

# Testing for efficient markets, Part II

Susan Thomas  
IGIDR, Bombay

May 24, 2011

# Recap:

- Market efficiency: all information is captured in current price.
- Operationalised by: no-arbitrage principle.
- Three types of tests of efficient markets based on information assumed: weak, semi-strong and strong form.
- Weak: Tests of independence of returns.
- Core idea of variance ratio: Uncertainty goes up as  $\sqrt{T}$  ● Approximation of VR using ACF ● Test statistic and inference based on overlapping samples ● Nelson-Kim-Startz strategy of scrambling ● Tests which address heteroscedasticity ● Standard explanations for serial correlations in returns data – nonsynchronous trading and indexes, and bid-ask bounce.

# Semi-strong form tests of EMH: The event study framework

# What are event studies?

- Typical event studies analyse the impact of a specific event on returns behaviour.
- Typically, “events” are types of corporate actions.  
Example: dividend announcements, sale of new shares, issuance of new debt, etc.
- Sometimes it is a macro-economic or institutional event at fixed periods, or at a given point in time. For example, the start of electronic trading in India, or the depository; the abolition of long term capital gains tax; the implementation of Clause 49, etc.
- Sometimes, the events can be spread over different points in time. For example, the announcement of an SEO; the start of futures trading on a stock; the impact of the budget, etc.

# Quantifying EMH questions

- We seek to understand the behaviour of stock returns around the event.
  - ① This can be measured as statistics of the returns like the mean or median.
  - ② It can be time series characteristics of the returns such as the value of the AR(k) coefficient.
- Other variables that have been studied more recently are:
  - Volatility of returns.
  - Liquidity of stocks.

# The “event study” approach involves:

- 1 Identify the event (say, bonus issues).
- 2 Identify the variable to be studied (say, returns).
- 3 Identify an “event horizon”.

The event horizon is a set of days  $N$  before the event, and an equal number of days after over which we expect that the event could have had the major, if not the sole, impact on price.
- 4 Identify a set of firms  $K$  that have undergone this event.
- 5 Line up the event dates for each firm in such a manner that we are able to calculate the “average” return on a portfolio of firms that have undergone this event.

Each firm will have undergone the event at different points in time; for each firm, set  $T = 0$  as the date on which the event took place and calculate daily returns for a set of days  $T - N$  and  $T + N$ .

# The event study approach

- For  $K$  firms, for the same day,  $t$ , we calculate the average returns for  $t$ .

$$\bar{r}_t = \sum_{j=1}^{j=K} r_{j,t}, \forall t = -N, -N + 1, \dots, -1, 0, 1, 2, \dots, N - 1, N$$

- This gives us a time series of length  $(2N + 1)$ .

# The event study approach, contd.

- We calculate the average to remove any stock-specific biases in the results.
- Typically, event study analysis is done on **Cumulated Average Returns** or CAR, as follows:

$$CAR_{(t<0)} = \sum_{t=-N}^{t=-1} \bar{r}_t, \quad CAR_{(t \geq 0)} = \sum_{t=0}^{t=N} \bar{r}_t$$

- $CAR_{(t<0)}$  gives us the returns to investing in a portfolio of the  $K$  stocks at the start of the event horizon till the event. Similarly,  $CAR_{(t \geq 0)}$  gives us the returns to investing in a portfolio of the  $K$  stocks from the event date to the end of the event horizon.
- The null is that the event has no impact:

$$H_0 : CAR_{(t \geq 0)} = CAR_{(t > 0)}$$



# The event study premise

- **EMH**  $H_0$  :  $\mathbf{car}_{(t<0)} = \mathbf{car}_{(t>0)}$
- For example, we expect that when a firm announces a bonus issue/stock split, there should be no difference in the behaviour of returns.
- $H_1$  can be dependent on the event itself.
- For example, we expect that an increase in transparency of the trading process will improve the liquidity of stocks.  
To test this, we structure the following event study:
  - Calculate the average liquidity of a set of  $K$  stocks **before** the start of NSE,  $\bar{I}C_{(t<NSE)}$
  - Calculate the average liquidity of a set of  $K$  stocks **six months after** the start of NSE,  $\bar{I}C_{(t>NSE)}$
- Then,

$$H_0 : \quad \bar{I}C_{(t<NSE)} = \bar{I}C_{(t>=NSE)};$$

$$H_1 : \quad \bar{I}C_{(t<NSE)} > \bar{I}C_{(t>=NSE)}$$

# Inference in an event study

- Testing  $H_0$  often involves knowing a “expected” CAR/excess returns,  $E(\text{CAR})$ , and the standard deviation of the CAR,  $\sigma$ .
- For EMH, the  $E(\text{CAR}) = 0$ .
- $\sigma$  for the CAR is calculated assuming independence. Then  $\sigma_{car} = N\sigma_{ear}$ , assuming that the CAR is calculated using  $N$  excess average returns.
- The event *horizon* becomes an important variable affecting robustness: the longer the horizon, the more noisy the inference.

# Problems of inference in event studies

- What happens when the event affects the volatility of returns?  
For example, US studies showed that the returns volatility increased in the post-bonus issue period.
- This is an even bigger issue for event studies over a longer term horizon.  
This is because multiple other events can impact upon returns behaviour over the event horizon.
- If this is not corrected, the results are biased in favour of rejecting  $H_0$ .

# Improving robustness of the event study

- 1 Calculate average returns *across firms*.  
This reduces the idiosyncracies of a single firms characteristics and focuses on reaction only to the event.
- 2 Calculate excess returns.  
This reduces the impact of systematic/macro-economic events on returns behaviour.
- 3 Create a *matched sample* of firms that are not vulnerable to the event.  
Ideally, for every firm sensitive to the event, find a firm that has similar characteristics for that period of time, that is not effected by the event.
- 4 Calculate returns variance on the day of the event, and the variance in the post-event period.
- 5 Use MonteCarlo or Bootstrap simulations to draw the distribution of the variable under the event study.

# Impact of the budget on Indian stock markets

# Event study of the budget and the market index

- Event: The Union Budget of the GoI.
- Event variable: Cumulated returns for the stock market index.
- Event horizon: 45 days before and after the event, which is around two months before and two months after the bonus issue.
- Question: Do stock market prices fully react to all information announced in the budget on the date of budget itself, or does it adjust to it over a period after?

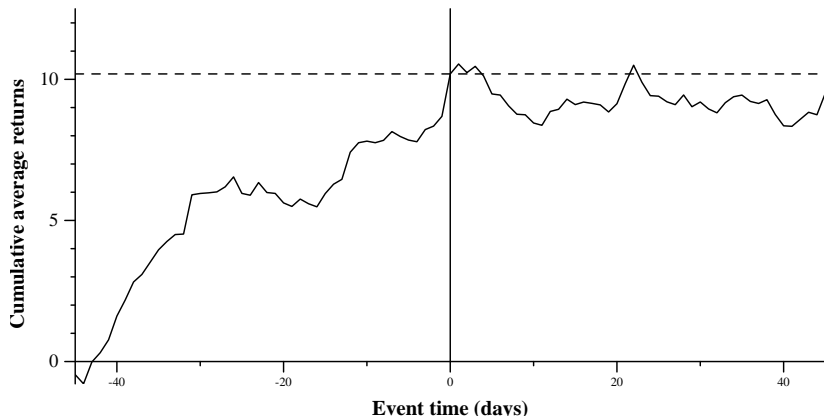
# Event study setup

- There had been 26 Union Budgets between April 1979 and June 2001.
- We have a time series of the market index put together by using a series of different indexes.  
The length of the time series is important because our study is on the impact of the Budget: the more the number of Budgets, the better the inference.
- The summary statistics for the returns on the index is:

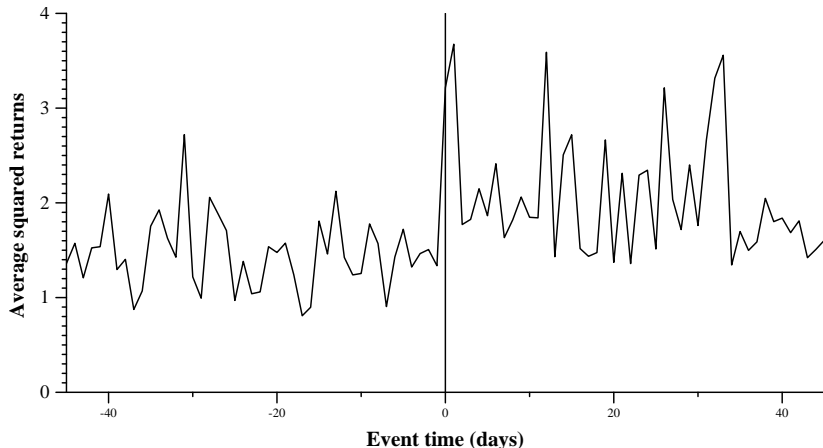
	All days	45 days		Non-Budget days
		before Budget	after Budget	
$\bar{r}_t$	0.084	0.193	-0.015	0.070
$\bar{r}_t^2$	2.943	2.447	4.681	2.445
Obs	4673	945	945	2762



# CAR around the event



# The volatility of returns around the event



- On average, there is a build up of returns before the budget.
- On average, there is a minor drop in returns after the budget.
- There is a significant rise in volatility after the budget.
- This is relatively consistent with what we would expect from an efficient market: in fact, most of the information appears to have been impounded into prices even **before** the budget date itself!

# Strong form tests of market efficiency

# Testing for the existence of insider trading

- Isolate a set of financial market entities who can have access to non-public information.
- *Professional fund managers* such as mutual funds, insurance companies, pension fund management companies.
- Test whether they demonstrate access to better information in the form of *enhanced returns*.  
If fund managers are able to systematically produce better returns, then this would be evidence of deviations from market efficiency.

# Mutual fund performance evaluation

- Daily NAV (Net Asset Value) of mutual funds are observable.
- Performance evaluation focus: *Are the returns on the mutual fund higher than some benchmark portfolio?*
- Hypothesis:  $r_{mf_t} - r_{f_t} = \alpha + \beta_{mf}(r_{M_t} - r_{f_t})$ 
  - 1 If the fund manager has systematically better performance,  $\alpha$  will be positive and significant. (Jensen's measure)
  - 2 If the fund manager has systematically better performance, the risk-adjusted return  $((r_{mf_t} - r_{f_t})/\beta_{mf}r_{M_t})$  will be better than the benchmark portfolio. (Sharpe's measure)
- Tests:

$$H_0 : \alpha > 0$$

$$H_0 : \frac{r_{mf_t} - r_{f_t}}{\beta_{mf}r_{M_t}} > \frac{r_{M_t} - r_{f_t}}{\sigma_{r_{M_t}}}$$

# Analysing mutual fund performance for Indian MFs

- Mutual funds in Indian began developing as an industry in the late eighties.
- We analysed the performance of 13 MF schemes in April 1994, with around Rs.69 billion of assets under management.

# Summary statistics for the fund schemes

Summary Statistics						
Scheme	Weeks	$r_j - r_f$		$r_M - r_f$		
		$E()$	$Var()$	$E()$	$Var()$	
1	Canbonus	71	-1.159	104	0.073	25
2	Canshare	206	0.107	88	0.589	28
3	Candouble	139	-0.096	90	0.535	31
4	Cangrowth	201	-0.320	105	0.605	29
5	Cantriple	60	-0.977	107	0.555	25
6	Canstar-cap	102	-0.195	137	0.293	37
7	Ind Ratna	140	0.376	134	0.600	29
8	Mastershare	215	0.511	75	0.514	28
9	Masterplus 91	81	-0.873	52	0.056	23
10	UGS 2000	87	0.260	48	0.228	23
11	UGS 5000	87	0.128	87	0.228	23



# Measures of Jensen's $\alpha$

		$\alpha$	$\beta$	$R^2$	$\sigma_\epsilon$
1	Canbonus	-1.216 (1.13)	0.779 (0.23)	0.147	9.479
2	Canshare	-0.373 (0.58)	0.815 (0.11)	0.213	8.345
4	Cangrowth	-0.966 (0.60)	1.068 (0.11)	0.316	8.489
6	Canstar-cap	-0.447 (1.04)	0.862 (0.17)	0.202	10.494
7	Ind Ratna	-0.360 (0.81)	1.227 (0.15)	0.327	9.535
8	Mastershare	-0.119 (0.39)	1.226 (0.07)	0.566	5.710
9	Masterplus 91	-0.927 (0.63)	0.953 (0.13)	0.402	5.632
10	UGS 2000	0.110 (0.67)	0.659 (0.14)	0.212	6.197
11	UGS 5000	-0.060 (0.89)	0.822 (0.18)	0.190	8.268

# Performance evaluation inference

- These mutual funds appear to have more unsystematic risk than the market.
- They give lower returns than the market index.
- Therefore, their Sharpe's ratio is not as good as that of the market index.
- The Jensen's  $\alpha$  is not significant for any of the schemes analysed.
- Conclusion: Mutual fund managers (circa 1994) were not out-performing the market index.  
This leads us to infer that the hypothesis of strong-form of market efficiency cannot be rejected.

# Concerns in performance evaluation

- The benchmark portfolio might be misspecified
  - 1 Problems with the market index construction.
  - 2 Practitioners claim: The benchmark chosen ought to be compatible with the objective of the investment. E.g., sectoral funds must be benchmarked against sectoral indices.
- Tradeoff between long time series (and high power of the tests) and short maturity of fund managers (and low power of the tests).

- EMH is a function of the economic environment.  
When market institutions change,