

*Università della Svizzera italiana*

*Lugano, 20 gennaio 2005*

**Default probabilities and business cycle regimes:  
a forward-looking approach**

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## Motivation:

- Importance of business cycle effects on risk measurement
- Risk-sensitivity / Procyclicality trade-off in Basel II

## Plan of the presentation:

- 1) Basel II and the procyclicality issue
- 2) Possible ways to deal with procyclicality
- 3) Model in Pederzoli and Torricelli (2005)
- 4) Publicly available Italian default data

## **Time dimension of credit risk**

Dependence on the general economic conditions through systematic risk factors:

Evidence of correlation between credit risk factors and macro-economic conditions: e.g. Wilson (1997), Nickell et al. (2000), Carey (2002), Bangia et al. (2002), Altman et al. (2002)

In particular:

Bangia et al. (2002): recession and expansion regimes in transition matrices

## Procyclicality

Amplification of the business cycle due to the **risk-sensitivity** of capital requirements

→ reduction in the capital ratio during recession and viceversa, i.e. reduction in lending when the economy is in a downturn

$$\frac{RC}{\sum_i w_i A_i} \geq 8\%$$

Jackson et al. (1999) → procyclicality in Basel I

Many concerns about procyclicality in Basel II, e.g.

Danielsson et al. (2001), Borio et al. (2001), Lowe and Segoviano (2002), Kashyap and Stein (2004), Gordy (2004), ...

# Business cycle and credit risk models:

## Where?

### A) Rating Systems:

- Rating Assignment
- Rating Quantification (Probability of Default)

### B) Loss Given Default

### C) Exposure at Default

### D) Correlations

Review: Allen and Saunders (2003)

### Focusing on (A):

#### *Rating Assignment:*

- Point in time
- Through the cycle

#### *Rating Quantification:*

- Unconditional PDs
- Time-varying / business cycle dependent PDs

## **Rating systems in current practice**

- Rating Agencies: through the cycle ratings logic (pessimistic scenario)
- Banks: typically point in time logic (based on accounting or market data)

### **Basel II requires:**

- through the cycle ratings;
- PDs estimated as long-run averages;
  - neutralization of the business cycle effects
  - time dimension of risk neglected

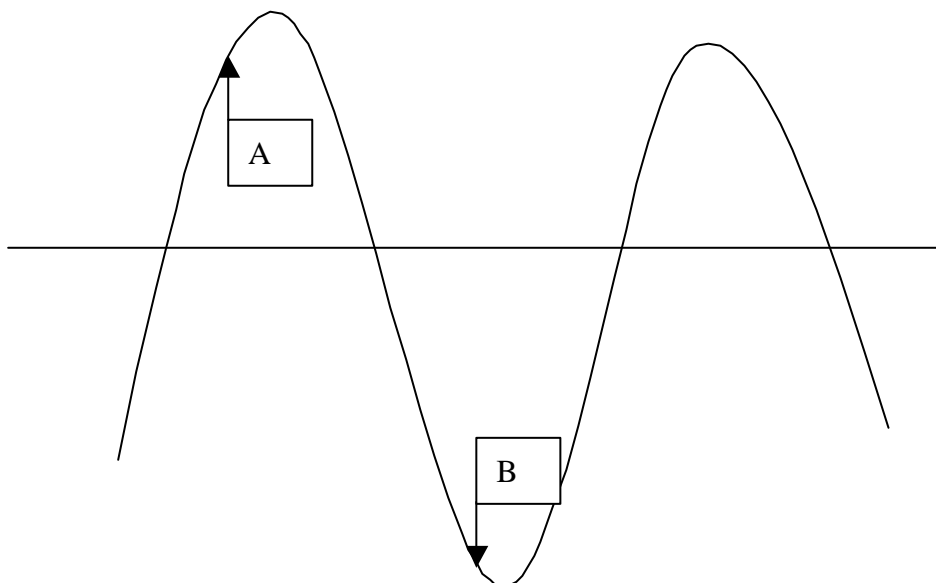
## **Three ways to deal with procyclicality in IRB**

1. Smoothing inputs to the capital function
2. Flattening the capital function itself
3. Smoothing the output of the capital function

Including the time dimension of risk → economic conditions over the credit horizon (typically one-year)

Two views of the business cycle:

- 1) business cycle too irregular to be predicted → current conditions as the best forecast for future conditions
- 2) business cycle –at least partly- predictable → appropriate forecast over the credit horizon





The model proposed in Pederzoli and Torricelli (2005) aims at:

- including business cycle effects;
- smoothing procyclicality by introducing economic forecasts in the PDs estimation.

→ *ttc* ratings + time-varying forward-looking PDs

PDs estimation based on:

1. Conditional expansion and recession PDs for each rating class;
2. Recession probability forecasts.

## **Models for business cycle dependent PDs estimation**

- Specific macroeconomic variables (e.g. GDP),  
continuous values  
→ CreditPortfolioView
- Business cycle as discrete variable, typically two  
values (expansion and recession)  
→ Bangia et al. (2002)

### **Why a discrete binomial model?**

- Evidence of good representativeness (e.g. Bangia et al. (2002))
- Econometric models for prediction of the business cycle states more accurate and stable (e.g. Estrella et al. (2003))
- From a regulatory point of view less variability in the binary representation

## The proposed model

**A.1** One-period model: period length equal to the credit horizon  $k$ ,  $k \in N$ .

**A.2** Business cycle state over  $[t, t+k]$  binomial variable:

$$S_{t+k} = \begin{cases} E & P(E) \\ R & P(R) \end{cases}$$

$S_{t+k}$  = business cycle state over  $[t, t+k]$ ;

E = expansion state;

R = recession state;

P(E) = probability of an expansion over one period;

P(R)=1-P(E) = probability of a recession over one period.

**A.3**  $P(R)$  conditioned on the information available in  $t$ ,  $I_t$

$$P_t(S_{t+k} = R) = P(S_{t+k} = R | I_t) = f(\mathbf{b}'x_t)$$

$x_t$  = vector of explanatory variables for the business cycle regime,  $x_t \in R^n$ ;

$\mathbf{b}$  = vector of coefficients.

**A.4** Default rate for each rating class stochastic variable with state-dependent distribution:

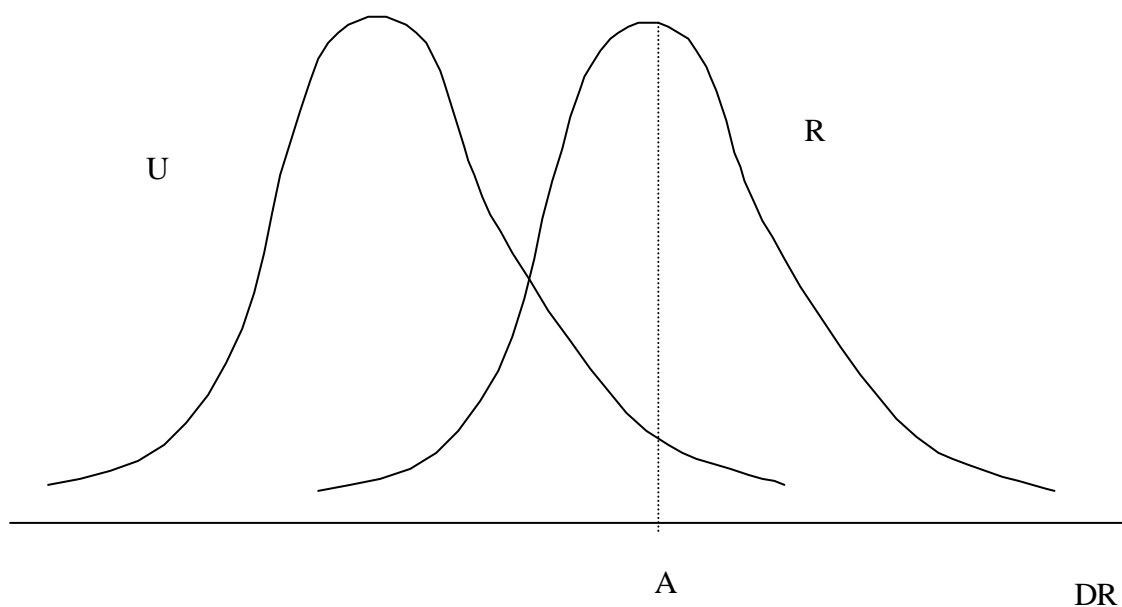
$$f(DR_{t+k} | S) = \begin{cases} f_E(DR_{t+k}) & \text{if } S = E \\ f_R(DR_{t+k}) & \text{if } S = R \end{cases}$$

$DR_{t+k}$  = default rate over [t, t+k];

$f_E$  = probability distribution of the default rate conditional on the state of expansion;

$f_R$  = probability distribution of the default rate conditional on the state of recession.

*Conditional and unconditional default rate distribution*



→ ex-ante mixture distribution:

$$f_t(DR_{t+k}) = P_t(S_{t+k} = E) \times f_E(DR_{t+k}) + P_t(S_{t+k} = R) \times f_R(DR_{t+k})$$

By defining the conditional default probabilities as:

$$PD_E = E(DR | E) \quad PD_R = E(DR | R)$$

the ex-ante (unconditional) default probability on  $[t, t+k]$  is:

$$\begin{aligned} PD_t &= E_t(DR_{t+k}) = \int DR_{t+k} f_t(DR_{t+k}) dDR_{t+k} \\ &= P_t(S_{t+k} = E) \times PD_E + P_t(S_{t+k} = R) \times PD_R \end{aligned}$$

→ analogous to Basel II if  $P(E)$ ,  $P(R)$  long-run sample proportion

→ but  $P(E)$ ,  $P(R)$  forward-looking over the credit horizon

## Time inconsistency:

Basel II (and credit risk models in general):  $k =$  one year

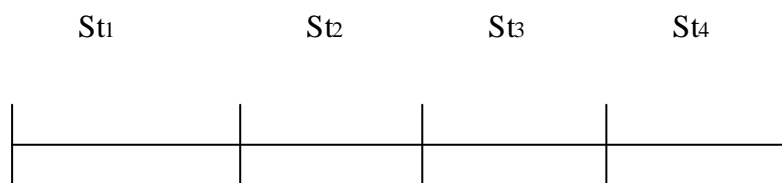
Business cycle chronology  $\rightarrow$  months/quarters

By dividing  $[t, t+k]$  in  $n$  sub-periods of length  $k/n$ :

$$S_{t_i} = \begin{cases} E & \text{if } [t_{i-1}, t_i] \text{ expansion} \\ R & \text{if } [t_{i-1}, t_i] \text{ recession} \end{cases} \quad i = 1, \dots, n$$

$$t_i = t + i \times \frac{k}{n} \quad i = 0, \dots, n$$

$k = 12$  months;  $n = 4$ .



$\rightarrow$  Forecast over each quarters

$\rightarrow$  Alternatively, proxy consistent with procyclicality target:

forecast of  $S_{t_4}$

## **Application to Italian data**

### United States:

(application in Pederzoli and Torricelli (2005))

- Transition and default data from Standard&Poor's (Bangia et al. (2002))
- NBER business cycle chronology

### Italy:

- Quarterly default data from Bank of Italy (1990 Q1-2002 Q4)
- ISAE/ECRI business cycle chronology

## Default data from Bank of Italy

*(Base Informativa Pubblica):*

### Quarterly default rates

*Default rates calculation:*

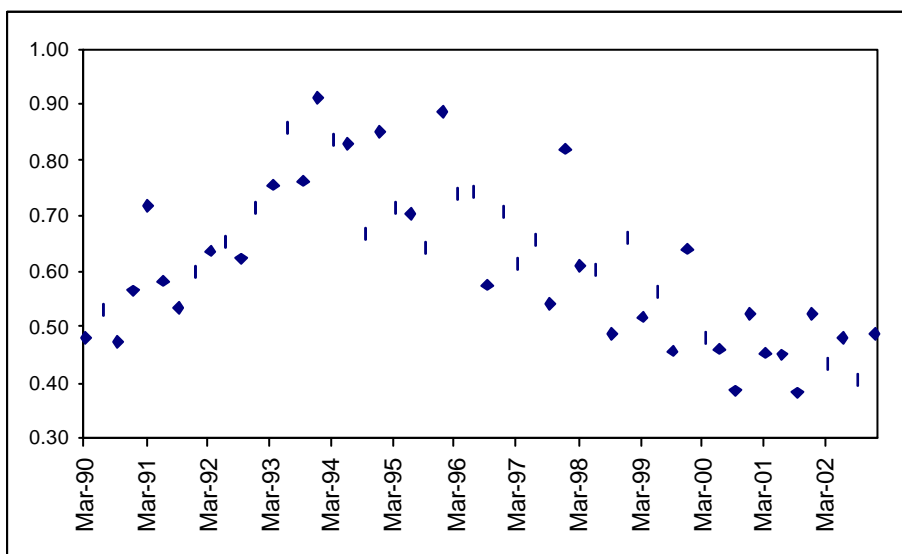
default rate  $DR_{t,t+k}$  for the period  $[t,t+k]$ :

$$DR_{t,t+k} = \frac{D_{t,t+k}}{PL_t}$$

$D_{t,t+k}$  = defaults flow over the period  $[t,t+k]$

$PL_t$  = stock of performing loans at time  $t$

*Quarterly percentage default rates historical series*





## Expansion and Recession regimes in the default rates

Business Cycle chronology:

- ISAE (*Istituto di Studi e Analisi Economica*)
- ECRI (*Economic Cycle Research Institute*)

ISAE chronology

Peaks	Troughs
<i>Oct-70</i>	<i>Oct-71</i>
<i>Mar-74</i>	<i>May-75</i>
<i>Feb-77</i>	<i>Dec-77</i>
<i>Mar-80</i>	<i>Mar-83</i>
<i>Mar-92</i>	<i>Jul-93</i>
<i>Nov-95</i>	<i>Nov-96</i>
<i>Dec-00</i>	

	Full sample	Expansion	Recession
# periods	44	35	9
mean DR	0.00643	0.00622	0.00727
std DR	0.00129	0.00127	0.00096

neglecting 2001, 2002 (likely structural break)

## Proxy for ratings

→ borrower's geographic area (South, Centre, North)

→ borrower's dimension (Small Business,

Large/Medium Corporates)

Proxy:

➤ global loan size < 500.000 euro → Small business

➤ global loan size > 500.000 euro → Medium/Large corporates

### *Conditional PD estimates by 'rating class'*

	<b>Recession</b>	<b>Expansion</b>
South Small	0.01212	0.01043
South Medium-Large	0.01842	0.01551
Centre Small	0.00763	0.00705
Centre Medium-Large	0.01174	0.01069
North Small	0.00480	0.00409
North Medium-Large	0.00702	0.00546

## Recession Probability Forecast

Probit Model:

$$P_t(R_{t+k} = 1) = \Phi(\mathbf{b}' X_t)$$

$$R_t = \begin{cases} 1 & \text{recession in quarter } t \\ 0 & \text{expansion in quarter } t \end{cases}$$

$X_t$  = explanatory variables

→ Domestic and international financial variables (Artis et al. (2004))

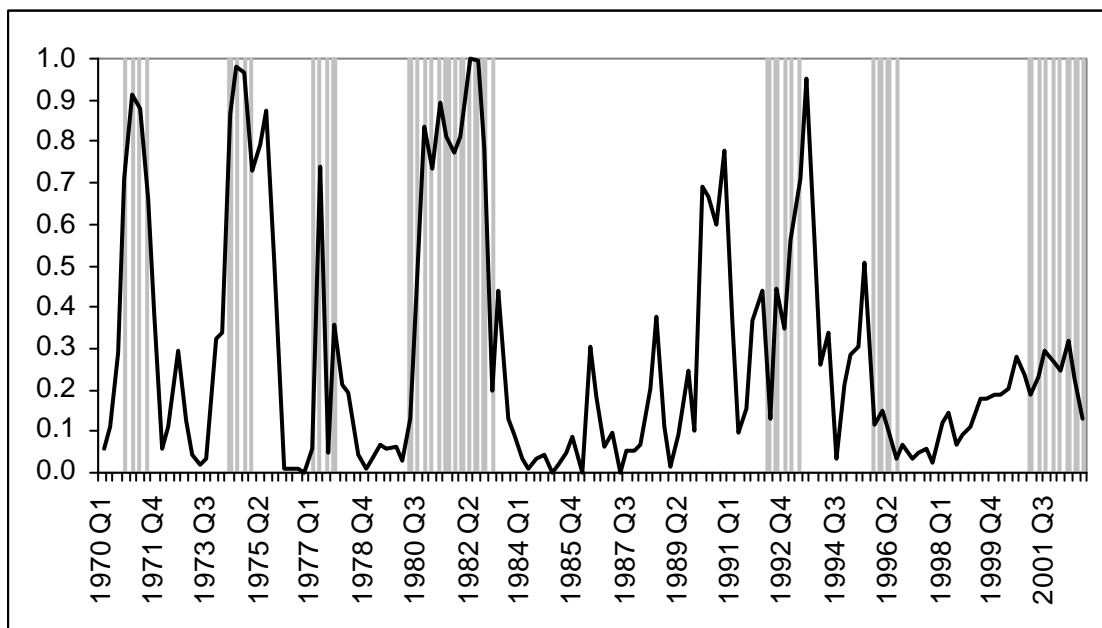
- Short and long interest rates from Italy, Germany
- Term Spread from Italy, Germany, US
- Equity Indices return from Italy, Germany, US

Sample: 1970 Q1 – 2002 Q4

Selection based on SIC criterion:

→ German term spread

→ Italian long term interest rate

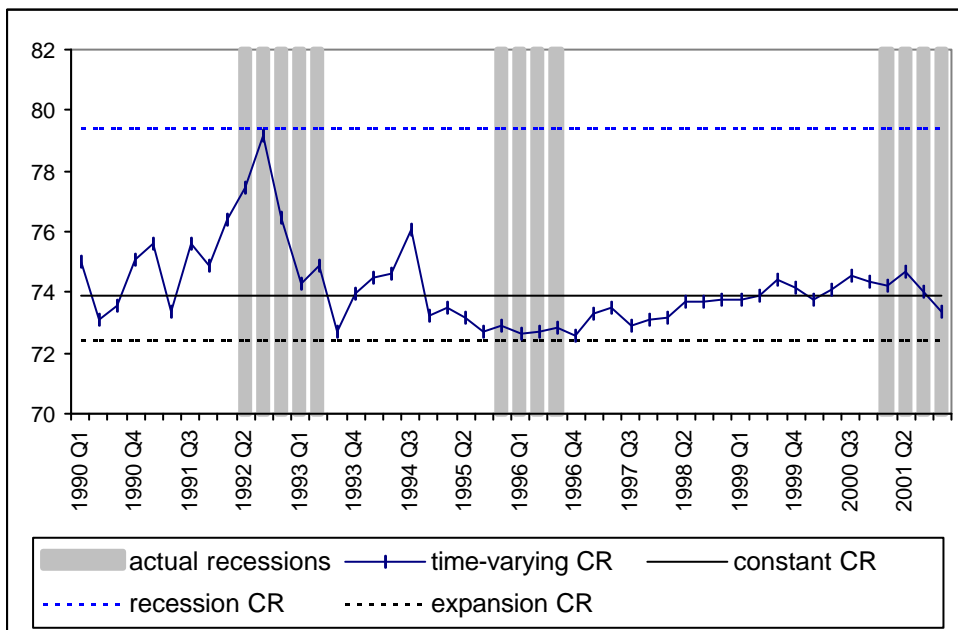


# Capital Requirements

Foundation IRB Approach

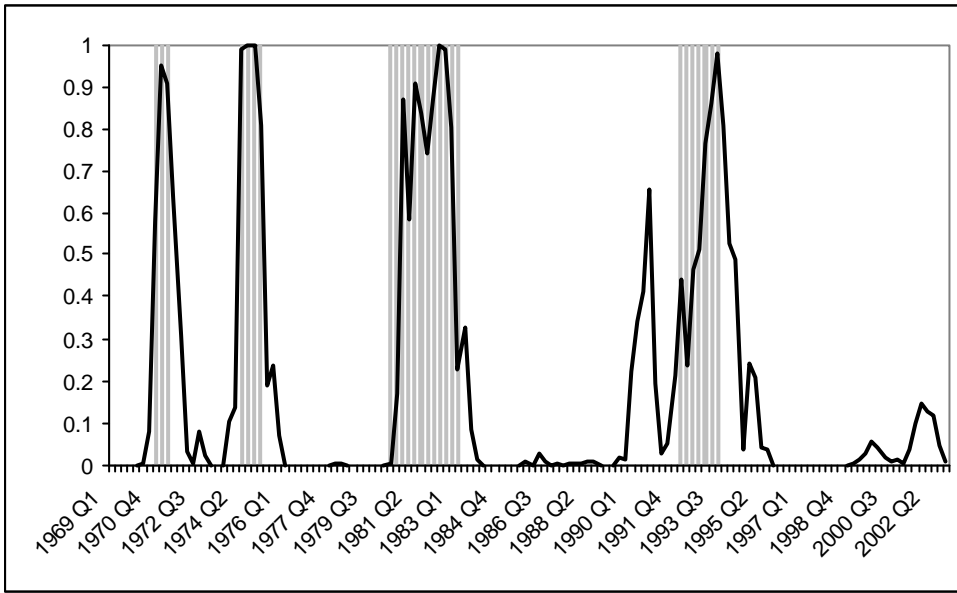
LGD = 45%, M= 2,5, EAD=100

## Capital Requirements (CR)

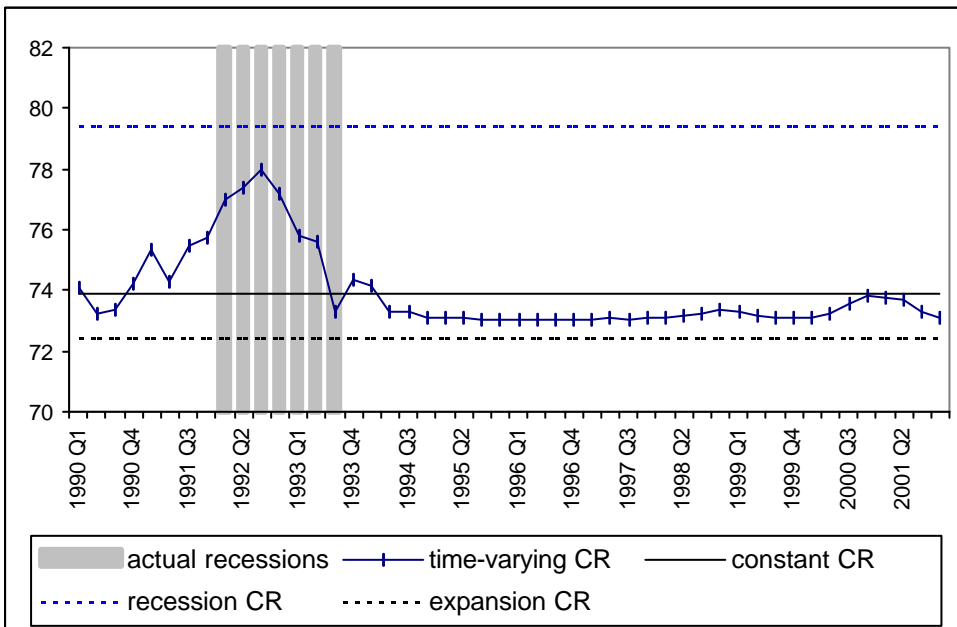


→ ISAE or ECRI?

## *Recession probability forecast – ECRI chronology*



## *Basel II Capital Requirements (CR)*



## **Open points**

1. Which chronology does better represent italian default rates dynamics?
2. European business cycle? Relationship with default rates.