### Bank Regulation and Stability: An Examination of the Basel Market Risk Framework

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# 1. Motivation

- Bank regulators:
  - Value-at-Risk (VaR) is used to measure the risk in the trading books of large banks and to determine the corresponding minimum capital requirements;
  - Stress Testing (ST) is used to assess whether banks withstand 'extreme' events.
- Practitioners:
  - Banks use VaR and ST to set risk exposure limits (survey of Committee on the Global Financial System, 2005).
- Researchers:
  - VaR is not sub-additive;
  - VaR does not consider losses beyond VaR;
  - Advocate Conditional-Value-at-Risk (CVaR): it is sub-additive, and considers losses beyond VaR.
- Our paper:
  - Examines the extent of the conflict between: (1) the popularity of VaR and ST among regulators and practitioners; and (2) the advocacy of CVaR by researchers.
  - More specifically, we examine the effectiveness of a risk management system based on *both* VaR and ST constraints in controlling CVaR.
  - Put differently: is the joint use of VaR and ST 'equivalent' to the use of CVaR?

# 2. Main result

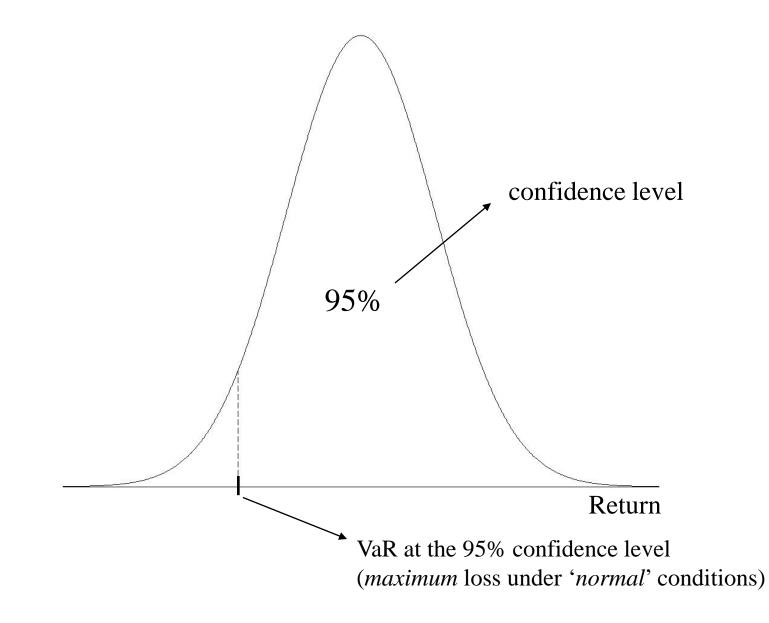
• The joint use of VaR and ST constraints allows the selection of portfolios with relatively *large* CVaRs.

• Hence, the joint use of VaR and ST constraints is *ineffective* in controlling CVaR.

- This result is consistent with:
  - Banks around the world suffered sizeable trading losses during the recent crisis.
  - Trading losses notably exceeded VaR (and even minimum capital requirements).
- Our paper supports the view that the Basel market risk framework did *not* promote bank stability.

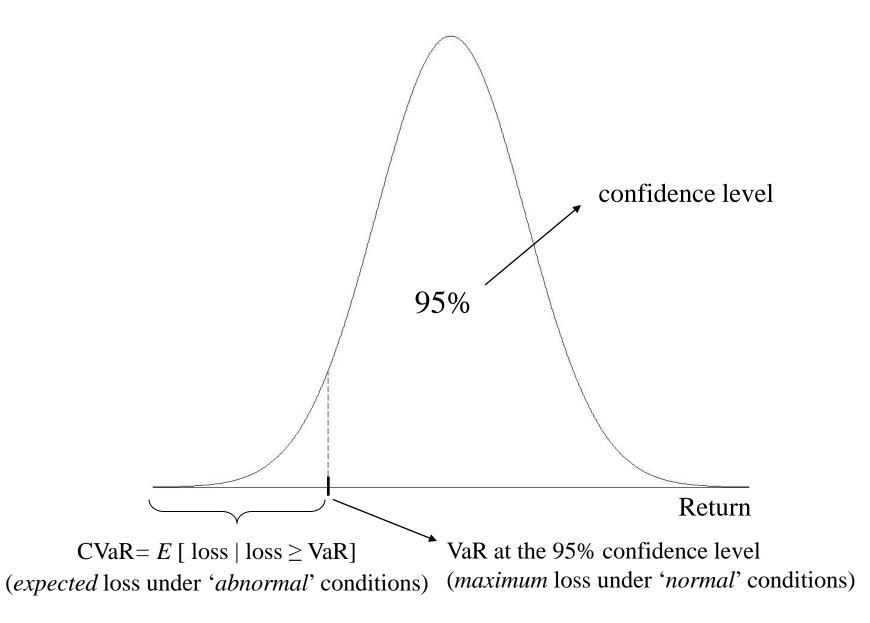
# 3. VaR, CVaR, and ST

For simplicity, consider a portfolio with a normally distributed return:



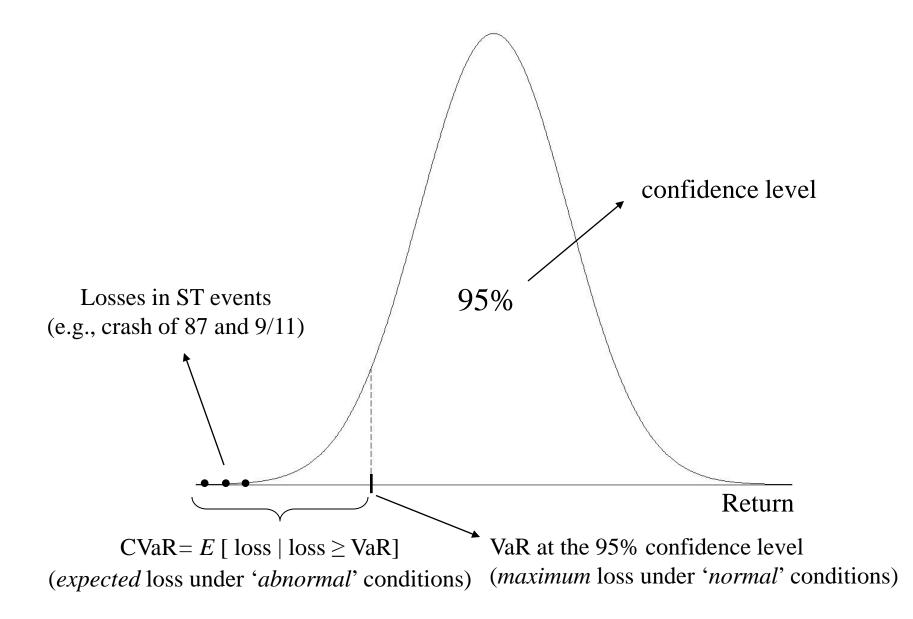
# 3. VaR, CVaR, and ST

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# 3. VaR, CVaR, and ST

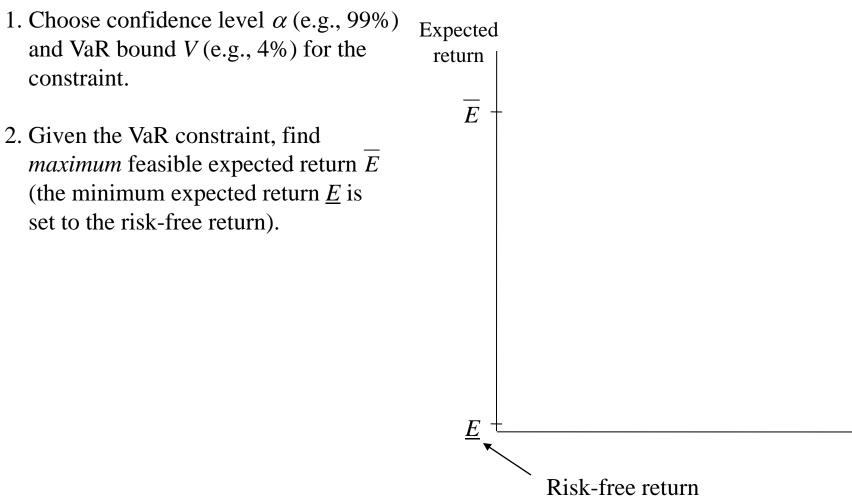
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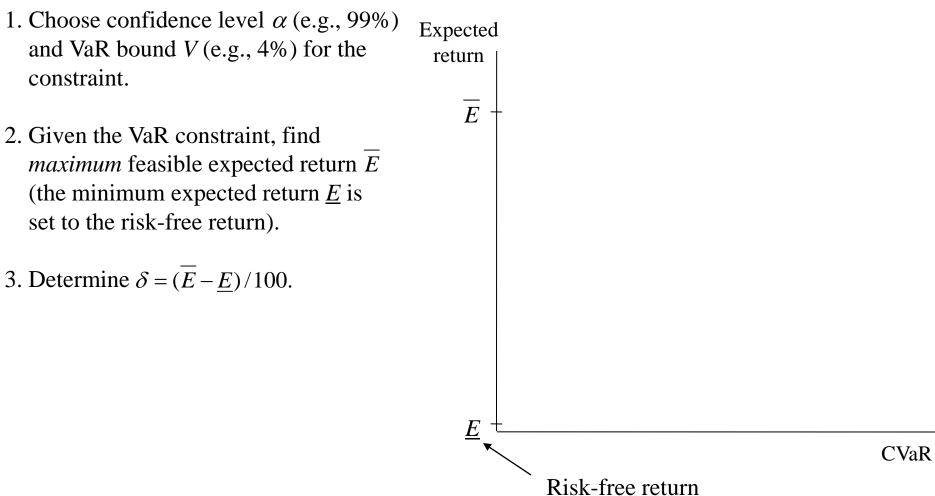
- Allocation problem among *nine* asset classes:
  - T-bills (assumed to be risk-free);
  - Government bonds;
  - Corporate bonds; and
  - Six size/value-growth Fama-French portfolios.
- *Monthly* investment horizon;
- Historical simulation:

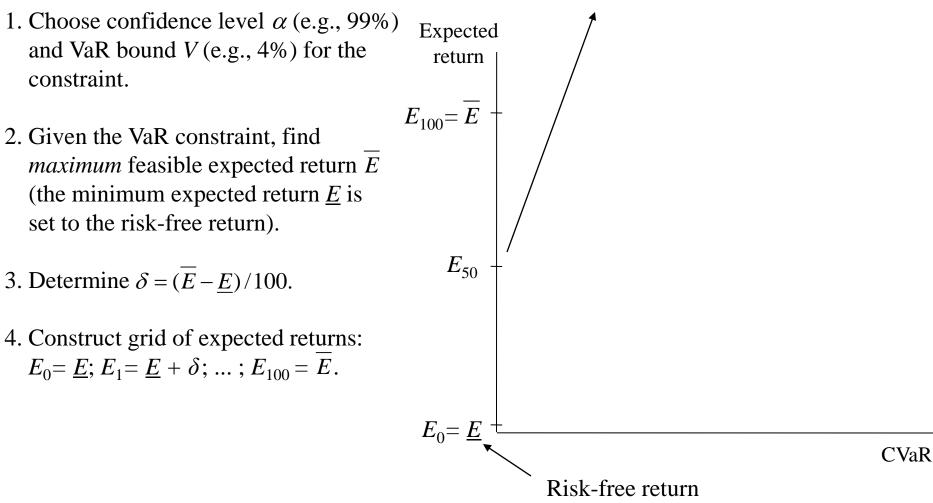
– 73% of banks that disclose methodology to estimate VaR report the use of historical simulation (Pérignon and Smith, 2010);

- Monthly data during the period 1982–2006;
- ST events: (i) 1987 stock market crash; and (ii) 9-11 (CGFS survey, 2005).
- Consider *three* different risk management systems based on:
  - A single VaR constraint;
  - Two ST constraints; and
  - A single VaR constraint and two ST constraints.
- Examine whether each set of constraints precludes the selection of *all* portfolios with relatively *large* CVaRs;
  - If a set of constraints precludes such portfolios, it is *effective* in controlling CVaR;
  - Otherwise, it is *ineffective* in controlling CVaR.

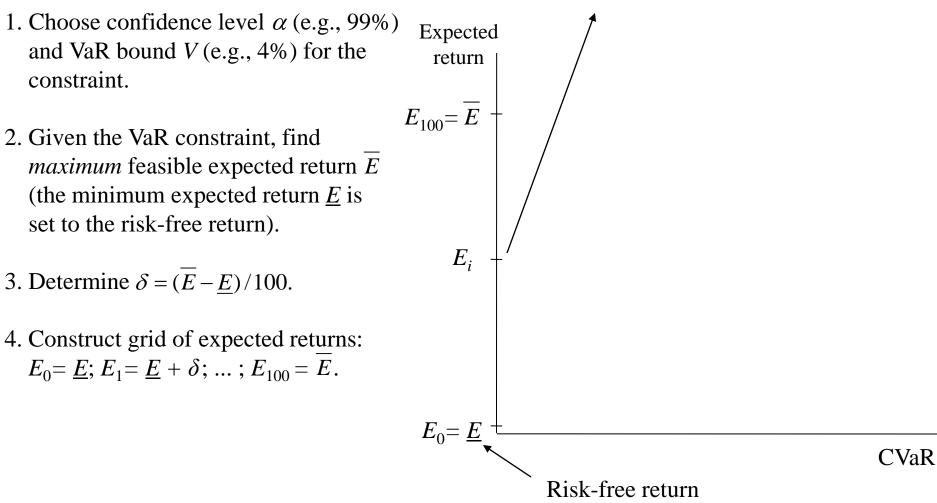


CVaR



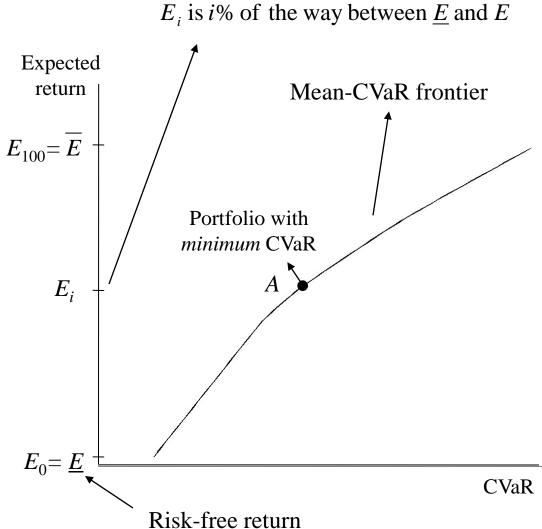


 $E_{50}$  is halfway between <u>E</u> and E

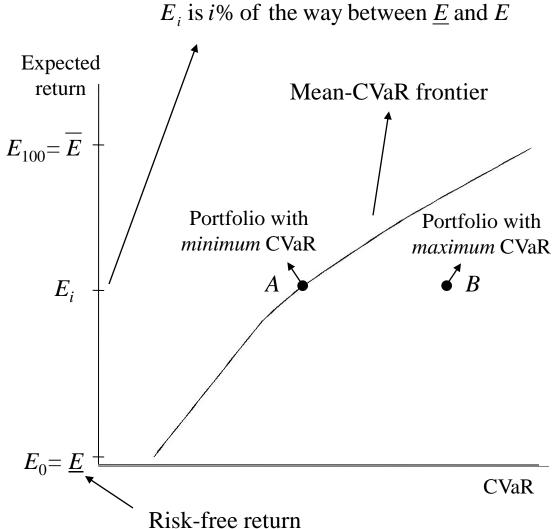


 $E_i$  is i% of the way between <u>E</u> and E

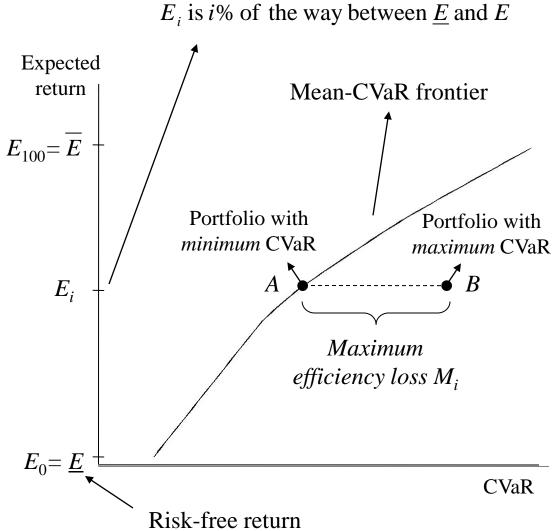
- 2. Given the VaR constraint, find maximum feasible expected return  $\overline{E}$ (the minimum expected return  $\underline{E}$  is set to the risk-free return).
- 3. Determine  $\delta = (\overline{E} \underline{E})/100$ .
- 4. Construct grid of expected returns:  $E_0 = \underline{E}; E_1 = \underline{E} + \delta; ...; E_{100} = \overline{E}.$
- 5. For each value in this grid  $E_i$ , find *maximum* efficiency loss  $M_i$ .



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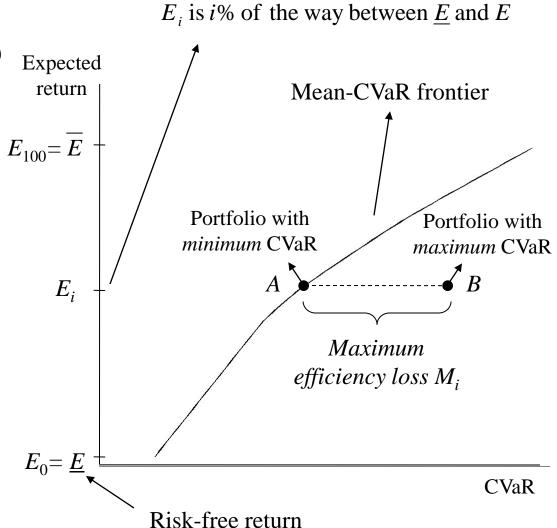


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#### 1. Choose confidence level $\alpha$ (e.g., 99%) and VaR bound V (e.g., 4%) for the constraint.

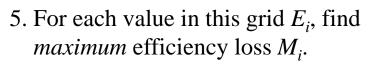
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- 5. For each value in this grid  $E_i$ , find *maximum* efficiency loss  $M_i$ .

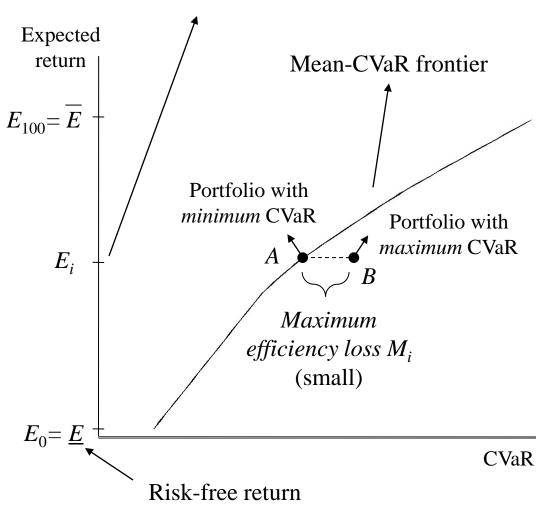


-> For example, if  $M_i = \underline{3\%}$ , then the VaR constraint allows the selection of a portfolio with a CVaR that *exceeds* the CVaR of the minimum CVaR portfolio by <u>3%</u>.

#### 1. Choose confidence level $\alpha$ (e.g., 99%) and VaR bound V (e.g., 4%) for the constraint.

- 2. Given the VaR constraint, find maximum feasible expected return  $\overline{E}$ (the minimum expected return  $\underline{E}$  is set to the risk-free return).
- 3. Determine  $\delta = (\overline{E} \underline{E})/100$ .
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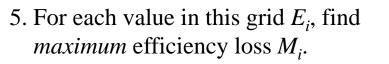


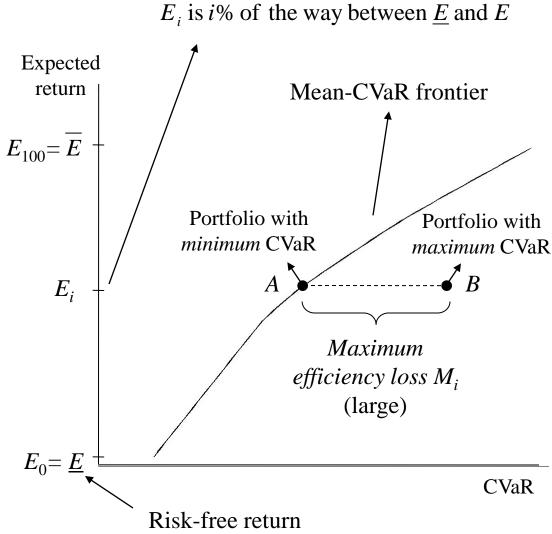
-> More generally, if maximum efficiency loss  $M_i$  is relatively *small*, then the VaR constraint is *effective* in controlling CVaR when the required expected return is  $E_i$ .

 $E_i$  is i% of the way between <u>E</u> and E

#### 1. Choose confidence level $\alpha$ (e.g., 99%) and VaR bound V (e.g., 4%) for the constraint.

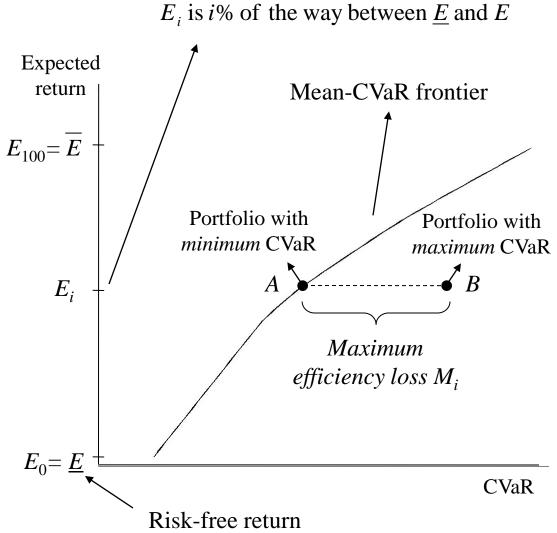
- 2. Given the VaR constraint, find maximum feasible expected return  $\overline{E}$ (the minimum expected return  $\underline{E}$  is set to the risk-free return).
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- 4. Construct grid of expected returns:  $E_0 = \underline{E}; E_1 = \underline{E} + \delta; ...; E_{100} = \overline{E}.$





-> However, if maximum efficiency loss  $M_i$  is relatively *large*, then the VaR constraint is *ineffective* in controlling CVaR when the required expected return is  $E_i$ .

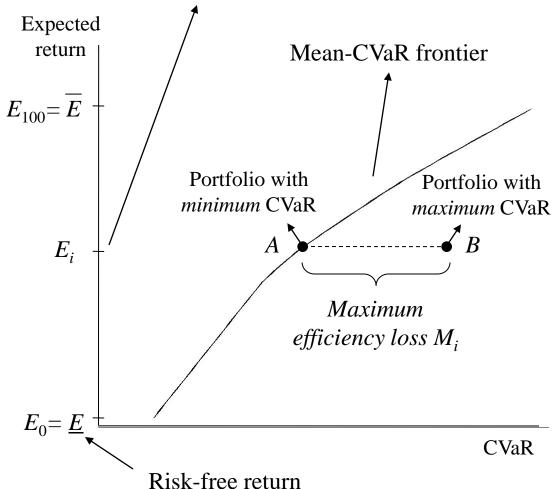
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- 4. Construct grid of expected returns:  $E_0 = \underline{E}; E_1 = \underline{E} + \delta; ...; E_{100} = \overline{E}.$
- 5. For each value in this grid  $E_i$ , find *maximum* efficiency loss  $M_i$ .
- 6. Compute *average* and *largest* efficiency losses



# 1. Choose confidence level $\alpha$ (e.g., 99%) and VaR bound V (e.g., 4%) for the constraint.

- 2. Given the VaR constraint, find maximum feasible expected return  $\overline{E}$ (the minimum expected return  $\underline{E}$  is set to the risk-free return).
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- 5. For each value in this grid  $E_i$ , find *maximum* efficiency loss  $M_i$ .
- 6. Compute *average* and *largest* efficiency losses, and average and largest *relative* efficiency losses

relative efficiency loss =  $\frac{\text{efficiency loss}}{\text{CVaR of portfolio on the mean-CVaR frontier}}$ 

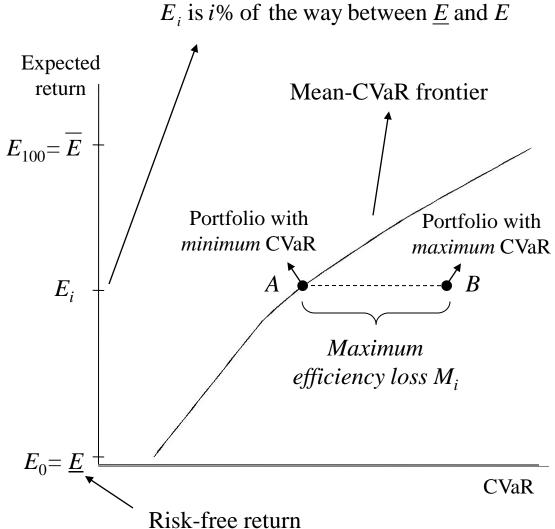


 $E_i$  is i% of the way between <u>E</u> and E

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- 6. Compute *average* and *largest* efficiency losses, and average and largest *relative* efficiency losses

relative efficiency  $loss_B = \frac{M_i}{CVaR_A}$ 

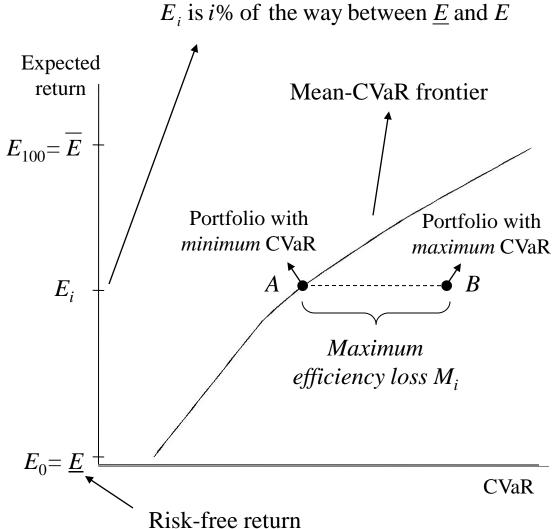


For example, if the relative efficiency loss is <u>100%</u>, then the VaR constraint allows the selection of a portfolio with a CVaR that is <u>twice</u> as large as the CVaR of the minimum CVaR portfolio.

#### 1. Choose confidence level $\alpha$ (e.g., 99%) and VaR bound V (e.g., 4%) for the constraint.

- 2. Given the VaR constraint, find maximum feasible expected return  $\overline{E}$ (the minimum expected return  $\underline{E}$  is set to the risk-free return).
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- 6. Compute *average* and *largest* efficiency losses, and average and largest *relative* efficiency losses

*relative* efficiency  $loss_B = \frac{M_i}{CVaR_A}$ 



- As CVaR  $\downarrow 0$ , the relative efficiency loss  $\uparrow \infty$ ;
- In the computation of average and largest relative efficiency losses, we only consider levels of expected return for which the CVaR in the denominator is *larger* than 1%.

|                                     | Fixed bound |         |
|-------------------------------------|-------------|---------|
| Confidence level $\alpha$           | 99          | %       |
| Bound V                             | 4%          | 8%      |
| Efficiency loss:                    |             |         |
| Average                             | 8.25        | 14.94   |
| Largest                             | 11.11       | 20.97   |
| Relative efficiency loss:           |             |         |
| Average                             | 366.99      | 501.75  |
| Largest                             | 934.56      | 1844.67 |
| Maximum feasible<br>expected return | 1.59        | 2.07    |

|                                     | Fixed bound |         |   |
|-------------------------------------|-------------|---------|---|
| Confidence level $\alpha$           | 99          | %       |   |
| Bound V                             | 4%          | 8%      | • <i>Small</i> bound (tight constraint) |
| Efficiency loss:                    |             |         | (light constraint)                      |
| Average                             | 8.25        | 14.94   | • <i>Large</i> average loss             |
| Largest                             | 11.11       | 20.97   |   |
| Relative efficiency loss:           |             |         |   |
| Average                             | 366.99      | 501.75  | • Large average relative loss           |
| Largest                             | 934.56      | 1844.67 |   |
| Maximum feasible<br>expected return | 1.59        | 2.07    |   |

|                                     | Fixed  | bound   |   |
|-------------------------------------|--------|---------|---|
| Confidence level $\alpha$           | 99     | %       |   |
| Bound V                             | 4%     | 8%      | • <i>Larger</i> bound (looser constraint) |
| Efficiency loss:                    |        |         |   |
| Average                             | 8.25   | 14.94   | • <i>Larger</i> average loss              |
| Largest                             | 11.11  | 20.97   |   |
| Relative efficiency loss:           |        |         |   |
| Average                             | 366.99 | 501.75  |   |
| Largest                             | 934.56 | 1844.67 |   |
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|                                     | Fixed bound |         |   |
|-------------------------------------|-------------|---------|---|
| Confidence level $\alpha$           | 99          | %       |   |
| Bound V                             | 4%          | 8%      | • <i>Larger</i> bound (looser constraint) |
| Efficiency loss:                    |             |         | (100501 constraint)                       |
| Average                             | 8.25        | 14.94   | • <i>Larger</i> average loss              |
| Largest                             | 11.11       | 20.97   |   |
| Relative efficiency loss:           |             |         |   |
| Average                             | 366.99      | 501.75  | • Larger average relative loss            |
| Largest                             | 934.56      | 1844.67 |   |
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|                                     | Fixed bound |         |   |
|-------------------------------------|-------------|---------|---|
| Confidence level $\alpha$           | 99          | 9%      |   |
| Bound V                             | 4%          | 8%      | • <i>Larger</i> bound (looser constraint)         |
| Efficiency loss:                    |             |         | (100ser constraint)                               |
| Average                             | 8.25        | 14.94   | • Larger average loss                             |
| Largest                             | 11.11       | 20.97   |   |
| Relative efficiency loss:           |             |         |   |
| Average                             | 366.99      | 501.75  | • Larger average relative loss                    |
| Largest                             | 934.56      | 1844.67 |   |
| Maximum feasible<br>expected return | (1.59)      | 2.07    | • <i>Larger maximum f</i> easible expected return |
|                                     |             |         |   |

|                                     | Fixed bound |         | Variable bound      |
|-------------------------------------|-------------|---------|---------------------|
| Confidence level $\alpha$           | 99          | %       | 99%                 |
| Bound V                             | 4%          | 8%      | Depends on <i>E</i> |
| Efficiency loss:                    |             |         |                     |
| Average                             | 8.25        | 14.94   | 3.86                |
| Largest                             | 11.11       | 20.97   | 9.56                |
| Relative efficiency loss:           |             |         |                     |
| Average                             | 366.99      | 501.75  | 105.93              |
| Largest                             | 934.56      | 1844.67 | 174.24              |
| Maximum feasible<br>expected return | 1.59        | 2.07    | 2.16                |

|                                     | Fixed        | bound   | Variable bound | ]   |
|-------------------------------------|--------------|---------|----------------|-----|
| Confidence level $\alpha$           | 99           | %       | 99%            |     |
| Bound V                             | <b>4%</b> 8% |         | Depends on E   |     |
| Efficiency loss:                    |              |         |                | ν   |
| Average                             | 8.25         | 14.94   | 3.86           | • 5 |
| Largest                             | 11.11        | 20.97   | 9.56           |     |
| Relative efficiency loss:           |              |         |                |     |
| Average                             | 366.99       | 501.75  | 105.93         |     |
| Largest                             | 934.56       | 1844.67 | 174.24         |     |
| Maximum feasible<br>expected return | 1.59         | 2.07    | 2.16           |     |

Advantages of variable bounds:

• *Smaller* average loss

|                                     | Fixed  | bound   | Variable bound |                                 |
|-------------------------------------|--------|---------|----------------|---------------------------------|
| Confidence level $\alpha$           | 99     | %       | 99%            |                                 |
| Bound V                             | 4%     | 8%      | Depends on E   | Advantages of                   |
| Efficiency loss:                    |        |         |                | variable bounds:                |
| Average                             | 8.25   | 14.94   | 3.86           | • <i>Smaller</i> average loss   |
| Largest                             | 11.11  | 20.97   | 9.56           | 1055                            |
| Relative efficiency loss:           |        |         |                |                                 |
| Average                             | 366.99 | 501.75  | 105.93         | • Smaller average relative loss |
| Largest                             | 934.56 | 1844.67 | 174.24         |                                 |
| Maximum feasible<br>expected return | 1.59   | 2.07    | 2.16           |                                 |

|                                     |             |         |                | -   |
|-------------------------------------|-------------|---------|----------------|---|
|                                     | Fixed bound |         | Variable bound |   |
| Confidence level $\alpha$           | 99          | %       | 99%            |   |
| Bound V                             | 4%          | 8%      | Depends on E   | Advantages of                             |
| Efficiency loss:                    |             |         |                | variable bounds:                          |
| Average                             | 8.25        | 14.94   | 3.86           | • <i>Smaller</i> average loss             |
| Largest                             | 11.11       | 20.97   | 9.56           | 1055                                      |
| Relative efficiency loss:           |             |         |                |   |
| Average                             | 366.99      | 501.75  | 105.93         | • Smaller average relative loss           |
| Largest                             | 934.56      | 1844.67 | 174.24         |   |
| Maximum feasible<br>expected return | 1.59        | 2.07    | 2.16           | • <i>Larger</i> maximum feasible expected |
|                                     |             |         |                | return                                    |

• Variable bounds are more *effective* in controlling CVaR than fixed bound

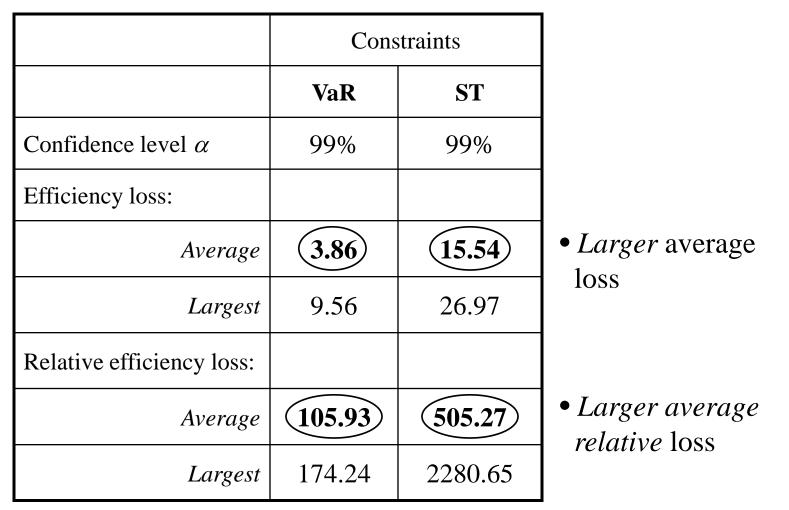
|                                     | Fixed bound |         | Variable bound |                               |
|-------------------------------------|-------------|---------|----------------|-------------------------------|
| Confidence level $\alpha$           | 99          | %       | 99%            |                               |
| Bound V                             | 4%          | 8%      | Depends on E   |                               |
| Efficiency loss:                    |             |         |                |                               |
| Average                             | 8.25        | 14.94   | 3.86           | • <i>Large</i> average loss   |
| Largest                             | 11.11       | 20.97   | 9.56           | 1055                          |
| Relative efficiency loss:           |             |         |                |                               |
| Average                             | 366.99      | 501.75  | 105.93         | • Large average relative loss |
| Largest                             | 934.56      | 1844.67 | 174.24         |                               |
| Maximum feasible<br>expected return | 1.59        | 2.07    | 2.16           |                               |

• VaR constraint with variable bounds is still *ineffective* in controlling CVaR

### 7. Results: variable bounds (VaR versus ST constraints)

|                           | Cons   | straints |                         |
|---------------------------|--------|----------|-------------------------|
|                           | VaR    | ST       |                         |
| Confidence level $\alpha$ | 99%    | 99%      |                         |
| Efficiency loss:          |        |          |                         |
| Average                   | 3.86   | 15.54    | • <i>Larger</i> average |
| Largest                   | 9.56   | 26.97    | loss                    |
| Relative efficiency loss: |        |          |                         |
| Average                   | 105.93 | 505.27   |                         |
| Largest                   | 174.24 | 2280.65  |                         |

### 7. Results: variable bounds (VaR versus ST constraints)



• The use of ST constraints is even *less effective* in controlling CVaR than the use of a VaR constraint

### 7. Results: variable bounds (VaR and ST constraints)

|                           | Constraints |         |          |  |  |
|---------------------------|-------------|---------|----------|--|--|
|                           | VaR         | ST      | VaR + ST |  |  |
| Confidence level $\alpha$ | 99%         | 99%     | 99%      |  |  |
| Efficiency loss:          |             |         |          |  |  |
| Average                   | 3.86        | 15.54   | 1.96     |  |  |
| Largest                   | 9.56        | 26.97   | 4.03     |  |  |
| Relative efficiency loss: |             |         |          |  |  |
| Average                   | 105.93      | 505.27  | 56.56    |  |  |
| Largest                   | 174.24      | 2280.65 | 138.53   |  |  |

• *Smaller* average loss

### 7. Results: variable bounds (VaR and ST constraints)

|                           | Constraints |         |          |                                 |
|---------------------------|-------------|---------|----------|---------------------------------|
|                           | VaR         | ST      | VaR + ST |                                 |
| Confidence level $\alpha$ | 99%         | 99%     | 99%      |                                 |
| Efficiency loss:          |             |         |          |                                 |
| Average                   | 3.86        | 15.54   | 1.96     | • <i>Smaller</i> average        |
| Largest                   | 9.56        | 26.97   | 4.03     | loss                            |
| Relative efficiency loss: |             |         |          |                                 |
| Average                   | 105.93      | 505.27  | 56.56    | • Smaller average relative loss |
| Largest                   | 174.24      | 2280.65 | 138.53   |                                 |

• Hence, there are notable benefits arising from using *both* VaR and ST constraints (relative to using just one type of constraint).

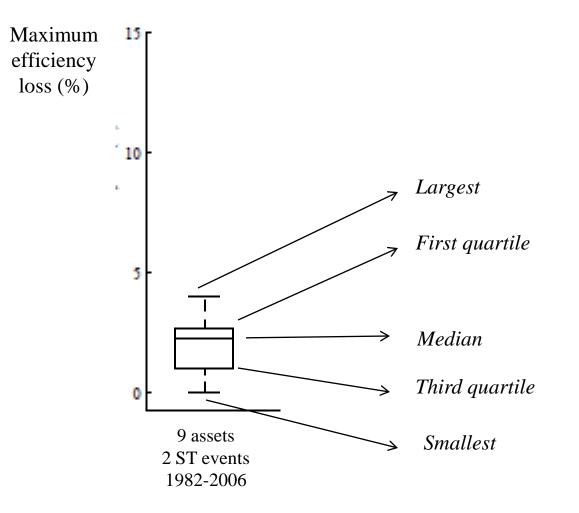
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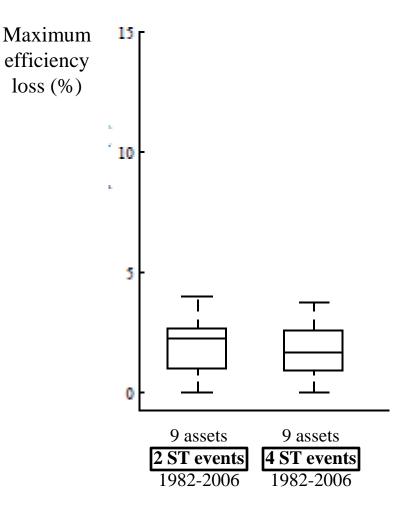
|                           | Constraints |         |          |                                  |
|---------------------------|-------------|---------|----------|----------------------------------|
|                           | VaR         | ST      | VaR + ST |                                  |
| Confidence level $\alpha$ | 99%         | 99%     | 99%      |                                  |
| Efficiency loss:          |             |         |          |                                  |
| Average                   | 3.86        | 15.54   | 1.96     | • <i>Large</i> average loss      |
| Largest                   | 9.56        | 26.97   | 4.03     |                                  |
| Relative efficiency loss: |             |         |          |                                  |
| Average                   | 105.93      | 505.27  | 56.56    | • Large average<br>relative loss |
| Largest                   | 174.24      | 2280.65 | 138.53   |                                  |

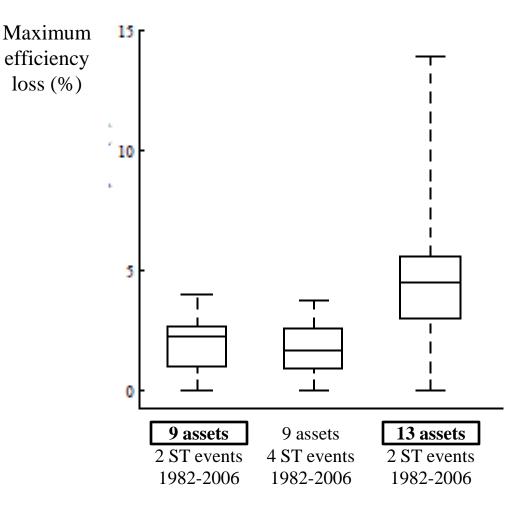
• However, the joint use of VaR and ST constraints is *ineffective* in controlling CVaR.

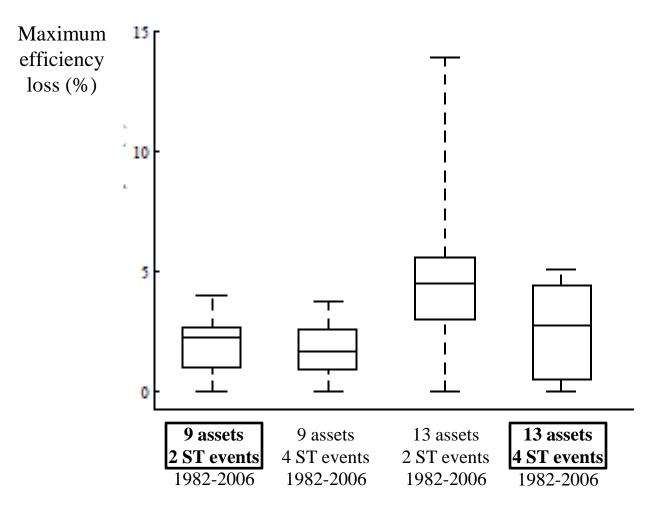
### 8. Robustness checks

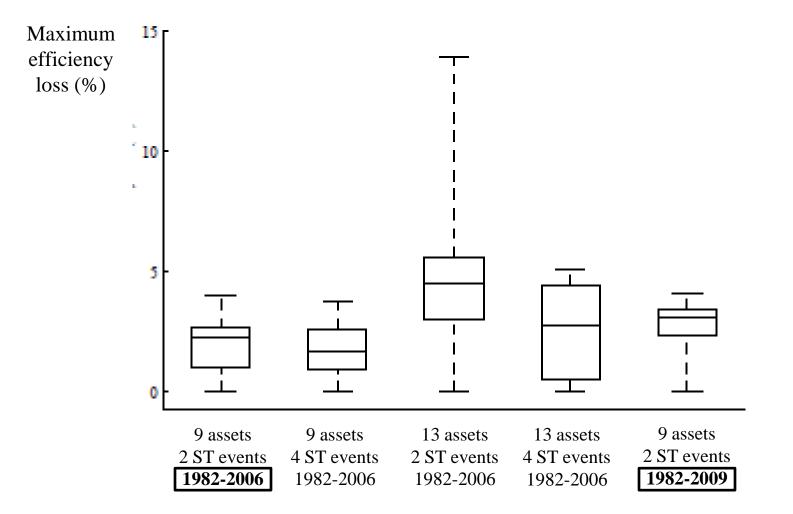
- Consider additional cases:
  - 1. A larger number of ST events (87 crash, 9-11, 97 Asian crisis, 98 Russian crisis);
  - 2. A larger number of assets (T-bills, T-bonds, corporate bonds, ten size Fama-French portfolios);
  - 3. Larger numbers of *both* ST events and asset classes;
  - 4. Data during the period 1982-2009; and
  - 5. Daily data.

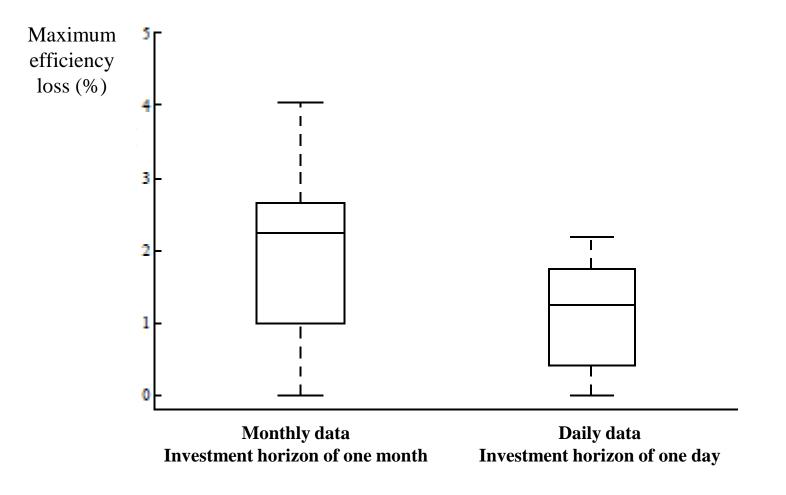












• In sum, all robustness checks indicate that the joint use of VaR and ST constraints is still *ineffective* in controlling CVaR.

# 9. Conclusion

• The joint use of VaR and ST constraints allows the selection of portfolios with relatively *large* CVaRs.

• Hence, the joint use of VaR and ST constraints is *ineffective* in controlling CVaR.

- This result is consistent with:
  - Banks around the world suffered sizeable trading losses during the recent crisis.
  - Trading losses notably exceeded VaR (and even minimum capital requirements).
- Our paper supports the view that the Basel market risk framework did *not* promote bank stability.

# **10. Related Research**

- Revised Basel market risk framework: stressed VaR
  - Motivation: revised framework is based on VaR, stressed VaR, and ST.
  - *Question*: is the revised framework *effective* in controlling tail risk?
  - *Main result I*: a risk management system based on the revised framework still allows the selection of trading portfolios with substantive tail risk.
  - Main result II: while the minimum capital requirements set by the original framework for such portfolios can be wiped out by losses during a period of just one day, this is much less likely with the revised framework.
  - *Reference*: Alexander, Baptista, and Yan, 2011, A comparison of the original and revised Basel market risk frameworks for regulating bank capital.

# **10. Related Research**

- An alternative: using multiple VaR constraints
  - *Motivation*: practitioners and regulators criticize the performance of VaR during the recent crisis, but still use it.
  - *Question*: does there exist *more effective* VaR-based risk management systems?
  - Main result: regulations and risk management systems based on multiple VaR constraints are more effective in reducing tail risk than those based on a single VaR constraint.
  - *Reference*: Alexander, Baptista, and Yan, 2011, When more is less:
    Using multiple constraints to reduce tail risk, *Journal of Banking and Finance*, forthcoming.