



EUROPEAN CENTRAL BANK

EUROSYSTEM

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# **The effect of macroprudential policies on credit developments in Europe 1995-2017**

Joint European Central Bank and Central  
Bank of Ireland research workshop

*Macprudential policy: from research to  
implementation*

10 July 2018, Dublin,

Central Bank of Ireland

- Macroprudential authorities have at their disposal **a diversity of instruments**, that incl. a standardized set of tools under CRDIV, but also an even richer set of tools that remain within the national remit (e.g. borrower-based standards)
- There is (still) relatively little empirical evidence supporting the selection of these instruments to address specific systemic risks
- We make a step in this direction by looking at **a broad set of measures** and **comparing** their effectiveness in **controlling credit growth?**
- We also assess their **interactions** with **monetary policy** in order to provide an additional guidance to macroprudential policy-makers on the optimal use of instruments in the monetary policy cycle

## Motivation: Narrative approach

- **Diversity** of instruments and their **limited comparability in time and across borders** is also one of the key challenges in the empirical studies on the effectiveness of macroprudential policies
- This makes the use of **narrative information** a viable option: the identification is achieved via knowledge of **the type of a measure and the timing of its application**
- MaPPED (Budnik and Kleibl, 2018) provides a detailed account of policies **with a macroprudential character** for over 20 years and for 38 countries
- It also separates **policy actions** and **policy instruments** allowing the **construction of different policy indicators**

## Motivation: Studies based on a larger sample of countries

- Earlier empirical findings on the effect of macroprudential instruments on credit growth...

	Lim et al. (2011)	Cerutti et al. (2017)	Akinci and Olmstead-Rumsey (2015)
Capital based	Countercyclical effect of <b>CCyB-type buffers</b> , negative effect of <b>profit distribution restrictions</b> and <b>dynamic provisioning</b>	Negative effect of <b>dynamic provisioning</b>	Negative effect of <b>capital requirements</b> , and other housing policies (incl. RW)
Borrower-based	Counter-cyclical effect of <b>LTV and DTI caps</b>	Negative effect of <b>LTV, DTI caps</b>	Negative effect of <b>LTV</b>
Reserve requirements and other	Counter-cyclical effect of <b>reserve requirements</b>	Negative effect of <b>reserve requirements, limits on FX loans, concentration limits</b>	Positive effect of <b>reserve requirements</b>
Sample	49 countries incl. 20 EU Member States	64 countries incl. 27 EU Member States	57 countries incl. 28 EU Member States
General take-aways		All above instruments <b>not significant for developing countries</b> (incl. borrower based instruments)	

## Preview of results: **Main findings**

- Macroprudential policies can have a significant impact on the evolution of credit to non-financial sector also in **developed (EU) economies**
- **Capital based-measures** suppress the growth rate (or procyclicality) of credit to NFCs, and **the transmission of monetary policy**. Overwhelming evidence on a positive and complementary to monetary policy impact of **profit distribution restrictions**.
- **Borrower-based measures**, such as LTV or DSTI limits, affect the growth rate of credit persistently and **positively**. There are however likely to have a significant countercyclical impact on credit due to their **positive interactions with monetary policy**. **Sectoral exposure** exhibit a **reverse** pattern.
- **Caps on** longer- and shorter-term **maturity mismatches** have (if anything) a **positive** impact on the credit growth and **negatively affect the transmission of monetary policy**. Strongest evidence of the negative and counterbalancing impact of **FX limits**.

- Sample **period**: 1995Q1-2017Q4
- Countries: all 28 EU
- **Macroeconomic variables**: **LHS** real bank credit to the NFPS (GDP deflator adjusted, BIS & national sources), to households and enterprises, **RHS** GDP (SDW), real monetary policy interest rate (BIS & national sources)
- **Macroprudential (*and other*) policies**:
  - **Capital-based**: (i) Minimum capital requirements, (ii) Capital buffers, (iii) Profit distribution restrictions , (iv) Risk weights, (v) General provisioning rules incl. general provisioning, (vi) Minimum capital requirements
  - **Borrower-based**: (i) LTV, (ii) DSTI/DTI/LTI, (iii) Other income based eligibility requirements, (iv) Other lending standards
  - **Liquidity requirements**: (i) Liabilities based reserve requirements, (ii) Asset based reserve requirements, (iii) FX exposure limits, (iv) Short-term liquidity requirements, (v) Long-term liquidity requirements
  - **Other**: (i) Exposure limits to sectors, (ii) Large exposure/concentration limits, (iii) Taxes

## Methodology: Cross-country panel

$$\Delta cr_{i,t} = \alpha_i + \alpha_i^c \Delta cr_{i,t-1} + \beta_i^y \Delta y_{i,t} + \beta_i^r r_{i,t} + \theta^0 I_{i,t} + \theta^1 I_{i,t} \Delta y_{i,t} + \theta^2 I_{i,t} r_{i,t} + \gamma_i X_{i,t} + \varepsilon_{i,t}$$

Credit persistence and time-invariant country effects
Credit demand/supply factors: economic activity, monetary policy

**Persistent effect of an instrument**
**Countercyclical effect of an instrument & Interactions with monetary policy**

- $\Delta cr_{i,t}$  - change in real credit (q-o-q) at time  $t$  in country  $i$
- $\Delta y_{i,t}$  - change in GDP (q-o-q) at time  $t$  in country  $i$
- $r_{i,t}$  - monetary policy interest rate at time  $t$  in country  $i$
- $I_{i,t}$  - policy index variable at time  $t$  in country  $i$
- $X_{i,t}$  - other control variables at time  $t$  in country  $i$
- $\varepsilon_{i,t}$  - residual
- $\alpha_i$  - country (fixed) effects
- $\alpha^c, \beta^y, \beta^i, \theta^0, \theta^1, \gamma$  – regression coefficients

## Cross-country panel: Problem areas

$$\Delta cr_{i,t} = \alpha_i + \alpha_i^c \Delta cr_{i,t-1} + \underbrace{\beta_i^y \Delta y_{i,t} + \beta_i^r r_{i,t}}_{\text{Endogeneity (1)}} + \underbrace{\theta^0 I_{i,t} + \theta^1 I_{i,t} \Delta y_{i,t} + \theta^2 I_{i,t} r_{i,t}}_{\substack{\text{Policy measurement (1)} \\ \text{Endogeneity (2)}}} + \gamma_i X_{i,t} + \varepsilon_{i,t}$$

No strict exogeneity (3)
Time-effects (5)

1. Measurement of policy  $I_{i,t}$
2. Endogeneity of RHS variables,  $\Delta y_{i,t}$ ,  $r_{i,t}$ ,  $I_{i,t}$
3. No strict exogeneity of  $\Delta cr_{i,t}$  in a panel setup
4. Time-effects and cross-sectional correlation of residuals (Pesaran, 2006):

$$\varepsilon_{i,t} = \delta_t + \sum_{p=0}^P \sum_{k=1}^K \delta_{p,k,i} F_{k,t-p} + v_{i,t}$$

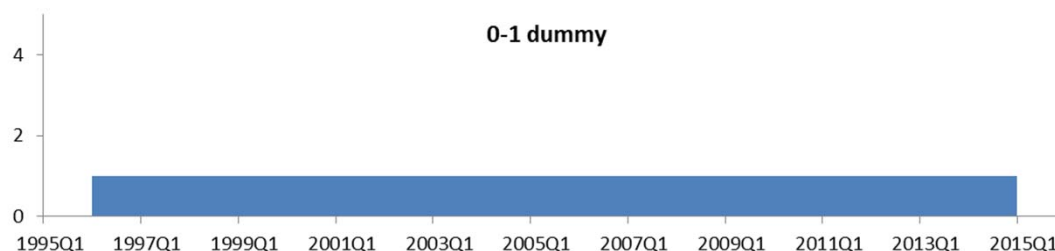
- $\delta_t$  - time-effects
- $\delta_{p,k,i}$  - country-specific heterogenous slopes
- $F_{k,t-p}$  -  $K$  common factors ( $p$ -th lag)
- $v_{i,t}$  - i.i.d. error



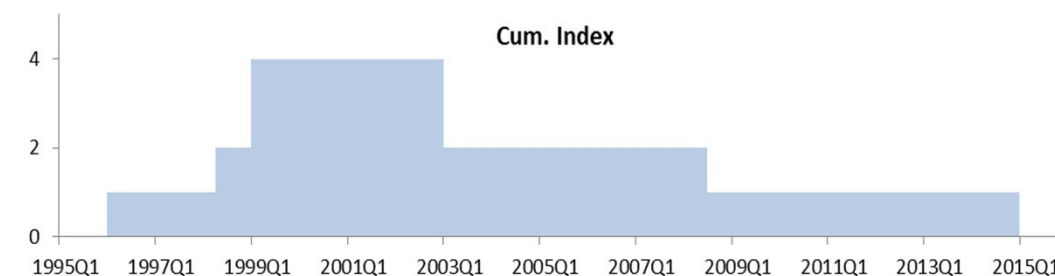
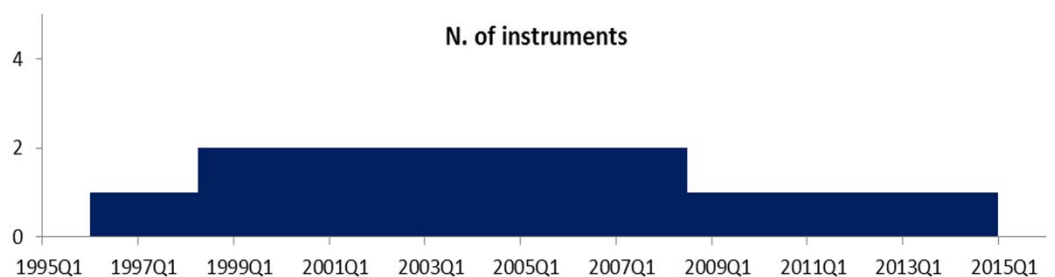
## Measuring policy intensity: Various options to construct policy indices

- **1996Q1**: introduction of an LTV limit on mortgage loans of **90% [level]** for **second-home buyers [scope]** [**activation**]
- 1998Q2: an introduction of a stricter LTV limit of 80% for **FX mortgage loans [currency]** for **first-and second-home buyers**
- 1999Q1: tightening of the LTV limit on FX loans to 70% and extending the LTV limit on domestic currency loans to second-home buyers
- 2003Q1: loosening of the LTV limit on mortgage loans in domestic and FX currency – 10% of loans in bank portfolio can be exempted from the limit [**exemptions**]
- 2008Q2: LTV limit on FX currency loans removed
- **2014Q4**: LTV limit on mortgage loans in domestic currency removed [**deactivation**]

### Representation in regressions



Examples of use: Lim et al (2011), Cerutti et al (2015)



Examples of use: Akinci and Olmstead-Rumsey (2015)

- (Most) **Systematic approach** to testing the impact of policy instruments
- **Policy measurement**: three types of indices, **a dummy, a number of instruments in place, a cumulated index of net tightenings**
- **Estimator**: the common correlated effects (partially) pooled (CCEP) by Pesaran (2006) and Chudik & Pesaran (2015)
- **Endogeneity treatment**: IV or lagged RHS variables specifications
- **Control variables**: ‘a sum’ of other policies, including the interactions of the aggregated policy index with GDP growth rate and interest rate

## Results: Example (capital-based policies)

Outcome variable Policy index Estimator	Real credit to private sector (Q-o-Q)					
	d (0-1)		D (0-n)		S (Cumulative)	
	CCE/IV	CCE/Lagged	CCE/IV	CCE/Lagged	CCE/IV	CCE/Lagged
<b>MINCAP</b>						
$I^{MINCAP}$			0.00172 (0.00372)	-0.00484 (0.00383)	0.00339 (0.00288)	0.000835 (0.00221)
$I^{MINCAP} \times \Delta y$			-0.308* (0.166)	0.0495 (0.134)	-0.106 (0.100)	-0.0220 (0.0533)
$I^{MINCAP} \times r$			0.00263 (0.00216)	0.00374*** (0.00128)	-0.000674 (0.000554)	-0.000133 (0.000242)
$R^2$			0.086	0.179	0.048	0.084
$P^*(rk)$			0.0317		0.0106	
$P^*(J)$			0.308		0.682	
$P^*(CD)$			0.693	0.947	0.883	0.756
$P^*(F)$			0.151	0.0348	0.574	0.919
<b>CAPBUF</b>						
$I^{CAPBUF}$	0.00461 (0.00755)	-0.00925 (0.00581)	-0.000848 (0.00227)	-0.00448 (0.00288)	0.000321 (0.00222)	-0.000160 (0.00280)
$I^{CAPBUF} \times \Delta y$	-0.856** (0.344)	0.0923 (0.160)	-0.404*** (0.131)	-0.0672 (0.0949)	0.0755 (0.0977)	0.104 (0.102)
$I^{CAPBUF} \times r$	0.00165 (0.00124)	0.00152* (0.000805)	-0.000733 (0.000857)	0.00145** (0.000610)	0.000738 (0.000694)	0.000340 (0.000539)
$R^2$	0.090	0.123	0.060	0.183	0.052	0.106
$P^*(rk)$	0.0341		0.0577		0.0497	
$P^*(J)$	0.511		0.644		0.471	
$P^*(CD)$	0.467	0.631	0.647	0.305	0.672	0.886
$P^*(F)$	0.0435	0.228	0.00578	0.0698	0.639	0.643
<b>PROFIT</b>						
$I^{PROFIT}$	0.0244** (0.0118)	0.0184** (0.00848)	0.0192 (0.0118)	0.0146* (0.00844)	0.0305** (0.0133)	0.0155** (0.00778)
$I^{PROFIT} \times \Delta y$	-0.145 (0.533)	-0.0167 (0.267)	0.910 (0.597)	0.275 (0.261)	-0.597 (0.524)	0.206 (0.241)
$I^{PROFIT} \times r$	-0.00894** (0.00352)	-0.00612*** (0.00174)	-0.00890*** (0.00345)	-0.00613*** (0.00183)	-0.00972*** (0.00363)	-0.00709*** (0.00177)
$R^2$	0.033	0.085	0.042	0.079	0.050	0.088
$P^*(rk)$	0.0212		0.0957		0.0871	
$P^*(J)$	0.522		0.437		0.604	
$P^*(CD)$	0.959	0.934	0.892	0.835	0.725	0.659
$P^*(F)$	0.0523	0.00343	0.00869	0.00299	0.0306	0.000473

- As a rule the measurement of policies matters, many results sensitive to the change in policy index
- A change in the estimator matters less and affects mostly significance levels (not signs)
- (Not seen) controlling for other policies, and especially their interactions with GDP and interest rates, significantly affects the results

## Results: Persistent or cycle-dependent impact on credit growth

	Total credit	NFC credit	Household credit
MINCAP			
CAPBUF	(CC)	-	
PROFIT	+	+	(+)
RW	- / (CC)	-	
SPECPROV		-	
GENPROV			+
LTV	(CC)	(+)/(CC)	
DTI	+	+	(+)/(PC)
INCOME	(+)		+
LENDSTD		(+)	(+)
ABRR	-		(-)
RR			
LIQLT	(+)	(+)	(+)
LIQST	(+)	(+)	
FXLIM	+	+	+
LAREXP			(+)
SECEXP	-	-	-
TAX			

**Legend:** +/- a positive/negative persistent impact of an instrument on credit growth, PC/CC pro-/countercyclical impact, () low statistical significance

- Significant and **positive impact on credit growth** of profit distribution restrictions, DTI caps (weaker on remaining lending standards), caps on FX mismatch (weaker on long- and short-term liquidity limits)
- Significant and **negative impact on credit growth** of sectoral exposure limits
- **Little evidence on counter- or procyclical impact of policy instruments**

## Results: Interactions with monetary policy

	Total credit	NFC credit	Household credit
MINCAP			
CAPBUF		+	
PROFIT	-	-	-
RW	(+)	(+)	
SPECPROV	-		-
GENPROV	+	+	(+)
LTV		(-)	-
DTI	-	(-)	-
INCOME	-	(-)	-
LENDSTD			
ABRR			+
RR			(+)
LIQLT			(-)
LIQST	+	(+)	
FXLIM	+		(+)
LA REXP	(-)	(+)	(-)
SECEXP	+	+	(-)
TAX	(+)	(+)	

Legend: +/- a moderating/amplifying effect of an instrument on monetary policy transmission, ( ) low statistical significance

- **Amplifying (complementary)** impact on the transmission of monetary policy of profit distribution restrictions, LTV, DTI, income related lending standards
- **Dampening (counterbalancing)** impact on the transmission of monetary policy of general provisioning rules, sectoral exposure limits, (weaker evidence on other capital-based and short-term liquidity caps)
- This **affects the assessment** of the effect of macroprudential instrument **on the (credit) cycle...**

- Change in the measurement of monetary policy stance: the nominal instead of the real monetary policy interest rates
- Controlling the regressions for a banking crisis dummy (as in Cerutti et al., 2015)
- Dropping one country at a time

## Conclusions: **Take aways**

- Panel regressions and narrative evidence provide a useful framework for the ‘**selection**’ of effective policy measures (here: the effectiveness measured in terms of the impact on credit growth)
- A share of macroprudential instruments appears to have a **lasting (across the cycle) positive impact on credit growth** (profit distribution restrictions, borrower-based standards, caps on maturity and FX mismatches)
- A share of instruments affects mostly **sectoral credit growth** leading to the redirection rather than the reduction of the overall credit e.g. capital buffers on NFC credit, and reserve requirements on household credit.

## Conclusions: **Take aways**

- The transmission of **many macroprudential policies** (capital-, borrower- and liquidity-based alike) to a substantial degree hangs on their **interactions with monetary policy**.
- With countercyclical monetary policy, **borrower-based policies**, or **profit distribution restrictions** (and specific provisioning standards) will act **countercyclically**, whereas capital buffers, general provisioning, RW, liquidity standards and sectoral exposure limits **‘procyclically’**
- **Countercyclical macroprudential policy** should take into account **monetary policy stance**. E.g. when monetary policy is loose, LTV, DTT bite less whereas (other borrower standards) sectoral exposure limits (alike) more.



## Conclusions: Caveats

- The outcomes are silent about the appropriate calibration of policy measures (weak measurement of policy intensity)
- No account is taken for announcement effects
- Not all measures used in the analysis targeted credit growth (pros – exogeneity, cons – the assessment of effectiveness is not fully valid)
- For some instruments e.g. sectoral risk weights or capital buffers, an additional analysis on a higher degree of granularity could be justified
- Endogeneity concerns prevail – these can be addressed looking forward by employing bank-level (rather than country-level) data as in Claessens et al. (2014)

# Literature

- Akinci, O., and J. Olmstead-Rumsey (2015): “How Effective are Macroprudential Policies? An Empirical Investigation.” International Finance Discussion Paper 1136.
- Budnik, K. and J. Kleibl (2018), “Macroprudential regulation in the European Union in 1995-2014: Introducing a new data set on policy actions of a macroprudential nature”, ECB WP No. 2123
- Cerutti, E., S. Claessens, and L. Laeven. 2017a. “The Use and Effectiveness of Macroprudential Policies: New Evidence,” *Journal of Financial Stability*, vol. 28, pp. 203-224
- Chudik, A. and M.H. Pesaran (2015): "Common correlated effects estimation of heterogeneous dynamic panel data models with weakly exogenous regressors," *Journal of Econometrics*, Elsevier, vol. 188(2), pages 393-420.
- Claessens, S., Ghosh, S. and R. Mihet (2014): Macro-Prudential Policies to Mitigate Financial System Vulnerabilities, IMF/14/155
- Lim, C., F. Columba, A. Costa, P. Kongsamut, A. Otani. M. Saiyid, T. Wezel, and X. Wu (2011): “Macroprudential Policy: What Instrument and How to Use Them? Lessons from Country Experiences.” IMF Working Paper 11/238.
- Pesaran M. Hashem (2006): “Estimation and Inference in Large Heterogeneous Panels with a Multifactor Error Structure”, *Econometrica*, Vol. 74, No. 4 (Jul., 2006), pp. 967-1012