

# Multifactor Models

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BUSI 448: Investments

# Where are we?

## Last time:

- The cross-section of expected stock returns
- Portfolio sorts
- Cross-sectional regression

## Today:

- Multifactor models
- Estimating expected returns
- Characteristic-based models

# Multifactor models

# Expected returns

- We are interested in characterizing the risk premium for stocks

$$E[r] = r_f + \text{risk premium}$$

- Empirically, the CAPM fares poorly in this regard.
- Today, we will explore some alternatives.

# Fama-French 3-factor model

Motivated by the size and value anomalies, Fama and French argued for a three factor model.

$$R_{i,t} - R_{f,t} = \alpha_i + \beta_i(R_{m,t} - R_{f,t}) + s_iSMB_t + h_iHML_t + \varepsilon_{i,t}$$

- Size factor: SMB (Small Minus Big)
- Value factor: HML (High Minus Low)
- Widely used asset-pricing model for stocks and for evaluation of asset managers

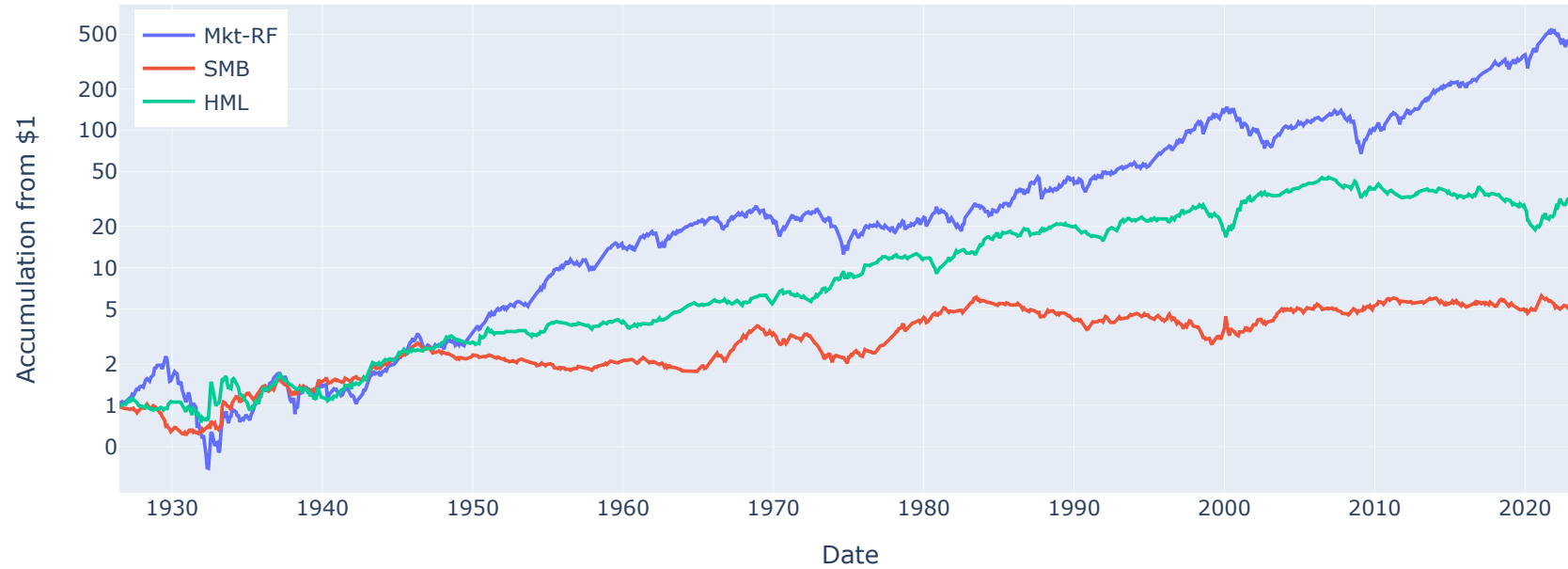
# SMB and HML

Form 6 portfolios on size (mkt cap) and value (B/M ratio)

	Low B/M	Medium B/M	High B/M
Small	Small growth		Small value
Large	Large growth		Large value

- SMB:  $(0.5 \cdot SG + 0.5 \cdot SV) - (0.5 \cdot LG + 0.5 \cdot LV)$
- HML:  $(0.5 \cdot SV + 0.5 \cdot LV) - (0.5 \cdot SG + 0.5 \cdot LG)$

# SMB + HML cumulative returns



# What are the CAPM alphas of HML and SMB?

$$SMB_t = \alpha_{SMB} + \beta_{SMB} (R_{m,t} - R_{f,t}) + \varepsilon_{i,t}$$

$$HML_t = \alpha_{HML} + \beta_{HML} (R_{m,t} - R_{f,t}) + \varepsilon_{i,t}$$

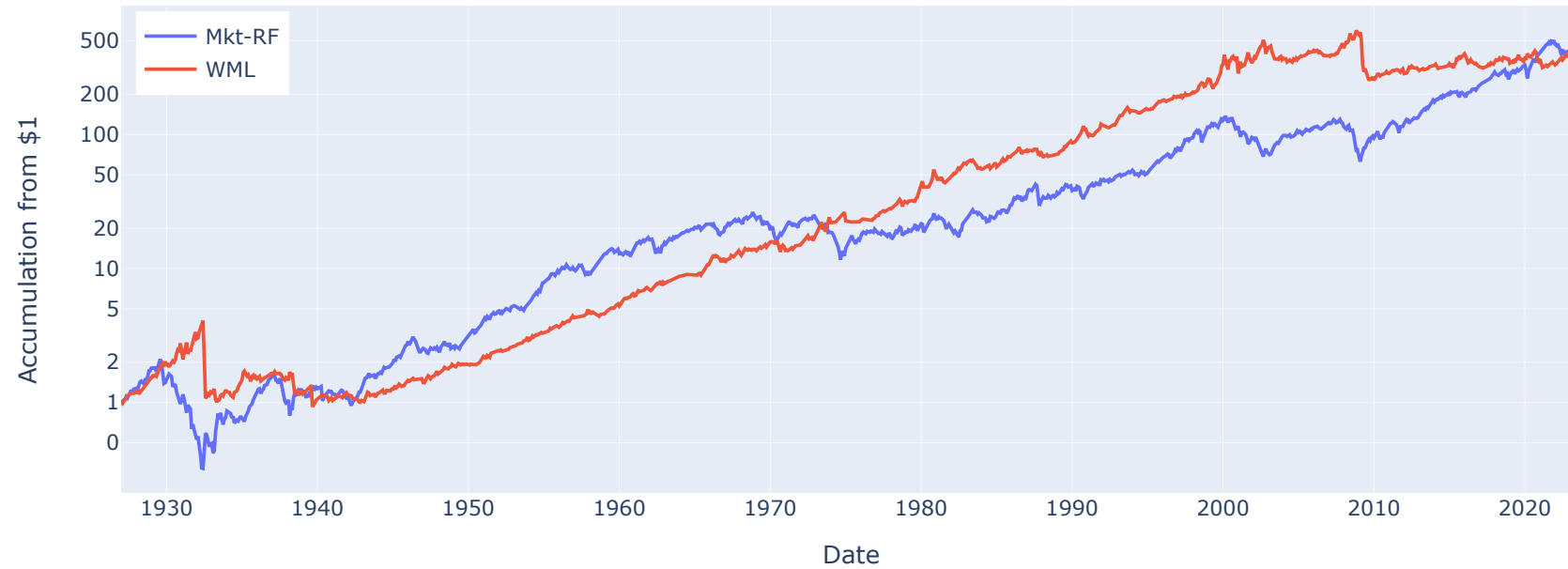
- Let's look at today's first notebook.
- Recall: non-zero alphas mean that the market portfolio is not mean-variance efficient
  - Investing in a portfolio of the market and a positive alpha portfolio leads to a higher Sharpe ratio.



# Momentum

- Consider sorting stocks based on their returns over the past year
- Call the top performers “winners”
- Call the bottom performers “losers”
- A portfolio that goes long “winners” and short “losers” outperforms
- This is known as a **momentum** strategy

# Momentum cumulative returns



# Momentum alphas

Can market risk exposure explain momentum?

$$WML_t = \alpha_{WML} + \beta_{WML}(R_{m,t} - R_{f,t}) + \varepsilon_{i,t}$$

What about the size and value factors?

$$WML_t = \alpha_{WML} + \beta_{WML}(R_{m,t} - R_{f,t}) + s_{WML}SMB_t + h_{WML}HML_t + \varepsilon_{i,t}$$

# Fama-French-Carhart model

The FFC model augments the Fama-French-Carhart model with a momentum factor.

$$r_{i,t} - r_{f,t} = \alpha_i + \beta_i(r_{m,t} - r_{f,t}) + s_iSMB_t + h_iHML_t + m_iWML_t + \varepsilon_{i,t}$$

- Size factor: SMB (Small Minus Big)
- Value factor: HML (High Minus Low)
- Momentum factor: WML (Winners Minus Losers)

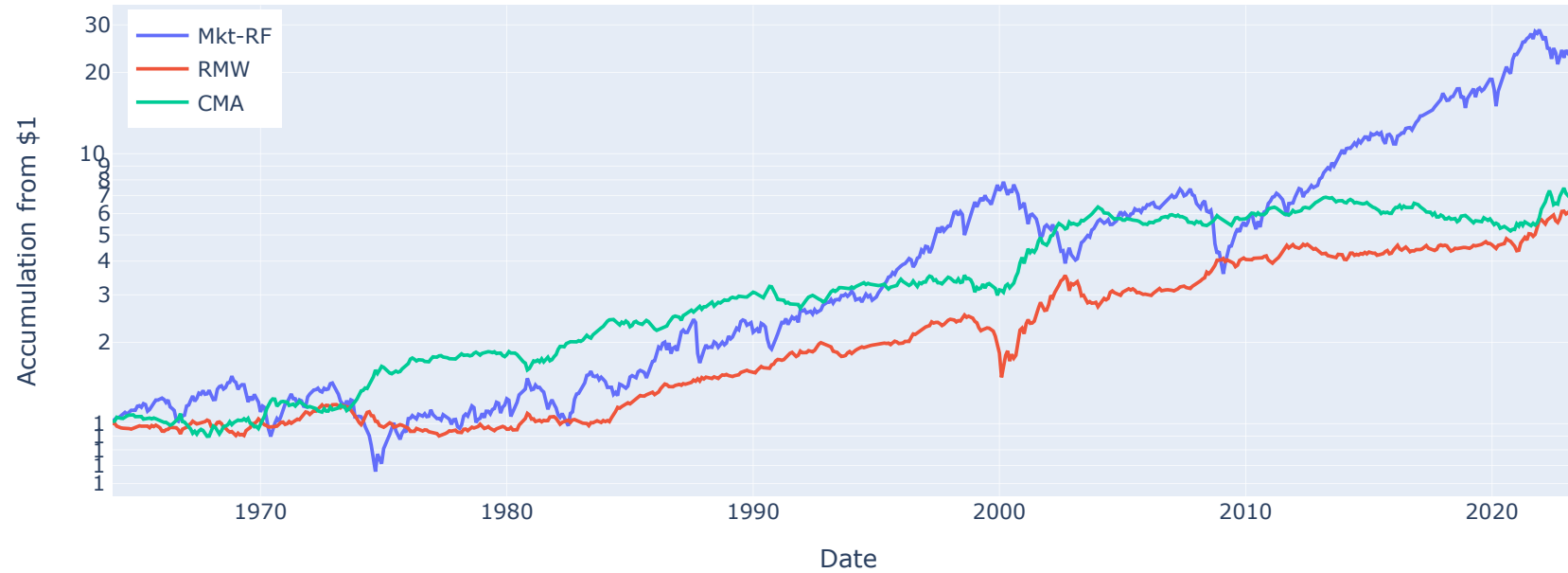
# Fama-French 5-factor model

- Industrious researchers have continued to generate firm characteristics that correlate with ex post performance.
- Recently, Fama and French have argued for the following model:

$$R_{i,t} - R_{f,t} = \alpha_i + \beta_i (R_{m,t} - R_{f,t}) + s_i SMB_t + h_i HML_t + r_i RMW_t + c_i CMA_t + \varepsilon_{i,t}$$

- Size factor: SMB (Small Minus Big)
- Value factor: HML (High Minus Low)
- Operating profitability factor: RMW (Robust Minus Weak)
- Investment factor: CMA (Conservative Minus Aggressive)

# RMW + CMA cumulative returns



(Data starts in the 1960s due to availability of accounting information.)

# What are the CAPM alphas of HML and SMB?

$$RMW_t = \alpha_{RMW} + \beta_{RMW} (R_{m,t} - R_{f,t}) + \varepsilon_{i,t}$$

$$CMA_t = \alpha_{CMA} + \beta_{CMA} (R_{m,t} - R_{f,t}) + \varepsilon_{i,t}$$

# Expected return estimates



# Factor models and $E[r]$ estimates

- For a given stock, we need three ingredients to construct an expected return estimate.

1. Factor loadings ( $\beta_i, s_i, h_i, r_i, c_i$ )

2. Factor risk premia ( $\lambda_{\text{mkt}}, \lambda_{\text{smb}}, \lambda_{\text{hml}}, \lambda_{\text{rmw}}, \lambda_{\text{cma}}$ )

3. The risk-free rate

- We have previously discussed the market risk premium.
- Now we want to estimate the other risk premiums
  - we can use the time-series average return of their respective long-short portfolio

# E[r] estimates

Using the estimated factor loadings and estimates of the factor risk premia, the factor model's estimate of expected returns is:

$$E[R_i] = R_f + \hat{\beta}_i \hat{\lambda}_{\text{mkt}} + \hat{s}_i \hat{\lambda}_{\text{smb}} + \hat{h}_i \hat{\lambda}_{\text{hml}} + \hat{r}_i \hat{\lambda}_{\text{rmw}} + \hat{c}_i \hat{\lambda}_{\text{cma}}$$

- Let's look at an example on the [dashboard](#)
- A notebook implementing this approach is on [Colab](#)

# Characteristic regressions

# Fama-MacBeth cross-sectional approach

- We could also simply use the cross-sectional relationship between realized returns and lagged characteristics to characterize expected returns.
- We will use  $N$  characteristics guided by the empirical record so far

# The procedure

1. Run cross-sectional regressions for 120 months of returns

$$R_{it} - R_{ft} = a_t + \sum_{j=1}^N b_{j,t} \cdot \text{characteristic}_{it-1} + e_{it}$$

2. Take average of each characteristic's time-series of  $b_{jt}$ s

$$\bar{b}_j = \frac{1}{120} \sum_{t=1}^{120} b_{j,t}$$

3. Expected return estimate  $\tau$  is:

$$E[R_{i\tau}] = R_{f\tau} + \bar{a} + \sum_{j=1}^N \bar{b}_j \cdot \text{characteristic}_{i\tau-1}$$

- Let's look at how to implement this

**For next time: Fixed Income: Duration**

