Before Markowitz, there was nothing.

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- portfolios matter, not single stocks: portfolio selection, rather than stock selection
- statistical properties of portfolios derived from single stocks

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- impact of long-only
- impact of correlations

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Zero risk?



R returns, size $n_{scenarios} \times n_{assets}$

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- w portfolio weights
- Rw portfolio returns

Zero risk?

$$m = \frac{1}{n_{\rm s}} \iota' R$$

$$\frac{1}{n_{\rm s}}R'R={\rm Cov}(R)+mm'$$

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not all risk can be diversified

not all risk can be diversified

 \rightarrow if not all risk can be diversified, try to get rewarded

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not all risk can be diversified

 \rightarrow if not all risk can be diversified, try to get rewarded

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characterise any portfolio by risk and reward

not all risk can be diversified

 \rightarrow if not all risk can be diversified, try to get rewarded

characterise any portfolio by risk and reward

a portfolio is <u>efficient</u> if, for a level of risk, there is no portfolio with higher expected return (equivalently: if, for a level of return, there is no portfolio with less risk)

Markowitz (1952): reward is expected portfolio return

$$\sum_{i=1}^{n_{\rm A}} \mu_i \mathbf{w}_i = \mu' \mathbf{w}$$

and risk is portfolio-return variance

$$\sum_{i=1}^{n_{A}}\sum_{j=1}^{n_{A}}w_{i}w_{j}\sigma_{ij}=w'\Sigma w$$

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Constructing efficient frontiers

$$\max_{\mathbf{w}} \ \mu' \mathbf{w} - \gamma \mathbf{w}' \Sigma \mathbf{w}$$

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with constraints

$$w \ge 0$$
$$w'\iota = 1$$

Quadratic Programming (QP)

in R, with solve.QP (package quadprog)

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$$\min_{b} - d'b + \frac{1}{2}b'Qb$$

subject to

$$A'b \geq b_0$$

Quadratic Programming (QP)

in R, with solve.QP (package quadprog)

$$\min_{b} - d'b + \frac{1}{2}b'Qb$$

$$\max_{\mathbf{w}} \mu' \mathbf{w} - \gamma \mathbf{w}' \Sigma \mathbf{w}$$

subject to

$$A'b \geq b_0$$

 $w \ge 0$ $\sum w = 1$

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QP – objective function

$$-d'b+\frac{1}{2}b'Qb$$

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QP – objective function

$$-d'b+\frac{1}{2}b'Qb$$

make substitutions

$$d = -\mu$$
$$Q = -2\gamma\Sigma$$

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QP – objective function

$$-d'b+\frac{1}{2}b'Qb$$

make substitutions

$$d = -\mu$$
$$Q = -2\gamma\Sigma$$

and we get

$$\mu' \mathbf{w} - \gamma \mathbf{w}' \Sigma \mathbf{w}$$

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QP – constraints $A'b \ge b_0$

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QP – constraints $A'b \ge b_0$



$$\iota_{n_{\mathsf{A}}} = \underbrace{[1, 1, 1, \dots]'}_{n_{\mathsf{A}}}$$

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QP - constraints

```
> na <- 3
> rbind(1, -diag(na), diag(na))
```

	[,1]	[,2]	[,3]	
[1,]	1	1	1	
[2,]	-1	0	0	
[3,]	0	-1	0	
[4,]	0	0	-1	
[5,]	1	0	0	
[6,]	0	1	0	
[7,]	0	0	1	

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QP - constraints

- > require("Matrix")
- > na <- 3
- > Matrix(rbind(1, -diag(na), diag(na)))
- 7 x 3 sparse Matrix of class "dgCMatrix"

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```
      [1,]
      1
      1
      1

      [2,]
      -1
      .
      .

      [3,]
      .
      -1
      .

      [4,]
      .
      .
      -1

      [5,]
      1
      .
      .

      [6,]
      .
      1
      .

      [7,]
      .
      .
      1
```

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