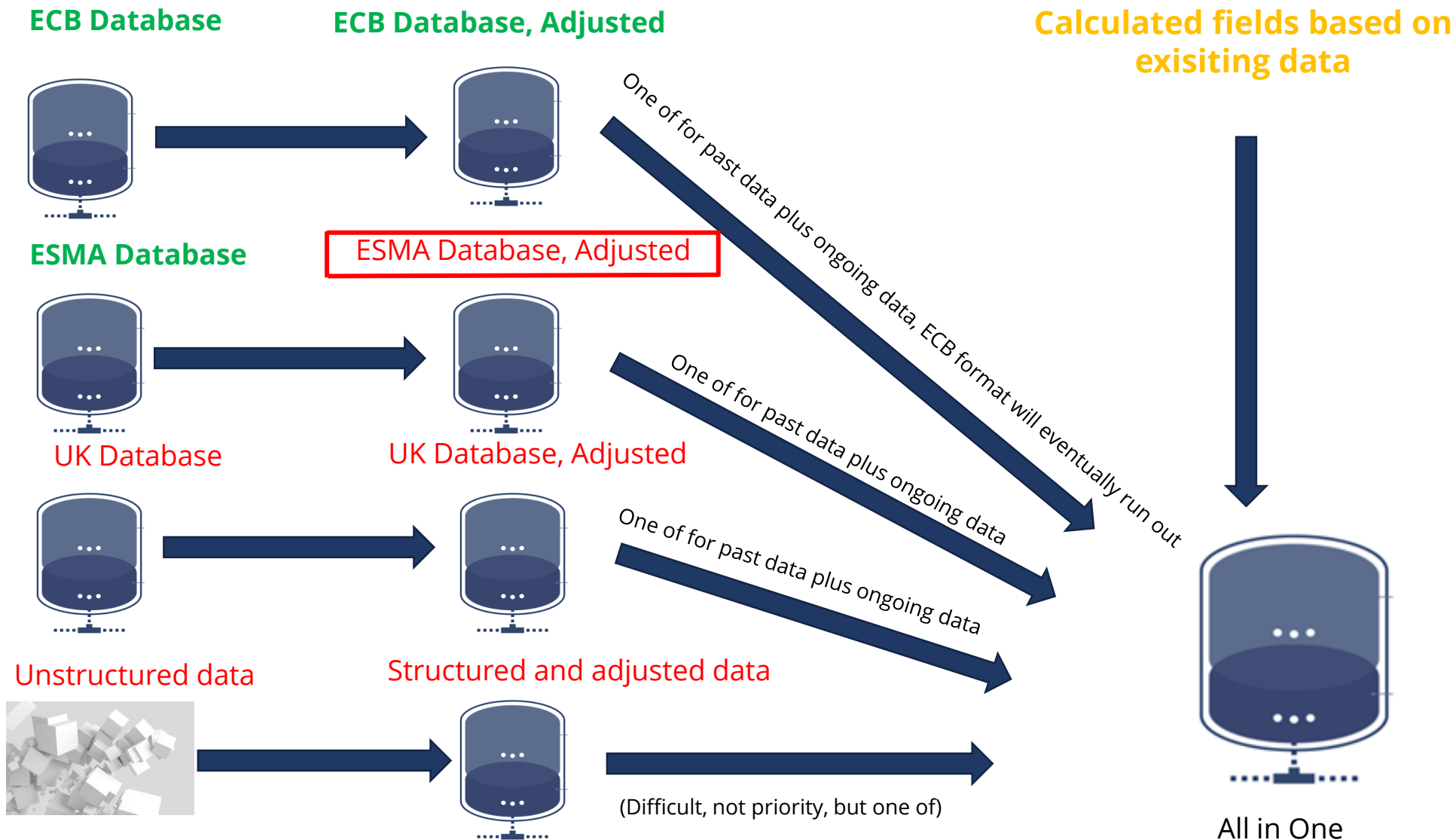
# **ALL IN 1 DATABASE**

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# ECB VS ESMA VS FCA DATA AVAILABILITY

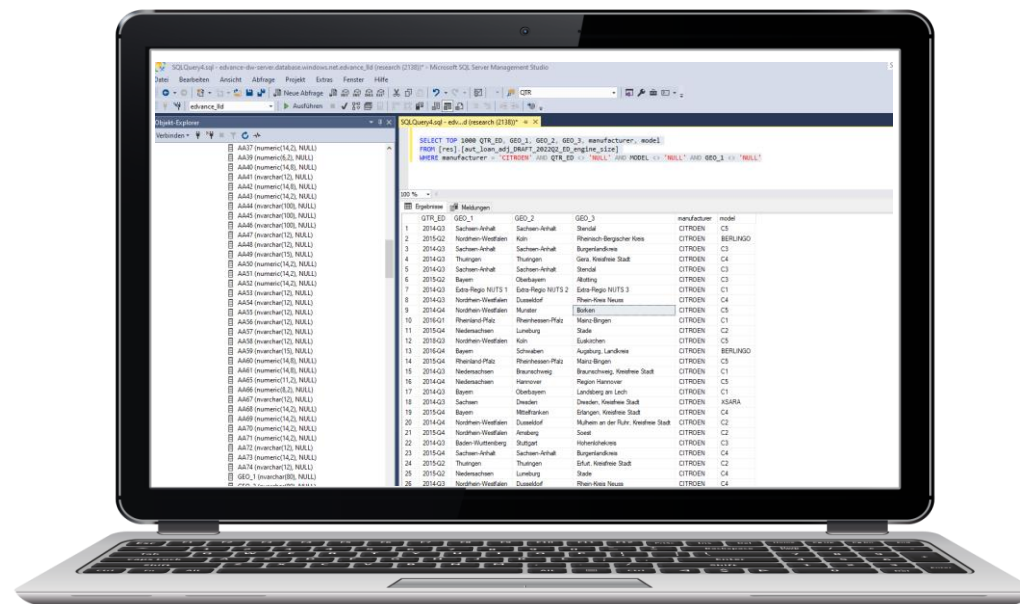
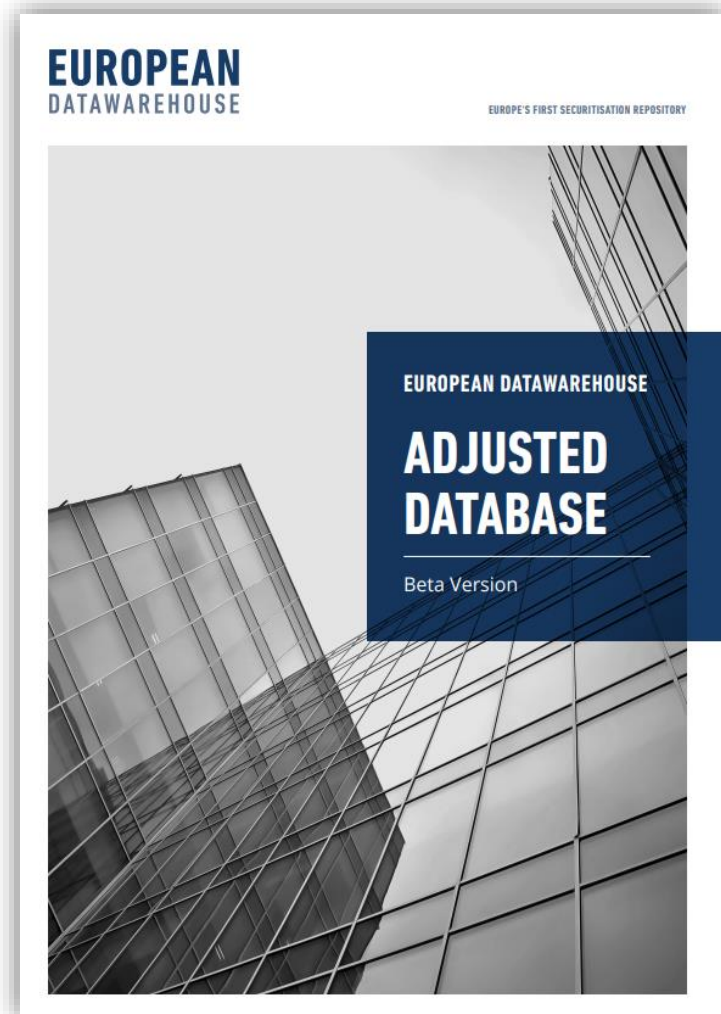


# 5 COMPONENTS



# ADJUSTED DATABASE REPORT

Soon available online (or ask sales team directly)



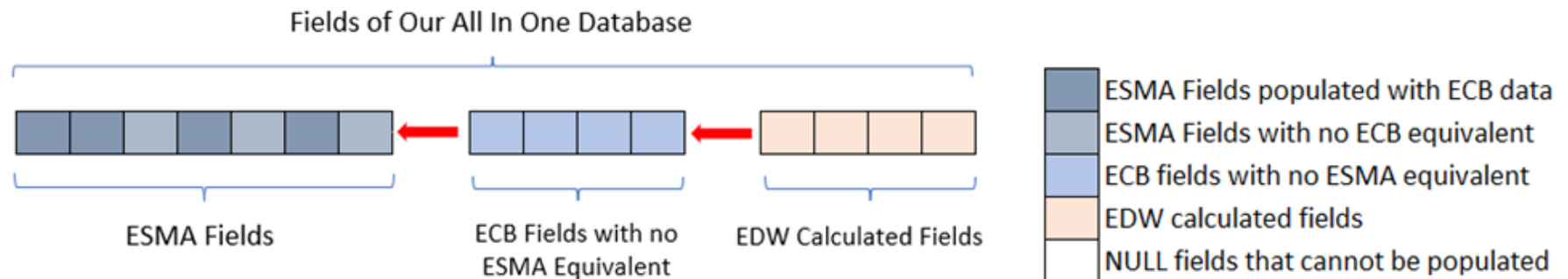
[https://eurodw.eu/research\\_articles/edw-adjusted-database-beta-report/](https://eurodw.eu/research_articles/edw-adjusted-database-beta-report/)

## LIST OF CALCULATED FIELDS AS OF SEPTEMBER 2023 IN ECB ADJUSTED DATABASE

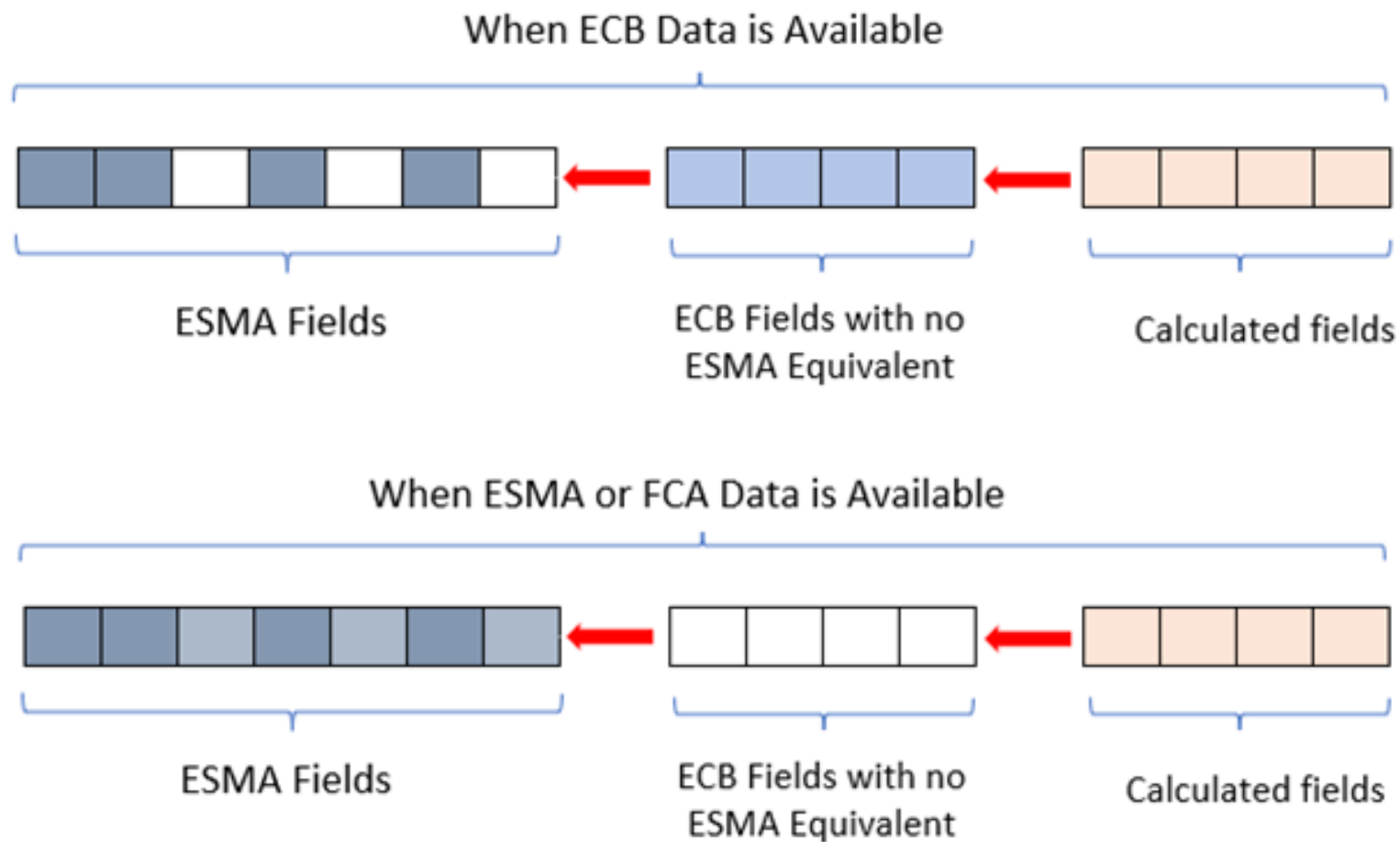
	AUTO	CONSUMER	CREDIT CARDS	LEASINGS	RMBS	SME
DATA_ORIGIN	yes	yes	yes	yes	yes	yes
EDCODE	yes	yes	yes	yes	yes	yes
PCD	yes	yes	yes	yes	yes	yes
GEO_1	yes	yes	yes	yes	yes	yes
GEO_2	yes	yes	yes	yes	yes	yes
GEO_3	yes	yes	yes	yes	yes	yes
QTR	yes	yes	yes	yes	yes	yes
COUNTRY	yes	yes	yes	yes	yes	yes
Manufacturer	yes	-	-	-	-	-
Model	yes	-	-	-	-	-
Fuel_Type	yes	-	-	-	-	-
Year_Registration	yes	-	-	-	-	-
Engine_size	yes	-	-	-	-	-
Vehicle_type	yes	-	-	-	-	-

# STRUCTURE

- To the ESMA fields, we add the ECB fields with no ESMA equivalent
- All the ESMA data can fit in
- All the legacy ECB data fits in

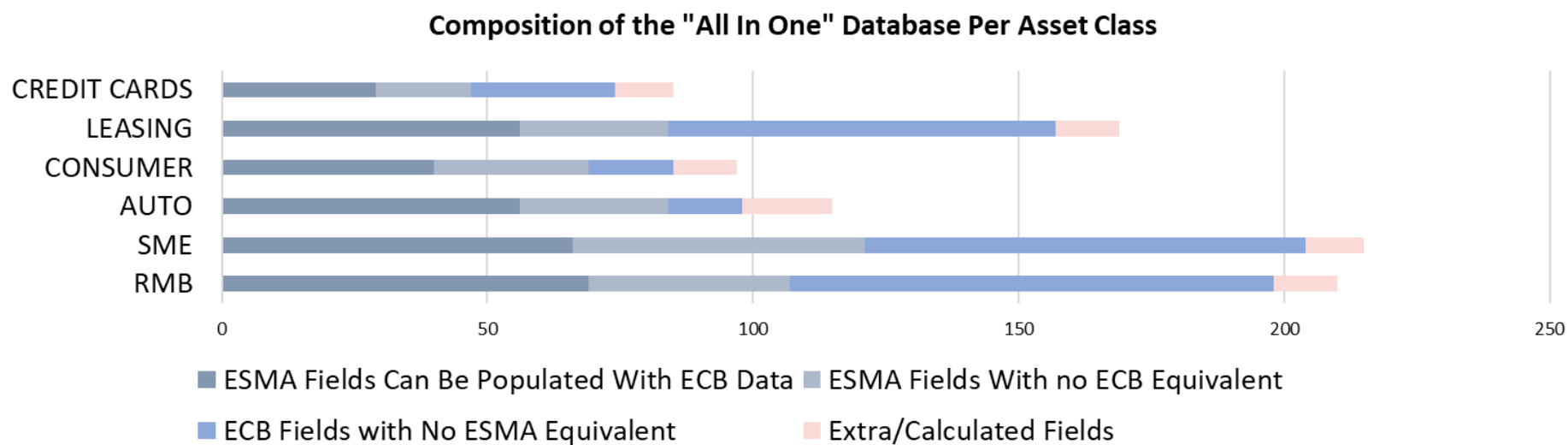


# POPULATING THE ALL IN ONE DATABASE



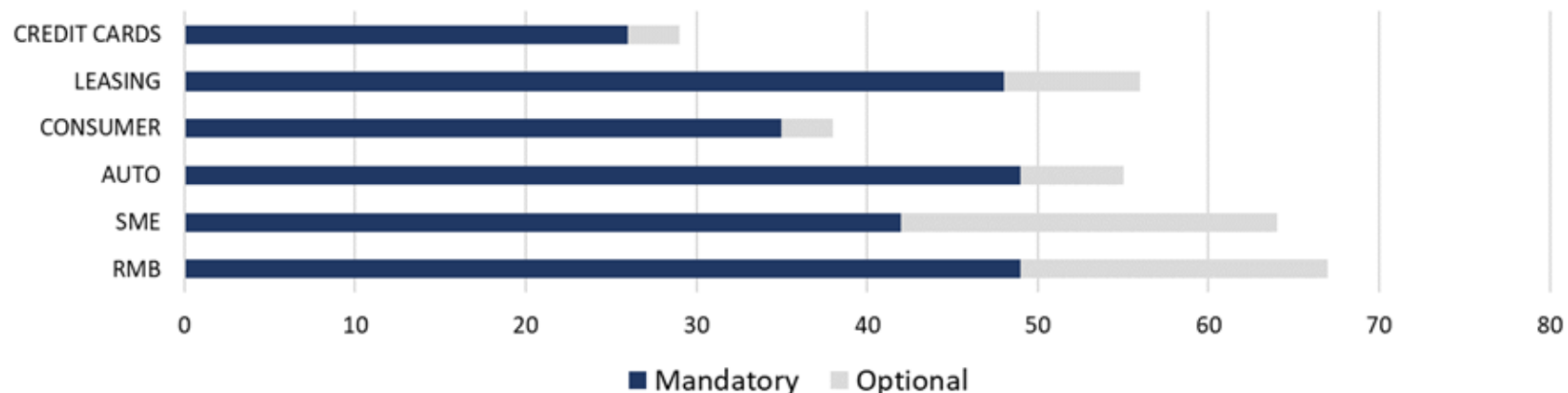


# COMPOSITION OF THE TABLES BY ASSET CLASS

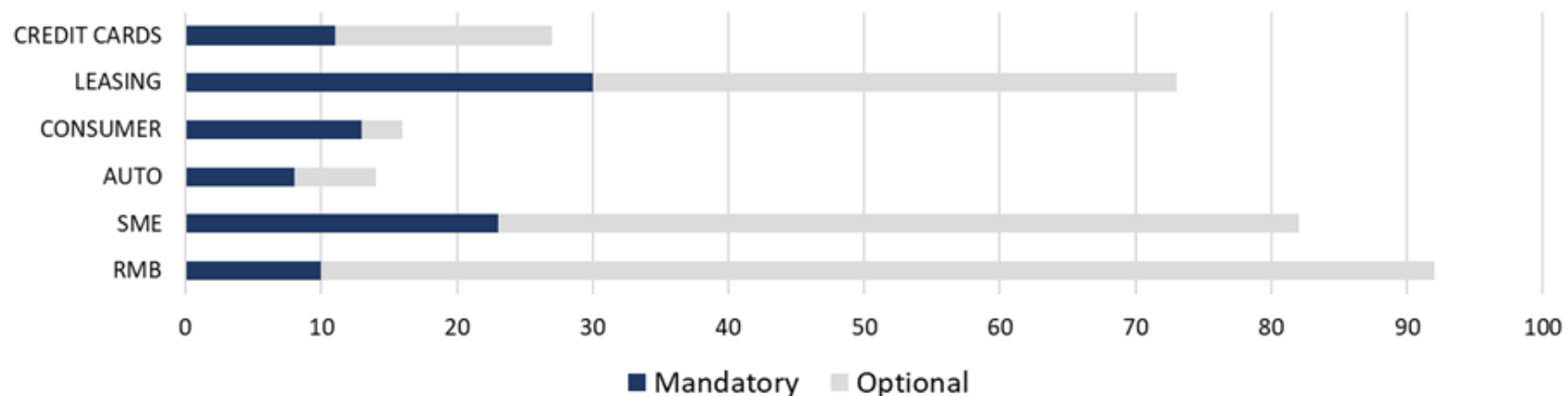


# DATA CONTINUITY MANDATORY VS OPTIONAL FIELDS





## ESMA Fields Populated With ECB Data Of which...



## ECB Fields With No ESMA Equivalent Of Which...



# ECB TO ESMA TRANSLATION

ECB		ESMA
Current Balance (AR67)		Current Principal Balance (RREL30)
Pool Cut-Off Date (AR1)		Data Cut-Off Date (RREL6)
Arrears Balance (AR169 - no amounts capitalised or fees...)		Arrears Balance (RREL67 - includes fees and amounts capitalised)
Origination Date (AR55 format YYYY-MM)		Origination Date (RREL23 - Day precision)












- Many fields fit “one to one” with a direct equivalent with same name and definition
- Some fields are defined somewhat differently but should generally be similar such as for the Arrears Balance which must include fees and capitalised amounts in ESMA...
- Dates in ECB often only had month precision, in ESMA day precision is required; we assume the 15th of the month

# ECB TO ESMA TRANSLATION

ECB			ESMA	
Origination Channel (AR58)			Origination Channel (RREL26)	
Office / branch network	1	➡	BRAN	Office or Branch Network
Central / Direct	2	➡	DRCT	Central or Direct
Broker	3	➡	BROK	Broker
Internet	4	➡	WEBI	Internet
Packager	5	➡	TPAC	Package
Third channel but underwriting processes performed 100% by the Originator	6	➡	TPTC	Third Party Channel but Underwriting Performed Entirely by the Originator

- Some ECB fields have the same name and the same options as their ESMA equivalent and can therefore be translated 1 to 1.
- Data from the field AR58 goes 1 to 1 in the corresponding options of field RREL26 of the “All in One Database”

# ECB TO ESMA TRANSLATION

ECB		ESMA	
Property type (AR131)			Poroperty type (RREC9)
Residential (House, detached or semi-detached)	1		RHOS Residential (House, detached or semi-d.)
Residential (Flat/Apartment)	2		RFLT Residential (Flat/Apartment)
Residential (Bungalow)	3		RBGL Residential (Bungalow)
Residential (Terraced House)	4		RTHS Residential (Terraced House)
Multifamily house (...) with recourse to the borrower	5		MFHS <b>Multifamilly House</b>
Multifamily house (...) without recourse to the borrower	6		MFHS <b>Multifamilly House</b>
Partially commercial use	7		PCMM Partial commercial use
Commercial/business use with recourse to the borrower	8		BIZZ <b>Commercial or business use</b>
Commercial/business use without recourse to the borrower	9		BIZZ <b>Commercial or business use</b>
Land only	10		LAND Land Only
Other	11		OTHR Other

- In this case, there is a loss of detail when switching from ECB to ESMA.
- The lost information is normally now stored in the new ESMA field "Recourse" (RREL76)

# **LOAN PERFORMANCE UPDATE**

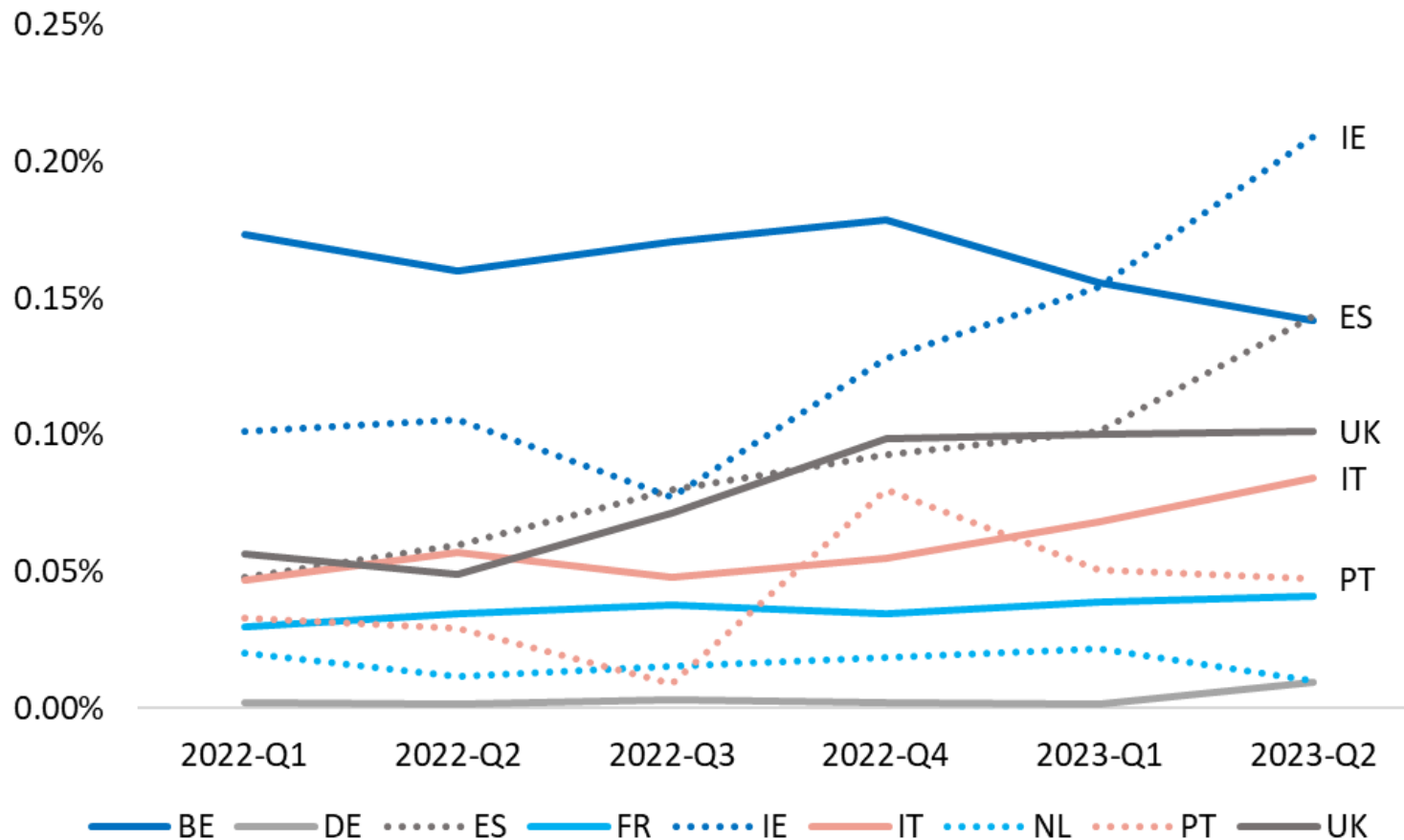
## **(2023-Q2 UPDATE)**

**USMAN JAMIL, EUROPEAN DATAWAREHOUSE**

# RMBS

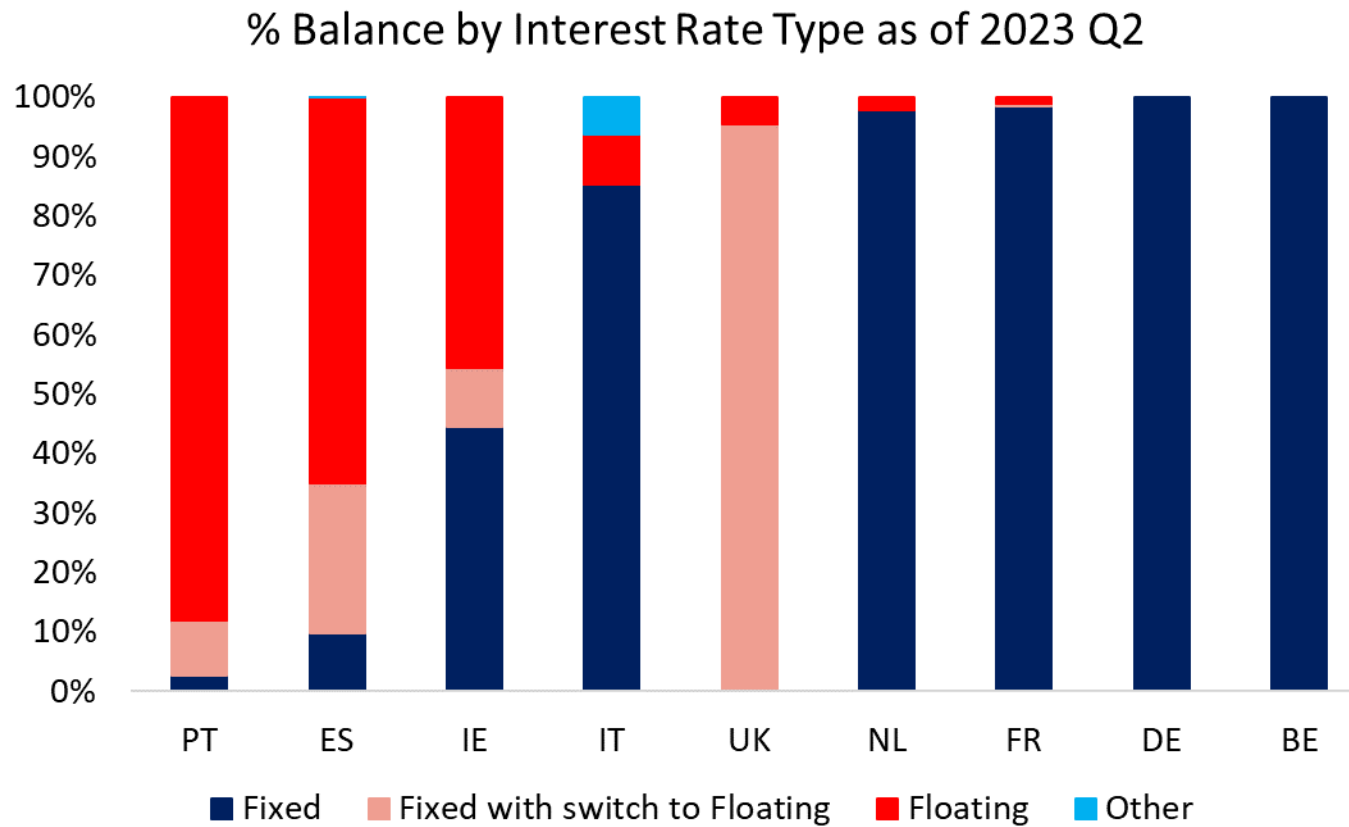
Delinquencies have gone up slightly in some countries

## 60 - 90 Days Delinquencies (% of Current Balance)



# RMBS

Floating Rate Mortgages are the norm for some countries while Fixed Rates for others



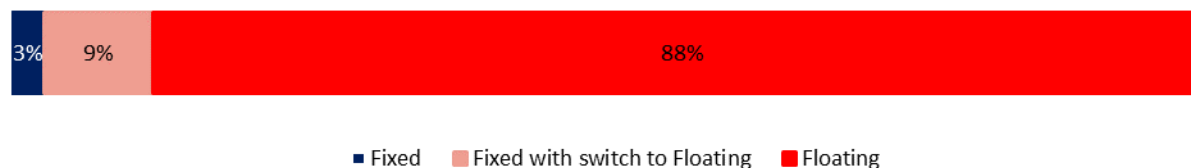
Are Floating Rate Mortgages driving Delinquencies??



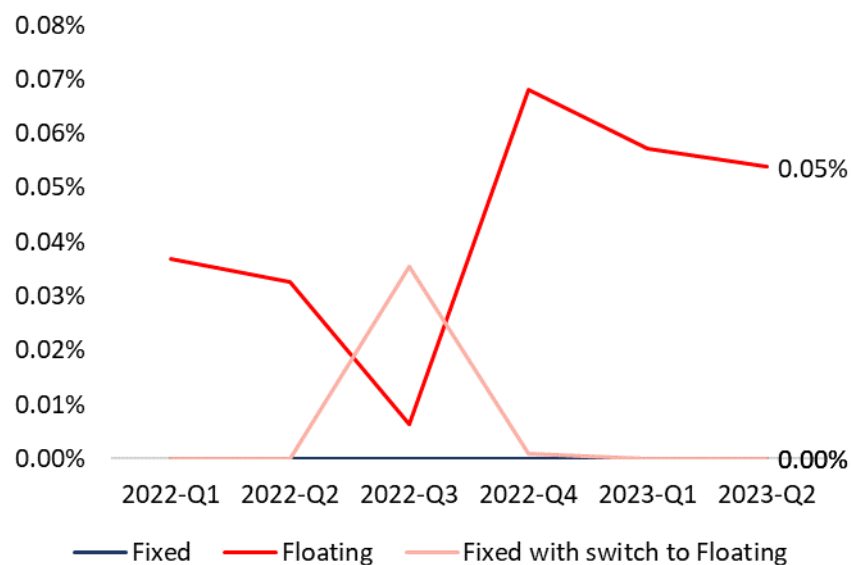
# RMBS

## Portugal

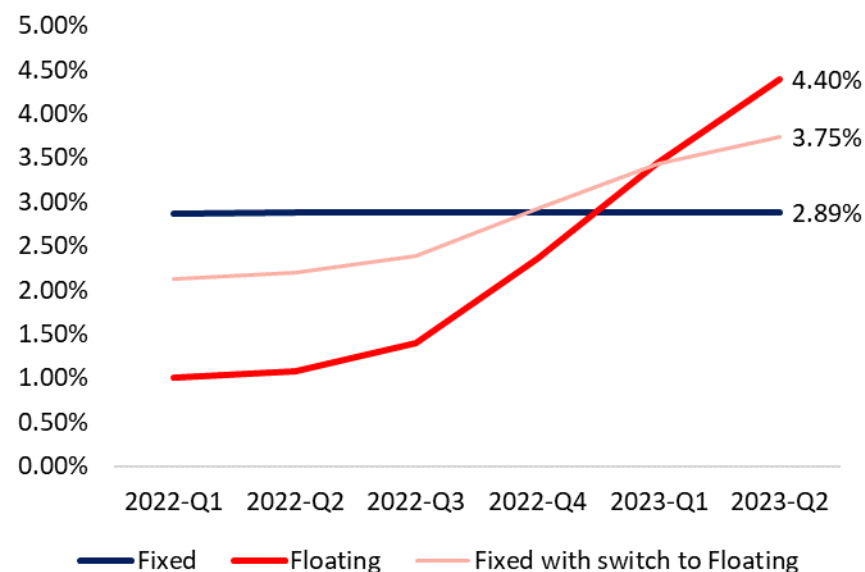
% Balance by Interest Rate Type as of 2023 Q2



60 - 90 Days Delinquencies by Interest Rate Type  
(% of Current Balance)



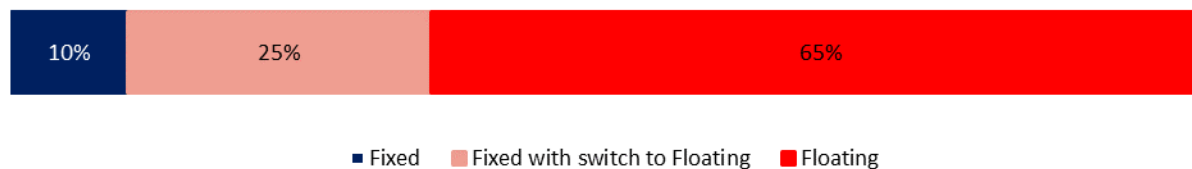
Average Interest Rate by Interest Rate Type  
(weighted by Current Balance)



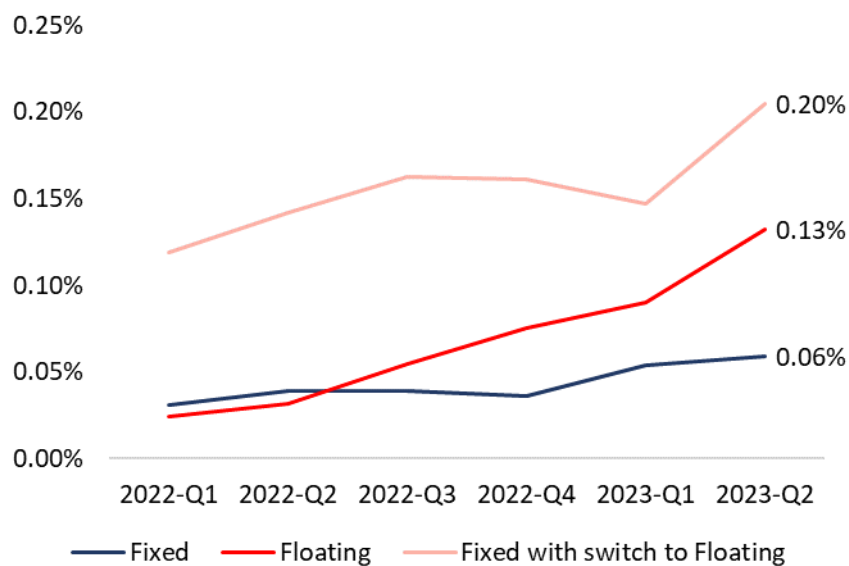
# RMBS

## Spain

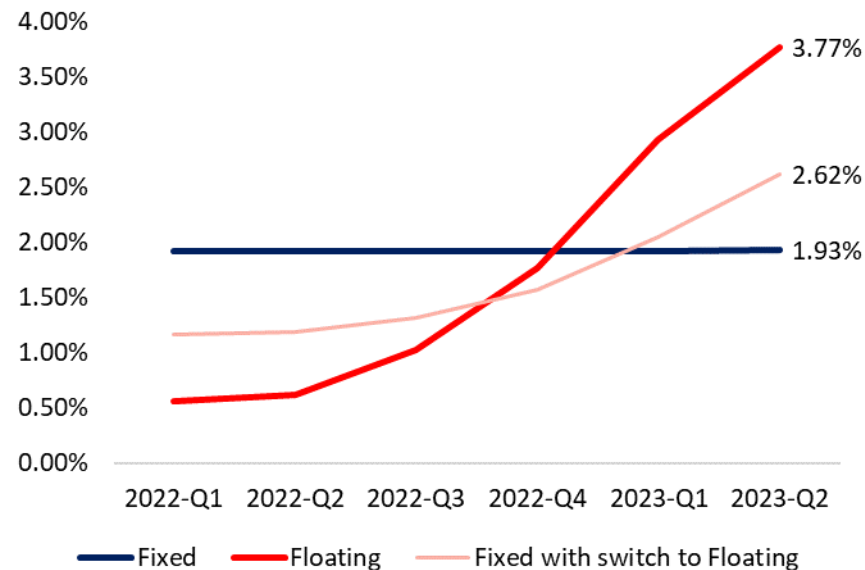
% Balance by Interest Rate Type as of 2023 Q2



60 - 90 Days Delinquencies by Interest Rate Type  
(% of Current Balance)



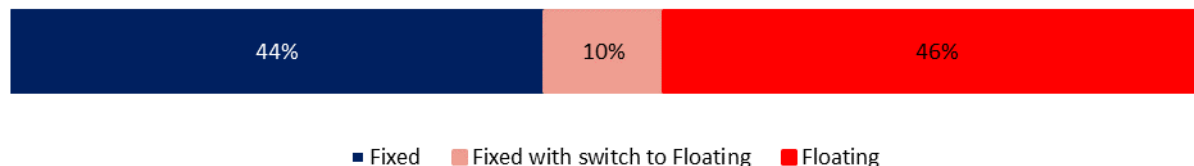
Average Interest Rate by Interest Rate Type  
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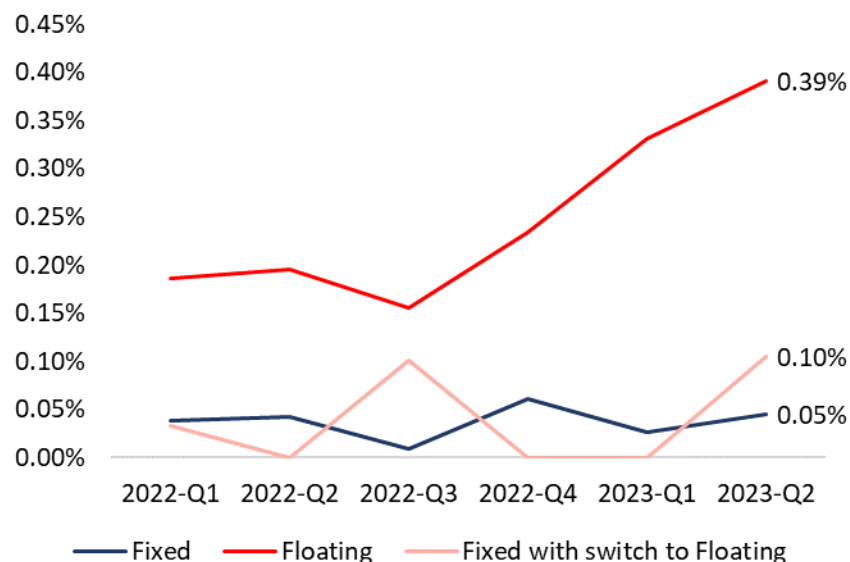
# RMBS

## Ireland

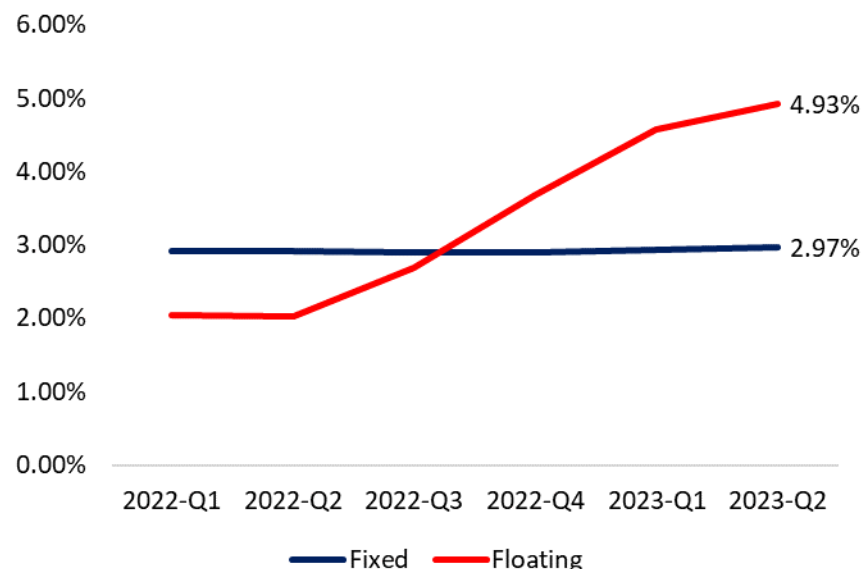
% Balance by Interest Rate Type as of 2023 Q2



60 - 90 Days Delinquencies by Interest Rate Type  
(% of Current Balance)



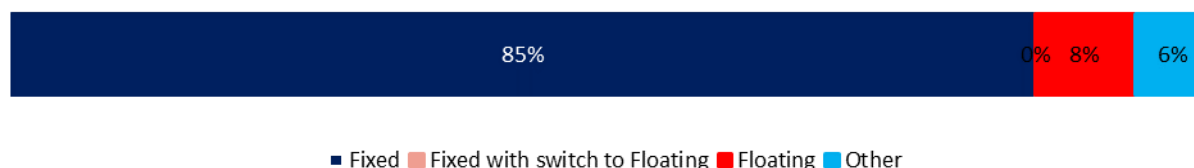
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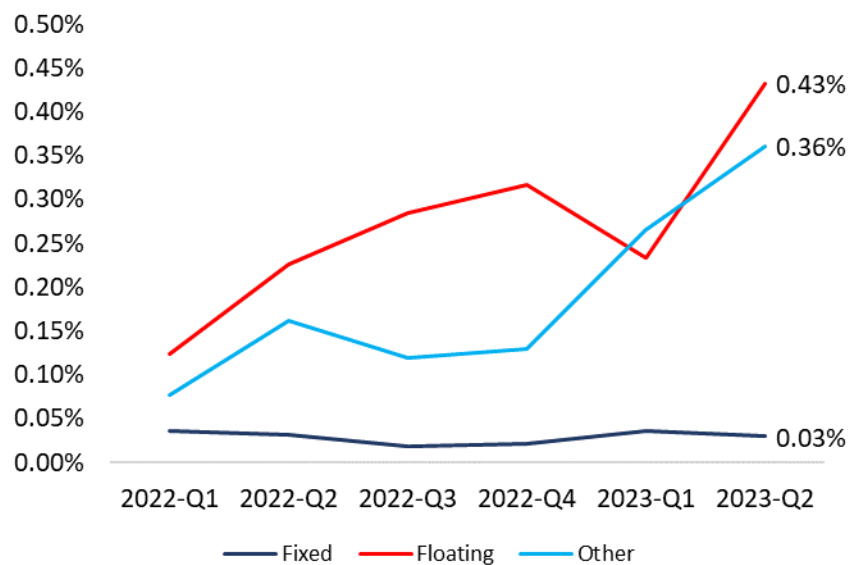
# RMBS

## Italy

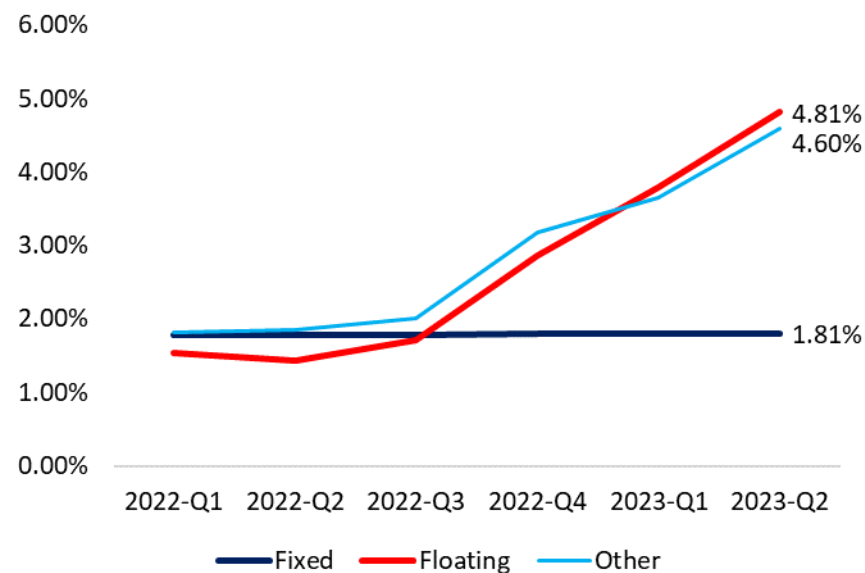
% Balance by Interest Rate Type as of 2023 Q2



60 - 90 Days Delinquencies by Interest Rate Type  
(% of Current Balance)



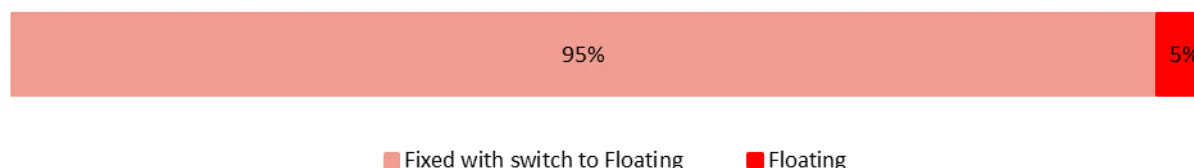
Average Interest Rate by Interest Rate Type  
(weighted by Current Balance)



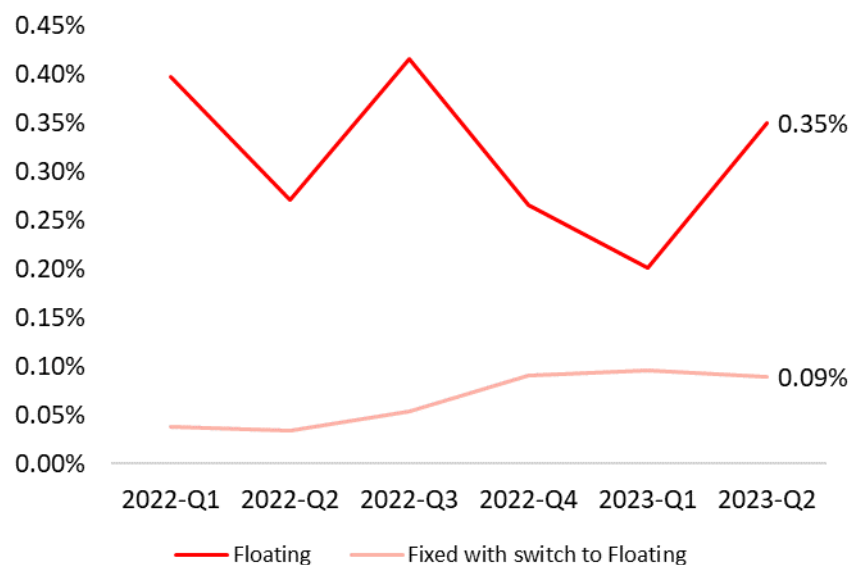
# RMBS

## UK

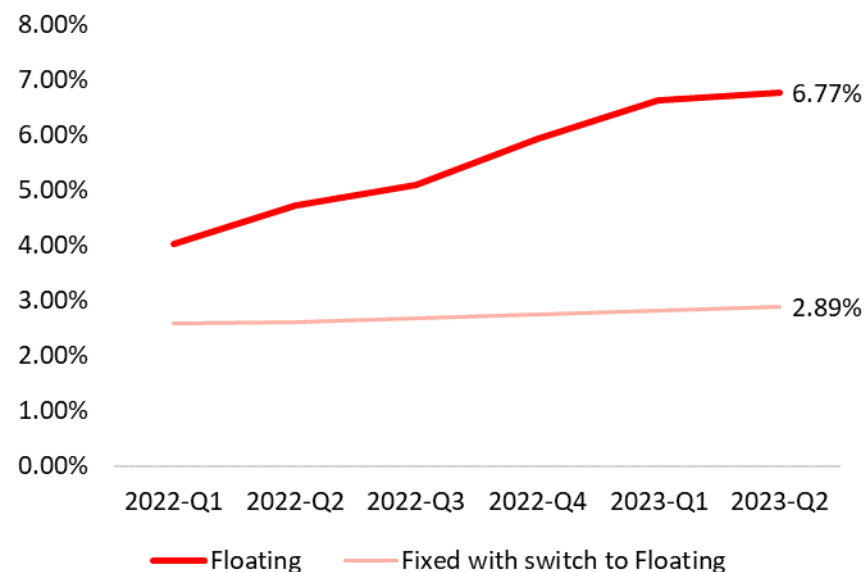
% Balance by Interest Rate Type as of 2023 Q2



60 - 90 Days Delinquencies by Interest Rate Type  
(% of Current Balance)

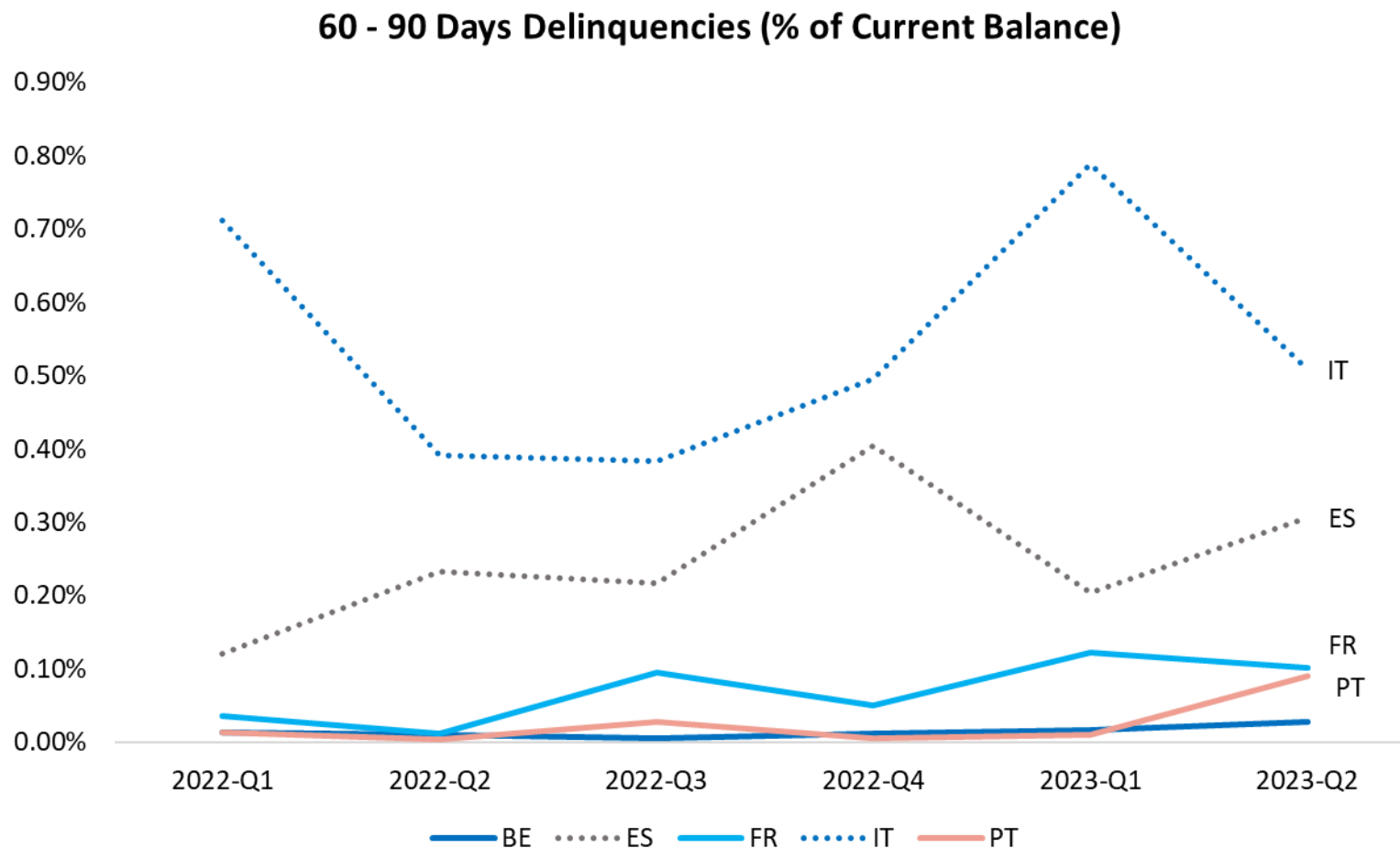


Average Interest Rate by Interest Rate Type  
(weighted by Current Balance)



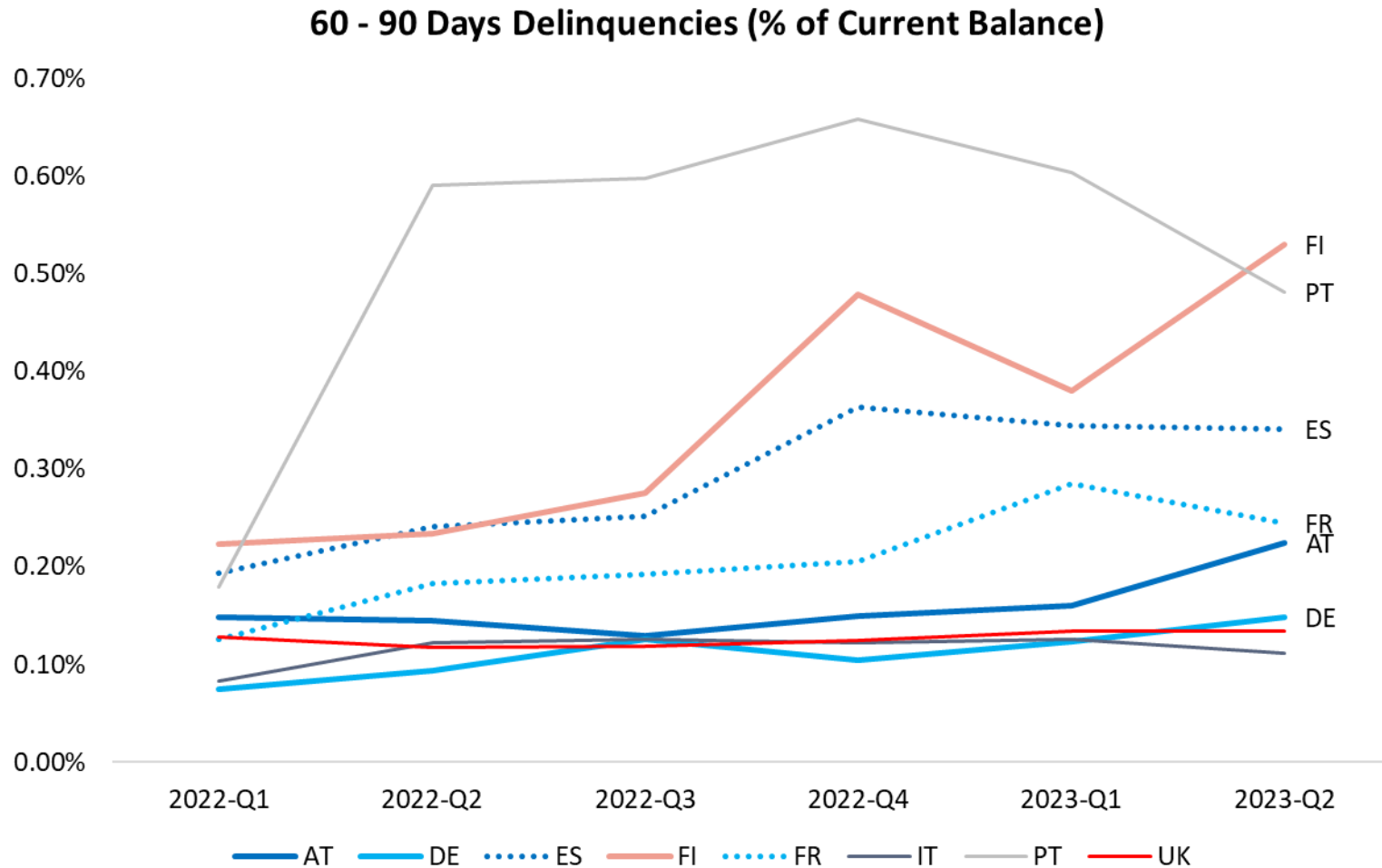
# SME

Slightly elevated delinquency levels for Spain and Italy



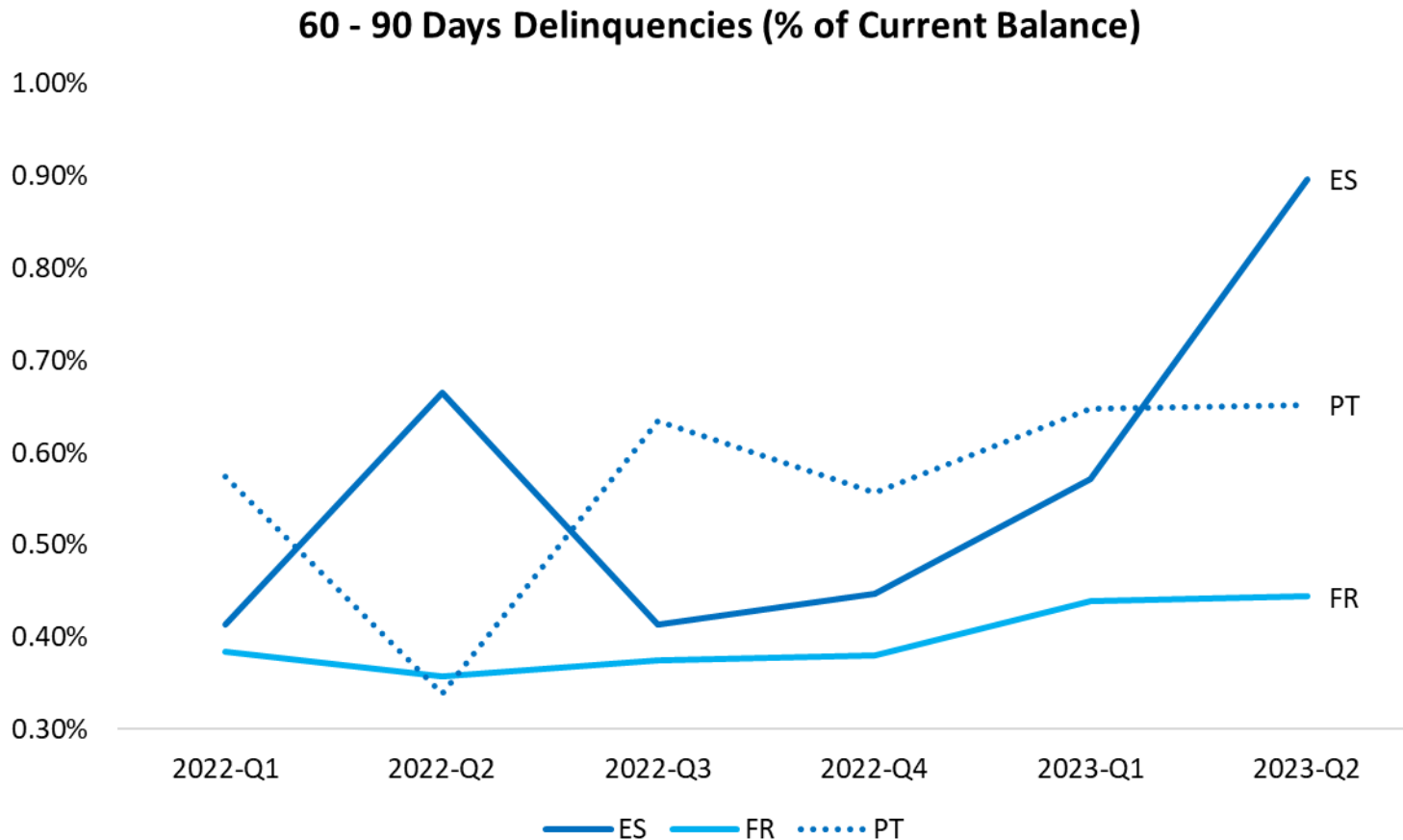
# AUTO

Delinquency levels are on the up in most countries



# CREDIT CARDS

Delinquency levels are rising a little



can be seen as a first sign for distress!!



# Complexity and the default risk of mortgage-backed securities

*The Journal of Banking and Finance, Volume 155, October 2023.*

*View Article* 

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*Alfonso Dufour<sup>a</sup>*

*Simone Varotto<sup>a</sup>*

<sup>a</sup>**ICMA Centre, Henley Business School, University of Reading**

<sup>b</sup>University Ca' Foscari Venezia

European DataWarehouse - Q3 Research Update Webinar

In this study, we examine the effects of the 2018 European securitisation regulation on mortgage quality and securitisation structures.

- Mortgages issued after the new regulation exhibit improved credit quality, resulting in reduced annual delinquency rates.
- Mortgage securitisations meeting the new 'simplicity, transparency, and standardisation' (STS) criteria show 0.77% lower annual delinquency rates and greater resilience to economic shocks.
- STS securitisations typically have fewer tranches with a smaller allocation to subordinated tranches than their non-STS counterparts.
- The improved quality of underlying loans outweighs potential negative effects of thinner subordinated tranches in compliant securitisations. This is reflected in higher ratings at origination.

The securitisation process was blamed for the detrimental role it played during the 2008 financial crisis (*Shin, 2009*).

- The ABS market was so **complex**, that even rating agencies **failed to accurately portray default risk** before the global financial crisis (*DeHaan, 2017*).
- The increasing **demand for high rated securities**, matched with the possibility to **transfer risk** to outside inventors, led banks to **lax their lending standards** (*Coval, Jurek & Stafford, 2009*).
- Banks active in securitisation tended to **take substantially more risk** than non-securitising ones (*Keys et al., 2009*).
- Banks active in securitisation were **less involved in the ex-post monitoring** of the loans (*Wang & Xia, 2014*).

# The Securitisation Process

**Placed vs Retained Asset-Backed Securities over the total amount of issued ABSs in Europe.**



Following its announcement in 2017, the new ABS regulation (*Regulation (EU) 2017/2402*) entered into force in 2018, significantly reforming the EU ABS market.

It promotes the harmonisation of the securitisation market through numerous provisions, which can be grouped in:

- General Provisions (Articles 1-17)
- Provisions for Simple, Transparent and Standardised Securitisation (Articles 18-28)

## Simple, Transparent & Standardised Securitisation (STS) (Articles 18-28)

- Unlike the general provisions, the STS regime is optional.
- There are now two different classes of EU securitisation: STS and non-STS, differentiated on the basis of whether they meet the STS criteria or not.
- The criteria relate to simplicity, transparency and standardisation of the ABS deals rather than to the quality of the underlying assets involved.

There should be no implication that STS deals are safer, but rather that a prudent and diligent investor will be able to better analyse the risk involved.

The effects of this newly introduced securitisation type on the quality of the securitised loans are uncertain:

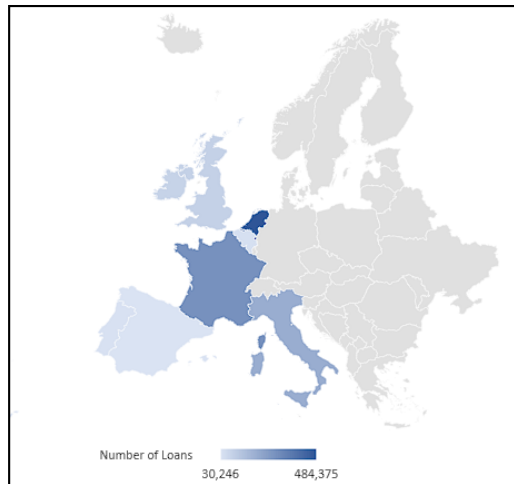
- On the one hand, higher simplicity, transparency and standardisation are likely to positively affect assets performance (e.g., *Ertan et al., 2017*).
- On the other hand, STS labels may have distorting effects on banks' behaviour (*McGowan and Nguyen, 2020*). STS labels may create a false sense of security on investors who may be prepared to fund riskier loans without requiring an adequate rate of return.

We retrieve our data from the **European DataWarehouse**, the designated depository in Europe for collecting and validating loan-level data for asset-backed securities.

- For each loan, more than 150 variables can be reported by the originators, 55 of which are mandatory.
- Our sample consists of 8,961,130 annual observations, reported from 2013 to 2020. These correspond to 3,997,044 loans that have been securitised within Residential Mortgage-Backed Securities (RMBS).
- The EDW also provides information on the tranching composition, which is subsequently linked to tranche-level characteristics sourced from Refinitiv Eikon to access additional data when available. Our final tranche-level dataset includes 782 observations.



Focusing on the post-regulation period, the sample includes 1,256,011 loans securitised in RMBS deals from 2018 to 2020.



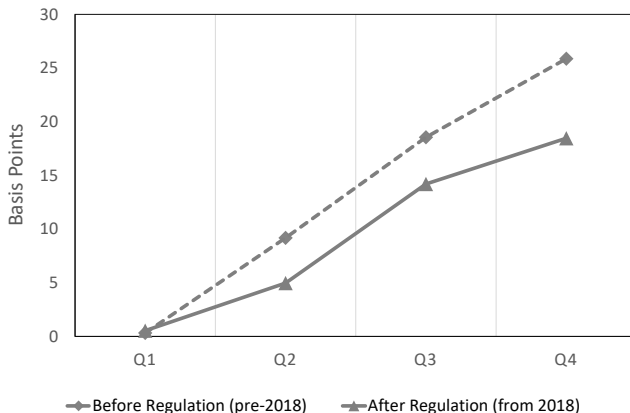
Around 40% of the loans are securitised in deals defined as STS according to the ESMA STS register.

- We analyse loan delinquencies through a panel-probit model.
- The variable *Loan Delinquency* takes the value of one each time a loan is in arrears for at least two consecutive quarters.

$$\begin{aligned} \text{Loan delinquency}_{i,t} = & \alpha + \beta_1 \text{Origin. from 2018}_i + \beta_2 \text{Int. Rate}_i + \beta_3 \text{Years to Mat.}_{i,t} \\ & + \gamma \text{Loan characteristics}_i + \delta \text{Borrower's characteristics}_i \\ & + \theta \text{Macro-variables}_{i,t-1} + \text{ABS deal FE} + \text{Year FE} + \varepsilon_{i,t} \end{aligned}$$

$$\begin{aligned} \text{Loan delinquency}_{i,t} = & \alpha + \beta_1 \text{STS Securitisation}_i + \beta_2 \text{Int. Rate}_i + \beta_3 \text{Years to Mat.}_{i,t} \\ & + \gamma \text{Loan characteristics}_i + \delta \text{Borrower's characteristics}_i \\ & + \theta \text{Macro-variables}_{i,t-1} + \text{ABS deal FE} + \text{Year FE} + \varepsilon_{i,t} \end{aligned}$$

**Cumulative delinquency rates of residential mortgages, before the COVID-19 pandemic.**

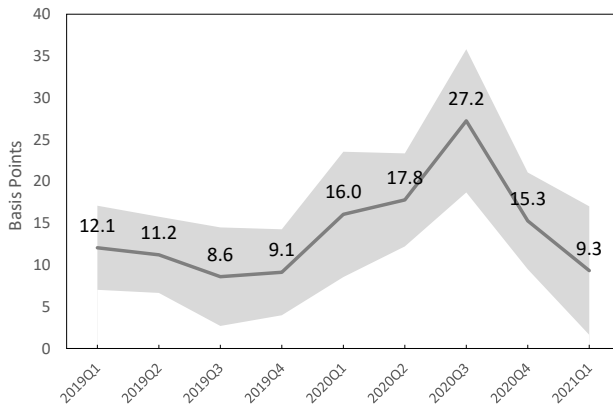


Our model also confirms that loans originated from 2018 show an average lower annual PD of 33.6 bp after controlling for loan/borrower characteristics and macroeconomic variables.

# The effects of the COVID-19 pandemic

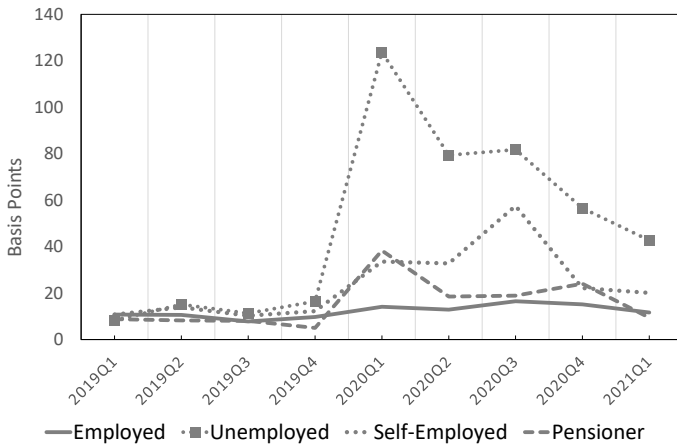
The COVID-19 pandemic provides a unique opportunity to analyse the difference in performance between loans securitised in STS deals and non-STS deals during adverse economic conditions.

**Fixed effect marginal coefficients of the probit regression model and their 95% confidence intervals.**



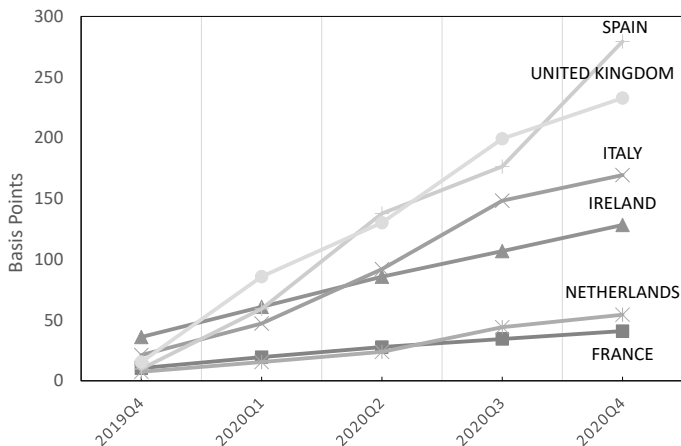
# The effects of the COVID-19 pandemic

## Quarterly delinquency rate by employment status.

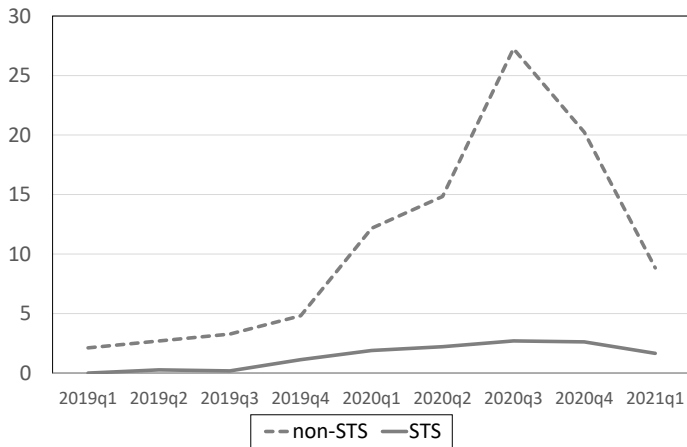


# The effects of the COVID-19 pandemic

**Cumulative delinquency rate by country of origination relative to the total number of active loans in 2019q4.**



## Quarterly delinquency rate for STS and non-STS securitisation.



**The effect of the STS regulation on mortgage delinquency rates.**

Dependent Variable: Loan delinquency		
Variable	Basis Points (bp)	
	2018 to 2019	2018 to 2020
<i>STS Securitisation</i>	-43.43*** (9.66)	-79.67*** (20.31)
<i>Loan characteristics</i>	yes	yes
<i>Borrower characteristics</i>	yes	yes
<i>Macro-Variables</i>	yes	yes
<i>Country fixed effects</i>	yes	yes
<i>Time Fixed Effects</i>	yes	yes
Observations	1,024,924	2,147,141
Pseudo R-squared	0.065	0.107



## The effect of the STS regulation on mortgage delinquency during the pandemic.

Dependent Variable: Loan Delinquency		
Variables	Marginal Effect (bp)	
	(1)	(2)
<i>STS Securitisation</i>	-74.35*** (20.92)	-25.37*** (8.37)
<i>Pandemic Period</i>	46.00*** (13.20)	44.99*** (12.74)
<i>STS Securitisation * Pandemic Period</i>		-84.60*** (22.64)
<i>Loan characteristics</i>	yes	yes
<i>Borrower characteristics</i>	yes	yes
<i>Macro-Variables</i>	yes	yes
<i>Country fixed effects</i>	yes	yes
Observations	2,147,141	2,147,141
Pseudo R-squared	0.099	0.102

We now focus on our tranche-level dataset to investigate the effects of the STS regulation on the securitisation structure of residential mortgage-backed securitisations.

Variable description	Non-STS	STS	Difference (2) – (1)	p-value
	Mean (1)	Mean (2)		
number of tranches	5.07	3.82	-1.25	0.011**
senior tranches (%)	86.7	90.4	3.7	0.021**
mezzanine tranches (%)	1.1	1.5	0.4	0.461
subordinated tranches (%)	12	8.1	-3.9	0.027**
- of which retained tranches (%)	5.3	4.7	-0.6	0.595
average tranche rating* per securitisation	25.6	26.5	0.84	0.002***

\* This is the variable *Rating equivalent* from Eikon, which ranges from 1 to 27, with 27 corresponding to AAA.

## Simple, Transparent and Standardised securitisation

- The default risk can more easily affect senior tranche holders, given the thinner subordinated tranches and fewer tranches available to absorb losses.
- We perform a stress-testing exercise to evaluate the expected losses for RMBS originators and tranche holders under various scenarios.
- The default rate for each scenario is derived from the distribution of loan default rates within our sample of securitisations.

LGD=100%			Exp. loss to investors			Exp. loss to originator
			Tranches			
Parameter	Securitisation	Def. Rate %	Senior	Mezz.	Subordinated	Retained
Average	Non-STs	1.49%	0.0%	0.0%	0.0%	28.1%
	STS	0.29%	0.0%	0.0%	0.0%	6.2%
90% qnt	Non-STs	3.94%	0.0%	0.0%	0.0%	74.2%
	STS	0.65%	0.0%	0.0%	0.0%	13.8%
95% qnt	Non-STs	5.42%	0.0%	0.0%	1.7%	100.0%
	STS	0.79%	0.0%	0.0%	0.0%	16.9%
99% qnt	Non-STs	17.45%	5.0%	100.0%	100.0%	100.0%
	STS	1.14%	0.0%	0.0%	0.0%	24.2%

- To supplement our findings, we utilise a simple ordinal logistic model to estimate the likelihood of tranches being rated AAA – A3, BAA1 – BAA3, or BA1 – C (i.e., speculative).

Marginal Effect			
Rating band	AAA - A3	BAA1 - BAA3	BA1 - C ( <i>speculative</i> )
<b>STS</b>	0.038** (0.016)	-0.012** (0.006)	-0.026** (0.013)
<i>Obs.</i>		163	
<i>Pseudo-R<sup>2</sup></i>		0.075	

In this study, we explore the role of lower ABS deal complexity during periods of macro-economic uncertainty. To do so, we analyse the effects of the new European ABS regulation, which entered into force in 2018

- Our study demonstrates that the general provisions of the regulation have led to an improvement in mortgage quality and a reduction in mortgages with “risky characteristics”.
- Our findings indicate that less complex ABS deals outperformed their non-STS counterparts during the Covid-19 pandemic.
- Our research provides evidence that the enhanced loan quality in STS deals outweighs the potential effects on securitisation structure, resulting in significantly higher tranche ratings at origination.

Thank you

Samuele Segato  
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- Main results with quarterly data.
- STS results on a sample of originators issuing both STS and non-STS securitisations.
- Sample restriction to the first two years after loan origination.
- Sample restriction to the first two observations per loan.
- Exclusion of loans securitised from 2017.
- Exclusion of loans originated before 2010.
- Exclusion of loans originated before 2013.
- Inclusion of country-specific lagged GDP.
- Inclusion of lagged 3-month Euribor index.
- Inclusion of measure of country-specific government intervention during Covid pandemic (ESI Index).
- Inclusion of lagged standard deviation of 3-month Euribor index.

# Asymmetric information in loan contracts: New evidence from Italian big data

Francesco Benvenuti

Department of Economics and Business Economics and CREATES  
Aarhus University

Joint work with: Monica Billio, Michele Costola, Marco LiCalzi  
(Ca' Foscari University)

European DataWarehouse Research Webinar

26 September 2023



# The Problem

- Consider the Loan to Value (LTV) of a loan:

$$\text{LTV} = \frac{\text{Loan Amount}}{\text{Collateral Value}}.$$

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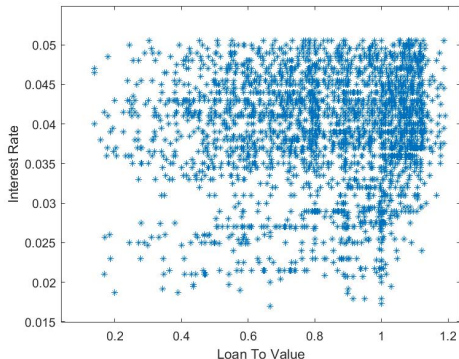
## Research question

Is a higher LTV associated to a higher interest rate in loan contracts?

- The answer to this question is not straightforward.
- It is an open problem in the economic literature, because **asymmetric information** influences this relation and can alter the intuitive reasoning.
- Indeed, this problem is related to the asymmetries which characterize a contract (asymmetric information).
- For instance, the bank is not informed on some features of the borrower.

# Loan to Value and interest rate

- In the plot below, there is not a clear trend between the Original LTV and the interest rate margin.



**Figure 1:** Cartesian plot of the Original LTV (x-axis) and interest rate margin (y-axis), from Italian loan data available on European DataWarehouse.

- Literature review.
- We propose a simple model to consider:
  1. Perfect information.
  2. Moral hazard.
  3. Adverse selection.
- Econometric analysis of loan contracts (data from the **European DataWarehouse**).
- Conclusions.



## Loan contracts and collateral

We want a deeper understanding of:

- What happens to the **interest rate margin** of loan contracts when **collateral** of a higher value is required?
- How this link is influenced by **information asymmetries**, which are characteristics of loan contracts.
- What are the conclusions of the theoretical and the empirical literature on this topic?
- Can a simple model provide any insights on this topic? What do real data tell us?

- Under certain asymmetries, the effect of higher collateral requirements on the interest rates applied by banks to borrowers is **not clear**.

# Literature review: Contrasting conclusions

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- In short, various authors have suggested **opposite conclusions depending on their different hypotheses or data**.
- For instance: The presence of transaction and liquidation costs; a different expected return of the borrower's investment; a different evaluation of the collateral.

# Literature review: Contrasting conclusions

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- For instance: The presence of transaction and liquidation costs; a different expected return of the borrower's investment; a different evaluation of the collateral.

## A major reference

- A seminal work is *Stiglitz, J. E. and Weiss, A. (1981)* where borrowers with higher wealth and who can provide more collateral, are also prone to invest in high risk projects, decreasing the advantage of banks. Collateral can lower the bank's return.

- We adapt the well-known **principal-agent model** to the specific case of loan contracts.
- In this model the agent acts in place of the principal. Are the interests of the agent the same as the principal?
- In other words, the principal (the bank) is affected by the actions of the agent (the borrower).

- We adapt the well-known **principal-agent model** to the specific case of loan contracts.
- In this model the agent acts in place of the principal. Are the interests of the agent the same as the principal?
- In other words, the principal (the bank) is affected by the actions of the agent (the borrower).
- We do not provide an unambiguous relation between collateral and interest rates of loan contracts.
- We focus on some **general features** of contracts.

# Results

- A summary of our results is given by the following diagram.
- Compared to the well known prisoner's dilemma, the states are not the same for all "players".

		Borrower		
		<u>Perfect Information</u>	<u>Moral Hazard</u>	<u>Adverse Selection</u>
Bank	LTV	↑	↑	↑
	$r$	↑	↓ (In frequency)	↑ (In frequency)

**Figure 2:** The different links between the LTV and the interest rate ( $r$ ), depending on the scenario considered.



## A result based on the risk-return trade off

- In the paper we show that, in our model, under symmetric information a higher collateral  $C$  corresponds to a lower interest  $i$ .

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## Intuition

The risk of a borrower does not change when  $C$  increases.

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## Intuition

The risk of a borrower does not change when  $C$  increases.

Given a fixed expected maximum return without collateral, the same value can be obtained applying lower interest rates if collateral is provided by borrowers.

Since a higher  $C$  increases the expected return,  $i$  must decrease.

# Asymmetric information

## Moral hazard

- Now the agent actively chooses the effort  $e$ , associated with the investment of the borrowed money, which cannot be controlled directly by the bank.
- In this scenario **a collateral requirement can be used** by the bank to force the borrower to increase  $e$ .
- Under moral hazard, a higher collateral requirement can be associated with a higher interest (it is a "penalization").

## Moral hazard

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## Adverse selection

- Two types of borrowers: Good (less likely to default) and Bad.
- The bank does not know who are the good borrowers: collateral can act as a signal.
- Interest can be lower with higher collateral.

## Dataset from the European DataWarehouse

- The data set analyzed is **very peculiar** compared with the previous literature on the subject.
- The data are provided by **European DataWarehouse**.
- It is a **huge collection** of microeconomic data for millions of Italian loan contracts, collected for each single borrower associated with a residential mortgage-backed security.
- In particular the dimension of the available data is 1, 147, 311 prior to cleaning.

## Variables available for each loan contract

- We include both **quantitative** and **qualitative** variables.



## Variables available for each loan contract

- We include both **quantitative** and **qualitative** variables.
- Quantitative variables: Interest rate margin, Original LTV, Original balance, Loan term, Borrower's income.
- Qualitative variables: nine variables related to the borrower and to the loan type, such as employment status or interest rate type.
- We remove outliers and missed values.

# Histogram of the Loan to Value

- Histogram of the Original LTV ratio. The median is around 0.8; a lower proportion of loans have a LTV ratio higher than 1, i.e. the amount of loan is higher than the appraised property value.

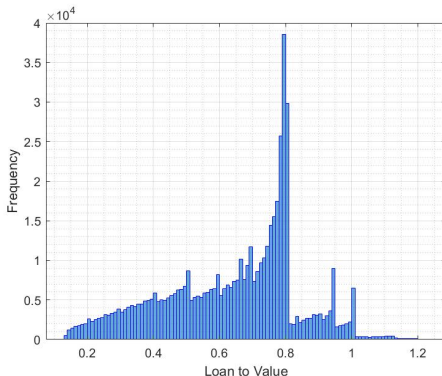


Figure 3: Histogram of the original LTV ratio.

# Cluster analysis

## Groups of data

- The relation between interest rate margin and collateral can be examined by looking at the **cluster analysis** of the original loan to value - interest rate margin variables.
- The  $K$ -means clustering partitions the data set into  $K$  disjoint sets of related data.
- The 'relation' is quantified by the distance from the cluster center.

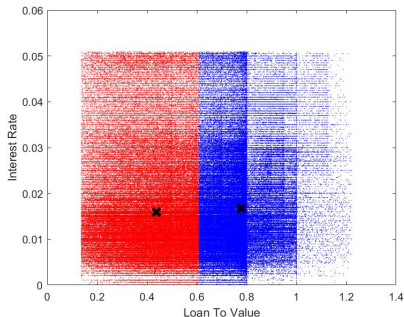


Figure 4: Cluster analysis with 2 centroids.

# Cluster analysis

## Groups of data

- A similar finding holds increasing the number of centroids.
- It would be interesting to study what happens with 10 centroids (future research).

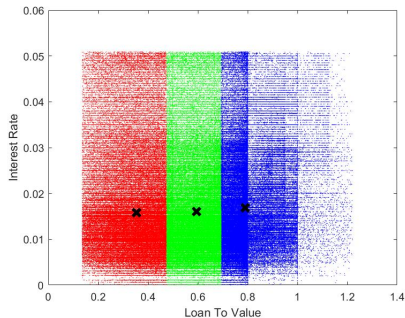


Figure 5: Cluster analysis with 3 centroids.

## Geometrical interpretation of the first two principal components

- We apply the PCA to data.
- The first two principal axes are both positive for the primary income and the original balance, while the loan term and the Original LTV have a negative second component.
- This supports the conjecture of a (slightly) positive link between the amount granted and the collateral required.

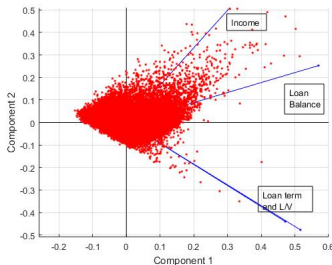


Figure 6: Biplot.

- We use a classical linear regression model, where we include both the quantitative and the categorical variables.

## Regression for the interest rates

$$interest\ rate_{i,t} = c + \beta \cdot Borrower\ Controls_i + \gamma \cdot Loan\ Controls_i + \varepsilon_{i,t},$$

- We also include the 3 months EURIBOR which is considered a reference for the offered interest rate in the European Interbank market.
- We run different specifications, depending on the availability of the data. For instance, the first specification (above 70% of observations available) involves 433,786 observations.

# Results

Table 1: Results of the regression analysis.

<i>Interest rate</i>	(1)	(2)	(3)
Loan to value ratio	0.00003*** [0.00000]	-0.00002*** [0.00000]	-0.00003*** [0.00001]
Original balance	-0.00381*** [0.00004]	-0.00300*** [0.00012]	-0.00009 [0.00021]
Loan term	0.00000*** [0.00000]	-0.00000** [0.00000]	0.00001*** [0.00000]
Borrower's income	0.00030*** [0.00003]	0.00090*** [0.00010]	-0.00066*** [0.00015]
Debt to income		-0.00000*** [0.00000]	0.00006 [0.00004]
EURIBOR 3M	0.00086*** [0.00007]	0.00264*** [0.00017]	0.00143*** [0.00027]

# Results

Table 2: Results of the regression analysis.

Borrower type FE	Yes	Yes	Yes
Employment status FE	Yes	Yes	Yes
Resident	No	Yes	Yes
Repayment method FE	Yes	Yes	Yes
Payment frequency FE	Yes	Yes	Yes
Payment type FE	Yes	Yes	Yes
Interest rate type FE	Yes	Yes	Yes
Lien	No	No	Yes
Property type FE	Yes	Yes	Yes
Origination year FE	Yes	Yes	Yes
SE	Rob.	Rob.	Rob.
Observations	433,786	55,883	7,949
R-squared	0.51021	0.54609	0.81818



## Summary and future research plan

- We have studied the open problem regarding the effect of collateral on interest rates of loan contracts, which is strictly connected to the theory of asymmetric information.
- The link collateral-interest rate in loan contracts is ambiguous, and it cannot be decided a priori.
- It is one of the few works in the literature on this topic which analyzes such a large amount of specific microeconomic data.
- The game theory discussion embeds past and more detailed models; we obtained the same conclusions based on few intuitive principles.
- We leave to future research the extension of this research to a multi-country level or regional level (heterogeneity across Italy).

# **SAVE THE DATE:** **8TH NOVEMBER**

**(WEDNESDAY FROM 1 PM TO 6 PM)**

## **GREEN AUTO SECURITIZATION WORKSHOP**

**IN FRANKFURT @ GOETHE UNIVERSITY**



**Q&A**

# THANK YOU//CONTACT US

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