

# Portfolio optimization in the digital financialization era using cryptocurrencies

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# Outline

- **Background**
- **Challenges[GAP]**
- **Objective**
- **Methodology**
- **Result**
- **Conclude**
- **Reference**

# Background

- **Development of investment portfolio theory**
  - TPT, MPT and PMPT (*Lekovic, 2021*)
- **Modern Portfolio Theory (*Markowitz, 1952*)**
  - Rational investor
  - Multiple Assets
  - Overall risk
- **The minimum return an investor can expect on any asset is usually the same risk-free rate of return combined with a margin of return to compensate for the risk (*Murphy, 1990*)**



## Background(Cont.)

- **Cryptocurrency** (*Bhatt, 2014*)
  - **Can be used to purchase goods or services**
  - **High security features**
  - **Decentralized finance**
- **High potential and Second Life or Maybe equivalent to the social network Web 2.0** (*Guadamuz and Marsden, 2015; Nian and Chuen (2015); Gafar et al., 2021*)

## Background(Cont.)

- **Support combine Cryptocurrency to Portfolio**
  - **Low correlation with traditional assets**(*Krückeberg and Scholz, 2019*)
  - **Improve risk and returns**(*Brière et al., 2015; Brauneis and Mestel, 2019; Symitsi and Chalvatzis, 2019; Kajtazi and Moro; 2019; Borri, 2019; Trimborn et al., 2020; Białkowski, 2020; Petukhina et al., 2021; Kaya and Mostowfi, 2021*)

## Background(Cont.)

- **Moving average**
  - **Suitable for risks and returns**(*Skintzi and Xanthopouloussinis, 2007; Metghalchi et al., 2021*)
  - **Price prediction**(*Khorram and Sheshmani, 2015;Ren et al., 2018; CALISKAN et al., 2020*)
- **Naive Portfolio**
  - **Minimizes risk without sacrificing expected returns**(*Tang, 2003*)
  - **Optimal strategy**(*Bock, 2018;Brown et al., 2013;li, 2018*)

## Background(Cont.)

- **Mean variance portfolio**
  - **There was no significant difference in performance between MinVar. Vs MaxSarpe. (*Vinzelberg and Auer, 2021*)**

# GAPs

- lack of integration
  - **G1** : Efficiency by mean variance in Cryptocurrency Add a traditional asset portfolio with transaction costs using moving averages.
  - **G2** : Efficiency point in the efficient frontier.
- Identify key points of interest
  - “Portfolio optimization in the digital financialization era using cryptocurrencies”



# Objective

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- 1. To create a portfolio with equal weight distribution using digital assets (The Naïve portfolio).**
- 2. To test the strategy of buying, selling, buying and holding, buying and selling over time Buy and sell following the moving average trend following.**
- 3. To test the level of return and risk according to the Mean-Variance model.**

# Related Literature

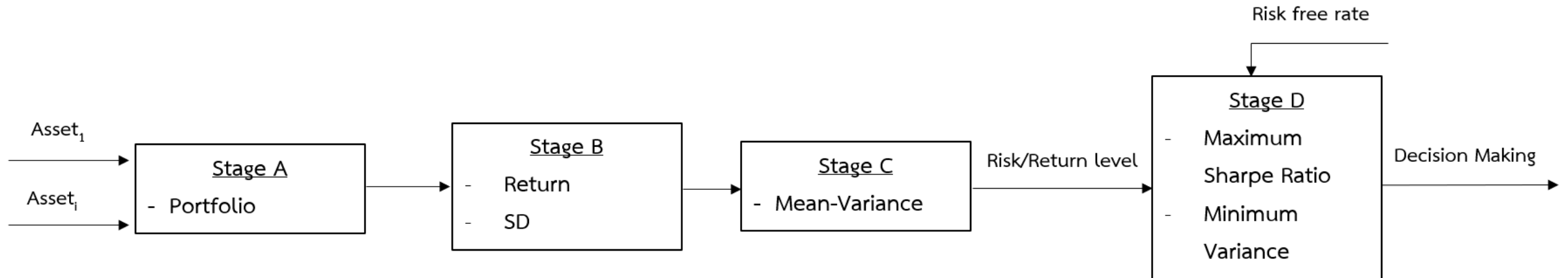
1. Naïve portfolio  $w_i = \frac{1}{N}$  (Tang, 2004)

2. Mean-Variance  $E(R_p) = \sum_{i=1}^N w_i E(R_i)$  ,  $w^T \Sigma w$  (Markowitz, 1952)

3. Sharpe ratio  $\frac{E(R) - R_f}{\sigma}$  (Sharpe., 1994)

4. MA  $SMA = \frac{(P_1 + P_2 \dots + P_n)}{n}$  (Metghalchi et al., 2021)

# Conceptual framework



# DATA

## **5 Most/Major value Periods 2016 to 2021 [From yahoofinance confirm by Coinbase, investing, Nasdaq and bloomberg]**

- I. Cryptocurrency**
- II. Technology Stocks U.S. Market**
- III. Currency**
- IV. Commodity**

# Methodology

1.<sup>st</sup> **Build an investment portfolio by the Naïve portfolio**  $w_i = \frac{1}{N}$  (Tang, 2004)

**Port.1      5 Most value cryptocurrency [BTC, ETH, Tether, XRP and Dogecoin]**

**Port.2      5 Major currency [EUR, JPY, GBP, AUD and CNY]**

**Port.3      5 Most value tech stocks [AAPL,MSFT,GOOG,AMZN and FB]**

**Port.4      5 Major commodity [Crude Oil, Gold, Coffee, Natural Gas and Silver]**

**Port.5      No.1 + No.2**

**Port.6      No.1 + No.3**

**Port.7      No.1 + No.4**

# Methodology (Cont.)

## 2.<sup>nd</sup> Trading strategy

- Buy and Hold
- Holding Periods (calendar)
  - 1, 3, 6, 12, 36, 48 months
- MA(50,200 Day)

- $$SMA = \frac{(P_1 + P_2 \dots + P_n)}{n}$$

- BUY MA(50) > MA(200)
- Sell MA(50) < MA(200)

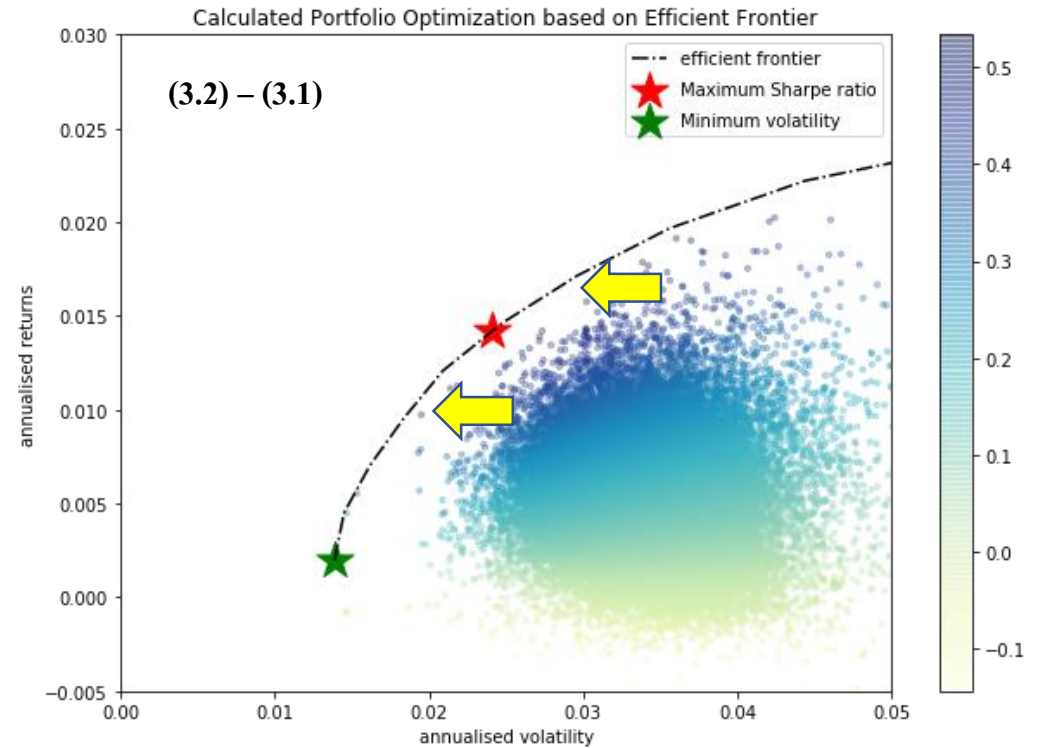
*(Skintzi and Xanthopoulossinis, 2007)*

# Methodology (cont.)

## 3.1<sup>rd</sup> Mean-Variance from 2<sup>nd</sup>

- $E(R_p) = \sum_{i=1}^N w_i E(R_i)$  (3.1)
- $\sum_{i=1}^N$  is sum of asset  $i$  to  $N$
- $w^T \Sigma w$  (3.2)
- $w$  is weight
- $\Sigma$  is the variance-covariance matrix

*(Markowitz, 1952)*



# Methodology (cont.)

## 3.1.1 Optimized Sharpe ratio from 3.<sup>rd</sup>

$$\max \frac{E(R) - R_f}{\sigma}$$

$R_f$  is risk free rate

$SD$  is standard deviation

(Sharpe, 1994)

## 3.1.2 Minimum Variance 3.<sup>rd</sup>

$$VAR(R_{p_{\min}}) = a^2 \sigma_x^2 + (1-a)^2 \sigma_y^2 + \dots + 2a(1-a)r_{xy} \sigma_x \sigma_y + \dots$$

or

$$\sigma_{p_{\min}}^2 = \text{Min} w_1^2 \sigma_1^2 + w_2^2 \sigma_2^2 + \dots + 2w_1 w_2 \sigma_1 \sigma_2 \rho_{12} + \dots$$

$w$  is weight of asset

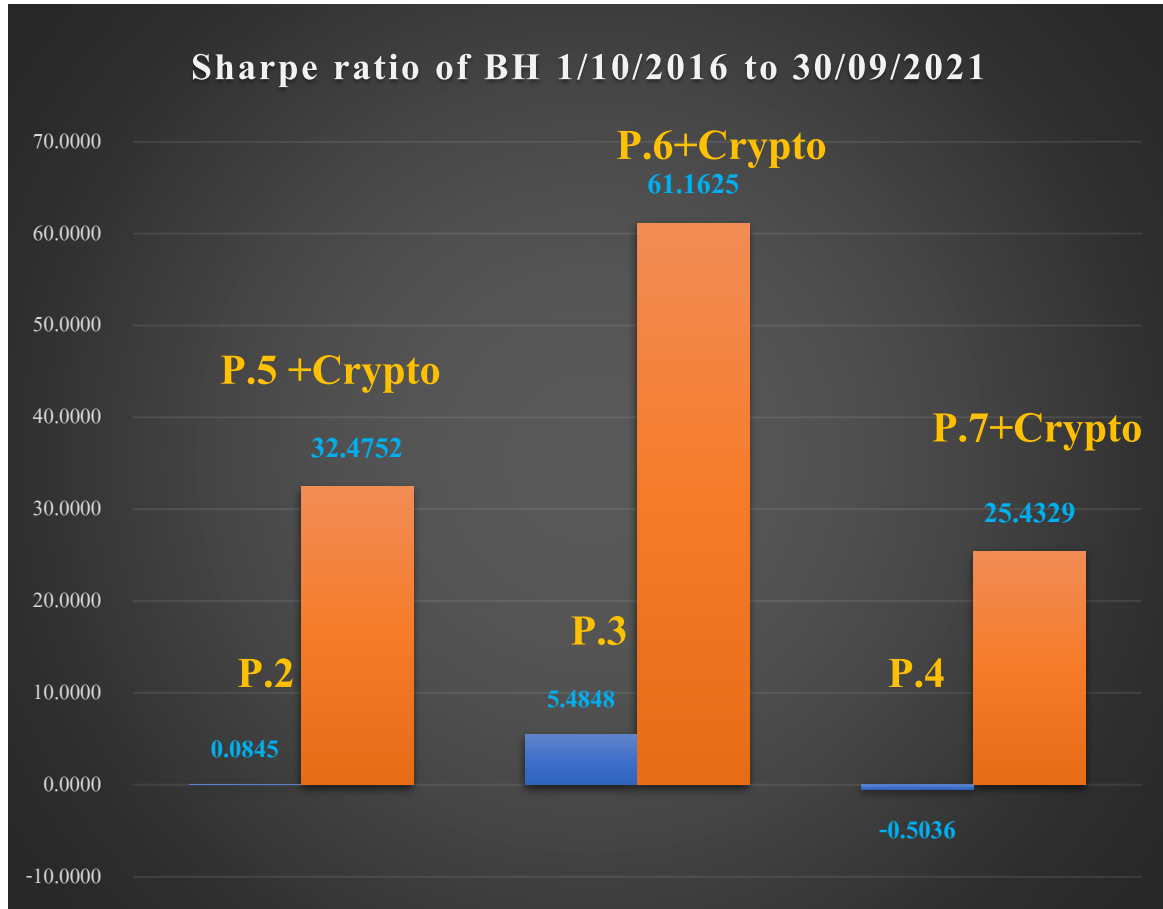
$\sigma$  is volatility

$\rho$  is correlation coefficient

(Markowitz, 1952)

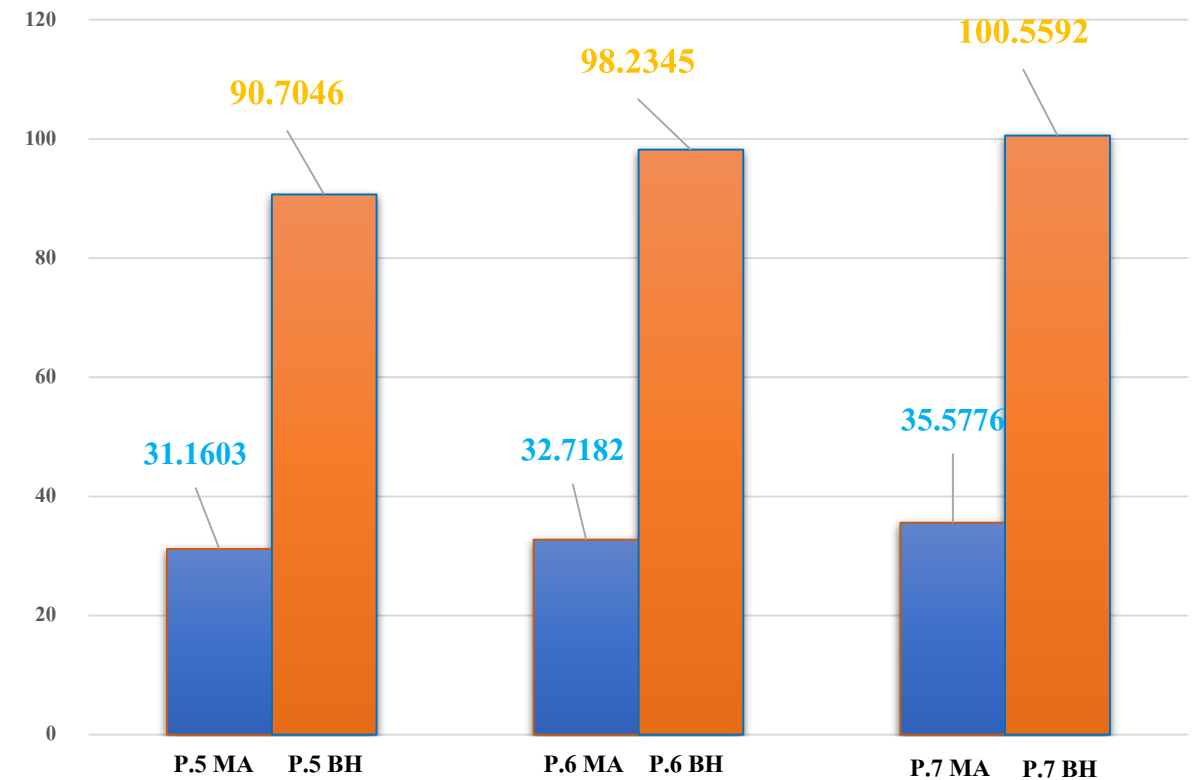


# Result



Risk(SD)

SD of BH VS MA(50,200) 1/10/2016 to 30/09/2021



# Result [Out of sample]

1/11/2018 to 31/10/2019

1/11/2019 to 31/10/2020

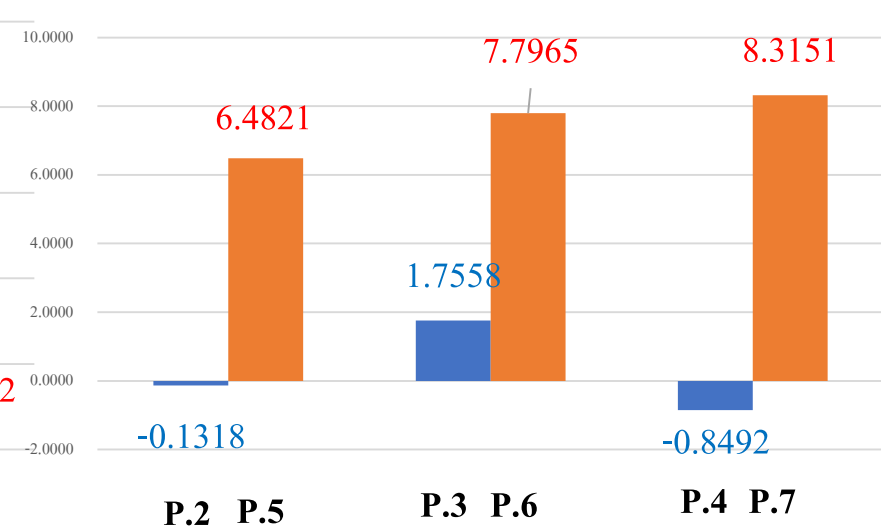
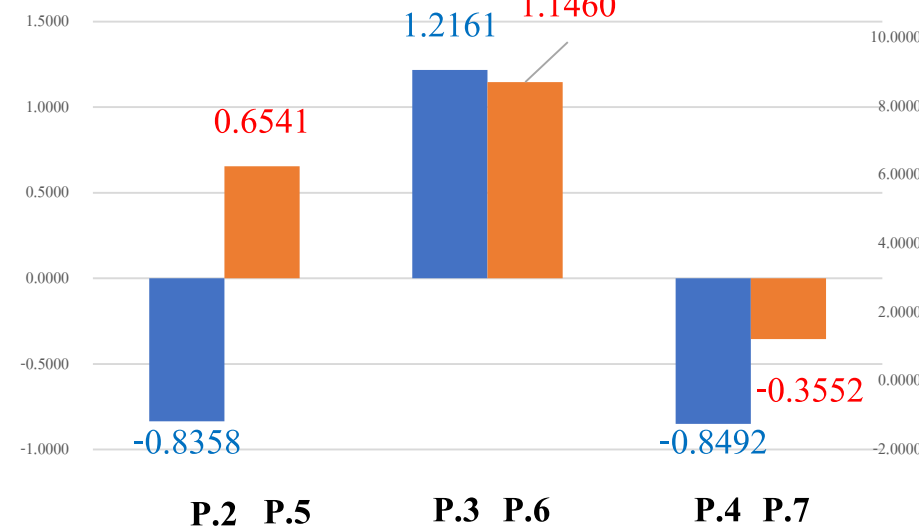
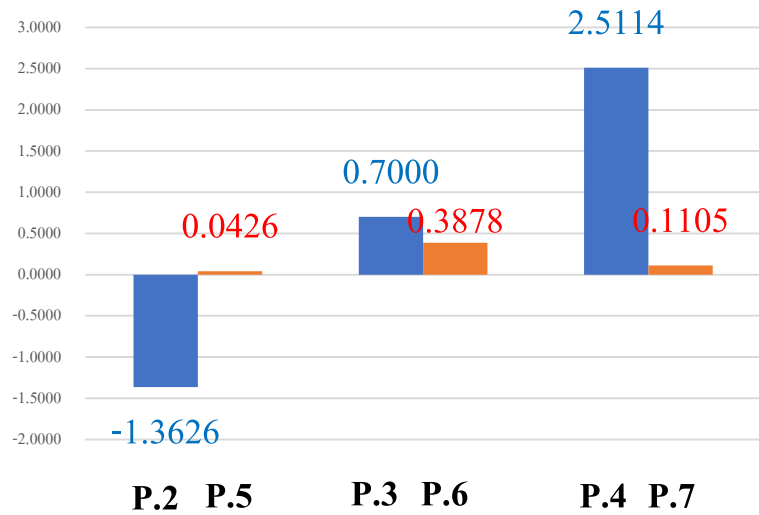
1/11/2020 to 31/10/2021

Sharpe ratio

Pre-Covid

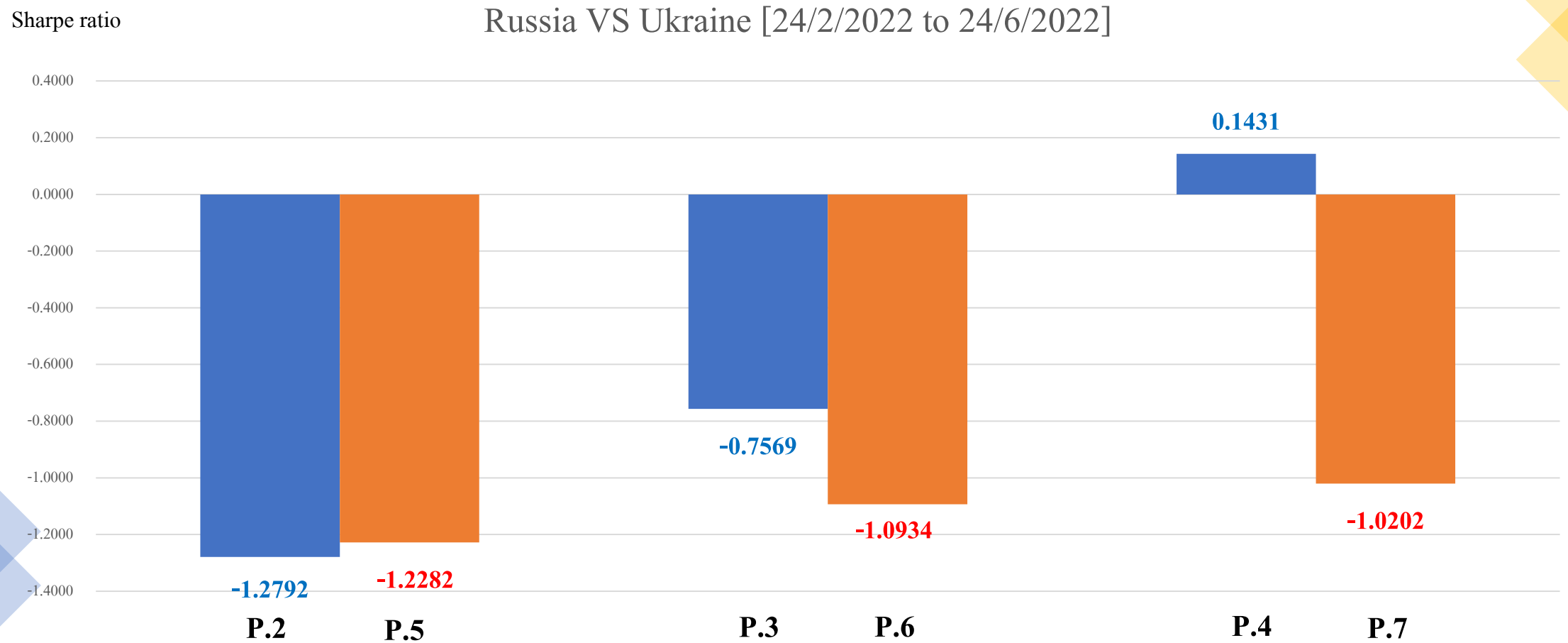
During-Covid

Post-Covid



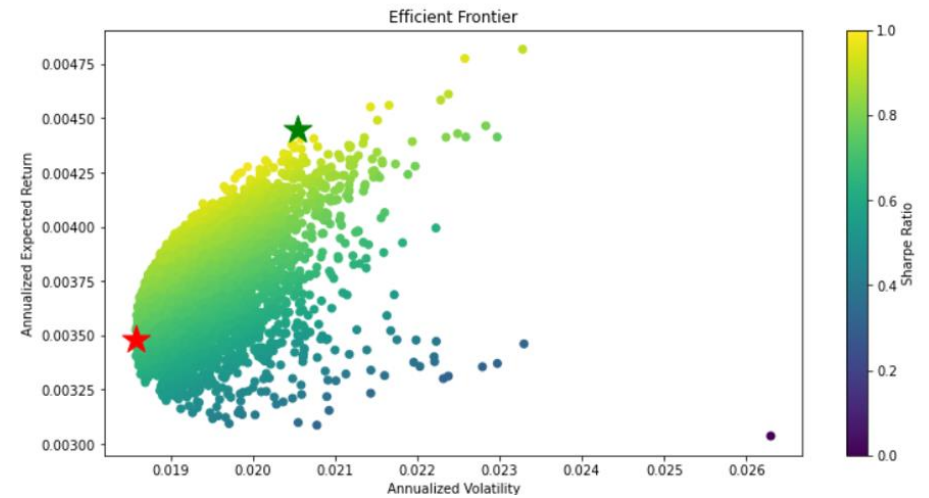
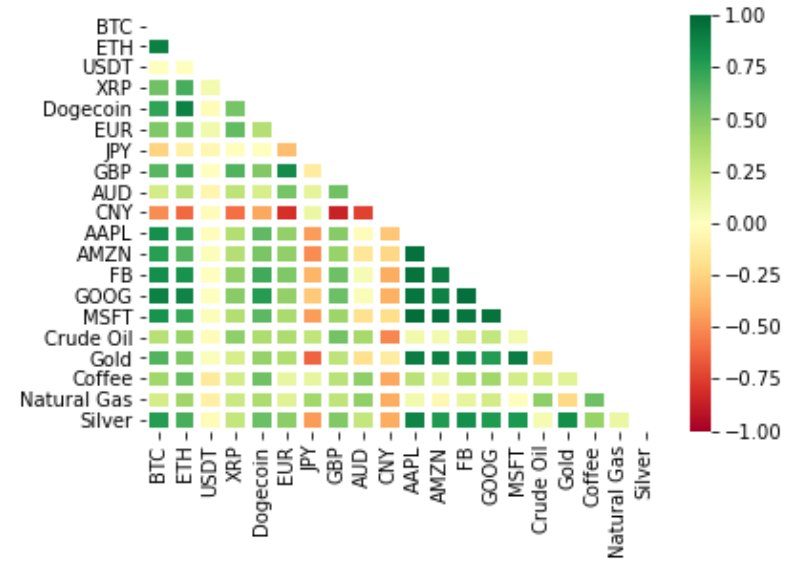
(Fu and Mishra , 2021)

# Result [Out of sample]



# Conclude

- Correlation Coefficient
- Returns and risks level
  - MinVar
  - MaxSharpe



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