

A Large Scale (Basel II Compliant) Application of Operational Risk

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Acknowledgements

Collaborators

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Outline

- **Structure of CSIRO presentations**
- **Motivation (Basle I and Basel II) – brief history**
- **What is Operational Risk? – some important risks**
- **Implications of Basel II (the New Accord)**
- **Advanced Measurement Approaches (AMA)**
- **Loss Distribution Approach (LDA)**
- **Capital allocation (annual capital charge)**
- **AMA Accreditation**
- **Large scale application at Commonwealth Bank**
- **Conclusions**
- **References (a rapidly growing area)**

Structure of CSIRO talks

- **John** – general introduction to op risk and brief description of the large scale project at Commonwealth Bank www.cba.com.au
- **Pavel** – modelling and quantification for the project – the financial mathematics and statistical methods in the project, the challenges, etc.

Motivation (Basle I and Basel II)

- **1988 Basle I Accord – Basel Committee on Banking Supervision (BCBS) – credit risk and market risk explicitly addressed, assumption about op risk.**
- **Since then, attention to and quantitative modelling of op risk has evolved rapidly.**
- **All BCBS publications**
<http://www.bis.org/bcbs/publ.htm>
- **BCBS publications relating to operational risk**
http://www.bis.org/bcbs/publ_10.htm

Motivation (Basle I and Basel II)

Brief history

- **July 1988 – Basle Capital Accord (Basle I)**
- **June 1999 – Capital charge for other risks (including operational risk) proposed under Basle CP1.**
- **Jan 2001 Consultative Paper – Capital charge for operational risk proposed under Basel CP2.**
- **Jan 2001 – Consultative Document – "Operational Risk"**
- **Sept 2001 – "Working Paper on the Regulatory Treatment of Operational Risk"**

Brief history

- **Sept 2001 – "Working Paper on the Regulatory Treatment of Operational Risk"**
 - **describes Advanced Measurement Approaches, Standardised Approach and Basic Indicator Approach**
 - **an overview of best practices around developing risk mitigation programs, guidelines on loss categories, monitoring risks, examples of mathematical methods**
 - **examples of how capital charge for op risk may be calculated.**

Brief history

- Feb 2003 – "Sound Practices for the Management and Supervision of Operational Risk"
(10 Principles)
- Apr 2003 – Consultative Paper (CP3) – The New Basel Capital Accord (Basel II)
<http://www.bis.org/publ/cp3full.htm>
<http://www.bis.org/bcbs/bcbscp3.htm>
- Apr 2003 – "Overview of the New Basel Capital Accord "
<http://www.bis.org/publ/cp3ov.htm>
- Aug 2003 – The Joint Forum – "Operational risk transfer across financial sectors"
- Jan 2004 – "Principles for the home-host recognition of AMA operational risk capital"
- June 2004 – "International Convergence of Capital Measurement and Capital Standards: a Revised Framework" (Basel II)
<http://www.bis.org/publ/bcbs107.htm> (see [bcbs107.pdf](#))
- July 2004 – "Implementation of Basel II: Practical Considerations"

Motivation (Basle I and Basel II)

- **Basel II recognises the importance of the potential impact of losses due to op risk and requires that banks hold adequate capital to protect against these losses.**
- **Increasing number of high-profile op loss events worldwide has led banks and regulators to view op risk management as an increasingly important process.**
- **In Australia, the national regulator (APRA) is now applying the same detailed scrutiny to op risk as previously to credit risk and market risk.**

What is Operational Risk?

The BCBS (Basel Committee on Banking Supervision) has defined op risk as:

‘the risk of loss resulting from inadequate or failed internal processes, people and systems, or from external events’

- a fairly general definition, hence some debate about inclusion of losses due to changes in business environment.**
- emergence of Strategic Business Risk and Legal Risk.**

What is Operational Risk?

- **The BCBS acknowledges that op risk has a variety of meanings to different banks within the banking industry.**
- **Banks tend to adopt their own definition of op risk.**
- **A clear understanding of what is meant by op risk is critical to effective management and control.**
- **Important that any definition:**
 - **covers the full range of op risks facing the particular bank, and**
 - **focuses on the most significant causes of severe losses due to day-to-day operations.**

What risks are important?

Within the banking industry, the BCBS has identified the following op risk event types that can cause substantial losses (from Annex 7 in the New Accord):

- **Internal fraud** eg intentional misreporting of positions, employee theft, and insider trading on an employee's own account.
- **External fraud** eg robbery, cheque forgery, damage from computer hacking (cyber crime).
- **Employment practices and workplace safety** eg workers' compensation claims, violation of employee OH&S rules, union activities, discrimination claims, and general liability.

What risks are important?

- **Clients, products and business practices** eg breaches of trust, misuse of confidential customer information, improper trading activities on the bank's account, money laundering, sale of unauthorised products.
- **Damage to physical assets** eg terrorism, vandalism, earthquakes, fires, floods.
- **Business disruption and system failures** eg hardware and software failures, telecommunication problems, utility outages, computer viruses, cyber crime.
- **Execution, delivery and process management** eg data entry errors, collateral management failures, incomplete legal documentation, unapproved access given to client accounts, non-client counterparty mis-performance, vendor disputes.

Other important operational risks

- **rogue traders, "bad apples", genuine human error, poor routine decision making, laissez-faire management**
- **sudden mistakes of business partners or outsources, hidden incompetence at multiple levels of an organisation, sudden power outage**
- **domino effect of loss events leading to failure**

Result: it's a risky business!

- **Successful operational risk management is a challenge - distributed nature of the risks - unpredictable low-frequency, high-loss fat tail events.**
- **Rigorous op risk management facilitates an effective response to loss events.**
- **See References – eg Douglas Hoffman.**

Implications of Basel II (the New Accord)

- **Under the Basel II framework, banks have the option of estimating operational risk using one of three approaches with increasing sensitivity to risk:**
 - (1) the Basic Indicator Approach,**
 - (2) the Standardised Approach, or**
 - (3) Advanced Measurement Approaches (AMA).**
- **The first two approaches are provided for banks with low exposure to operational risk. They require that banks hold enough capital to cover operational risk as a fixed proportion of a specified risk measure.**

Advanced Measurement Approaches

- **Third approach, AMA, adopted by the major banks in Australia**
- **Loss Distribution Approach (LDA)**
- **Direct loss and indirect loss**
- **(Key) risk indicators**
- **Scenario analysis**
- **Internal and external (eg Fitch) loss data**
- **Hybrid approaches?**

Loss Distribution Approach

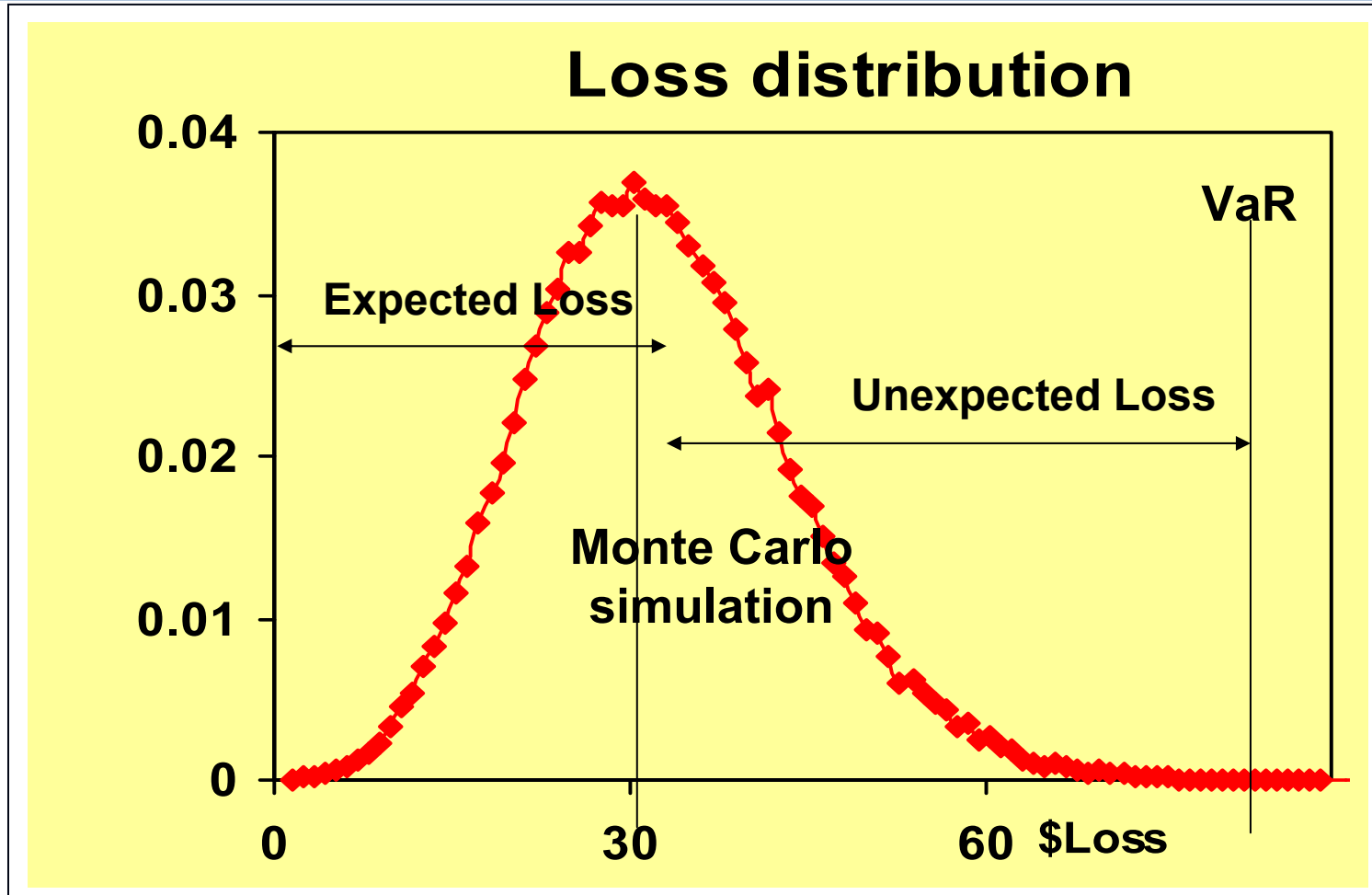
LDA

- **Expected loss (EL)**
eg mean, median, mode
- **Value-at-Risk (VaR)**
– defined at the desired rating level eg 0.999
st Prob [Loss \leq VaR] = 0.999 (ie quantile)
- **Unexpected loss (UL)**
UL = VaR – EL

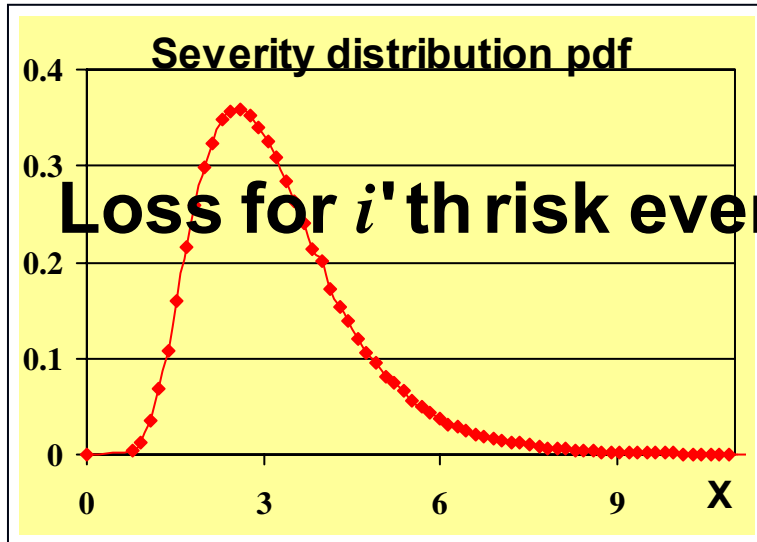
Capital Allocation (Annual Capital Charge)

Unexpected loss = VaR - Expected Loss

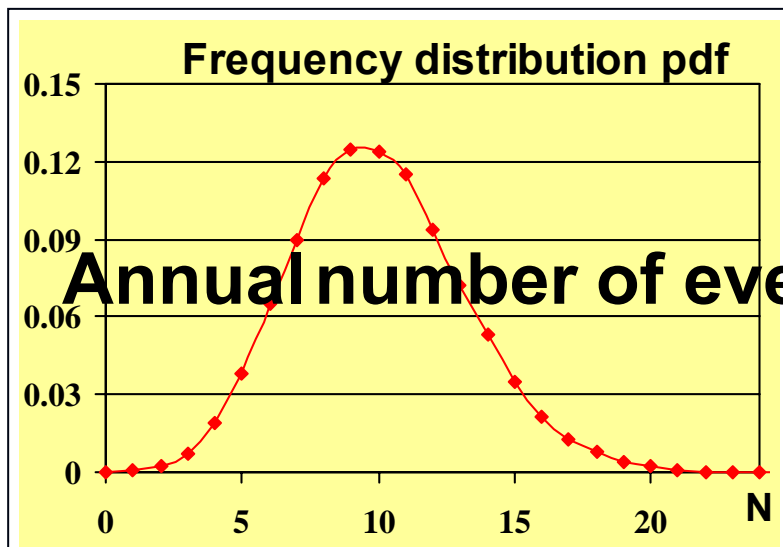
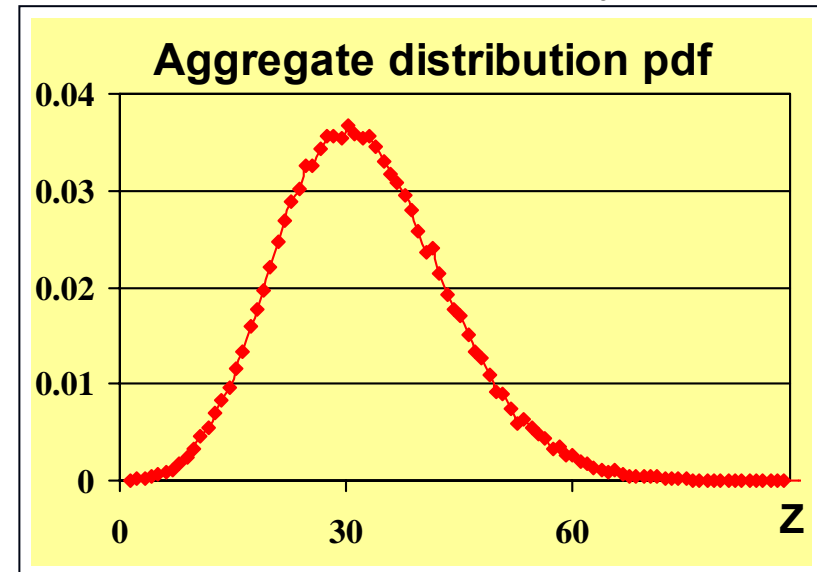
Prob [Loss \leq VaR] = 0.999



Single risk – annual loss over one year



$$\text{Annual Loss } Z_i = \sum_{j=1}^{N_i} X_{ij}$$



AMA Accreditation

Some of the advantages of AMA accreditation

- **Potential reductions in regulatory capital**
- **Competitive advantage through better pricing for op-risk**
- **Saving of funding costs due to reduced regulatory and economic capital**
- **Reduce operational losses through more effective monitoring**
- **Improve preventative mechanisms**
- **Focus on reliability of critical processes**
- **Potentially, standards in common internationally eg with Sarbanes-Oxley**

Large scale application at Commonwealth Bank

Commonwealth Bank



- **Brief history of large project**
 - user acceptance testing of **GORMS** by CSIRO 1999/2000
 - choice of distributions by experts for Monte Carlo simulation
 - modifications and suggestions (eg collect internal data)
 - copula for correlation
- **Collaboration on prototype development**



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The prototype software

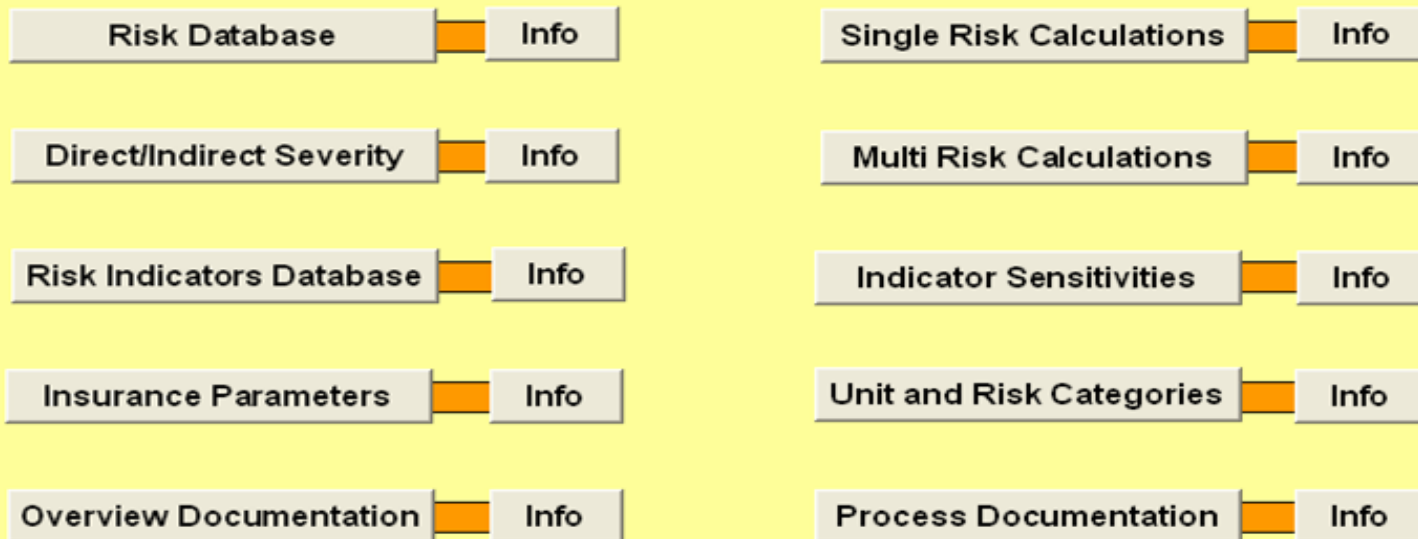
- **Hierarchical tree structure – combination of business unit and risk event type at each node**
 - three levels of business units
 - three levels of risk
- **23 risk categories relate to areas such as customers and relationships, reputation, security, suppliers, technologies, business processes and products, accounting and admin, regulatory changes, etc.**

Prototype

– interim solution during full system build

Operational Risk Capital Model Prototype

Main Menu



*Developed by Group Operational Risk, and CSIRO
Intellectual Property owned by the Commonwealth Bank of Australia*

Commonwealth Bank



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Large scale application at Commonwealth Bank

- **Bank decides to build customised system rather than buy off-the-shelf product**
- **Tender process**
- **Software development team formed**
- **Web-based system built in .Net, C#, Fortran**
- **Following rigorous SDLC**
- **Close liaison with the users – requirements defined in business requirements document**
- **Tech Specs (SRS) documents being written, review and change control**

Recap

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Conclusions

- **A relatively new discipline for statisticians**
- **Many challenges eg**
 - **internal data**
 - **combining internal, external data and expert opinions for estimation of operational risk**
 - **modelling dependence between operational risks**
 - **modelling insurance**
 - **censoring (reporting above a certain threshold)**
 - **practical application of methods for modelling extreme values**
 - **appropriate use of mixture distributions**

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- **Basel Committee on Banking Supervision (January 2004) Principles for the Home-Host Recognition of AMA Operational Risk Capital.**
- **Basel Committee on Banking Supervision (August 2003) High-level Principles for the Cross-border Implementation of the New Accord.**
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