THE MULTI-SCALE CURRENCY EXPOSURE OF FOOD AND BEVERAGE FIRMS IN MALAYSIA: AN APPLICATION OF WAVELET TECHNIQUE

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ABSTRACT

The paper embarks initial investigation on the multi-scale exchange rate exposure of 49 food and beverage corporations in Malaysia from July 2005 till August 2018 using the Maximal Overlap Discrete Wavelet Transformation (MODWT) approach. Wavelet multi-scaling approach is capable to decompose a given time series into several frequency domains and useful in facilitating exchange risk modeling within multiple time horizons. The study finds that the level of exchange rate exposure exhibits non-homogenous trend across scales, where the incidence of exposure tends to be concentrated at the higher time scale (low frequency) for overall period as well as across the sub-periods surrounding the Global financial Crisis 2008. From policy implication, the study suggests that exchange risk measurement must account for different time horizons effect and vigorous risk management strategies should be placed primarily for widened investment interval.

Keywords: Currency Exposure, Wavelet Technique, Food and Beverage Industry

INTRODUCTION

Since the abolishment of the Bretton Woods system in 1970s, the issue of exchange rate exposure remains major concern of multinationals and regulators around the globe. Fundamentally, exchange risk becomes one of the important aspects in international asset pricing. The unanticipated change in foreign exchange rate may result in substantial impact to firm's projected cash flows. Adler & Dumas (1984) defines exchange rate exposure as firm's sensitivity to any change in foreign currency under a regression framework. A significant number of studies have been conducted to examine exchange rate exposure with large concentration is put under the context of developed economies. However, majority of the studies found minimal level of exposure mainly due to vigorous hedging practices in the region (Abdul Wahab et al., 2017; Suhaimi et al., 2019a). Jorion (1990) reported minimal exposure level with only about 5% of 287 U.S. corporations from 1971 till 1987 were affected by changes in trade weighted index exchange rate. The modest exposure level was due to the widespread hedging activities by the U.S firms.

Under the context of small open economy of Malaysia, firms operating in the country are nonchalantly exposed to exchange risk especially those with substantial foreign sales and imports. The study puts highlight on food and beverage sector, considering that the sector has become one of the major components in Malaysian consumer product industry. Moreover, examining a single sector will provide more meaningful findings as exchange exposure is unique for each industry (Ibrahim, 2008; Abdul Wahab, 2021). Majority of Malaysian firms are net importers of food and beverage goods and services due to the lack of local production, resources and limited alternative energy sources (Abdullah et al., 2018). With this regard, Malaysia imports large amount of raw materials to support its local demands as well as to facilitate its export activities for processed products. Food and beverage corporations were also affected during the Global financial crisis

(GFC) 2008 to some extent. We hypothesize that sudden increase and reduction in exchange rate during the GFC has strong influence on the incidence of exposure. The exchange rate exposure tends to be an event specific as a response to the specific financial crisis (Parsley & Popper, 2006; Suhaimi et al., 2019b). Several studies were conducted under the context of Malaysia market. Muller & Verschoor (2007) run large scale study of currency exposure involving 3000 Asian firms including from Malaysia and found that 25% of total firms had significant exposure to the USD with majority of them were highly levered firms. Bartram & Bodnar (2012) examined currency exposure of 4404 non-financial corporations including firms from Malaysia with a duration from July 1994 till December 2006. Interestingly, they found high level of exposure among developing countries and minimal level of exposure among developed countries (US, Canada) due to widespread of hedging use. Specifically, about 15.5% Malaysia firms were significantly exposed to the USD. Abdul Wahab (2017) investigated the impact of Foreign Currency Derivatives (FCD) on the level of exchange risk of 106 non-financial corporations in Malaysia from January 1995 until December 2014. The study reported slightly lower exposure among hedged firms compared to unhedged firms, signifying the effectiveness of hedging in mitigating exchange risk for short term hedging strategy. Bacha et al., (2013) documented considerably large exposure with about 71% of 158 sample firms had significant exposure to exchange risk. This study argued that the level of economic openness had strong connection with the level of exchange rate exposure.

From specification perspective, wavelet analysis in finance is considered relatively new despite of its significant applications in various financial and economic problems such as capital asset pricing model (Masih et al., 2010; Gencay et al., 2005), portfolio allocations (Kim & In, 2010), scaling properties of exchange rate volatility (Gencay et al., 2001) and many more. However, the interest in making importance of wavelet technique in examining the potential time scales exchange rate exposure has not been fully discovered yet. Previous studies only focused on single domain frequency in analyzing exchange rate exposure, ignoring the potential heterogeneity among investors. This is especially true under the imperfect market in which market players demonstrate different expectations and goals in their investment portfolio. Given the heterogeneity in investment interval, wavelet method decomposes return series into different frequencies to further understand the influence of multi-scale investment interval to the level of exposure.

Given all these issues, the first objective of the study is to analyze the multi-scale exchange rate exposure with special emphasis on the food and beverage corporations in Malaysia. The second objective focuses in examining the time varying multi-scale exposure surrounding the Global financial crisis 2008. The organization of the paper is structured as follows; Part 2 explains the data selection and methodology, while section 3 offers discussion on the results. Final part concludes the whole findings and offers direction for future study.

METHODOLOGY

Data

For data collection process, the study employs a set of screening criteria. First, the data of firms should span from July 2005 till August 2018. The starting point of data is taken from the date when Malaysia authority decided to de-peg the Malaysian Ringgit from the de facto US dollar peg at MYR 3.80 per USD which took place aftermath the Asian financial crisis 1997. The post de-peg period is opted mainly to avoid multi collinearity problem under the fixed regime. Besides, the effect of exchange rate exposure could be realized better under the floating regime compared to fixed regime. The study uses daily stock returns comprising corporations in Food Producers and Beverage sector as classified by Thompson Reuters Data stream with stringent listing criteria. This

enhances the validity of the data extracted for this study. The final sample contains 49 corporations of food producers and beverage. Daily data of stock returns are extracted to effectively convert our returns series into different classes of frequency. Besides stock returns, the study also collects daily market returns peroxided by FTSE Bursa Malaysia Composite Index as the control market factor. As for exchange rates, four major trading currencies are selected namely the U.S. Dollar (USD), the Great Britain Pound (GBP), the Euro (EUR), and the Japanese Yen (JPY). Direct quotation is used where the value of foreign currency is denominated in term of the Malaysian Ringgit.

Method

In order to ensure the stationary property of each series is taken care of, we transform the original trended series (the stock price (P_t), market index and exchange rates) into stationary series as follows;

$$R_t = \ln(P_t/P_{t-1}) \tag{1}$$

$$\mathbf{R}_{\mathrm{m,t}} = \ln(\mathbf{P}_{\mathrm{m,t}}/\mathbf{P}_{\mathrm{mt-1}}) \tag{2}$$

$$R_{X,t=ln} (X_{t} / X_{t-1})$$
(3)

 R_t denotes the stock returns, $R_{m,t}$ represents the market returns while $R_{X,t}$ represents returns for specific bilateral exchange rate *i.e.*, MYR/USD, MYR, EUR, MYR/GBP, MYR/JPY. The next step requires decomposition of each return series into its constituent multi resolution parts through the application of the maximal overlap discrete wavelet transformation (MODWT). MODWT transforms the single frequency domain of stock returns into multi-frequency domains. This provides better understanding on the level of activities occurring during each frequency domain. In this study, a special class of MODWT namely the Daubechies Least Asymmetric wavelet filter of length 8, *LA(8)* is used to decompose a return series using 5 different scale crystals which are defined as *d1* (2-4 days), *d2*(4-8 days), *d3* (8-16 days), *d4* (16-32 days) and *d5* (32-64 days) (Suhaimi et al., 2019). The decomposed series can be explained as;

$$r_{t} \approx \sum_{k} s_{j,k} \phi_{j,k}(t) + \sum_{k} d_{j,k} \psi_{j,k}(t) + \sum_{k} d_{j-1,k} \psi_{j-1,k}(t) + \dots + \sum_{k} d_{1,k} \psi_{1,k}(t)$$
(4)

j is the number of scale crystals (intervals or frequencies)

k is the number of coefficients in the specified component

 $\phi_{i,k}(t)$ and $\psi_{i,k}(t)$ are the father and mother orthogonal wavelet pairs that are given by

$$\phi_{j,k}(t) = 2^{-j/2} \phi\left(\frac{t-2^{j}k}{2^{j}}\right) \quad for \qquad j=1 \quad to \quad J$$

$$\psi_{j,k}(t) = 2^{-j/2} \psi\left(\frac{t-2^{j}k}{2^{j}}\right) \quad for \qquad j=1 \quad to \quad J$$
(5)

There are several interesting features from this equation. First, the return series is decomposed into the detailed component (mother wavelet) and smooth component (father wavelet). It should be noted that the level of activities occurring within father wavelet should be hypothetically different than that of the detailed part. The coefficients for mother wavelet $d_{j,k}$ and father wavelet $s_{j,k}$ are;

$$s_{j,k} \approx \int \phi_{j,k}(t) f(t) dt$$

$$d_{j,k} \approx \int \psi_{j,k}(t) f(t) dt$$
(6)

 $s_{j,k}$ represents the smooth part of information extracted from return series while the $d_{j,k}$ captures the detailed part within shorter period of time. After extracting the decomposed returns, all the information is combined and regressed under its respective scale. The residual model of Jorion (1990) is employed to effectively capture the level of each scale across different frequency domains. Each model is repeatedly regressed following each scale as follows;

$$R_{t}^{j} = a_{t}^{j} + \beta_{M}^{j} R_{M}^{j} + \beta_{USD}^{j} R_{USD}^{j} + \beta_{EUR}^{j} R_{EUR}^{j} + \beta_{GBP}^{j} R_{GBP}^{j} + \beta_{JPY}^{j} R_{JPY}^{j} + e_{t}^{j} \qquad for \qquad j = 1, 2, ..., 5$$

The heart of the study lies on the beta coefficient for each currency (USD, EUR, GBP, JPY). The beta coefficient measures the level of exchange rate exposure and the significance of beta implies the significant impact of exchange rate change on firm value. The positive beta infers better performance during appreciation of foreign currency (favouring exporter) while negative beta implies better performance during depreciation of foreign currency (favouring importer). Under wavelet analysis, identical beta across different time scales signal inexistence of multi-scale nature of currency exposure. On the other hand, different betas across varied scales signify the importance of time scales in exchange risk pricing. For robustness check, the study replicates equation (7) with robust standard error. The study tests the existence of heteroscedasticity problem through a special procedure called Breusch Pagan test for each individual regression. The problem will be handled through Garch(1,1) embedded into the regression model as proposed by Bacha, et al., (2013).

RESULTS AND DISCUSSIONS

Table 1 provides the comprehensive results of the beta coefficients which represent scalespecific exchange risk for all stocks. In ensuring the validity of the results, the analysis is further extended by embedding GARCH (1,1) specification into Jorion (1990) model for firms exhibiting heteroscedasticity problem. Several noteworthy information are shown in Table 1. First, it appears that food and beverage firms show a multi-scale tendency where the extent of beta coefficients for all currencies are changing non-monotonically with the time scale. The magnitudes of positive and negative exposure are increasing from low time scale (high frequency) to high time scale (low frequency).



FIGURE 1 MULTI-SCALE POSITIVE EXPOSURE (OLS WITH GARCH (1,1))



FIGURE 2 MULTI-SCALE NEGATIVE EXPOSURE (OLS WITH GARCH (1,1))

Fo	reign	ı Exchang	ge Exposure	Tab of Food and	ole 1 I Bev	erage	s firms in Ma	alaysia (OLS	5 witł	1	
			USD	<u>AKCH(1,1)</u>	EUR					Global Wald Test	
Wavelet	f	%			f	%			f	%	
Scale	{1}	{2}	Mean Beta (Positive)	Mean Beta (Negative)	{3}	{4}	Mean Beta (Positive)	Mean Beta (Negative)	{8 }	{9 }	
D1	9	18.40%	0.1627	-0.1668	7	14%	0.0894	-0.1133	48	98%	
D2	8	16.30%	0.099	-0.1255	12	25%	0.0955	-0.0976	48	98%	
D3	32	65.30%	0.2519	-0.1333	26	53%	0.1581	-0.1326	49	100%	
D4	32	65.30%	0.3433	-0.1339	30	61%	0.1971	-0.191	48	98%	
D5	40	81.60%	0.2745	-0.2393	40	81%	0.2954	-0.2288	49	100%	
S5	49	100.00%	0.2855	-0.2938	48	98%	0.1815	-0.2942	49	100%	
	GBP										
Wavelet	f	%			f	%					
Scale	{5}	{6}	Mean Beta (Positive)	Mean Beta (Negative)	{7 }	{8 }	Mean Beta (Positive)	Mean Beta (Negative)		\mathbf{R}^2	
D1	8	16%	0.0995	-0.0924	12	25%	0.0738	-0.0741	0.	0563	
D2	11	22%	0.1206	-0.1269	12	25%	0.07	-0.094	0.	0704	
D3	20	41%	0.1246	-0.1724	22	45%	0.0717	-0.1287	0.	1015	
D4	32	65%	0.2077	-0.2026	26	53%	0.116	-0.1292	0.1453		
D5	40	82%	0.2431	-0.1809	41	84%	0.1821	-0.2044	0.	1449	
S5	47	96%	0.2906	-0.1735	48	98%	0.1927	-0.1854	0.	1705	

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Table 2 FOREIGN EXCHANGE EXPOSURE OF FOOD AND BEVERAGES FIRMS IN MALAYSIA ACROSS THE GLOBAL FINANCIAL CRISIS (2008)												
	USD			EUR					Wald Test			
Sub-Period	Wavelet	f %				f	%			f	%	
GFC	Scale	{1}	{2}	Mean Beta (+)	Mean Beta (-)	{3}	{4}	Mean Beta (+)	Mean Beta (-)	{ 9 }	{10}	
Pre-GFC	D1	15	31%	0.7916	-0.712	6	12%	0.2905	-0.3413	46	94%	
	D2	13	27%	0.4859	-0.4723	7	14%	0.4172	-0.3435	47	96%	
	D3	21	43%	0.9189	-0.4544	20	41%	0.4577	-0.5608	47	96%	
	D4	29	59%	0.9553	-0.8716	32	65%	0.4248	-0.7257	48	98%	
	D5	44	90%	1.2762	-0.9901	39	80%	1.3528	-0.9078	49	100%	
	S5	47	96%	1.7618	-1.9186	48	98%	1.5879	-1.4348	49	100%	
Mid-GFC	D1	12	24%	0.5395	-0.5008	6	12%	0.1689	-0.2215	40	82%	
	D2	13	27%	0.4502	-0.4791	11	22%	0.2384	-0.2137	44	90%	
	D3	17	35%	0.6501	-0.4975	19	39%	0.4055	-0.3337	49	100%	
	D4	32	65%	0.8086	-0.6371	28	57%	0.5212	-0.4132	48	98%	
	D5	36	73%	0.7783	-0.4581	42	86%	0.7508	-0.3251	49	100%	
	S5	47	96%	0.9174	-0.9078	48	98%	0.7732	-0.3302	49	100%	
Post-GFC	DI	11	22%	0.1355	-0.1591	10	20%	0.0813	-0.1473	44	90%	
	D2	6	12%	0.0953	-0.1678	15	31%	0.1608	-0.1129	46	94%	
	D3	22	45%	0.2492	-0.14/4	20	41%	0.1654	-0.14/3	48	98%	
	D4	34	69%	0.3835	-0.099	28	5/%	0.1477	-0.2123	48	98%	
	D5	36	/3%	0.3314	-0.2453	42	86%	0.2025	-0.3078	49	100%	
	S5	48	98%	0.3226	-0.4469	48	98%	0.1875	-0.3619	49	100%	
Whole	DI	9	18%	0.1627	-0.1668	/	14%	0.0894	-0.1133	48	98%	
Period	D2	8	16%	0.099	-0.1255	12	25%	0.0955	-0.0976	48	98%	
	D3	32	65%	0.2519	-0.1333	20	55%	0.1581	-0.1320	49	100%	
	D4	32	05%	0.3433	-0.1339	30	01%	0.1971	-0.191	48	98%	
			V'111/	11:1/15	11 1 1 2 1 1 2		0'10/	11 7115 4	11 1 100	40		
	D3 \$5	40	82%	0.2745	-0.2393	40	82%	0.2954	-0.2288	49	100%	
	S5	40 49	82% 100%	0.2745 0.2855 CBP	-0.2393 -0.2938	40 48	82% 98%	0.2954 0.1815 IPV	-0.2288 -0.2942	49 49	100%	
Sub-Period	S5 Wavelet	40 49 f	82% 100%	0.2745 0.2855 GBP	-0.2393 -0.2938	40 48 f	82% 98%	0.2954 0.1815 JPY	-0.2942	49 49	100%	
Sub-Period GFC	S5 Wavelet Scale	40 49 f	82% 100%	0.2745 0.2855 GBP Mean Beta	-0.2393 -0.2938 Mean Beta	40 48 f	82% 98%	0.2954 0.1815 JPY Mean Beta	-0.2288 -0.2942 Mean Beta	49 49	100% 100% R2	
Sub-Period GFC	S5 Wavelet Scale	40 49 f {5}	82% 100% % {6}	0.2745 0.2855 GBP Mean Beta (+)	-0.2393 -0.2938 Mean Beta (-)	40 48 f {7}	82% 98% % {8}	0.2954 0.1815 JPY Mean Beta (+)	-0.2288 -0.2942 Mean Beta (-)	49 49	100% 100%	
Sub-Period GFC Pre-GFC	S5 Wavelet Scale	40 49 f { 5 } 8	82% 100% % {6} 16%	0.2745 0.2855 GBP Mean Beta (+) 0.3767	-0.2393 -0.2938 Mean Beta (-) -0.3537	40 48 f {7} 8	82% 98% % {8} 16%	0.2954 0.1815 JPY Mean Beta (+) 0.2491	-0.2288 -0.2942 Mean Beta (-) -0.1792	49 49 0.	100% 100% R2 0949	
Sub-Period GFC Pre-GFC	D3 S5 Wavelet Scale D1 D2	40 49 f {5} 8 13	82% 100% % {6} 16% 27%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882	40 48 f {7} 8 12	82% 98% % {8} 16% 24%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117	49 49 0.	100% 100% R2 0949 1022	
Sub-Period GFC Pre-GFC	D3 S5 Wavelet Scale D1 D2 D3	40 49 f {5} 8 13 15	82% 100% % {6} 16% 27% 31%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073	40 48 f {7} 8 12 21	82% 98% % {8} 16% 24% 43%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441	49 49 0. 0. 0.	R2 0949 1022 1737	
Sub-Period GFC Pre-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4	40 49 f {5} 8 13 15 20	82% 100% % {6} 16% 27% 31% 41%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982	40 48 f {7} 8 12 21 28	82% 98% % {8} 16% 24% 43% 57%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903	49 49 0. 0. 0. 0.	R2 0949 1022 1737 2203	
Sub-Period GFC Pre-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5	40 49 f {5} 8 13 15 20 43	82% 100% % {6} 16% 27% 31% 41% 88%	0.2745 0.2855 GBP (+) 0.3767 0.3381 0.4079 0.453 0.9931	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588	40 48 f {7} 8 12 21 28 40	82% 98% % {8} 16% 24% 43% 57% 82%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807	49 49 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832	
Sub-Period GFC Pre-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5	40 49 f {5} 8 13 15 20 43 47	82% 100% % {6} 16% 27% 31% 41% 88% 96%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887	40 48 f {7} 8 12 21 28 40 47	82% 98% % {8} 16% 24% 43% 57% 82% 96%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954	49 49 0. 0. 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832 .173	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1	40 49 f f f f 5 8 13 15 20 43 47 6	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197	40 48 f f 7 8 12 21 28 40 47 10	82% 98% % {8} 16% 24% 43% 57% 82% 96% 20%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2	49 49 0. 0. 0. 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832 .173 1202	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2	40 49 f {5} 8 13 15 20 43 47 6 14	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606	40 48 f f 7 8 12 21 28 40 47 10 10	82% 98% % {8} 16% 24% 43% 57% 82% 96% 20% 20%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2 -0.2141	49 49 49 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832 .173 1202 .158	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D3 D3	40 49 f {5} 8 13 15 20 43 47 6 14 15	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621	40 48 f {7} 8 12 21 28 40 47 10 10 24	82% 98% % {8} 16% 24% 43% 57% 82% 96% 20% 20% 49%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2 -0.2141 -0.2841	49 49 49 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832 .173 1202 .158 2041	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D3 D4 D5 D1 D2 D3 D4 D5 D4 D5	40 49 f {5} 8 13 15 20 43 47 6 14 15 36	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005	40 48 f {7} 8 12 21 28 40 47 10 10 24 28	82% 98% % {8} 16% 24% 43% 57% 82% 96% 20% 20% 20% 57% 57%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.2 -0.2 -0.2141 -0.2841 -0.2841 -0.5475	49 49 49 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0.	R2 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5	40 49 f {5} 8 13 15 20 43 47 6 14 15 36 40	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.4432	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.3005 -0.3701 -0.3701	40 48 f {7} 8 12 21 28 40 47 10 10 24 28 39	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 57% 82%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2984 0.2984	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005	49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 S5 S5 D1 D2 D3 D4 D5 S5 S5 D1	40 49 f {5} 8 13 15 20 43 47 6 14 15 36 40 47 10	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.122	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 47	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 57% 80% 96%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.2035 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.2984	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005	49 49 49 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D1 D2 D3 D4 D5 S5 S5 D1 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D4 D2 D3 D3 D4 D2 D3 D4 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D2 D3 D4 D2 D3 D4 D2 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D2 D3 D3 D4 D5 S5 S5 D1 D2 D3 D3 D4 D2 D3 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D5 D3 D4 D5 S5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D5 S5 S5 D4 D3 D4 D5 S5 S5 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 D4 D4 D5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5	40 49 f f f 5 8 13 15 20 43 47 6 14 15 36 40 47 10	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1892	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.905	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 57% 80% 96% 22%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.0498 0.101	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5065 -0.0911 -0.1007	49 49 49 49 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0. 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D2 D2 D2 D2 D2 D2	40 49 f {5} 8 13 15 20 43 47 6 14 15 36 40 47 10 8 8	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 20%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.155	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3601 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1572	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 25	82% 98% 98% (% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 20% 30% 96% 22%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.2031 0.2015 0.2936 0.2984 0.3786 0.0498 0.101 0.0455	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5065 -0.0911 -0.1097 -0.182	49 49 49 49 0.	R2 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474	
Sub-Period GFC Pre-GFC Mid-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5 S5 S5 D1 D2 D3 D4 D3 D4 D5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5 S5	40 49 f {5} 8 13 15 20 43 47 6 14 15 36 40 47 10 8 17	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1578	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 20	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 20% 31% 53%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.2031 0.2015 0.2936 0.2984 0.3786 0.0498 0.101 0.0458 0.1796	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5065 -0.0911 -0.1097 -0.183 -0.1277	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .173 3105 3045 .173 0337 0474 0711	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5	40 49 f f f 5 8 13 15 20 43 47 6 14 15 36 40 47 10 8 17 24	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 92%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.204	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 0.2177	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 20	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 57% 80% 96% 22% 31% 53% 57%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2936 0.2936 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.0911 -0.1097 -0.183 -0.1277 0.2127	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5	40 49 49 f {5} 8 13 15 20 43 47 6 14 15 36 40 47 10 8 17 24 40	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.2006	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1286	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 40	82% 98% 98% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 31% 57% 80% 96% 22% 31% 53% 57% 80%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2936 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2271	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.1097 -0.183 -0.1277 -0.2127 -0.2127	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1	40 49 f f 5 8 13 15 20 43 47 6 14 15 36 40 47 10 8 17 24 40 47 9	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 20%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0005	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.024	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 49 49	82% 98% 98% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 31% 57% 80% 96% 22% 31% 53% 57% 80%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2936 0.2936 0.2984 0.3786 0.2936 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0238	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.2127 -0.2127 -0.2127 -0.2063 0.0741	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045 0929 0563	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D5 S5 D1 D2	40 49 49 f {5} 8 13 15 20 43 47 6 14 15 366 40 47 10 8 17 24 40 47 8 11	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 20%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0995 0.1206	-0.2393 -0.2938 Mean Beta (-) -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.0924 -0.1260	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 49 12	82% 98% 98% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 31% 57% 80% 96% 22% 31% 53% 57% 80% 100% 25%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2936 0.2936 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0738	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.2127 -0.2127 -0.2063 -0.0741 -0.204	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045 0929 0563 0704	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D2 D3	40 49 49 f f <	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 16% 35% 49%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0995 0.1206 0.1246	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.0924 -0.1269 -0.1269 -0.1724	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 47 11 15 26 28 39 49 12 12 22	82% 98% 98% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 57% 80% 96% 22% 31% 53% 57% 80% 100% 25% 25%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0738 0.07 0.0717	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.2127 -0.2127 -0.2063 -0.0741 -0.2942	49 49 49 49 0.	100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045 0929 0563 0704 1015	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4	40 49 49 f {5} 8 13 15 20 43 47 6 14 15 36 40 47 10 8 17 24 40 47 8 11 20 32	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 16% 22% 41% 65%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0995 0.1206 0.1246 0.2077	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.0924 -0.1269 -0.1724 -0.2026	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 47 11 15 26 28 39 49 12 12 22 22	82% 98% 98% (8) 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 20% 31% 57% 80% 57% 80% 100% 25% 25% 45% 5324	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0738 0.07 0.0717 0.116	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.2903 -0.4807 -0.254 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.2127 -0.2127 -0.2127 -0.2063 -0.0741 -0.094 -0.1287 0.1292	49 49 49 49 0.	100% 100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .173 3045 .173 0337 0474 0711 0847 3045 0929 0563 0704 1015 1453	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5 D1 D2 D3 D4 D5	40 49 49 f f <	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 16% 22% 41% 65% 82%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0995 0.1206 0.1246 0.2077 0.2431	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.0924 -0.2026 -0.2026 -0.1809	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 47 11 15 26 28 39 49 12 12 22 26 41	82% 98% 98% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 31% 57% 80% 96% 22% 31% 53% 57% 80% 100% 25% 25% 45% 53%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0738 0.07 0.0717 0.116 0.1821	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.2127 -0.2127 -0.2127 -0.2127 -0.2063 -0.0741 -0.094 -0.1287 -0.1292 -0.2044	49 49 49 49 0.	100% 100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .173 2041 3105 3045 .173 0337 0474 0711 0847 3045 0929 0563 0704 1015 1453	
Sub-Period GFC Pre-GFC Mid-GFC Post-GFC	D3 S5 Wavelet Scale D1 D2 D3 D4 D5 S5	40 49 49 f f <	82% 100% % {6} 16% 27% 31% 41% 88% 96% 12% 29% 31% 73% 82% 96% 20% 16% 35% 49% 82% 96% 16% 22% 41% 65% 82% 96%	0.2745 0.2855 GBP Mean Beta (+) 0.3767 0.3381 0.4079 0.453 0.9931 1.3968 0.2364 0.1871 0.1875 0.274 0.4432 0.6149 0.1106 0.1283 0.156 0.1697 0.294 0.3096 0.0995 0.1206 0.1246 0.2077 0.2431 0.2906	-0.2393 -0.2938 -0.2938 Mean Beta (-) -0.3537 -0.3537 -0.3882 -0.4073 -0.3982 -0.9588 -0.7887 -0.197 -0.3606 -0.3621 -0.5005 -0.3701 -0.6577 -0.132 -0.0995 -0.1578 -0.1808 -0.2177 -0.1386 -0.0924 -0.2026 -0.1809 -0.1725	40 48 f f 7 8 12 21 28 40 47 10 10 24 28 39 47 11 15 26 28 39 47 11 15 26 28 39 49 12 12 22 22 26 41 48	82% 98% 98% (% 16% 24% 43% 57% 82% 96% 20% 20% 20% 20% 20% 20% 20% 20% 31% 57% 80% 96% 22% 31% 53% 53% 80% 100% 25% 25% 45% 53%	0.2954 0.1815 JPY Mean Beta (+) 0.2491 0.1843 0.3743 0.4083 0.7137 0.3905 0.2031 0.2015 0.3278 0.2936 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.2984 0.3786 0.0498 0.101 0.0458 0.1786 0.1808 0.2371 0.0738 0.07 0.0717 0.116 0.1821 0.1927	-0.2288 -0.2942 Mean Beta (-) -0.1792 -0.3117 -0.2441 -0.2903 -0.4807 -0.954 -0.2 -0.2141 -0.2841 -0.5475 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5005 -0.5065 -0.0911 -0.1097 -0.183 -0.1277 -0.2127 -0.2127 -0.2063 -0.0741 -0.094 -0.1287 -0.2044 -0.2044 -0.1854	49 49 49 49 0.	100% 100% 100% 100% 100% 0949 1022 1737 2203 1832 .173 1202 .158 2041 3105 3045 .173 0337 0474 0711 0847 3045 0929 0563 0704 1015 1453 1449 1705	

A close visual inspection in Figure 1 and Figure 2 shows that there are upward trends of positive exposure from d1 till d5 and downward trends for negative exposure. The same fashion is also found to the percentage of exposed firms for all currencies. This phenomenon could be explained in the context of the relation between exchange risk and trading holding period. Long term investors face greater amount of risk compared to short term investors. Hence, return for long term investors is expected to be higher to compensate high risk premium. Secondly, there is gradual increase in the value of goodness-of-fit measure (R²), signifying the variability of exchange rates could explain stock returns better at the higher scale component. It seems that explanatory power increases from low scale to higher scale. From here, it could be concluded that the assessment of exchange rate exposure is more relevant at the higher scale, specifically starting from d3 (16-32 days) where percentage of exposed firms reaches above 50%. Third, in term of specific individual currency, it could be clearly seen that USD, EUR, GBP and YEN exhibited higher level of exposure at the high scale and smooth scale (father wavelet). The significant exposure of all stated currencies is no coincidence given by the fact that the four countries are major trading countries with Malaysia.

To specifically conduct the second objective, the study runs sub-period analysis to further understand the behavior of multi-scale exposure surrounding the global financial crisis 2008 (pre, middle and post crisis). Based on Table 2, the identical trend of gradual increase in the level of exposure from low scale to high scale is found across all the sub-periods. Secondly, there is enough evidence that the extent of exposure was peaked during the pre-GFC period followed by the middle of GFC period. The pre-GFC period coincided with de-peg period where the regulator decided to let the de facto peg of the Malaysian Ringgit to the USD to be floated under managed float system. Within this period, Malaysia Ringgit recorded a significant appreciation and causing large fluctuation in exchange returns. The GFC period also recorded high level of exposure, however to a lesser extent than the Asian Financial crisis 1997 as shown by Parsley & Popper (2006); Muller & Verschoor (2007); Bacha, et al., (2013).

CONCLUSION

The study offers new dimension in investigating the exchange rate exposure of 49 food and beverage corporations in Malaysia through multi-scaling approach. The study applies the Maximal Overlap Discrete Wavelet Transformation (MODWT) technique to effectively decompose all variables into multi-scale orthogonal components. Based on the analysis, there is statistical evidence of multi-scale tendency of exchange rate risk across five levels of scale. The findings are parallel with the existing investment theory which connects the length of investment interval with risk level. It is found that investing in food and beverage stocks within shorter period entails lower level of exchange risk than longer period. Thus, higher risk premium for long term investors should be accompanied with higher returns. From the results, the study suggests that vigorous risk management programs should be focused to manage exchange risk within widened investment horizons. Future research should be concentrated on how hedging practices could affect the level of multi-scale exposure. Further, the analysis could be extended to other industries to get comprehensive overview about the nature of multi-scale exposure of Malaysia corporations.

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