



**foveSIMM**

**a formally verified SIMM**

# In a nutshell

- [OpenSIMM](#): ISDA margin model for non-cleared derivatives
  - does the model *always* perform properly?
- **formal methods**: *proof* for *all* cases, not *testing* of *many*
  - faster, cheaper, surer, eases regulatory approval
  - [Intel](#), [Facebook](#), [Airbus](#), [NASA](#), [Amazon](#), [DARPA](#), [Microsoft](#)
- [foveSIMM](#): a proof-of-concept formally verified SIMM
  - *proves* margin payments *always* increase in the confidence level, are defined, scale with portfolio size and with confidence level
  - *generates* performant, executable Scala code

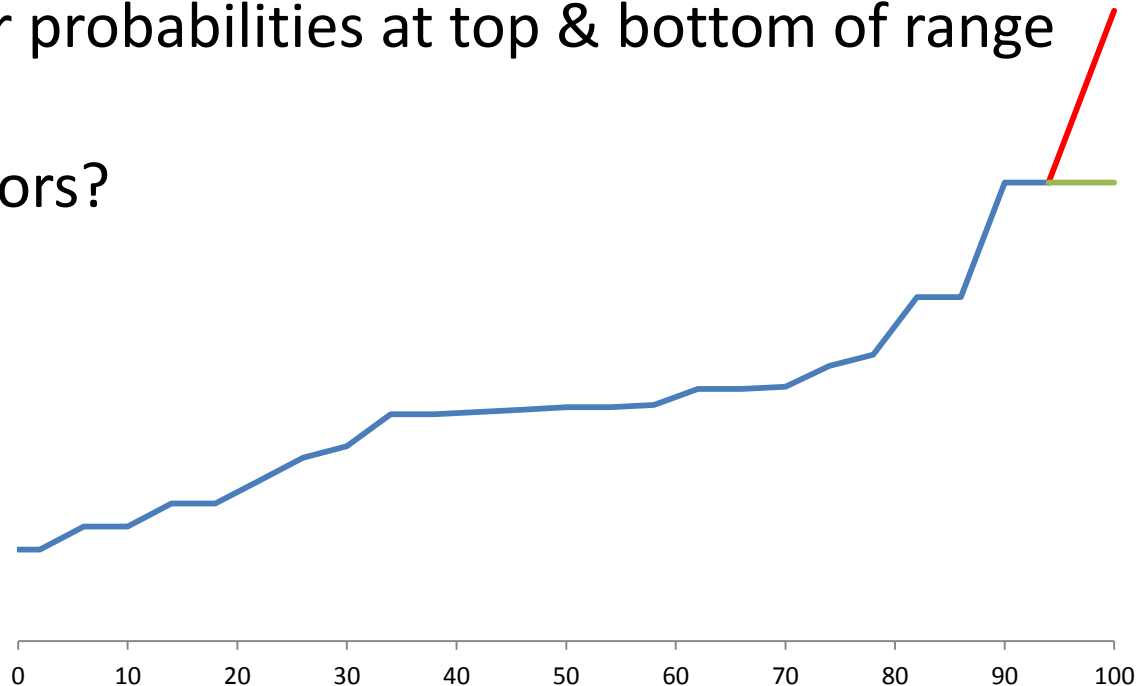
# OpenSIMM

- reference implementation of ISDA's Standard Initial Margin Model (SIMM)
- written in Java 8 (heavily using its functional features)
- version used commercially is not open source



# Trusting OpenSIMM

- built around a **percentile function**,  $f(L, p)$ 
  - $L$ , a list of shocks
  - $p$ , a probability
- OpenSIMM fails for probabilities at top & bottom of range
- are there other errors?



# Traditional development cycle (small model or small change)

1. quant builds a prototype (c. 1 month)
  2. functional specs, business requirements (c. 2 months)
  3. developers write code (c. 2 months)
  4. testing (c. 1 month)
  5. validation (c. 1 month)
    - shows correct performance on test cases
  6. regulatory approval (c. 3-9 months)
    - shows correct performance on test cases
- scales poorly: new cases and interactions to test

# Formal development cycle

1. quant prototype is functional, extracts production code
  - writes definitions, theorems (properties of the model)
  - with prover, writes *proofs* for *all* cases
2. validators, regulators can focus on definitions, theorems
  - prover: general purpose, open source, small core
- scales well: more libraries mean more proven results
  - wrote boundedness proof strategy in c. 1 minute
  - prover then found proof automatically in c. 20 seconds
- faster, cheaper & better risk management

# Preliminary theorems

1. **bounded:**  $f(L, p)$  is always less than its value at  $p = \bar{p}$
2. **monotonic:**  $f(L, p)$  weakly increases over  $p \in [0, 1]$ 
  - thus,  $f(L, p)$  is *defined* for *all*  $p \in [0, 1]$   
(Java's was undefined above top,  $\bar{p}$  & below bottom,  $\underline{p}$ )
3. **homogeneity:**  $f(L, p)$  scales with the portfolio size

$$f(\alpha \times L, p) = \alpha \times f(L, p)$$

e.g. doubling portfolio, *always* doubles margin

# Lipschitz continuity theorem

- knowing the margin payment at  $p_1$  bounds it at *any*  $p_2$

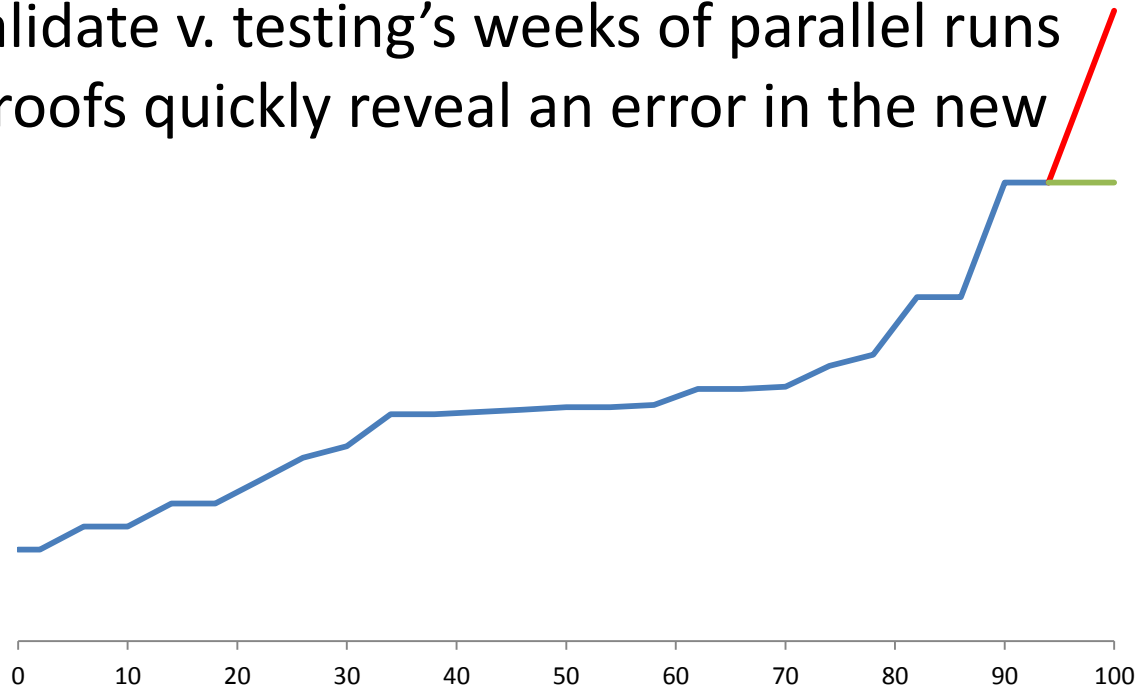
$$f(L, p_2) - f(L, p_1) \leq k \times (p_2 - p_1)$$

- typically, a model change like this would require
  - 3 weeks of parallel runs
  - back/stress-testing on *all* relevant portfolios
- no need to re-compute: it's proven



# Validating a model change

- horizontal extension to  $f(L, p)$  is very conservative
- we change the definition of  $f(L, p)$  and re-run the proofs
  - losses increase above  $\bar{p}$  at the *worst* historic rate
  - 10 hours to re-validate v. testing's weeks of parallel runs
  - problems with proofs quickly reveal an error in the new definition



# Comparing executable code

OpenSIMM's Java	verified Scala
c. 1,700 lines of code	c. 3,000 lines of code
<1 sec run time	<1 sec run time
excludes data files	includes data files
c. ½ are comments	code unoptimised

- can also [generate executable code](#) in Haskell, OCaml, SML

# sorry

- a proof fails if any step in it fails
- can insert a **sorry** statement in the code
  - prover skips that step, accepting it as true
  - eases modular code development
- can then have operational risk discussion:
  1. take the risk, and use the unverified code
  2. use traditional software engineering to mitigate the risk
  3. remove it by verifying it

# to do list

1. confirm the formulae for the IR asset class
2. read data from same input files as OpenSIMM
  - use OpenSIMM's I/O routines, plugging Scala into Java
3. refine Isabelle code
  - use existing library results, not our own
  - eliminate 'sorry' statements
4. optimise the executable Scala code
5. 'sign' the executable code to certify its origins