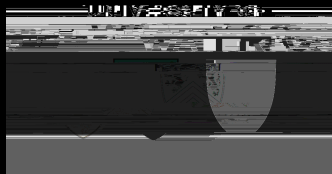


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## Portfolio Optimization under Climate Change

Joint work with Professor Mary Hardy & Professor Ben Feng

AFRIC 2023

## Question

Explore long-term and short-term returns of pension portfolios while adapting to a low-carbon economy.

# Climate Risks

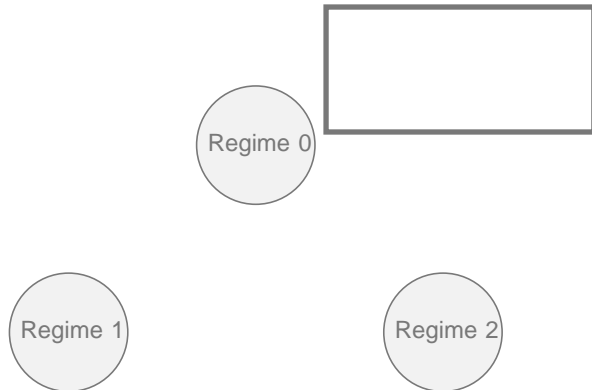
## 1. Transition Risks

-   

## 2. Physical Risks

- 
- 
- 
- 

# Climate Scenario Assumptions



# Climate Model

- ❖ Conditional Multivariate Normal Model
  - ❖ Simulated quarterly returns
  - ❖ Allow for impacts of physical and transition risks, depending on
    - | Sector of the economy
    - | Regime
    - | Time since the transition

# Climate Risk Phase

# Exogenous vs Endogenous Processes

## Exogenous Process: Economic Scenarios

1. No Transition
2. Early Transition
  - Transition to Regime 1 at  $t = 2$
3. Mid Transition
  - Transition to Regime 2 at  $t = 5$

## Endogenous Process: Decarbonization Strategy

1. No Decarbonization
2. Slow Decarbonization
  - 10-year decarbonization pathway: untargeted
3. Quick Decarbonization
  - 5-year decarbonization pathway: untargeted

# Portfolio Assumptions

## 1. Assets:

- $\frac{1}{N}$

- $\frac{1}{N}$

## 2. Base Strategy; no decarbonization

- $\frac{1}{N}$        $\frac{1}{12}$       (T = 30)

- $\frac{1}{N}$

## 3. Decarbonization

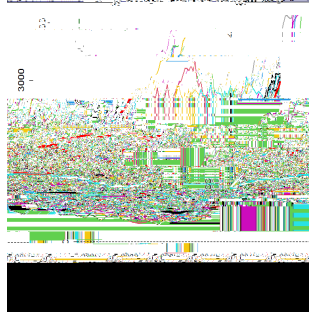
- $\frac{1}{N}$        $\frac{1}{12}$        $\frac{1}{9}$



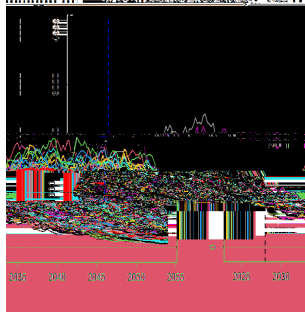
# Wealth Process: No Decarbonization

# Wealth Process: Slow Decarbonization

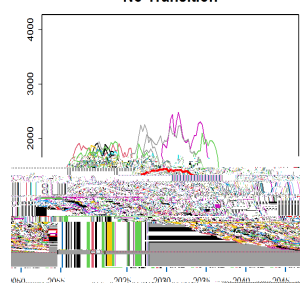
### Early Transition to Regime 1



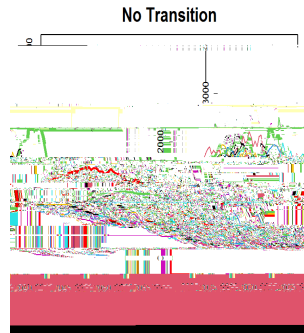
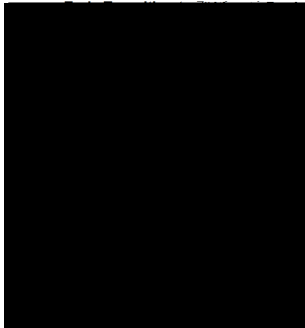
### Mid Transition to Regime 2



### No Transition



# Wealth Process: Quick Decarbonization



## Comparison at Median

# Plan Participant Backlash

# Plan Participant Backlash

# Case against Decarbonization?

## 1. Short term views

- ❖ Brown energy remains high performing

## 2. Climate change skepticism

- ❖ Disagreement on timing
- ❖ Disagreement on capital market impact



## References

1. Scott Kelly, Zhiyi Yeo, Andrew Coburn, Jennifer Copic, Doug Crawford-Brown, Aideen Foley, Eugene Neduv, Danny Ralph, and Farzad Saidi. Unhedgeable Risk: How Climate Change Sentiments Impacts Investors. University of Cambridge 2015.
2. Kevin Doran and Elias Quinn. Climate change risk disclosure: A sector by sector analysis of sec 10-k filings from 1995-2008. North Carolina Journal of International Law and Commercial Regulation, 34, 03 2009.
3. Iqbal Owadally, Jean-Rene Mwizere, Neema Kalidas, Kalyanie Murugesu, and Muhammad Kashif. Long-term sustainable investment for retirement. Sustainability, 13(9), 2021.
4. Davide Benedetti, Enrico Bis, Fotis Chatzimichalakis, Luciano Lillo Fedele, and Ian Simm. Climate change investment risk: Optimal portfolio construction ahead of the transition to a lower-carbon economy. Annals of Operations Research, 299(1):847-871, 2021.



# Climate Model

Annual Expected return & volatility under scenario  $s$ , at time  $t$

$$E[R_{t;s} | F_t] = r_{t;s} + \beta_{t;s} (E[R_{t;s} | F_t] - r_{t;s}) + \sigma_{t;s} \epsilon_t$$

$$\sigma_{t;s} = \sqrt{\text{Var}[R_{t;s} | F_t]}$$

# Plan Portfolio Assumptions

1. Investment Strategy: Long-Term  $\frac{1}{N}$  Investor ( $T = 30$ )

2. Asset Structure:

✦ ~~60/60~~

✦ Wealth Process:

$$P_{t+1} = P_t \exp \left( \hat{\alpha}_t + \sum_{i,j} \beta_{t,ij} \frac{1}{2} \sigma_{t,ij}^2 Z_t \right)$$

where  $Z_t \sim N(0, 1)$  and  $\beta_{t,ij} = \hat{\alpha}_{t,ij}$