

# Cross Gamma approximations of a portfolio's CVA value

Comparing the performance of “bumping over AAD” for Tape-Based AAD vs Code Generation AAD to compute second-order greeks

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# Experiment 3:

- The third and final experiment wanted to test what “bumping over AAD” offers with respect to the cross Gamma approximations of a portfolios CVA value
- Calculating the Cross Gamma Hessian entries w.r.t the points on the Volatility Term structure curves
- How do the approximation methods scale as we increase the computational load on the the respective engines

is defined below:

$$\left. \begin{aligned} \frac{\partial^2 CVA}{\partial \theta_{\sigma_1} \partial \theta_{\sigma_2}} &= \frac{CVA(\sigma_1^{+\Delta_1}, \sigma_2^{+\Delta_2}) + CVA(\sigma_1^{-\Delta_1}, \sigma_2^{-\Delta_2})}{4\Delta_1 \Delta_2} \\ &\quad - \frac{CVA(\sigma_1^{+\Delta_1}, \sigma_2^{-\Delta_2}) - CVA(\sigma_1^{-\Delta_1}, \sigma_2^{+\Delta_2})}{4\Delta_1 \Delta_2} \end{aligned} \right\}$$

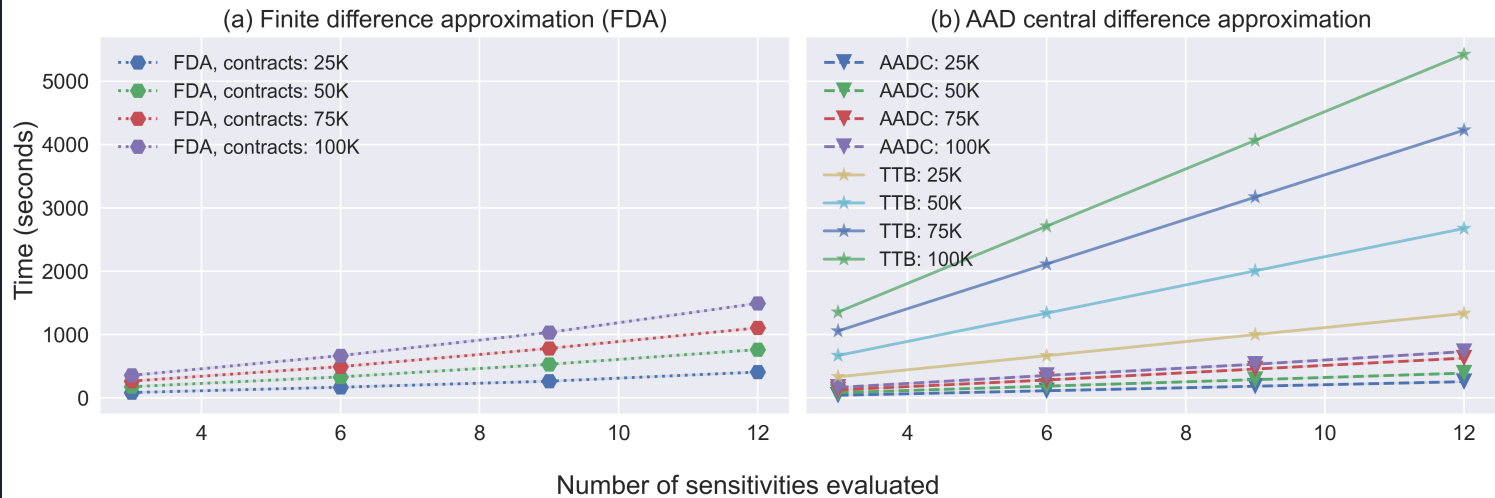
## “Bumping over AAD”

$$\frac{\partial CVA_{AAD}}{\partial \theta_{\sigma}} = \frac{CVA_{AAD}(\theta_{\sigma} + \Delta\theta_{\sigma}) - CVA_{AAD}(\theta_{\sigma} - \Delta\theta_{\sigma})}{2\Delta\theta_{\sigma}} + \mathcal{O}(\Delta\theta_{\sigma}^2)$$

# Scaling behaviour of both engines:

## Quadratic vs linear scalability

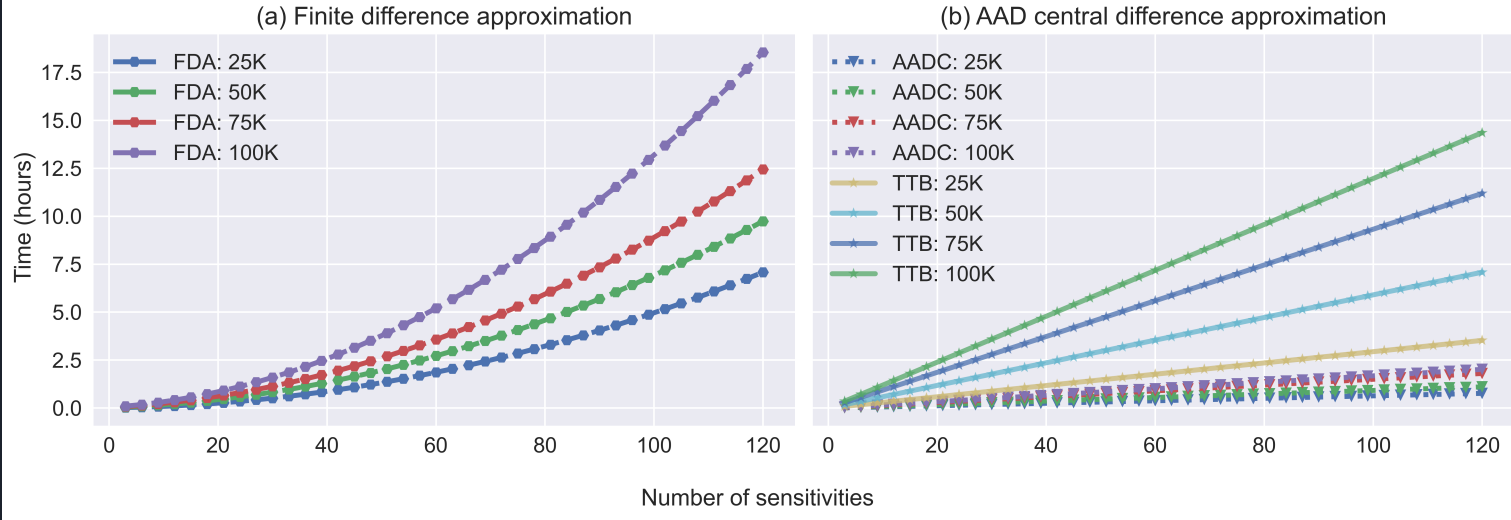
Computation time (s) for the evaluation of varying cross-gamma sensitivities using 3000 MC paths



# Scaling behaviour of both engines:

## Quadratic vs linear scalability

Theoretical Computation time (hrs) to evaluate all cross gamma sensitivities w.r.t one currency pair for 3000 MC paths and varying contracts



## For all 120 Cross Gamma Hessian entries (between two currencies)

The evaluation of 120 Cross Gamma Hessian (**120 points of the Volatility term structure curves**) entries could then be computed w.r.t to two currencies and

$$\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{GBP} = \frac{\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{USD} + \frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{USD}}{2}$$

<i>Method</i>	Number of contracts in portfolio			
	25,000	50,000	75,000	100,000
	Evaluation time (hrs)			
<i>B&amp;R</i>	6.32	8.70	11.11	16.56
<i>B&amp;AADC</i>	0.77	1.10	1.80	2.02
<i>B&amp;TTB</i>	3.52	7.08	11.18	14.35
	Order of improvement attained ( $\mathcal{O}$ )			
<i>B&amp;AADC</i>	0.96	0.94	0.83	0.96
<i>B&amp;TTB</i>	0.31	0.13	0.046	0.11
	Theoretical speed up			
<i>B&amp;AADC</i>	9.24	8.82	6.90	9.19
<i>B&amp;TTB</i>	2.00	1.37	1.11	1.29

TABLE 4.19: Theoretical time taken, Order of Improvement ( $\mathcal{O}$ ) and computational speed-up realised for the evaluation of all Cross gamma sensitivities (120) with respect to a single currency pair using finite difference approximations vs 'bumping' over AAD. Employing 3000 MC paths

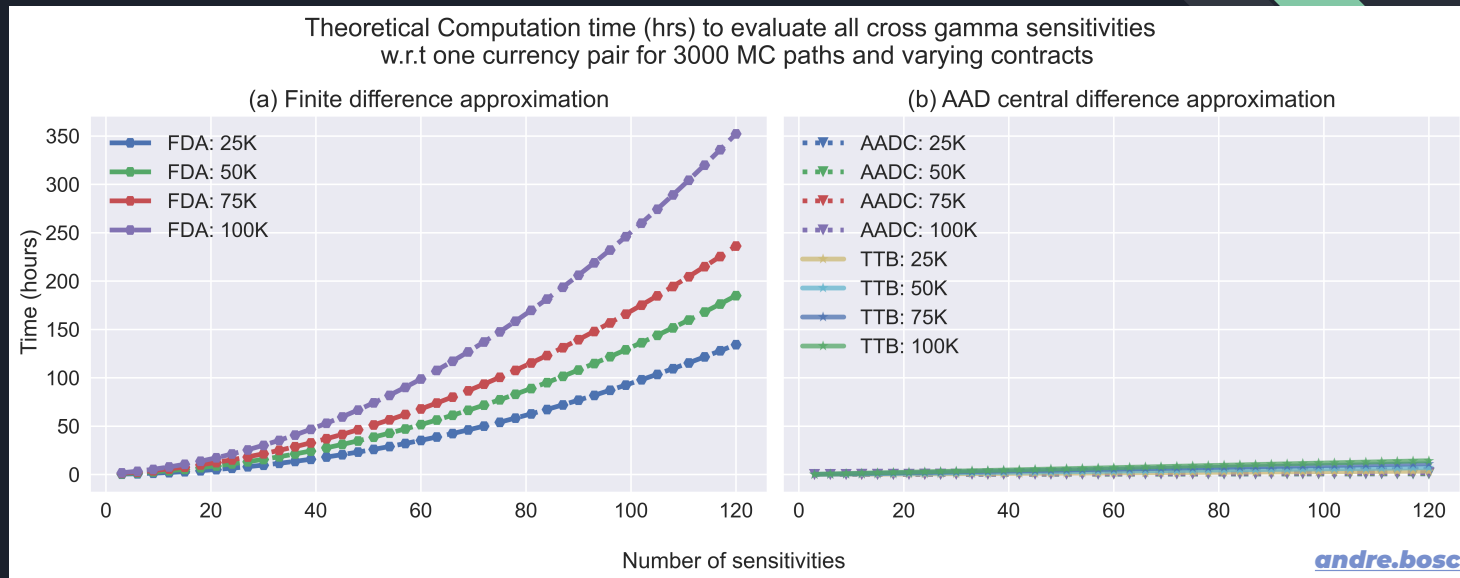
For all 2280 Cross Gamma Hessian entries (between two currencies)

Using “bumping over AAD” does however house an incredibly **scalable advantage**

**All first-order adjoints are evaluated** w.r.t to the Volatility term structure curves

$$\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{GBP} = \frac{\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{xCurrencies}}{2} + \frac{\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{xCurrencies}}{2}$$

Essentially producing the remaining 2280 Cross Gamma Hessian Entries by



# For all 2280 Cross Gamma Hessian entries (between two currencies)

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$$\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{GBP} = \frac{\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{xCurrencies}}{2} + \frac{\frac{\partial CV A_{AAD}}{\partial \theta_{\sigma}}_{xCurrencies}}{2}$$

Essentially producing the remaining 2280 Cross Gamma Hessian Entries by producing the original 120 !

<i>Method</i>	Number of contracts in portfolio			
	25,000	50,000	75,000	100,000
	Evaluation time (hrs)			
<i>B&amp;R</i>	120.06	165.23	211.09	314.63
<i>B&amp;AADC</i>	0.77	1.10	1.80	2.02
<i>B&amp;TTB</i>	3.52	7.08	11.18	14.35
	Order of improvement attained ( $\mathcal{O}$ )			
<i>B&amp;AADC</i>	2.24	2.22	2.11	2.24
<i>B&amp;TTB</i>	1.58	1.41	1.32	1.38
	Theoretical speed up			
<i>B&amp;AADC</i>	175.64	167.64	131.11	174.74
<i>B&amp;TTB</i>	38.11	26.12	21.13	24.54

TABLE 4.21: Theoretical time taken, Order of Improvement ( $\mathcal{O}$ ) and computational speed-up realised for the evaluation of all Cross gamma sensitivities (2240) with respect to a main currency paired with all other currencies using finite difference approximations vs 'bumping' over AAD. Employing 3000 MC paths