## Before Markowitz, there was nothing.

## Harry Markowitz

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


## Harry Markowitz

GOTO: mv.R

## Harry Markowitz

- impact of long-only
- impact of correlations


## Zero risk?



R returns, size $n_{\text {scenarios }} \times n_{\text {assets }}$ w portfolio weights

Rw portfolio returns

## Zero risk?

$$
\begin{gathered}
m=\frac{1}{n_{\mathrm{s}}} \iota^{\prime} R \\
\frac{1}{n_{\mathrm{s}}} R^{\prime} R=\operatorname{Cov}(R)+m m^{\prime}
\end{gathered}
$$

## Risk and reward

not all risk can be diversified

## Risk and reward

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

## 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

## 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 efficient 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)

## Risk and reward

Markowitz (1952): reward is expected portfolio return

$$
\sum_{i=1}^{n_{\mathrm{A}}} \mu_{i} w_{i}=\mu^{\prime} w
$$

and risk is portfolio-return variance

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

## Constructing efficient frontiers

$$
\max _{w} \mu^{\prime} w-\gamma w^{\prime} \Sigma w
$$

with constraints

$$
\begin{aligned}
w & \geq 0 \\
w^{\prime} \iota & =1
\end{aligned}
$$

## Quadratic Programming (QP)

in R, with solve.QP (package quadprog)

$$
\min _{b}-d^{\prime} b+\frac{1}{2} b^{\prime} Q b
$$

subject to

$$
A^{\prime} b \geq b_{0}
$$

## Quadratic Programming (QP)

in R, with solve.QP (package quadprog)

$$
\min _{b}-d^{\prime} b+\frac{1}{2} b^{\prime} Q b
$$

$$
\max _{w} \mu^{\prime} w-\gamma w^{\prime} \Sigma w
$$

subject to subject to

$$
A^{\prime} b \geq b_{0}
$$

$$
\begin{aligned}
w & \geq 0 \\
\sum w & =1
\end{aligned}
$$

## QP - objective function

$$
-d^{\prime} b+\frac{1}{2} b^{\prime} Q b
$$

## QP - objective function

$$
-d^{\prime} b+\frac{1}{2} b^{\prime} Q b
$$

make substitutions

$$
\begin{aligned}
d & =-\mu \\
Q & =-2 \gamma \Sigma
\end{aligned}
$$

## QP - objective function

$$
-d^{\prime} b+\frac{1}{2} b^{\prime} Q b
$$

make substitutions

$$
\begin{aligned}
d & =-\mu \\
Q & =-2 \gamma \Sigma
\end{aligned}
$$

and we get

$$
\mu^{\prime} w-\gamma w^{\prime} \Sigma w
$$

QP - constraints $A^{\prime} b \geq b_{0}$

## QP - constraints $A^{\prime} b \geq b_{0}$

$A^{\prime}=\left[\begin{array}{rrrr}1 & 1 & \ldots & 1 \\ -1 & & & \\ & -1 & & \\ & & \ddots & \\ & & & -1 \\ 1 & & & \\ & 1 & & \\ & & \ddots & \\ & & & 1\end{array}\right]=\left[\begin{array}{r}t_{n_{A}} \\ -I_{n_{A}} \\ I_{n_{\mathrm{A}}}\end{array}\right]$ and $b_{0}=\left[\begin{array}{c}1 \\ -w_{1}^{\max } \\ -w_{2}^{\max } \\ \vdots \\ -w_{n_{\mathrm{A}}}^{\max } \\ w_{1}^{\min } \\ w_{2}^{\min } \\ \vdots \\ w_{n_{\mathrm{A}}}^{\min }\end{array}\right]$

$$
\iota_{n_{\mathrm{A}}}=\underbrace{[1,1,1, \ldots]^{\prime}}_{n_{\mathrm{A}}}
$$

## QP - constraints

$>$ na <- 3
$>\operatorname{rbind}(1,-\operatorname{diag}(n a), \operatorname{diag}(n a))$

|  | $[, 1]$ | $[, 2]$ | $[, 3]$ |
| ---: | ---: | ---: | ---: |
| $[1]$, | 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 |

## QP - constraints

> require("Matrix")
> na <- 3
> Matrix(rbind(1, -diag(na), diag(na)))
7 x 3 sparse Matrix of class "dgCMatrix"
$[1] \quad 1 \quad 1 \quad$,
[2,] -1
[3,] . -1 .
$[4$,$] . -1$
$[5] \quad$,1 .
$[6$,$] . 1$.
$[7$,$] . 1$

## Harry Markowitz

GOTO: mv.R

## References

囯 Gilli, Manfred, Dietmar Maringer, and Enrico Schumann
(2011). Numerical Methods and Optimization in Finance. Elsevier/Academic Press. URL: http: //nmof .net.
囯 Markowitz, Harry M. (1952). "Portfolio Selection". In: Journal of Finance 7.1, pp. 77-91.

