Online appendix for "The Perfect Storm: Forex Interventions, Global Banks' Limited Risk-Bearing Capacity, Deviations from Covered Interest Parity, and the Impact on the USD/ILS Options Market"

A Intervention regimes since 2008

The Bank of Israel (BOI) has been intervening since 2008 to contain the sustained appreciation trend that has characterized the Israeli new shekel (ILS) since the "Great Financial Crisis" (GFC). In this period, the BOI has changed its intervention regime (or intervention strategy) several times. We document the different intervention regimes in the following.

A.1 Overt interventions

Although the first intervention was not pre-announced, we include it here as part of the overt interventions to maintain the chronological order. After more than a decade without intervening, the BOI started purchasing foreign currency in the spot foreign exchange market on March 13-14, 2008 to stabilise¹ disorderly markets.²

A.1.1 Intervention regime I

On March 20, 2008, the BOI announced that it would build up its foreign exchange reserves – which amounted to 29 billion US dollars (USD) at the end of February 2008 – over the next two years from March 24 onwards until reaching a level in the range of USD 35-40 billion.

¹See Flug and Shpitzer (2013) for details.

²As identified by several market indicators. These include intra-day volatilities, spreads and non-linear changes in the spot rate.

A.1.2 Intervention regime II

On July 10, 2008 – against the backdrop of a steep appreciation of the ILS vis-à-vis the USD – the BOI announced that it would increase its daily USD purchases to USD 100 million.

A.1.3 Intervention regime III

On November 11, 2008, the BOI announced that it raised the targeted range of its foreign exchange reserves to USD 40-44 billion. The BOI added that it would continue to purchase USD 100 million each day.

A.2 Secret interventions

A.2.1 Intervention regime IV

In August 2009, the BOI announced that it would no longer carry out the daily spot purchases of USD 100 million that it had committed to in July 2008. The BOI emphasized that it would intervene in the foreign exchange market in periods of extraordinary exchange rate fluctuations, whenever these were incompatible with domestic macroeconomic fundamentals. This policy change was in part motivated by the BOI's aim of gradually withdrawing the exceptional policy measures that it had adopted in response to the GFC. At some point in July 2011, the BOI stopped intervening for the following two and a half years.

A.3 Overt and secret intervention

A.3.1 Intervention regime V

On May 13, 2013, the BOI announced that it would restart USD purchases to offset the expected improvement in the current account (i.e. capital inflows) due to the surge in natural gas production over the coming years as an aftermath of the start of commercial production of the Tamar gas field on March 30, 2013.³ The BOI announced that it expected to purchase USD 2.1 billion in total by the end of that year to offset the capital inflows associated with these additional gas sales. On top of that, the BOI explained

³This gas field was discovered in deep water near Haifa in 2009. Readers who are not familiar with the Israeli economy are referred to the Wikipedia entry titled "Natural gas in Israel" (Wikipedia, 2020) for details.

that it would intervene in the market secretly. The BOI later reported it has started to intervene again in April, 2023.

A.3.2 Intervention regime VI

On January 14, 2021, the BOI changed its strategy by announcing the total amount of USD (i.e. USD 30 billion) that it planned to buy in 2021. Although the exact amount of these USD purchases was publicly announced, the BOI remained silent about the timing of these USD purchases and did not declare how much USD it planned to buy on any given day.⁴

A.4 Background information

The resource costs of an FX intervention regime can easily be estimated, as shown in Amador, Bianchi, Bocola, and Perri (2020). We have estimated these costs for the different intervention regimes (see Section F). The results suggests that by historical standards, intervention regime V (i.e. the regime that we analyze in our paper) is characterized by low costs in terms of domestic GDP (see Figure G.1). Our finding is consistent with the empirical evidence in Levy-Yeyati and Gómez (2022) that documents that leaning-against-the-wind interventions are often less costly than precautionary interventions.

Compared to the resource costs associated with the Swiss National Bank's (SNB) minimum exchange rate regime, the resource costs of the BOI are lower. In the case of the SNB, these costs amounted to more than 0.2% of Swiss GDP (see Figure 2 in Amador et al. (2020)).

⁴See https://www.boi.org.il/en/NewsAndPublications/PressReleases/Pages/14-1-21.aspx.

⁵In this case, foreign currency purchases are financed by issuing foreign currency-denominated assets. The costs of this intervention "strategy" typically equals the sovereign credit risk spread plus the term premium associated with any maturity mismatch (Levy-Yeyati and Gómez, 2022).

Variable	Description	Source
ATMV/BF/RR	At-the-money option/butterfly spread/risk reversal contracts on the USD/ILS spot rate for six maturities. In the case of the last two contracts, we have options with a delta of 10 and 25. The prices are quoted in implied volatilities (in percent) and equal the midpoint of the bid and ask, calculated at 17:00 New York time.	Bloomberg.
CDS	5-year CDS spread on Israeli external debt. In basis points.	Bloomberg.
CITI_Surprise_Index EUR/USD	1 EUR in terms of USD calculated at 17:00 New York time (midnight in Israel).	Bloomberg. Bloomberg.
FXI_t	Daily net USD purchases in the USD/ILS spot market. In USD billion.	Bank of Israel.
IL_CPI_Surprise	Difference between the actual change in the IL CPI (p.a.) and the average annual change in the CPI forecasted by professional forecasters the day before the announcement of the CPI.	Bank of Israel.
IL_Monetary_Surprise	Difference between the actual Israeli monetary interest rate and the average of interest rate forecasts by profes- sional forecasters (about 12) the day before the interest rate decision	Bank of Israel.
NEER	Nominal effective FX rate (NEER) of the ILS computed as the trade-weighted arithmetic average of the foreign value of the ILS vis-à-vis a basket of 24 currencies (31 countries). The FX rates are calculated at 17:00 New York time. Our index includes 97.3% of Israel's trading partners. A higher index indicates a weaker ILS.	Bloomberg & own calcula- tions.
NS_FFR_Surprise	Unanticipated change of the federal funds rate target (using federal funds futures) within a 30-minute window surrounding scheduled FOMC meetings. This data is an updated version of Nakamura and Steinsson (2018) and has recently been used by, e.g., Miranda-Agrippino and Ricco (2021).	M. Acosta. ⁶
NS_Policy_Surprise	Unanticipated change in the path of future interest rates within a 30-minute window surrounding scheduled FOMC meetings. This data is an updated version of Nakamura and Steinsson (2018) and has recently been	M. Acosta. ⁷
USD/ILS	used by, e.g., Miranda-Agrippino and Ricco (2021). 1 USD in terms of ILS calculated at 17:00 New York time (midnight in Israel)	Bloomberg.
VIX	(midnight in Israel). Implied volatility from S&P 500 index options. In percent.	СВОЕ.

⁶Downloaded from https://www.acostamiguel.com/replication/MPshocksAcosta.xlsx
⁷Downloaded from https://www.acostamiguel.com/replication/MPshocksAcosta.xlsx

$\overline{RR}/\overline{BF}$		Risk reversal/butterfly spread divided by ATMV.	Bloomberg.
Δ Prob.	of	One-day lagged two-week change of the right tail of the	Own
$appr{t-11,t-1}$		RND. It is 5%, 8%, 10%, 13% and 20% for the one-month	calcula-
		up to the twelve-month horizon.	tions.
Δ Prob.	of	One-day lagged two-week change of the right tail of the	Own
$depr{t-11,t-1}$		RND. It is 5%, 8%, 10%, 13% and 20% for the one-month	calcula-
		up to the twelve-month horizon.	tions.
TELBOR		One-month Israeli interbank rate. In percent.	Bank of
			Israel.
LIBOR		One-month US LIBOR rate. In percent.	Bloomberg.

B Two popular investment strategies in foreign exchange option markets

B.1 FX option deltas

In OTC markets, FX option quotes refer to the implied volatilities (IVs) according to the Garman and Kohlhagen (1983) pricing formula (Carr and Wu, 2007). In this pricing framework, the call and put option spot deltas are equal to:

$$\Delta_{C} \equiv \exp^{-r^{f}\tau} \Phi(d),$$
 (C.1)

$$\Delta_P \equiv -\exp^{-r^f \tau} \Phi(-d), \tag{C.2}$$

with

$$d = \frac{\ln(F_t/X) + \sigma^2/2(T-t)}{\sigma\sqrt{T-t}}.$$
 (C.3)

B.2 Market quoting convention

By market convention, FX option prices are quoted as the implied volatility of at-themoney options (ATMV), butterfly spreads (BF) and risk reversals (RR) for different deltas. The ATMV is thereby defined as the price (in terms of IVs) of a delta-neutral straddle. A straddle is a portfolio composed of a long call and a long put option with identical strike prices and maturity. A straddle is thus delta-neutral,⁸ if d is equal to zero.⁹ Using a second-order polynomial to describe the implied volatility smile curve using d as the measure of moneyness, as in Backus, Foresi, and Wu (2004):

$$IV(d) = \gamma_0 \left(1 + \gamma_1 d + \gamma_2 d^2 \right), \tag{C.4}$$

the first parameter is termed the level of the implied volatility smile and is an estimate of the ATMV. Therefore,

$$ATMV = \gamma_0 = IV(0). \tag{C.5}$$

Hence, at-the-money is defined as d = 0.10

The 25- Δ BF spread reflects the difference between the arithmetic mean of two 25- Δ

⁸That is, when $\Delta_C = -\Delta_P$.

⁹The strike of this straddle equals $K_{ATM} = F_t \exp 1/2\sigma^2(T-t)$.

¹⁰This is also the ATMV definition in Bloomberg, see e.g. Olijslagers, Petersen, de Vette, and van Wijnbergen (2019).

options (a call and a put) plus the IV of the delta-neutral straddle:

$$BF25 = 0.5 \left[IV(d(25c)) + IV(d(25p)) \right] - ATMV, \tag{C.6}$$

where the numbers in parenthesis refer to the call and put option's z-value.

The 25- Δ RR equals the difference in IVs between a 25- Δ call and a 25- Δ put option. This option strategy can be expressed as:^{11,12}

$$RR25 = IV(d(25c)) - IV(d(25p)). (C.7)$$

B.3 Risk reversals

Risk reversals (RRs) are a widely used option strategy composed of a long out-of-the-money call and a short out-of-the-money put option on the same underlying with identical option deltas (in absolute percentage terms) and time to maturity.¹³ The RR is thereby quoted in terms of implied volatilities (IV):¹⁴

$$RR_t \equiv \sigma_t^C - \sigma_t^P. \tag{C.8}$$

In our paper, the call and the put option refer to a USD call ILS put option and a USD put ILS call option, respectively.

From Equation (C.8) we can see that a RR captures any asymmetry of the implied volatility-moneyness function.¹⁵ In other words, a non-zero RR results whenever an asymmetric volatility smile exists. Hence, RRs reflect the implied skewness of the risk-neutral probability density (RND) of exchange rate returns at the expiry date. A positive RR, for instance, indicates a skewed expected return distribution for the USD/ILS exchange rate, that is, a tilt of expectations towards a large USD appreciation. The RR buyer then gains (loses) on a gross basis when the USD appreciates (depreciates) vis-à-vis the ILS over the lifetime of the option contract.

¹¹See Section 2 in Carr and Wu (2007).

¹²The time index is suppressed in the present online appendix for the sake of clarity.

¹³The moneyness of the call (put) option are chosen such that the strike price K_2 (K_1) of the call (put) is larger (smaller) than the FX forward rate F_t , that is, $K_1 < F_t < K_2$.

 $^{^{14}}$ Note that FX options are quoted in terms of implied volatilities for historical reasons, whilst equity options are quoted in nominal terms.

¹⁵This function measures the slope of the implied volatility smile across moneyness (Carr and Wu, 2007).

¹⁶Ignoring the size of the premium paid for this option strategy.

This strategy also implies a position that is close to vega-neutral, as the option vegas of the call and the put options that constitute a RR are approximately equal in the Garman and Kohlhagen (1983) (GK) framework, which is the market standard for computing the quoted prices of FX options and their risk parameters (e.g. option deltas). Hence, under the GK framework, any change in IVs should only have a negligible effect on the RR.

With regards to the effect of the BOI's intervention activity, any unexpected FX spot market transaction targeted to weaken the foreign value of the ILS should lead to an increase in the RR,¹⁷ whenever interventions are effective in affecting second-moment market expectations in the intended direction. Hence, the estimated coefficient should be positive when regressing the FX intervention data on the change in RRs.

B.4 Butterfly spreads

A butterfly (BF) spread is constructed by buying an option with a strike price K_1 and an option with a higher strike price K_3 (that is $K_1 < K_3$). In parallel, two options with a strike price $K_2 = (K_1 + K_3)/2$ are sold to reduce the initial costs of this option trading strategy. ^{18,19}

The BF spread measures the difference between the average implied volatility of two (e.g. $10-\Delta$) options and the implied volatility of a delta-neutral straddle (Olijslagers et al., 2019), where a straddle is a portfolio composed of a long call and a long put option with identical strike prices and maturity. The BF spread therefore captures the implied excess kurtosis of the implied volatility-moneyness function.

For the long position, this strategy leads to profits on a gross basis whenever the realized volatility at expiry is lower than the implied volatility at inception.²⁰ Consequently, the larger the BOI's FX intervention volumes are (and provided these intervention activities are unexpected throughout the time to maturity of the BF spread),

¹⁷In the case of the BOI: a more pronounced tilt towards an USD appreciation. As shown in the paper, the RR has been mostly positive throughout the period of interest. Markets have therefore on average been willing to pay more for protection against a strong appreciation of the USD than for a strong depreciation of the USD.

¹⁸See chapter 10 in Hull (2006).

¹⁹Thus, $K_1 < K_2 < K_3$.

²⁰Indeed, the payoff of this strategy is maximized if the spot exchange rate at the expiration date equals K_2 .

the more profitable BF spreads should be, 21 as interventions are expected to stabilize the targeted FX rate. 22

²¹That is, their quoted prices should increase.

²²See the success criteria in the FX intervention strand of literature, for instance, Humpage (1999), Fatum and Hutchison (2003), Fratzscher (2005), Fatum and Hutchison (2006), Galati, Higgins, Humpage, and Melick (2007), Fatum (2008), Fratzscher (2008) and Fratzscher, Gloede, Menkhoff, Sarno, and Stöhr (2019).

C Daily cross-correlation between the main variables and the options data

Table D.1 shows the daily cross-correlations between the main variables of our empirical exercise in the paper and the price quotes of the option trading strategies (Tables D.4-D.2). We see that the main variables are rather weakly correlated in the cross-section, as evidenced in Table D.1:

Table D.1: Cross-correlation between the main variables

	ΔUSD/ILS	ΔEUR/USD	ΔNEER	Δ Forward ₃ m	Foreign flows - total	Local flows - real sector	Local flows - financial sector	Local flows - inst. investors	Δ5-year Israeli CDS	ΔLIBOR	ΔTELBOR
Spot and forward exchange	rates:										
ΔUSD/ILS	1										
ΔEUR/USD	-0.50	1									
Δ NEER	0.79	0.05	1								
Δ Forward _{3m}	0.89	-0.42	0.74	1							
Flows:											
Foreign flows - total	0.13	-0.07	0.10	0.15	1						
Local flows - real sector	-0.18	-0.01	-0.19	-0.22	-0.55	1					
Local flows - financial sector	-0.04	0.06	-0.03	-0.04	-0.16	-0.09	1				
Local flows - inst. investors	0.23	-0.01	0.23	0.23	-0.28	-0.22	0.04	1			
Misc:											
Δ CDS	0.05	-0.01	0.03	0.09	0.04	-0.07	0.05	0.05	1		
ΔLIBOR	-0.05	-0.03	-0.08	-0.05	-0.01	0.09	-0.03	-0.13	-0.02	1	
ΔTELBOR	-0.04	0.01	-0.04	-0.05	-0.07	0.03	-0.04	0.03	-0.02	0.04	1

Notes: The table presents the cross-correlation between selected variables. For details on the variables, see Appendix B in the present online appendix. The data span the period from January 1, 2013, to January 31, 2020.

Table D.2 presents the cross-correlation between the at-the-money volatility measures ("ATMV") for six different maturities, ranging from one week ("1w") to twelve months ("12m"). We also include the correlation between these price quotes and the log return of the USD/ILS spot rate (" Δ USD/ILS").

Table D.2: Cross-correlation between the USD/ILS at-the-money implied volatilities and the USD/ILS spot rate

	ATMV1w	ATMV1m	ATMV3m	ATMV6m	ATMV9m	ATMV12m	ΔUSD/ILS
ATMV1w	1						
ATMV1m	0.952	1					
ATMV3m	0.920	0.984	1				
ATMV106m	0.885	0.957	0.989	1			
ATMV109m	0.861	0.933	0.975	0.996	1		
ATMV1012m	0.835	0.910	0.958	0.988	0.997	1	
Spot exchange	e rate:						
ΔUSD/ILS	0.040	0.030	0.015	0.004	0.000	0.000	1

Notes: The table displays the cross-correlation between the price quotes of the daily USD/ILS at-the-money implied volatilities (in percent) for six maturities ranging from one week ("1w") to twelve months ("12m"). The correlation between these price quotes and the log return of the USD/ILS spot rate (" $\Delta USD/ILS$ ") is displayed in the last row. Cross-correlations that are larger than or equal to 0.975 are in bold letters. The data span the period from January 1, 2013, to January 31, 2020. Data source: Bloomberg.

Table D.3 presents the cross-correlation between the price quotes of the 10- Δ and the 25- Δ butterfly spreads ("BF10" and "BF25") for six different maturities, ranging from one week ("1w") to twelve months ("12m"). We also include the correlation between these price quotes and the log return of the USD/ILS spot rate (" Δ USD/ILS").

Table D.3: Cross-correlation between the USD/ILS butterfly spreads and the USD/ILS spot rate

	BF101w	BF101m	BF103m	BF106m	BF109m	BF1012m	BF251w	BF251m	BF253m	BF256m	BF259m	BF2512m	ΔUSD/ILS
10-Δ:													
BF101w	1												
BF101m	0.402	1											
BF103m	0.400	0.925	1										
BF106m	0.421	0.893	0.984	1									
BF109m	0.371	0.891	0.977	0.984	1								
BF1012m	0.393	0.862	0.959	0.984	0.983	1							
25-∆:													
BF251w	0.734	-0.025	-0.056	-0.058	-0.075	-0.074	1						
BF251m	0.326	0.914	0.898	0.872	0.884	0.850	-0.064	1					
BF253m	0.318	0.882	0.953	0.938	0.950	0.926	-0.095	0.946	1				
BF256m	0.352	0.859	0.944	0.961	0.965	0.961	-0.095	0.915	0.977	1			
BF259m	0.331	0.850	0.933	0.948	0.969	0.962	-0.096	0.906	0.969	0.991	1		
BF2512m	0.352	0.815	0.908	0.937	0.951	0.967	-0.107	0.868	0.938	0.978	0.983	1	
Spot exchan	ge rate:												
Δ USD/ILS	0.087	0.049	0.036	0.036	0.025	0.024	0.071	0.024	0.017	0.016	0.015	0.005	1

Notes: The table displays the cross-correlation between the price quotes of the daily USD/ILS butterfly spreads (in percent) for six maturities ranging from one week ("1w") to twelve months ("12m") and two option deltas of \pm 10% ("BF10") and \pm 25% ("BF25"). The correlation between these quoted option prices and the change in the log USD/ILS spot rate (" $\Delta USD/ILS$ ") is displayed in the last row. Cross-correlations that are larger than or equal to 0.975 are in bold letters. The data span the period from January 1, 2013, to January 31, 2020. Data source: Bloomberg.

Finally, Table D.4 presents the cross-correlation between the price quotes of the $10-\Delta$ and the $25-\Delta$ risk reversals ("RR10" and "RR25") for six different maturities, ranging from one week ("1w") to twelve months ("12m"). We also include the correlation between these price quotes and the log return of the USD/ILS spot rate (" Δ USD/ILS").

Table D.4: Cross-correlation between the USD/ILS risk reversals and the USD/ILS spot rate

	RR101w	RR101m	RR103m	RR106m	RR109m	RR1012m	RR251w	RR251m	RR253m	RR256m	RR259m	RR2512m	$\Delta USD/ILS$
10- ∆:													
RR101w	1												
RR101m	0.818	1											
RR103m	0.720	0.970	1										
RR106m	0.658	0.931	0.987	1									
RR109m	0.621	0.908	0.975	0.996		1							
RR1012m	0.599	0.886	0.961	0.990	0.994	1							
25-∆:													
RR251w	0.916	0.929	0.870	0.825	0.797	0.780	1						
RR251m	0.811	0.998	0.972	0.935	0.912	0.890	0.927	1					
RR253m	0.716	0.967	0.999	0.987	0.975	0.960	0.867	0.971	1				
RR256m	0.658	0.930	0.987	0.999	0.995	0.990	0.824	0.934	0.988	1			
RR259m	0.628	0.910	0.976	0.996	0.999	0.995	0.802	0.915	0.977	0.997	1		
RR2512m	0.600	0.886	0.960	0.989	0.992	0.999	0.780	0.892	0.963	0.990	0.995	1	
Spot exchar	nge rate:												
ΔUSD/ILS	0.096	0.056	0.043	0.033	0.028	0.026	0.089	0.057	0.044	0.034	0.030	0.026	1

Notes: The table displays the cross-correlation between the price quotes of the daily USD/ILS risk reversals (in percent) for six maturities ranging from one week ("1w") to twelve months ("12m") and two option deltas of \pm 10% ("RR10") and \pm 25% ("RR25"). The correlation between these price quotes and the log return of the USD/ILS spot rate (" Δ USD/ILS") is displayed in the last row. Cross-correlations that are larger than or equal to 0.975 are in bold letters. The data span the period from January 1, 2013, to January 31, 2020. Data source: Bloomberg.

D Foreign exchange transaction volumes and relative bidask spreads for the three option strategies

25000 20000 15000 Million of Dollars 10000 5000 0 April-07 April-10 April-13 April-16 April-19 Spot transactions Outright forwards FX swaps Currency swaps Options Total

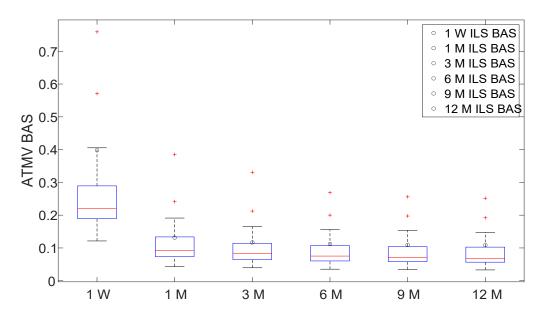
Figure E.1: Daily foreign exchange transaction volume

Notes: The figure shows the daily average volume of over-the-counter foreign exchange (FX) transactions in the spot, forward, FX swap, currency swap and option market in April of the corresponding year, where one of the currencies involved is the ILS. The data is retrieved from the BIS triennial central bank survey, which is carried out every three years. Source: https://www.bis.org/statistics/rpfx19.htm.

We also display the box plots of the relative bid-ask spread (BAS) for the three option strategies that we use in the paper for 28 currency pairs across six maturities, ranging from one week ("1 W") to twelve months ("12 M"). The currency pairs are retrieved from Bloomberg and are the following: Australian dollar (AUD)/USD, euro (EUR)/Czech koruna (CZK), EUR/pound sterling (GBP), EUR/Japanese yen (JPY), EUR/Norwegian kroner (NOK), EUR/Swedish krona (SEK), EUR/USD, GBP/Swiss franc (CHF), GBP/JPY, GBP/USD, USD/Canadian dollar (CAD), USD/Chilean peso (CLP), USD/Colombian peso (COP), USD/CZK, USD/Danish krone (DDK), USD/Hun-

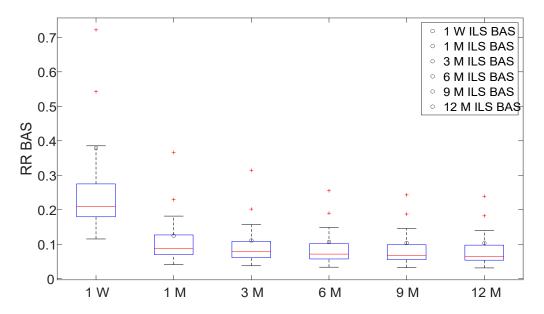
garian forint (HUF), USD/Icelandic krona (ISK), USD/ILS, USD/JPY, USD/Mexican peso (MXN), USD/New Zealand dollar (NZD), USD/NOK, USD/Polish zloty (PLN), USD/SEK, USD/South-Korean won (KRW), USD/CHF, USD/Turkish lira (TRY).

Figure E.2: Relative bid-ask spread for at-the-money implied volatility options across six maturities



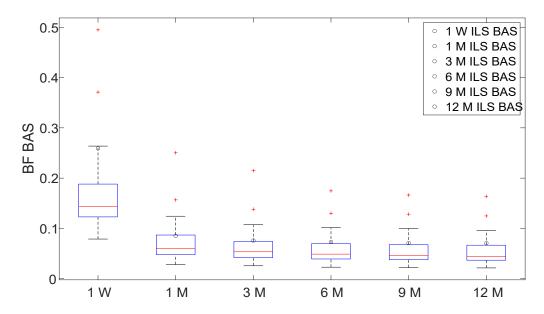
Notes: The figure displays the box plot of the quoted bid-ask spreads (BAS) of the at-the-money implied volatility (ATMV) options divided by the corresponding mid-quote for 28 currency pairs across six maturities, ranging from one week ("1 W") to twelve months ("12 M"). The average relative BAS for the USD/ILS ATMV contracts are represented by the dots. The data span the period from January 01, 2013 to December 31, 2020. Source: Bloomberg.

Figure E.3: Relative bid-ask spread for the risk reversals across six maturities



Notes: The figure displays the box plot of the quoted bid-ask spreads of the risk reversals (RR) divided by the corresponding mid-quote for 28 currency pairs across six maturities, ranging from one week ("1 W") to twelve months ("12 M"). The average relative BAS for the USD/ILS RR contracts are represented by the dots. The data span the period from January 01, 2013 to December 31, 2020. Source: Bloomberg.

Figure E.4: Relative bid-ask spread for the butterfly spreads across six maturities



Notes: The figure displays the box plot of the quoted bid-ask spreads of the butterfly spreads (BF) divided by the corresponding mid-quote for 28 currency pairs across six maturities, ranging from one week ("1 W") to twelve months ("12 M"). The average relative BAS for the USD/ILS BF contracts are represented by the dots. The data span the period from January 01, 2013 to December 31, 2020. Source: Bloomberg.

E The higher moments of the risk-neutral density

This appendix shows how risk reversals (RR) and butterfly (BF) spreads are related to the implied skewness and excess kurtosis of the RND. The RR and the BF spread (also the ATMV) are usually highly liquid option strategies (Bossens, Rayée, Skantzos, and Deelstra, 2010) and are typically available for six different maturities, ranging from one week up to one year.²³

The idea of using the price quotes of option contracts instead of calculating the higher-order moments after extracting the RND from option prices was put forward by e.g. a referee in Morel and Teïletche (2008) to reduce the model-dependence that you are more exposed to in the latter case. This referee, nevertheless, suggested to use the price quotes directly. In Section E.3 we will show that implementing the referee's suggestion gives proxies of the implied moments of the RND that are proportional to the ATMV level. In line with this finding, we will show that the price quotes of the RR and the BF spread will approximate the implied skewness and the implied kurtosis of the RND only after scaling these prices by the ATMV level.

E.1 Option-implied volatility curve

Backus et al. (2004) show that the option-implied volatility curve²⁴ is approximately equal to:²⁵

$$IV_{t,T}(d) \approx ATMV_{t,T} \left[1 - \frac{1}{6} s_{t,T} d - \frac{1}{24} k_{t,T} (1 - d^2) \right],$$
 (G.1)

where $IV_{t,T}$ and $ATMV_{t,T}$ are the implied volatility and an estimate of the price quote of the ATMV at time t of the options maturing at time T. It is common market practice to replace the ATMV metric by a constant value (Carr and Wu, 2003)²⁶ to make quotes

²³The six maturities equal one week, one month, three months, six months, nine months and twelve months.

²⁴Or option-implied volatility smile, that is, the graph that displays the implied volatility-moneyness function.

²⁵See their Equation (16). They use a Gram-Charlier expansion to allow the density of the logarithm of the spot exchange rate to exhibit non-zero skewness and excess kurtosis and therefore deviate from a normal density. A similar approach has been advanced by Zhang and Xiang (2008) to model the implied volatility smirk for equity index options. They propose a second-order polynomial that leads to a similar formula; see their equations (2) and (7)-(9).

²⁶For instance, equal to the average historical (or realized) volatility of the underlying asset over a specific period.

comparable different assets (that is, exchange rates in our paper):²⁷

$$ATMV_{t,T} = \sigma$$
.

The other expressions in Equation (G.1) represent the skewness ($s_{t,T}$), the excess kurtosis ($k_{t,T}$) and the z-value (d) of the daily log spot rate return r_t :

$$\begin{array}{rcl} s_{t,T} & = & \frac{E(r_t - \mu)^3}{\sigma^3}, \\ k_{t,T} & = & \frac{E(r_t - \mu)^4}{\sigma^4} - 3, \\ & \text{and} \\ d & = & \frac{\ln(\frac{F}{X})}{IV\sqrt{T - t}} + \frac{1}{2}IV\sqrt{T - t}. \end{array}$$

The first two expressions represent the skewness and the excess kurtosis,²⁸ both centred at the mean μ and scaled by the third and fourth power of the volatility σ of the underlying spot exchange rate.

Notice that changes in the mean μ will not affect the skewness $s_{t,T}$ and the excess kurtosis $k_{t,T}$, as both metrics are centred at μ .

E.2 Moneyness

We follow Backus et al. (2004) and use d as a measure of the degree of moneyness for mathematical convenience, contrary to industry convention, where only the negative of the first summand of d is used to compute the moneyness of options.^{29,30} As a consequence, the sign of the d is switched compared to the conventional sign of d (i.e. we get an IV smile that is grosso modo the mirror image of the conventional IV smile).³¹

Notice that *d* is negative for typical market parameters and maturities not exceeding two years (Bisesti, Castagna, and Mercurio, 2005):

1. For instance, for a 25- Δ call option, the option delta $\Delta_C = \exp\left(-r^f \tau\right) \Phi\left(d(25c)\right)$

²⁷Subsequent papers also impose this calibration, see for instance Zhang and Xiang (2008).

²⁸Capturing the slope and the curvature of the IV smile.

²⁹See e.g. Carr and Wu (2003), Carr and Wu (2007) and Zhang and Xiang (2008).

³⁰Notice that the degree of moneyness can be expressed by the strike price or any transformation of it, e.g. the forward-moneyness, the log-moneyness or the option delta (Reiswich and Wystup, 2010).

 $^{^{31}}$ For e.g. the call option, we get a negative d, whilst it is positive by industry convention.

equals 0.25 under the GK framework.³²

- 2. After re-arranging and inverting this equation, we get $d(25c) = \Phi^{-1}(0.25 \cdot \exp(r^f \tau))$.
- 3. For representative parameters and maturities, we see that $0.25 \cdot \exp(r^f \tau) \stackrel{!}{<} 0.5$, as otherwise r^f would have to be larger than $\ln(2)/\tau$ ($\approx 34.7\%$ for a period of $\tau = 2$ years).³⁴
- 4. Hence, d(25c) will be negative in standard applications.³⁵
- 5. Also notice that d(25c) > d(10c), unless $r^f = 0$.

Link between the three option strategies and the higher moments E.3 of the risk-neutral density

Substituting the IV smile expression (Equation (G.1)) in equations (C.5), (C.8) and (C.6), we get

$$ATMV = ATMV_{t,T} (= \sigma \text{ by market convention}),$$
 (G.2)

$$BF25 = \frac{-ATMV_{t,T}}{24} k_{t,T} \left(1 - \left[d(25c)^2 \right] \right),$$
 (G.3)

$$\begin{cases} \geq 0 & k_{t,T} \leq 0, \\ < 0 & k_{t,T} > 0. \end{cases}$$
 (G.4)

$$RR25 = \frac{-ATMV_{t,T}}{6} s_{t,T} (d(25c) - d(25p)),$$

$$= \frac{-ATMV_{t,T}}{3} s_{t,T} d(25c),$$

$$\begin{cases} \geq 0 \quad s_{t,T} > 0, \\ < 0 \quad s_{t,T} < 0. \end{cases}$$
(G.5)

$$\begin{cases} \ge 0 & s_{t,T} > 0, \\ < 0 & s_{t,T} < 0. \end{cases}$$
 (G.6)

From Table 4 in the paper, we learn, that the excess kurtosis must be negative, because the minima and maxima are in most cases less than three standard deviations below and above the mean. According to Equation (G.4), the BF spread must then be nonnegative, in line with the descriptive statistics in Table 4 in the paper.

³²Similarly, for a put option, we get: $\Delta_P = \Delta_C - \exp\left(-r^f\tau\right)$ (hint: simply take the derivative of the put-call parity with respect to the underlying).

³³For a put option: $d(25p) = -d(25c) = \Phi^{-1}(0.75 \cdot \exp(r^f \tau))$.

³⁴Similarly, 0.75 · exp $(r^f \tau)$ 0.5, as otherwise r^f would have to be smaller than $\ln(2/3)/\tau$ ($\approx -20.3\%$ for a period of $\tau = 2$ years).

³⁵Similarly, d(25p) will be positive in standard applications.

We can similarly learn that the mean is greater than the median for all the RRs that we consider. This suggests that the RND is on average right-skewed, that is, the RND on average exhibits a positive skewness. From that table we also learn that the RRs are most often positive throughout our sample period. This finding is in line with the aforementioned inequalities, whereby a positive skewness is associated with nonnegative price quotes for the RRs (Equation (G.6)).

If we scale BF25 and RR25 by ATMV and re-arrange both expressions, we get:³⁶

$$\widetilde{BF25} \equiv \frac{-24}{(1 - [d(25c)^2])} \frac{BF25}{ATMV'}$$

$$= k_t, \qquad (G.7)$$

$$\widetilde{RR25} \equiv \frac{-3}{d(25c)} \frac{RR25}{ATMV'}$$

$$= s_t. \qquad (G.8)$$

As mentioned in Section E.1, the skewness and the excess kurtosis are both unaffected by changes in the mean. Therefore, in theory, neither the scaled BF spread nor the scaled RR should change when FX interventions affect the mean of the RND (or expected future spot rate distribution). This contrasts, however, with the empirical evidence, where the RR and the spot rate seem to be positively correlated in FX option markets, as emphasized in the paper. In other words, the price quote of a RR must also be affected by additional factors.

E.4 Sensitivities of the butterfly spread and the risk reversal

E.4.1 Butterfly spread

For typical (e.g. 25- Δ) out-of-the money options that constitute this option strategy, taking the derivative of the BF spread with respect to the skewness and the excess

³⁶Olijslagers et al. (2019) similarly divide the price of both option strategies by the ATMV.

kurtosis of the RND gives:

$$\frac{\partial BF}{\partial s_{t,T}} \bigg|_{-1 < d < 1} = 0,$$

$$\frac{\partial BF}{\partial k_{t,T}} \bigg|_{-1 < d < 1} = \frac{-ATMV_{t,T}}{24} \left(1 - \left[d(25c)\right]^2\right),$$

$$< 0$$

Hence, the BF spread increases when the excess kurtosis decreases; that is, when extreme exchange rate movements in both directions become less likely over the lifetime of the BF spread. It is unaffected by changes in the skewness of the RND (or expected future spot rate distribution).

E.4.2 Risk reversal

We proceed in a similar way for the change in the price quote of the RR:

$$\left. \frac{\partial RR}{\partial s_{t,T}} \right|_{-1 < d < 1} = -\frac{ATMV_{t,T}}{3} d(25c),$$
 $> 0,$
 $\left. \frac{\partial RR}{\partial k_{t,T}} \right|_{-1 < d < 1} = 0.$

Hence, the RR increases when the skewness becomes more pronounced, whilst it is unaffected by changes of the excess kurtosis of the RND (or expected future spot rate distribution).

F The costs of foreign exchange interventions

Amador et al. (2020) propose a metric Δ_t that allows central banks to quantify the resource costs associated with FX interventions carried out at time t. The metric is approximated by the covered interest parity (CIP) deviations observed for three-month-ahead assets; that is, the ILS and USD sovereign zero-coupon yields for a maturity of three months ($i_t^{ILS,3m}$ and $i_t^{USD,3m}$) and the USD/ILS forward rate F_t :³⁷

$$\Delta_t = \left[\frac{\left(1 + \frac{i_t^{ILS,3m}}{4*100} \right)}{\left(1 + \frac{i_t^{USD,3m}}{4*100} \right)} \frac{S_t}{F_t^{3m}} \right]^{(1/3)} - 1.$$
 (G.1)

The losses in period T are then calculated as

$$Losses_t = \frac{\Delta_t}{1 + \Delta_t} * FXRes_t, \tag{G.2}$$

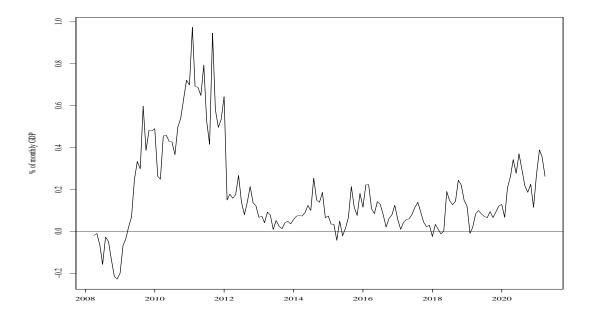
which corresponds to Equation (6.1) in Amador et al. (2020) and where $FXRes_t$ denotes the market value of the stock of foreign reserves held at the end of period t. We proxy this variable by the USD-denominated end-of-month stock published by the BOI.³⁸ The loss metric is then divided by the monthly USD denominated Israeli GDP series.³⁹ The resulting time series is displayed in the following Figure G.1:

³⁷Contrary to Amador et al. (2020) who use overnight index swap rates, we use sovereign zero-coupon yields because we cannot obtain the former for the ILS.

³⁸Note that this approximation results in a loss metric that is slightly upward biased.

³⁹To obtain this variable, we first downloaded the quarterly ILS-denominated Israeli GDP time series data from the Federal Reserve Economic Database (FRED) maintained by the Federal Reserve Bank of St. Louis. We then transformed this variable to get its USD denominated counterpart. This GDP variable is then HP-filtered (with a smoothing parameter of 1'600) to get the GDP trend. We then used the cubic spline interpolation method to convert the quarterly trend into monthly data after dividing the resulting time series by three. The finally obtained time series represents the costs of foreign exchange interventions in terms of GDP.

Figure G.1: Costs of foreign exchange interventions



Notes: The figure displays the costs of foreign exchange interventions. This variable is a function of covered interest parity deviations, the market value of the stock of foreign reserves held by the BOI at the end of each month and the ILS denominated monthly Israeli GDP data. The variables used to compute the CIP deviations are retrieved from Bloomberg. The data on foreign reserves is obtained from the International Monetary Fund and the GDP data from the Federal Reserve Economic Database (FRED) maintained by the Federal Reserve Bank of St. Louis. The data span the period from April 1, 2008 to April 1, 2021.

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