

Quantitative Research & Investment Strategy

Emma Battellino, Ron Bewley, Tally Dewan, Joanna Nash
and Simon Sando

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Does One Size Fit all?

Volatility in the US and Australia

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Outline of talk

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1. Introduction – features of the two markets
 2. Clusters or outliers?
 3. Switchbacks
 4. GARCH models with shifts
 5. Conclusions

Annualised Volatility Statistics (%)

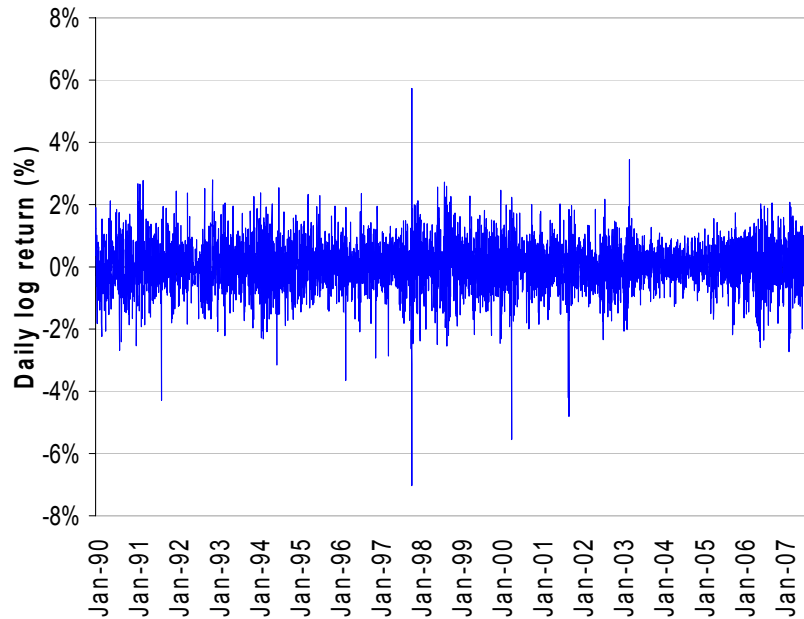


Data Frequency	S&P/ASX 200 Index	S&P 500 Index
Daily	12.83	15.74
Weekly	12.16	14.86
Monthly	12.39	13.69

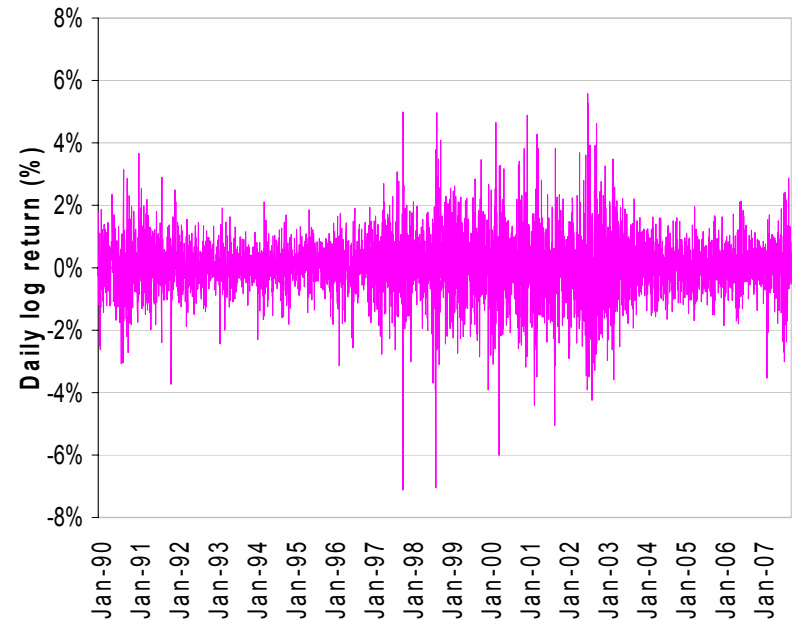
Source: CommSec Quantitative Research & Investment Strategy

Similar regimes? - Daily log returns

S&P/ASX 200 Index



S&P 500 Index



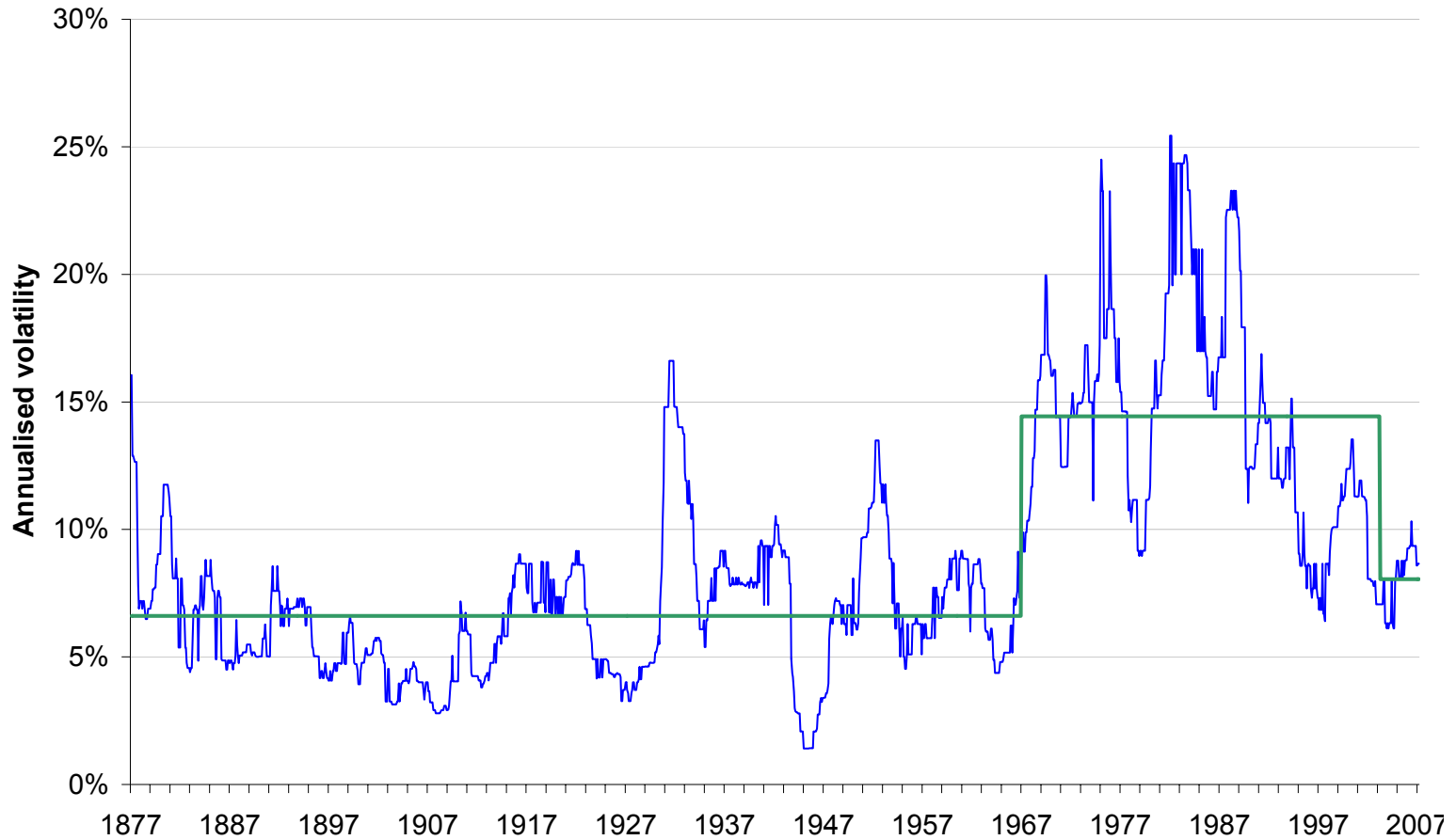
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Where is long-run volatility heading?

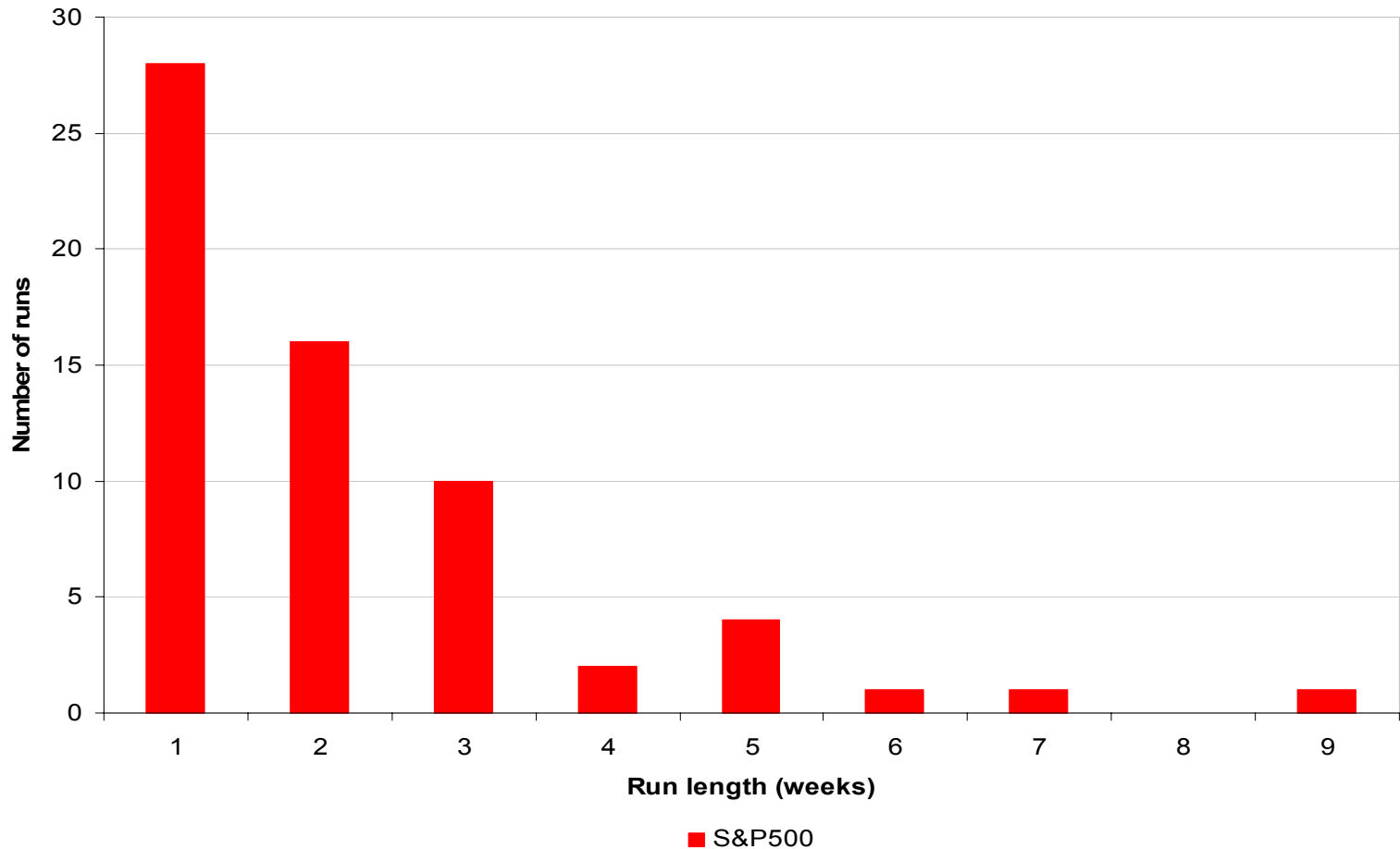
1. Work by Engle and Rangel (2007) has suggested that many countries are in low volatility regimes and will revert back to higher volatility levels
2. We suggest that Australia has already mean reverted – back to a lower level
3. To challenge Engle and Rangel's results we consider the Australian All Ordinaries, the only equities series that we have data back before 1984
4. We take 25-month rolling windows of absolute demeaned monthly returns and look at the change over time

Annualised Volatility of the All Ordinaries



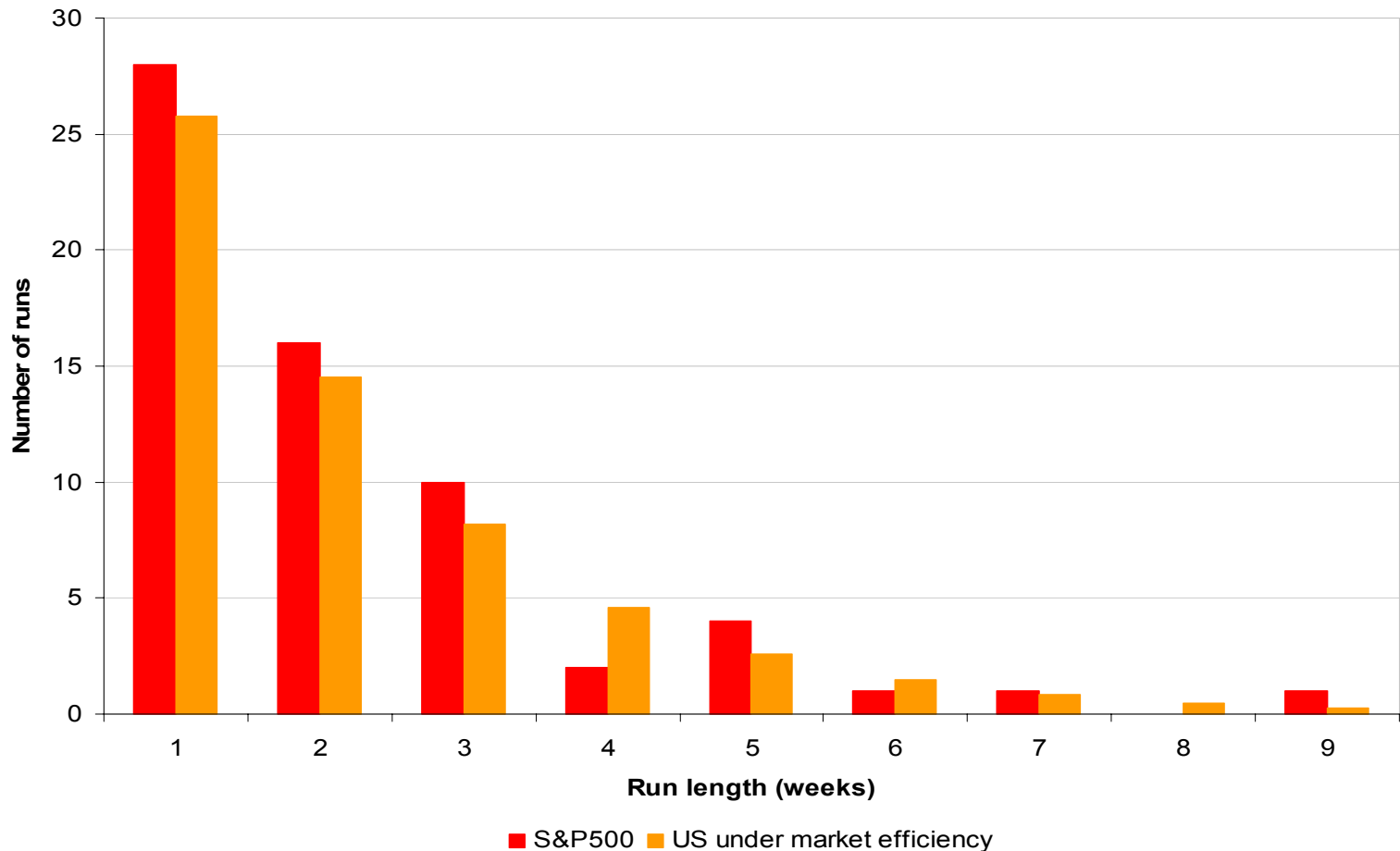
Source: CommSec Quantitative Research & Investment Strategy

Actual distribution of run-lengths of positive weekly returns: S&P 500



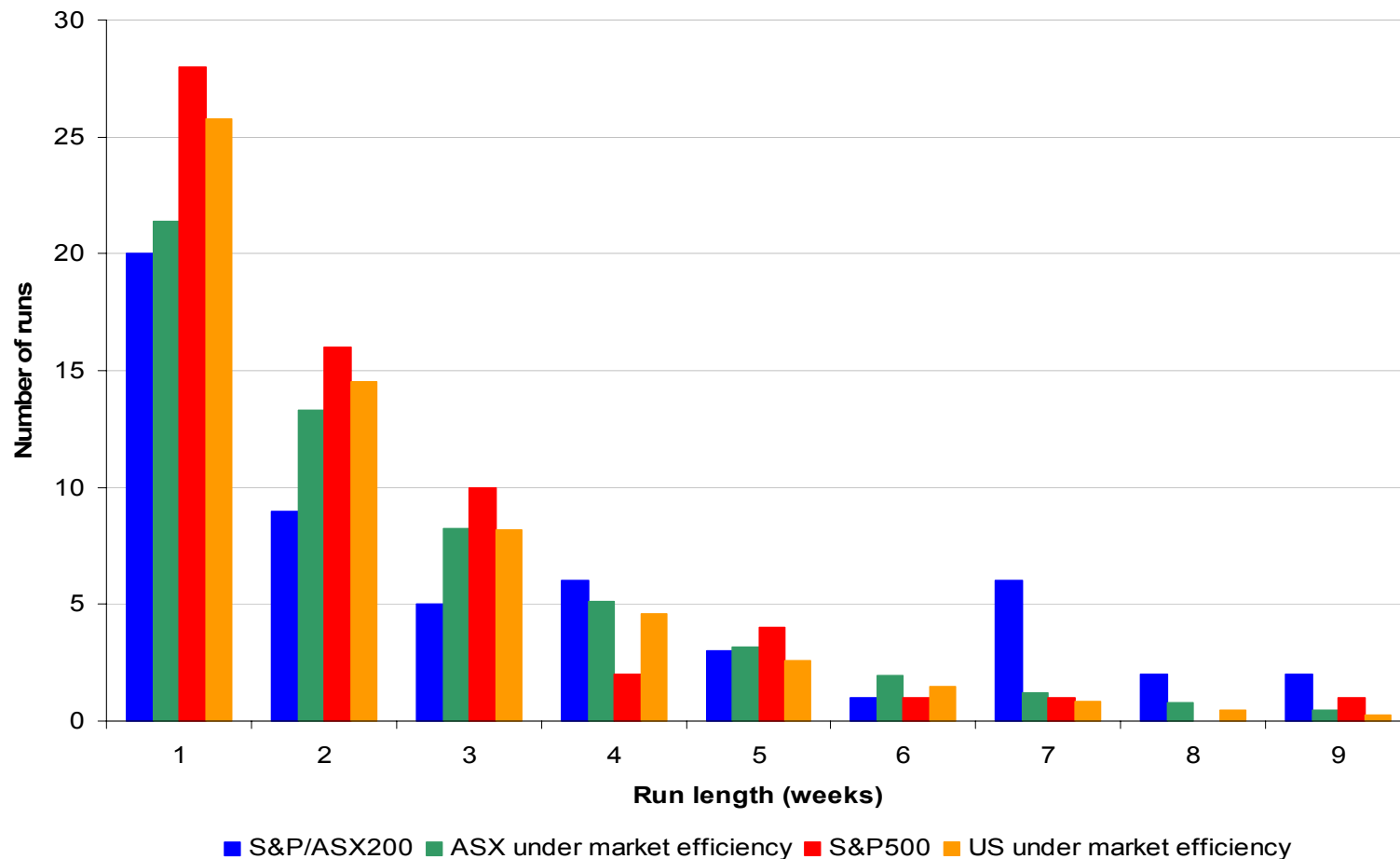
Source: CommSec Quantitative Research & Investment Strategy

Actual and simulated distributions of run-lengths of positive weekly returns: S&P 500



Source: CommSec Quantitative Research & Investment Strategy

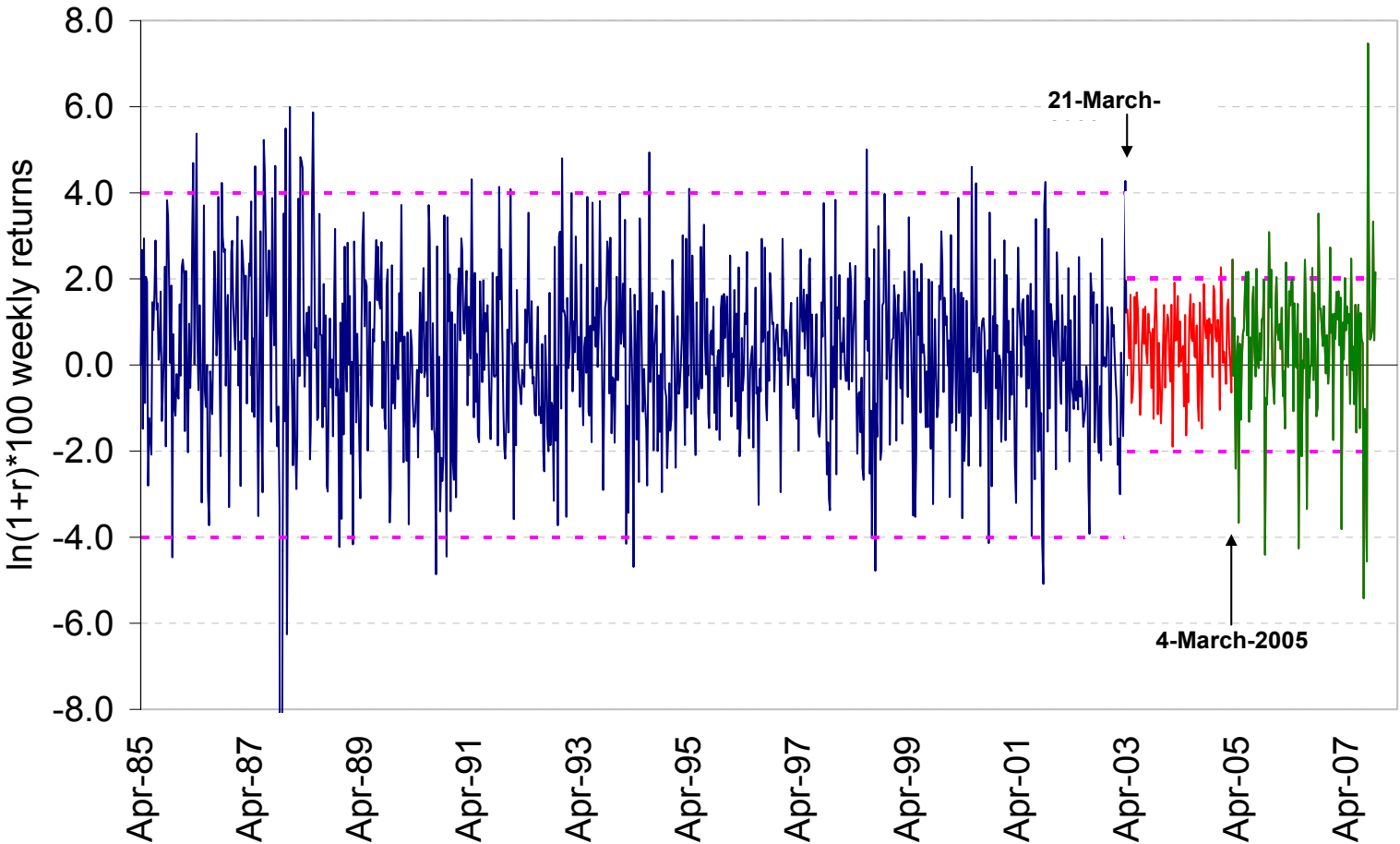
Actual and simulated distributions of run-lengths of positive weekly returns: S&P/ASX 200 and S&P 500



Source: CommSec Quantitative Research & Investment Strategy



S&P/ASX 200 Index volatility



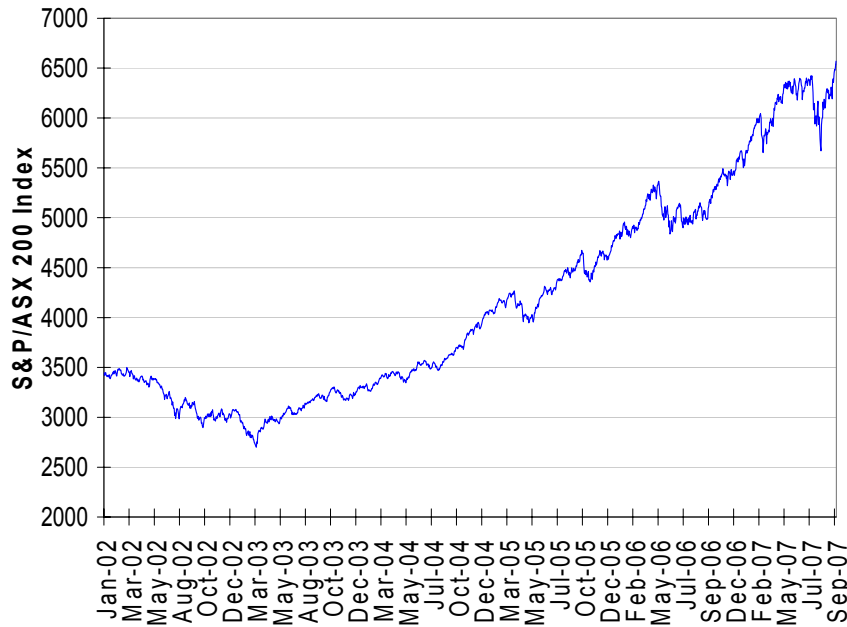
Source: CommSec Quantitative Research & Investment Strategy



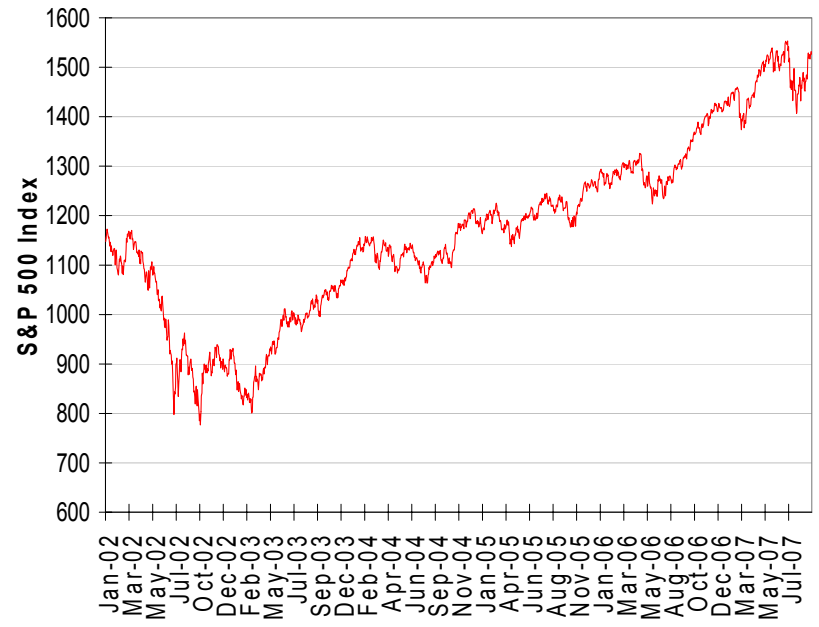
Index 2002 - Present



S&P/ASX 200 Index



S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy

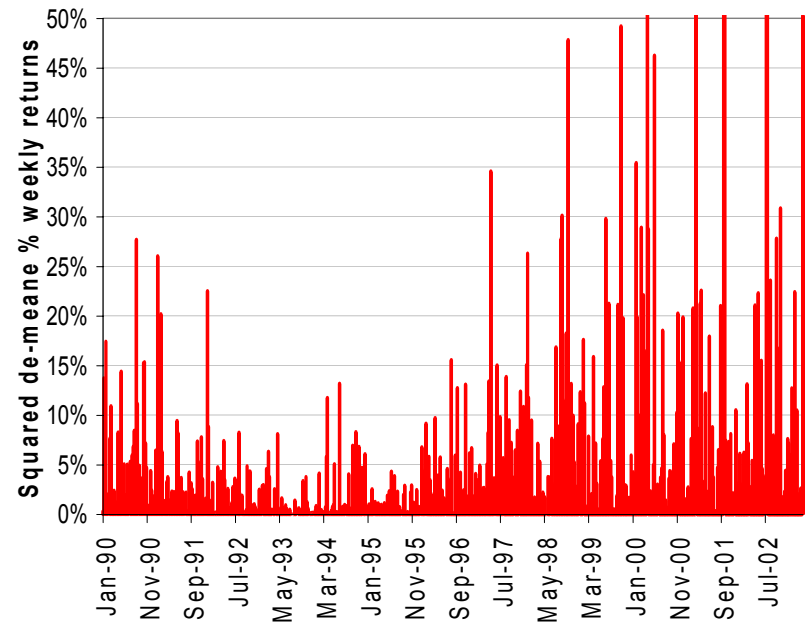
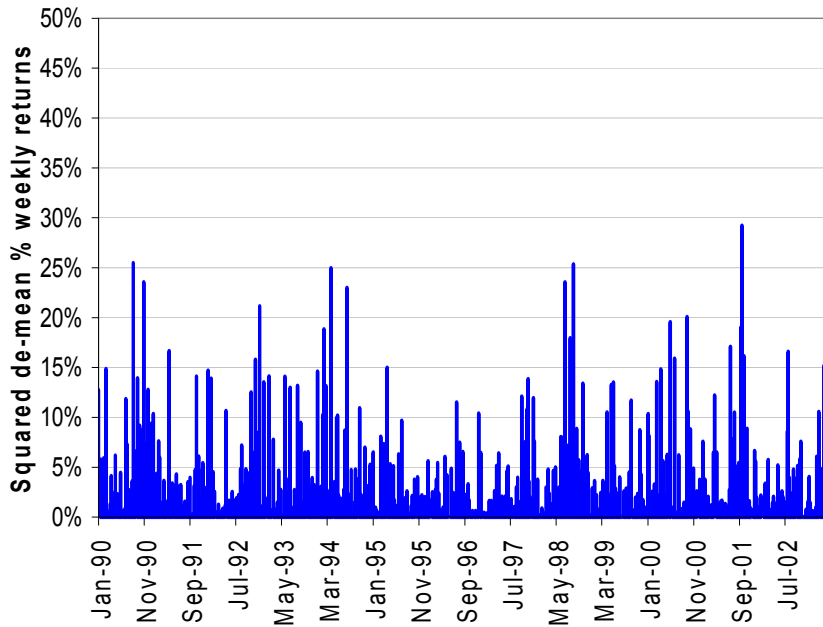


Clusters in S&P/ASX 200 Regime 1?



S&P/ASX 200 Index

S&P 500 Index



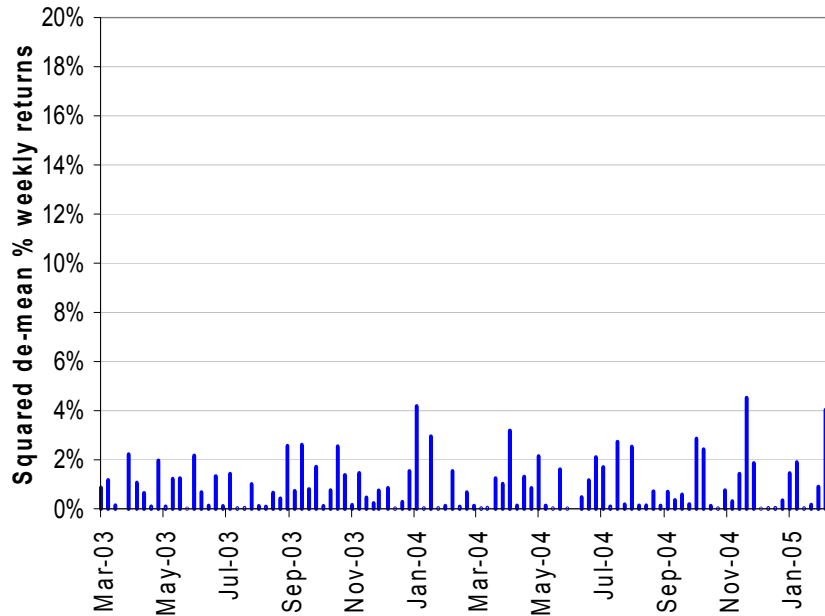
Source: CommSec Quantitative Research & Investment Strategy



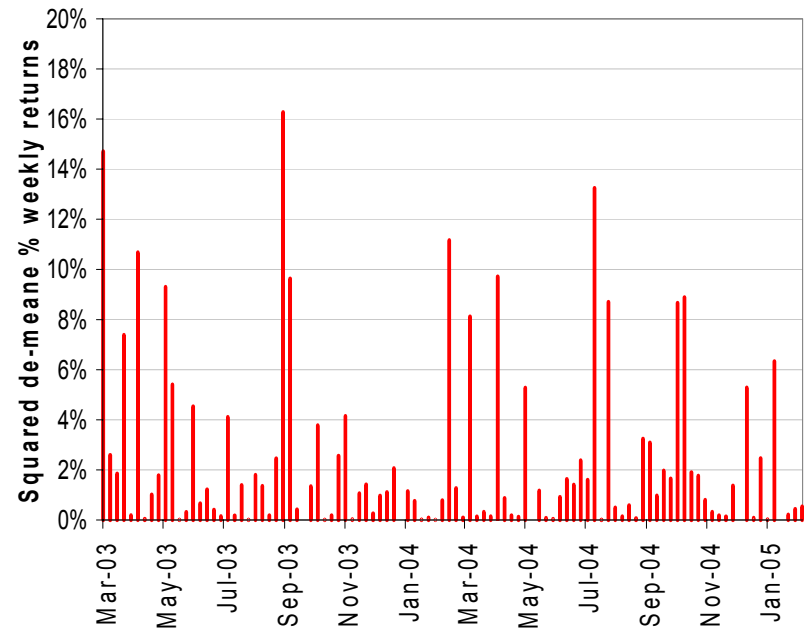
Clusters in S&P/ASX 200 Regime 2?



S&P/ASX 200 Index



S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy

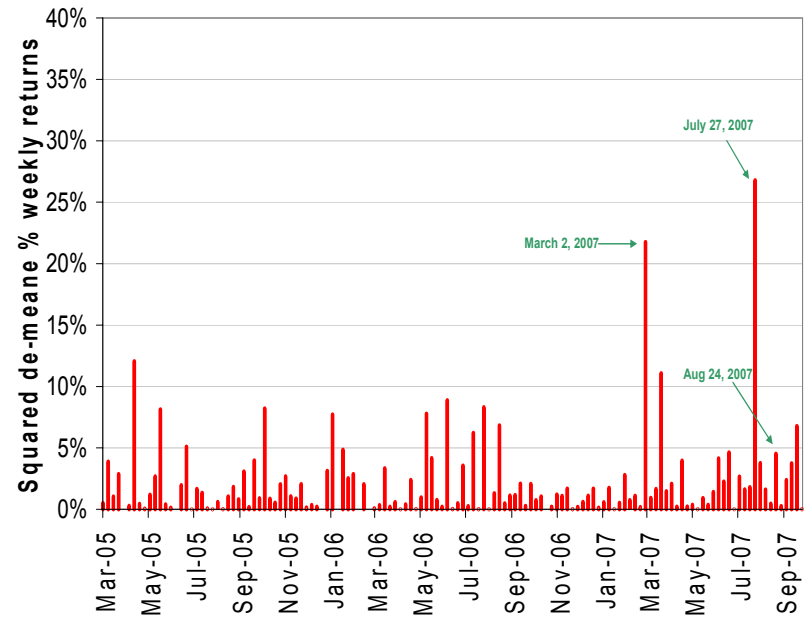
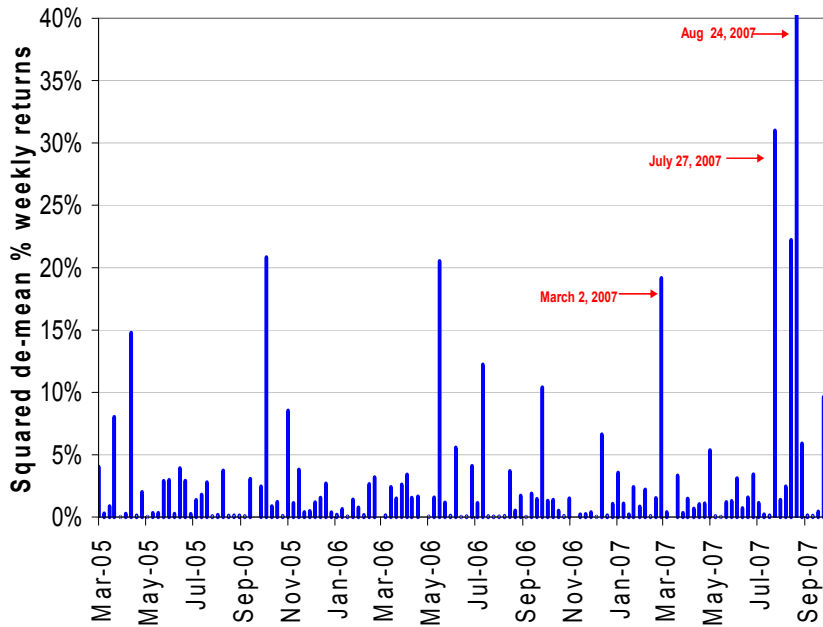


Clusters in S&P/ASX 200 Regime 3?



S&P/ASX 200 Index

S&P 500 Index



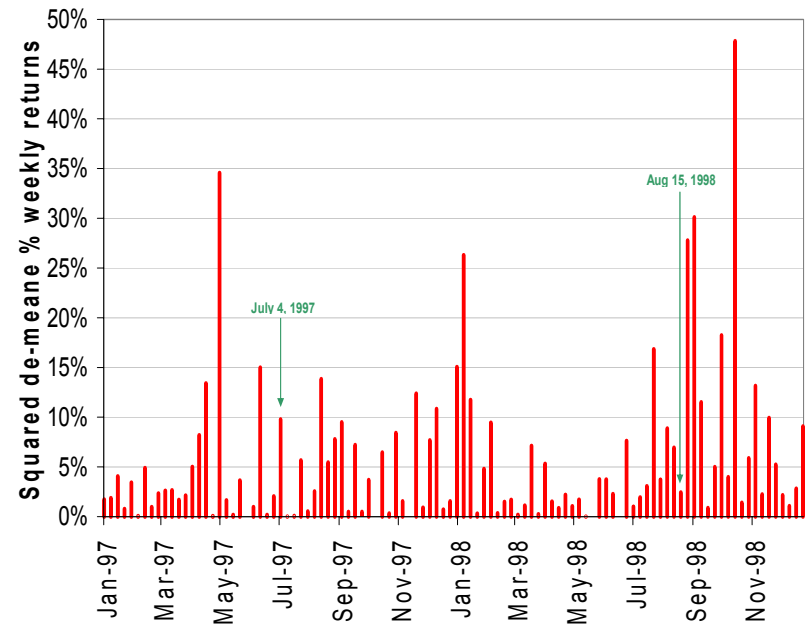
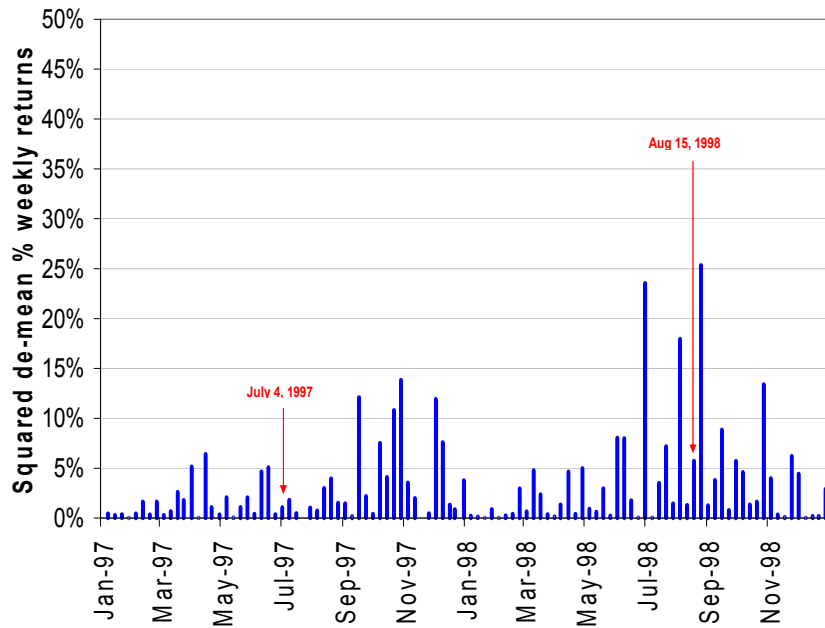
Source: CommSec Quantitative Research & Investment Strategy



Hong Kong handover-1/7/97 & Asian crisis - 15/8/98

S&P/ASX 200 Index

S&P 500 Index



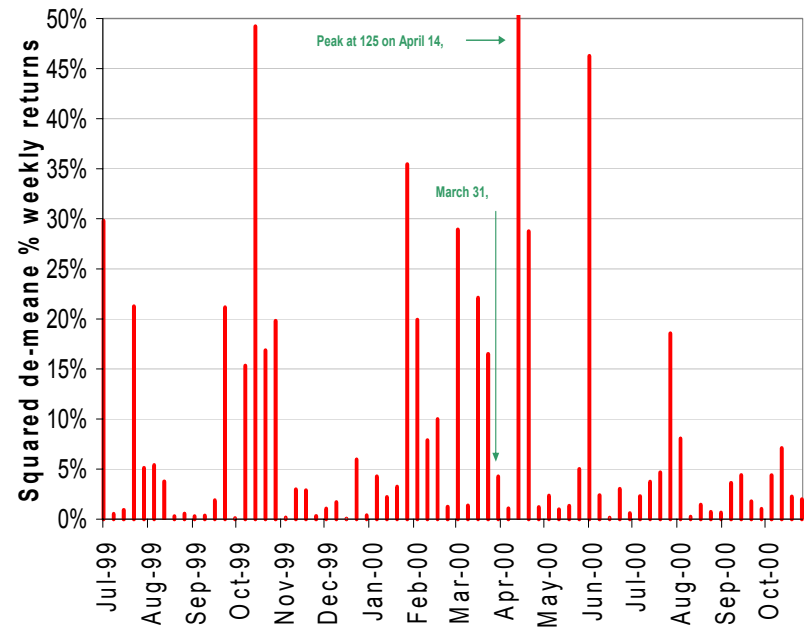
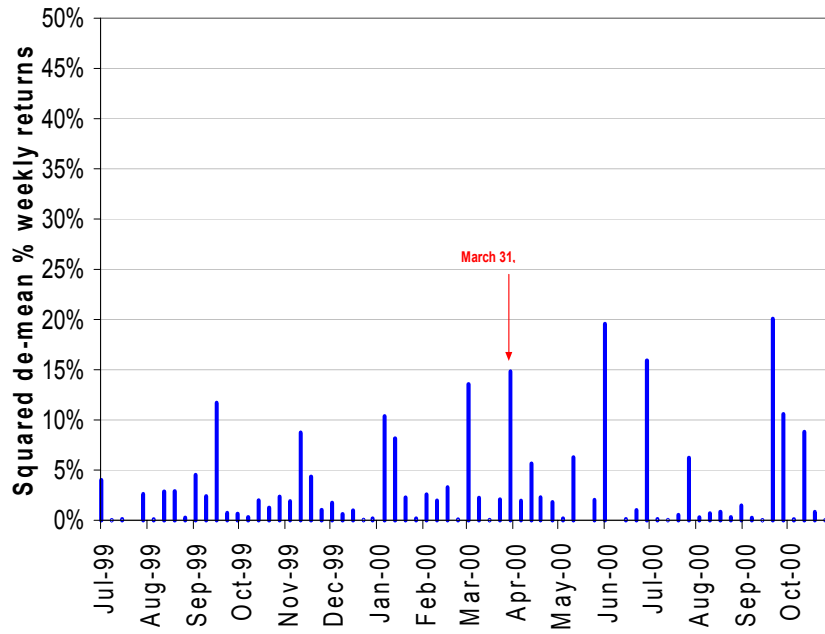
Source: CommSec Quantitative Research & Investment Strategy

Tech wreck bubble - 27/3/00



S&P/ASX 200 Index

S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy

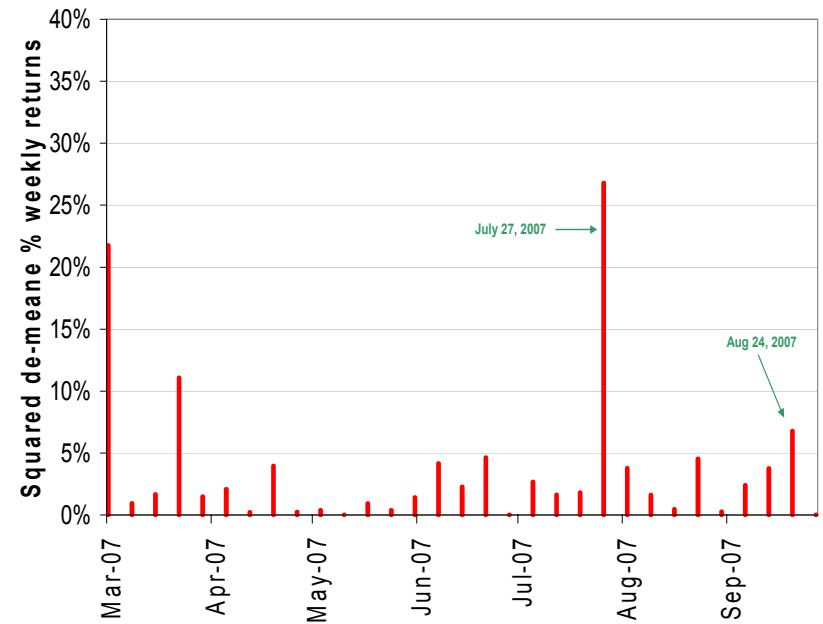
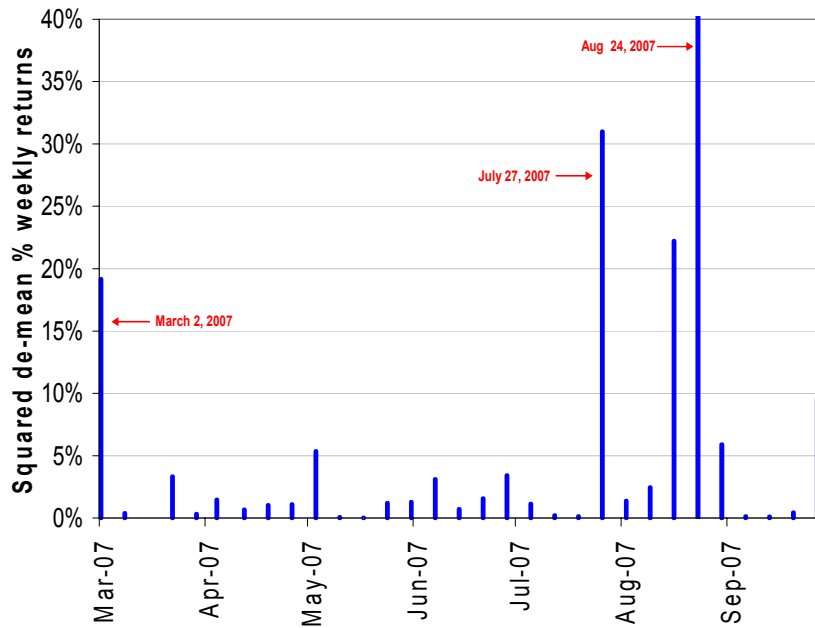


Recent sub-prime crisis – weekly returns



S&P/ASX 200 Index

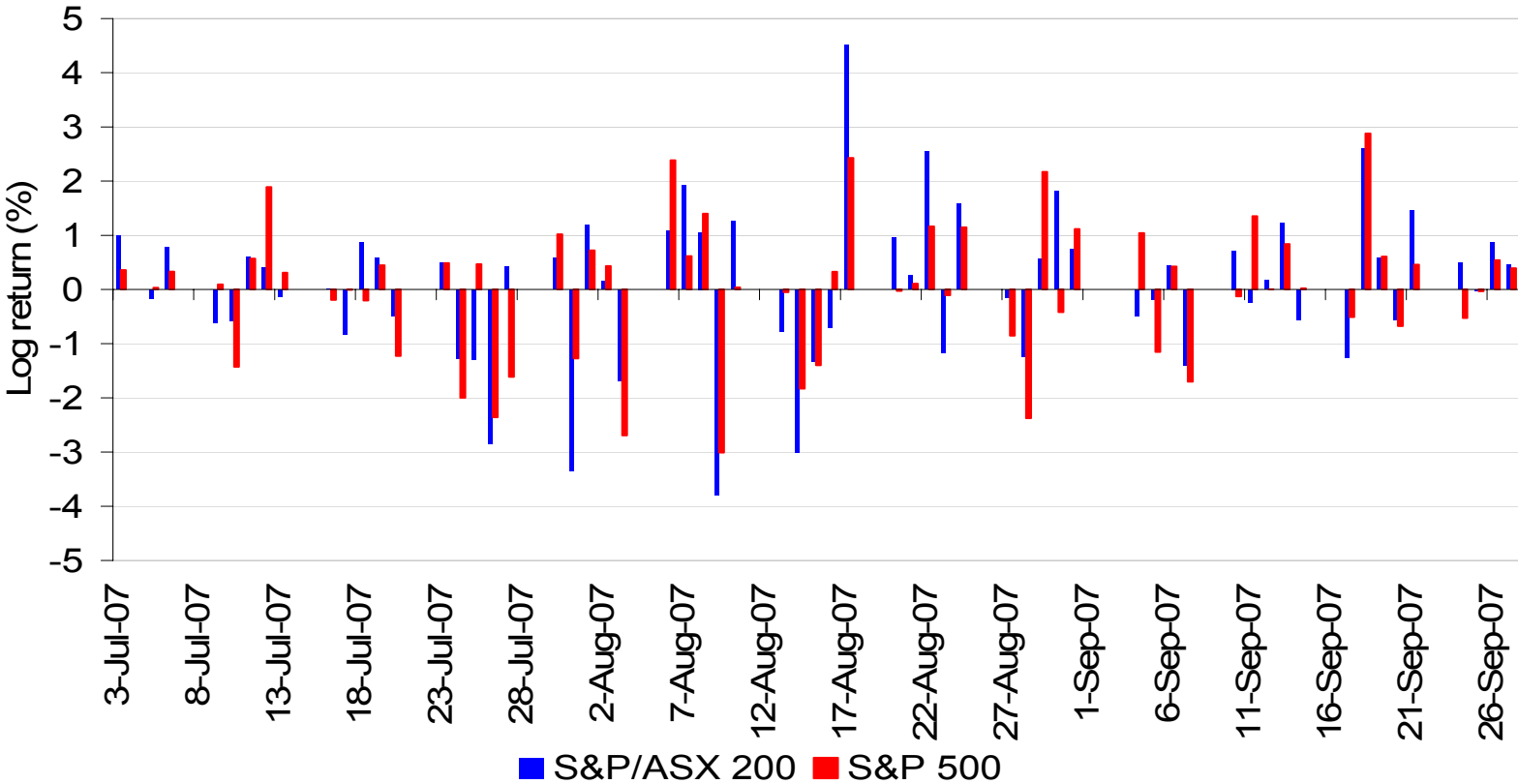
S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy



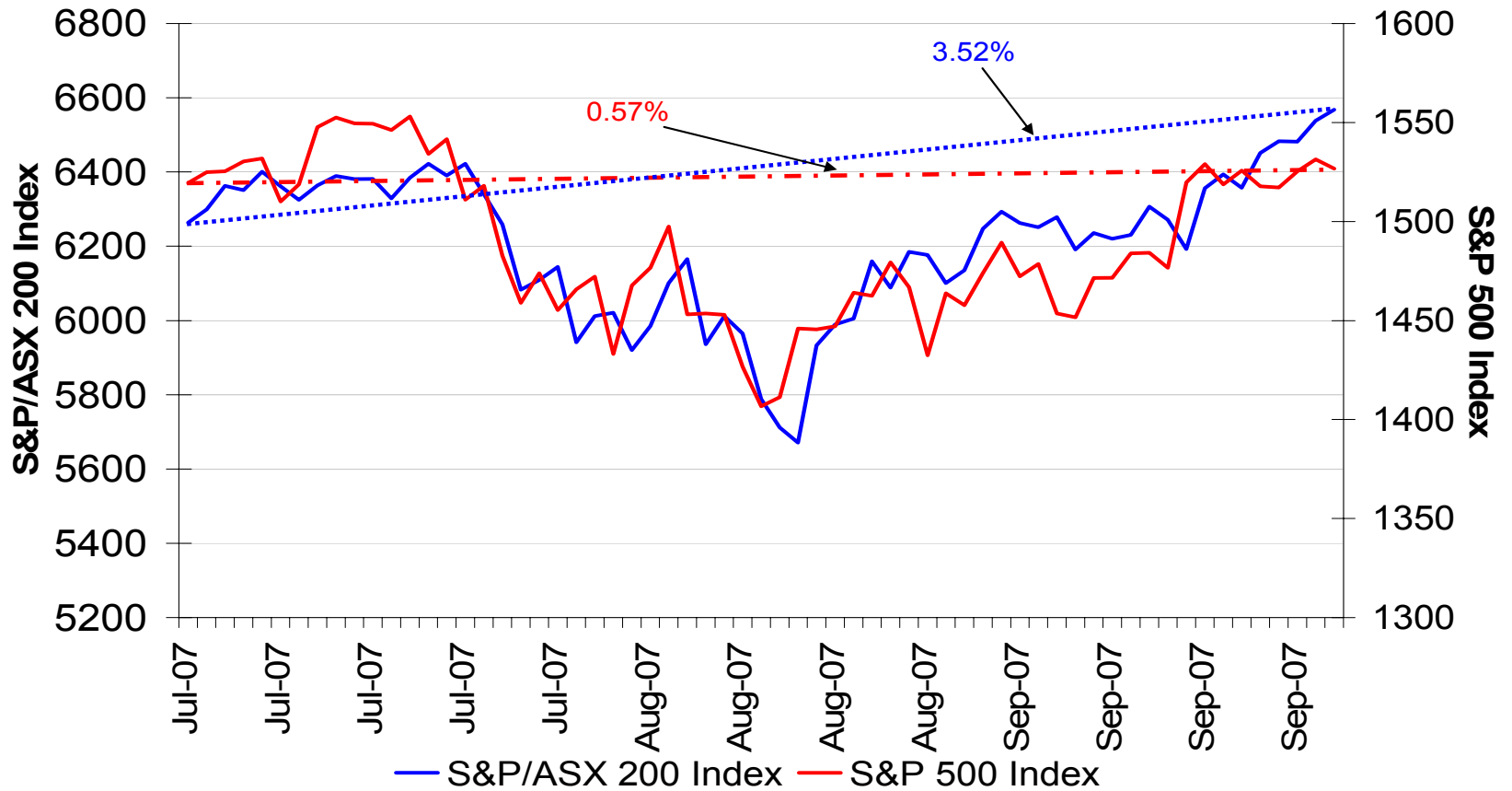
Recent credit crisis - daily returns



Source: CommSec Quantitative Research & Investment Strategy




Recent Growth rates in the two markets




Source: CommSec Quantitative Research & Investment Strategy



Visual conclusions

- 
1. Changes in the volatility regime for Australia – have moved from volatility clusters to outliers
 2. US heavily dominated by clustering in the volatility
 3. Have other market factors changed – switchbacks, autocorrelation?
 4. What does this mean for modelling volatility?

Switchbacks

- 
1. Switchbacks are two consecutive outliers that occur when we observe a large increase (decrease) followed by an approximately equal (in terms of size) decrease (increase) in the data
 2. Switchback rules
 - Must be in the top quartile of returns for the previous year
 - Next observation must be of opposite sign
 - Next observation must be within 25% of the original observation of the switchback pair

How to correct for switchbacks?



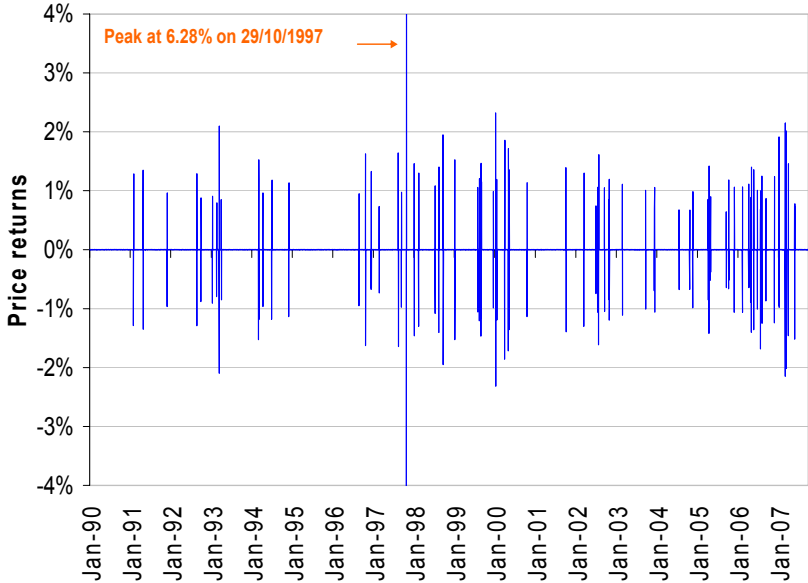
$$AR : y_t = a + by_{t-1} + cD_t + u_t$$

$$Int : y_t = a + b(y_{t-1} - cD_{t-1}) + cD_t + u_t$$

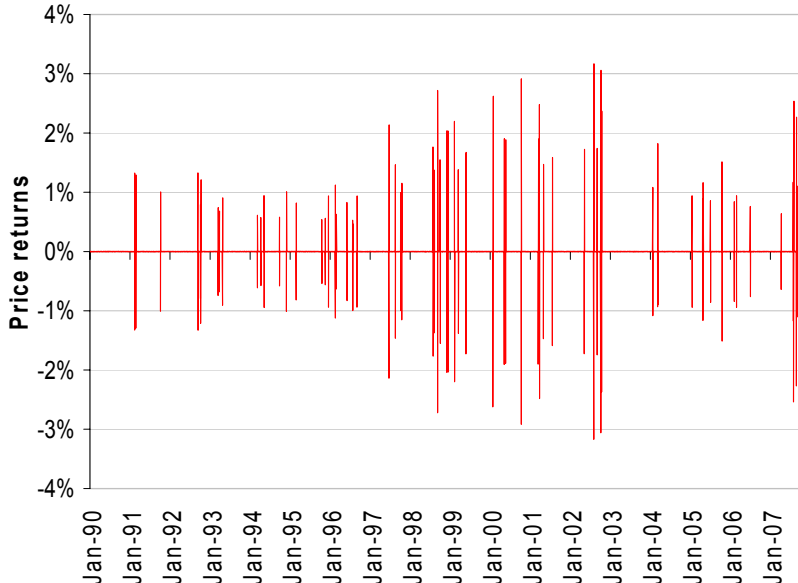
Switchbacks



S&P/ASX 200 Index



S&P 500 Index



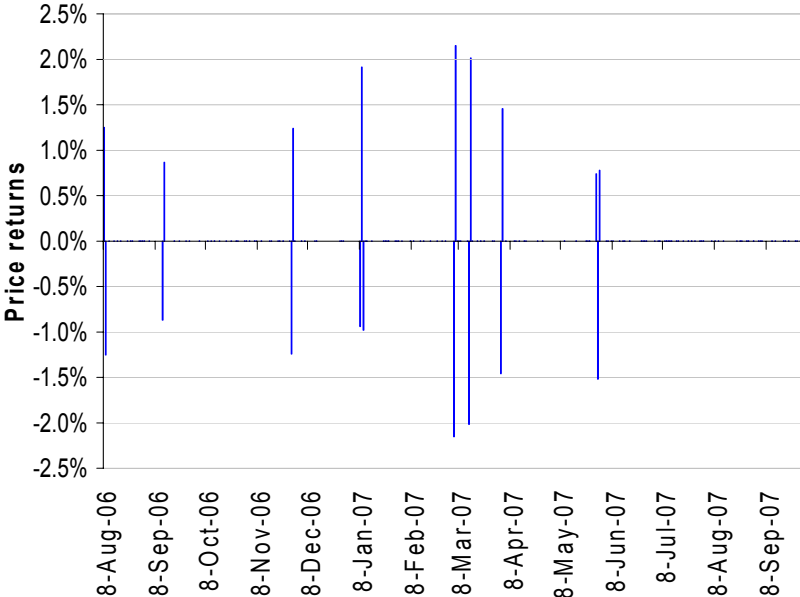
Source: CommSec Quantitative Research & Investment Strategy



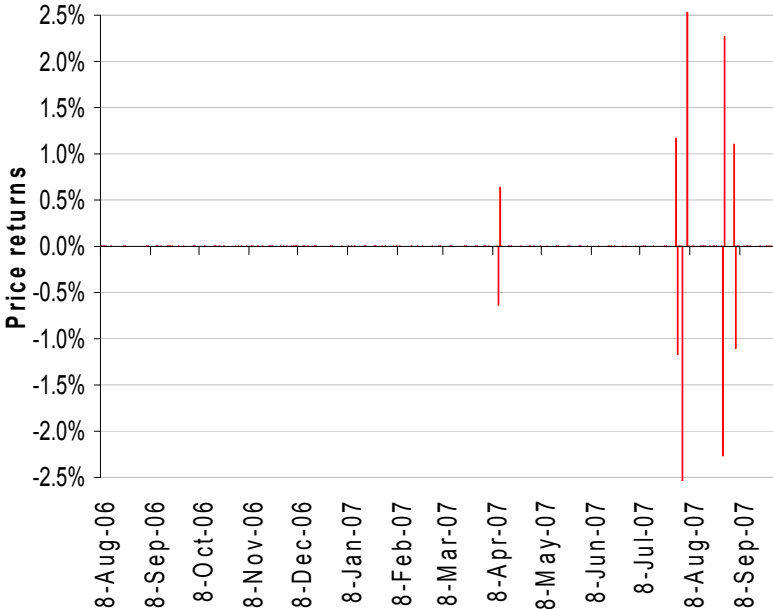
Recent switchbacks or 'news'



S&P/ASX 200 Index



S&P 500 Index

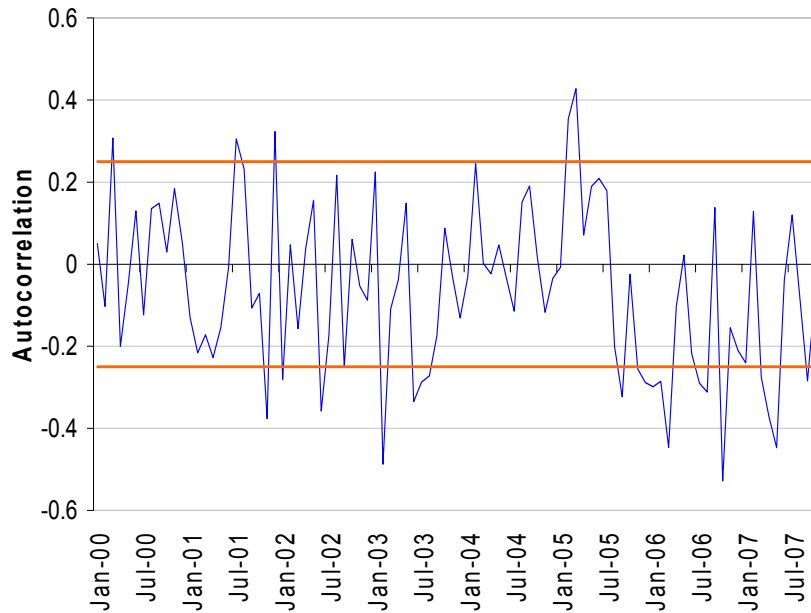


Source: CommSec Quantitative Research & Investment Strategy

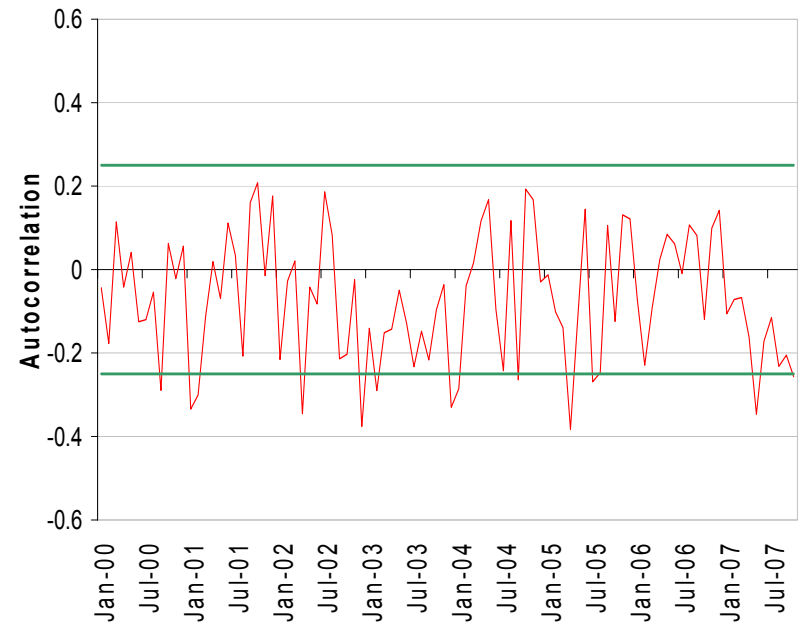


Autocorrelations

S&P/ASX 200 Index



S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy

Average volatility levels March 2005 - Sept 2007

Type of volatility	S&P/ASX 200 Index	S&P 500 Index
Simple volatility	12.13	10.71
Switchback adjusted	11.45	10.19
Newey-West corrected	10.94	9.78
Switchback-adjusted-Newey-West corrected	10.45	9.57

Source: CommSec Quantitative Research & Investment Strategy

Modelling Questions?

1. What will these changes mean for modelling volatility in the two markets?
2. Will one model over the whole time period be able to capture all these dynamics?
3. Are the traditional GARCH volatility models appropriate for both, either markets?

GARCH equations

GARCH model with level shifts

$$h_t = \alpha_0 + \alpha_1 v_{t-1}^2 + \beta_1 h_{t-1}^2 + \gamma_1 D_1 + \lambda_2 D_2$$

Long-run mean of model

$$\bar{h} = \frac{\alpha_0 + \gamma_1 D_1 + \lambda_2 D_2}{1 - \alpha_1 - \beta_1}$$

Minimum Volatility

$$h_{\min} = \frac{\alpha_0 + \gamma_1 D_1 + \lambda_2 D_2}{1 - \beta_1}$$

Half Life

$$k = \frac{\log(0.5)}{\log(\alpha_1 + \beta_1)}$$

GARCH estimates without shifts 1990-2007



Parameter	S&P/ASX 200 Index			S&P 500 Index		
	Estimate	Standard Error	t-statistic	Estimate	Standard Error	t-statistic
Constant	0.0018	0.001	3.196	0.0019	0.001	3.507
ALPHA0	0.0000	0.000	0.706	0.0000	0.000	1.232
ALPHA1	0.0590	0.033	1.806	0.0495	0.017	2.985
BETA1	0.9020	0.086	10.521	0.9455	0.018	53.705

Source: CommSec Quantitative Research & Investment Strategy

Detecting shifts in the long-run volatility

1. We look for a break in realised volatilities using the Andrews test
2. We apply the test to an AR (1) model in each market
3. We then place a dummy variable at these break dates to account for level shifts in the long-run levels of the volatility

GARCH estimates with shifts up to Regime 2 (March 2005)

Parameter	S&P/ASX 200 Index			S&P 500 Index		
	Estimate	Standard Error	t-statistic	Estimate	Standard Error	t-statistic
Constant	0.00181	0.001	3.183	0.00202	0.001	3.190
ALPHA0	0.00005	0.000	3.183	0.00014	0.000	1.113
ALPHA1	0.05255	0.019	2.836	0.08020	0.035	2.262
BETA1	0.79911	0.042	19.055	0.58313	0.282	2.068
GAMMA1	-0.00003	0.000	-2.963	-0.00008	0.000	-1.060
GAMMA2				0.00019	0.000	1.204
GAMMA3				-0.00017	0.000	-1.156

Source: CommSec Quantitative Research & Investment Strategy

GARCH estimates with shifts 1990-2007



Parameter	S&P/ASX 200 Index			S&P 500 Index		
	Estimate	Standard Error	t-statistic	Estimate	Standard Error	t-statistic
Constant	0.0020	0.001	3.801	0.0020	0.001	3.587
ALPHA0	0.0000	0.000	3.596	0.0001	0.000	1.327
ALPHA1	0.0529	0.021	2.550	0.0619	0.032	1.964
BETA1	0.7879	0.042	18.818	0.5989	0.228	2.622
GAMMA1	-0.0000	0.000	-3.314	-0.0001	0.000	-1.244
GAMMA2	0.0000	0.000	2.654	0.0002	0.000	1.449
GAMMA3				-0.0002	0.000	-1.418

Source: CommSec Quantitative Research & Investment Strategy

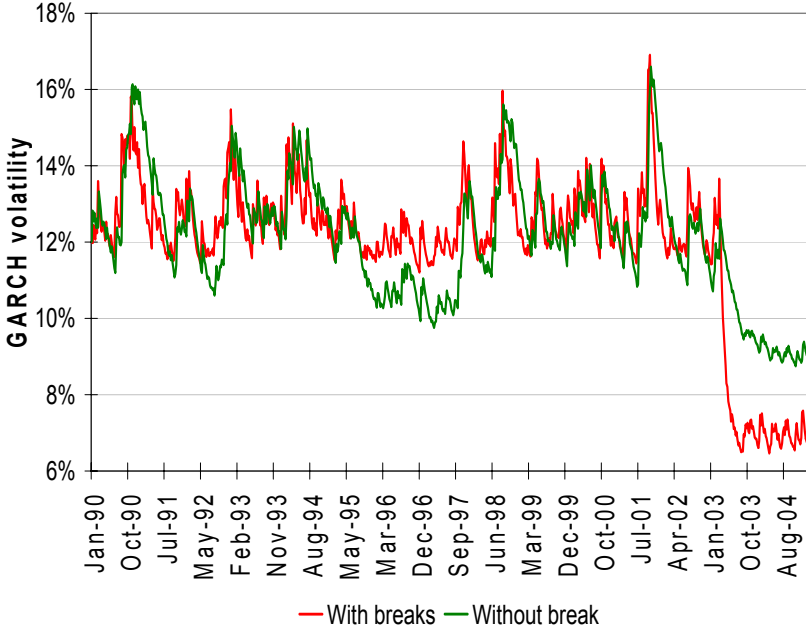
Derived estimates

	Entire period no dummy		S&P/ASX 200 Regime 2 (1990-2005 with dummies)		S&P/ASX 200 Regime 3 (1990-2007 with dummies)	
	S&P/ASX 200 Index	S&P 500 Index	S&P/ASX 200 Index	S&P 500 Index	S&P/ASX 200 Index	S&P 500 Index
Long-run mean	12.34%	15.30%	6.95%	10.75%	11.39%	10.79%
Minimum volatility	7.79%	4.65%	5.98%	9.66%	10.45%	9.92%
Half-life (weeks)	17.43	137.48	4.32	1.69	4.00	1.67

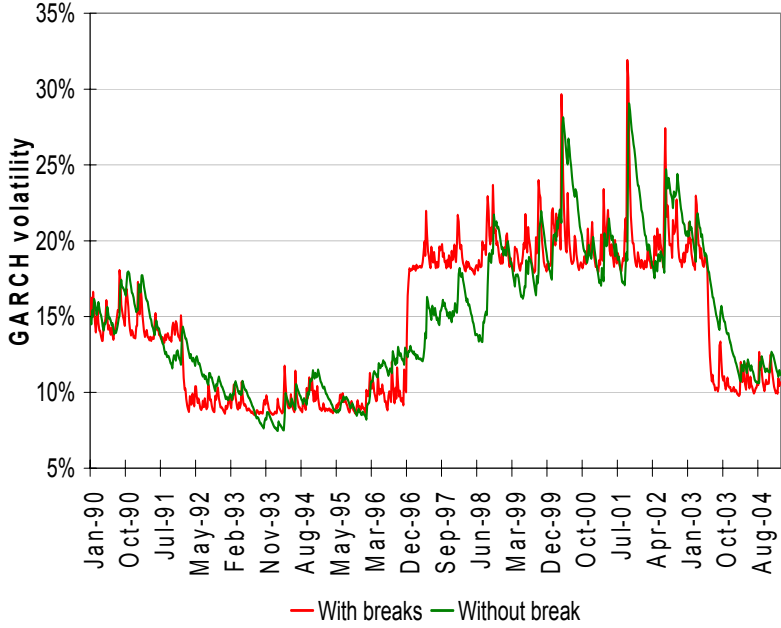
Source: CommSec Quantitative Research & Investment Strategy

GARCH on raw weekly data 1990-2005

S&P/ASX 200 Index



S&P 500 Index

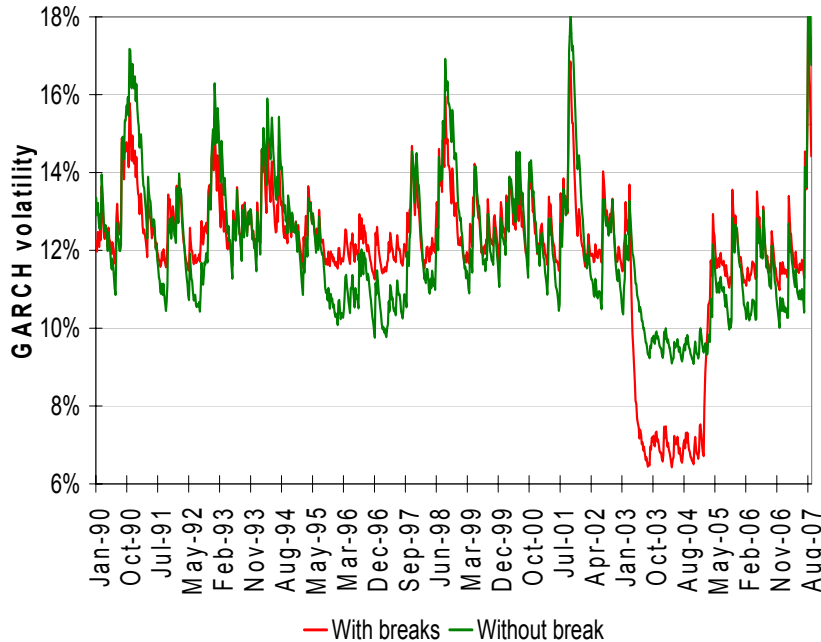


Source: CommSec Quantitative Research & Investment Strategy

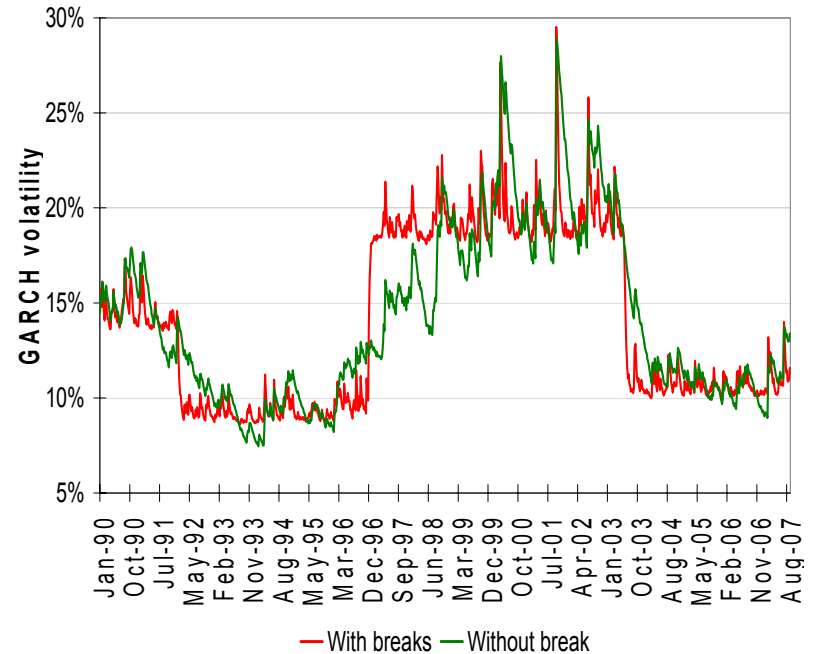


GARCH on raw weekly data 1990-to date

S&P/ASX 200 Index



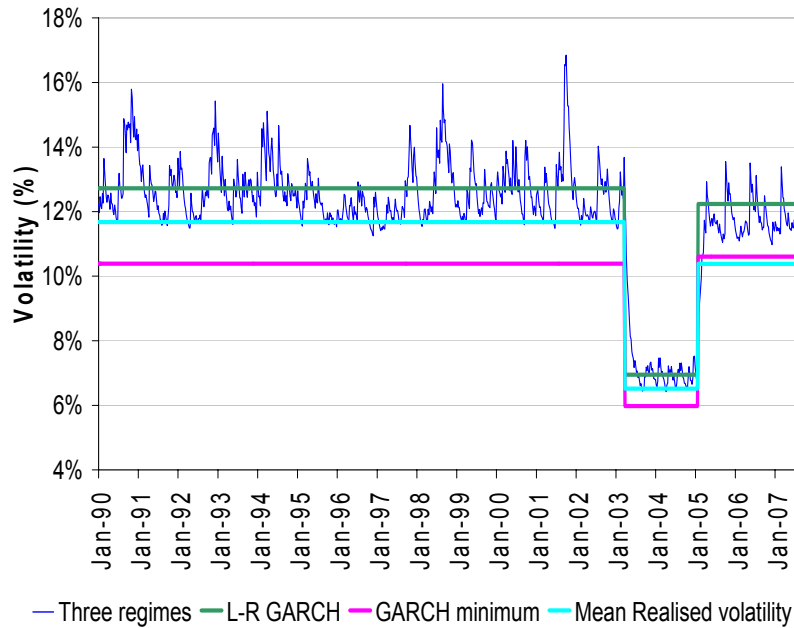
S&P 500 Index



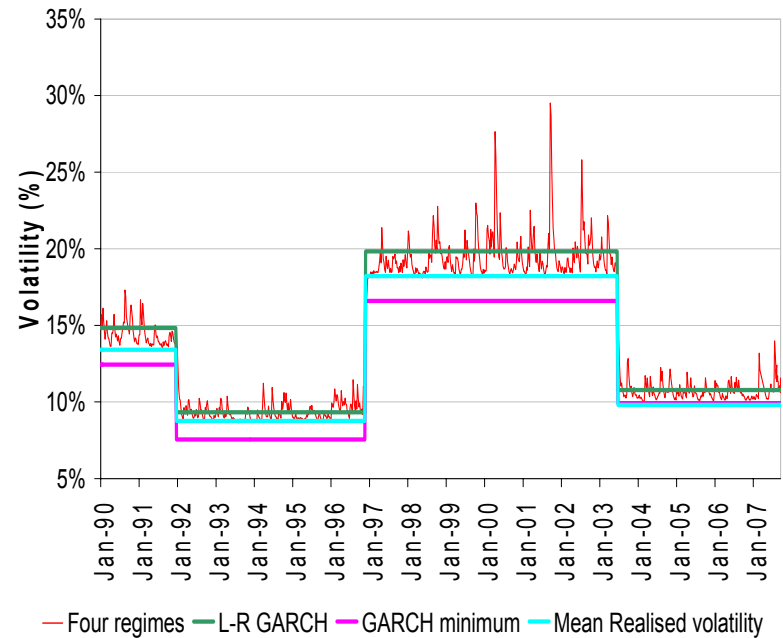
Source: CommSec Quantitative Research & Investment Strategy

Underneath the GARCH's

S&P/ASX 200 Index



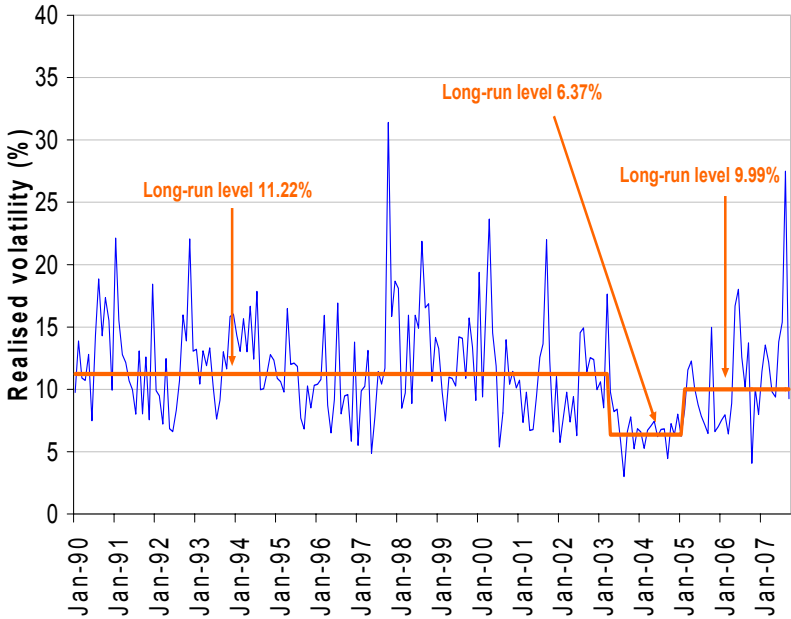
S&P 500 Index



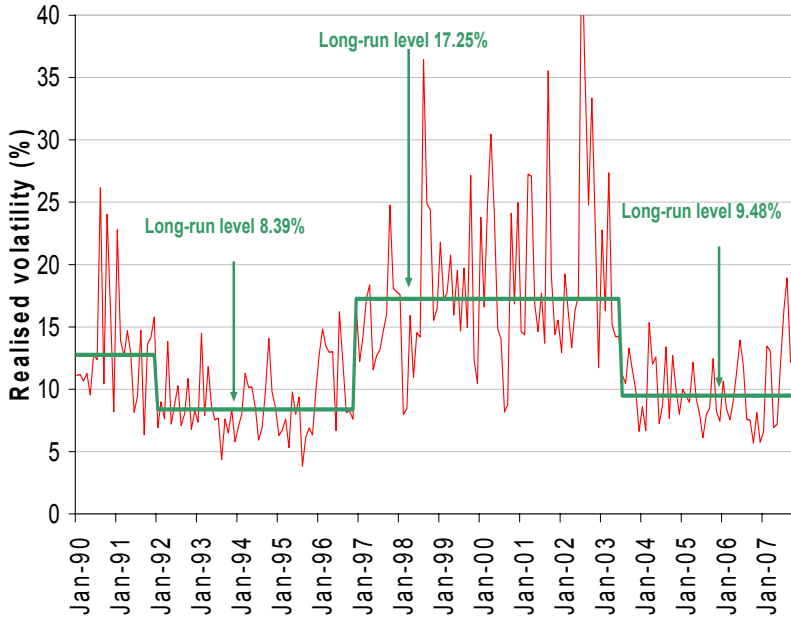
Source: CommSec Quantitative Research & Investment Strategy

Newey-West adjusted realised volatility

S&P/ASX 200 Index




S&P 500 Index



Source: CommSec Quantitative Research & Investment Strategy



Similarities between Australian and US volatility

- 
1. Clusters in volatility in the first regime
 2. Both markets have different regimes (but not at the same location)
 3. Both markets have experienced switchbacks
 4. GARCH model works well to model the first regime

Dissimilarities between Australian and US volatility

1. Switchbacks appear at different times and are of different magnitudes
2. Genuine clustering more apparent in the US market with Australia experiencing more outliers especially since 2005
3. Breaks in the GARCH process are weaker in the US and GARCH approximation is a better fit in the US
4. Autocorrelation more significant in the Australian market
5. GARCH model no longer appropriate for Australian market
6. Reaction to recent credit crisis very different

Conclusions



1. Australia over-reacts to non-Australian problems
2. Australian market inefficient: long exuberance runs and switchbacks
3. GARCH does not work for Australia
4. $\sigma\sqrt{T}$ inappropriate for Australia

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