

University Finance Seminar 20 January 2006

Volatility-Induced Financial Growth: Modelling FX Market Makers

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Centre for Financial Research

Judge Business School

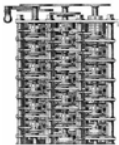
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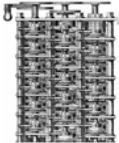
Co-workers: R G Bates & V Leemans

Research partially sponsored by Bank of America, EPSRC, FutureLogic and HSBC



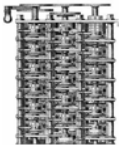
Outline

- 1 Introduction**
- 2 The Global FX Market**
- 3 Structure of the FX Market**
- 4 Modelling FX Investment**
- 5 Modelling FX Market Makers**
- 6 Conclusions and Future Directions**



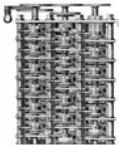
1 Introduction

- Increasing evidence that **markets are predictable**
 - **Lo & McKinley (2000)** state that rather than being a symptom of inefficiency predictability in the financial markets is the “oil that lubricates the gears of capitalism”
- Most **technical traders** are active in the FX markets and **at high frequency**
 - Daily vs high frequency **Neeley (1999)**
 - Equities vs FX **Taylor & Allen (1992)**
 - Asset allocation vs trading **Dempster & Jones (2001)**



Literature Review

- **Macroeconomic fundamentals** based models of FX timeseries **do not fit** empirical evidence at horizons of less than one year **Meese & Rogoff (1983)**
- Increasing interest in **microstructure** based approaches **Lyons (2001)**
- Published work on **orders and transaction flows** in **equity markets**
Gabaix et al (2003) **Farmer & Lillo (2003)**
- Much less published for **FX** due to **lack of data** **Bates et al (2003)**



2 The Global FX Market Turnover 2004

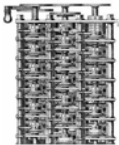
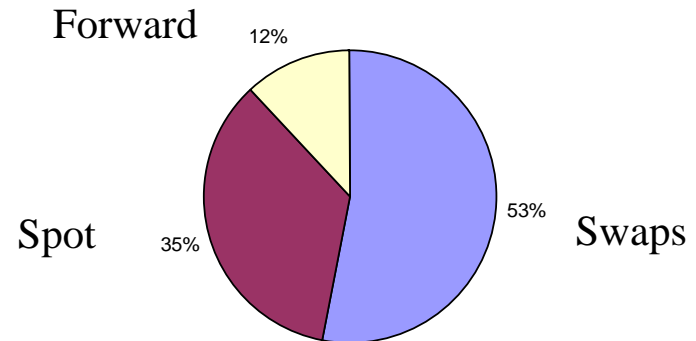
Latest Bank for International
Settlements FX market survey was
conducted in April and June 2004

Average daily FX market turnover
\$1.9 trillion

Now estimated at **\$2.5 trillion**

Swaps 53%, Spot 35%, Outright
Forward 12%

Spot daily turnover about **\$620 billion**



FX Market Turnover by Currency

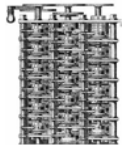
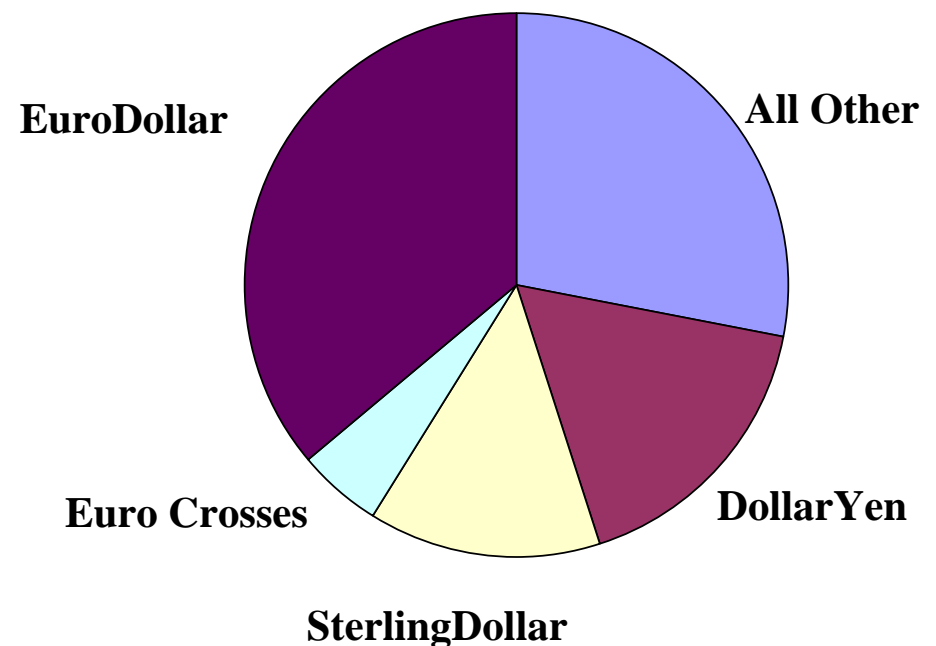
EuroDollar easily the most traded currency pair with **28%** of global turnover

DollarYen next with **17%**

SterlingDollar was **14%**

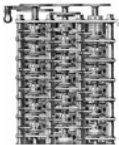
Further **5%** of turnover in the **crosses** between these currencies - mainly the EuroYen and SterlingEuro crosses

All other currencies and their crosses together accounted for about **a third** of global FX turnover



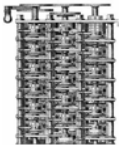
FX Market Concentration

- Global **FX trading** is highly **concentrated**
- In **2001** there were almost **2000 institutions** active in the FX market
- But just **30** of those accounted for **35%** of global **turnover**
- In the three years to **2005** this concentration into fewer banks continued until **20 banks** accounted for **40%** of **turnover**
- In **2005** the top **7 banks** accounted for **60%** of **turnover** of which **Deutsche** and **UBS** alone accounted for over **29%** between them



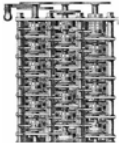
Inter-Bank FX Market

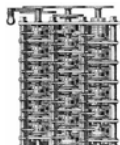
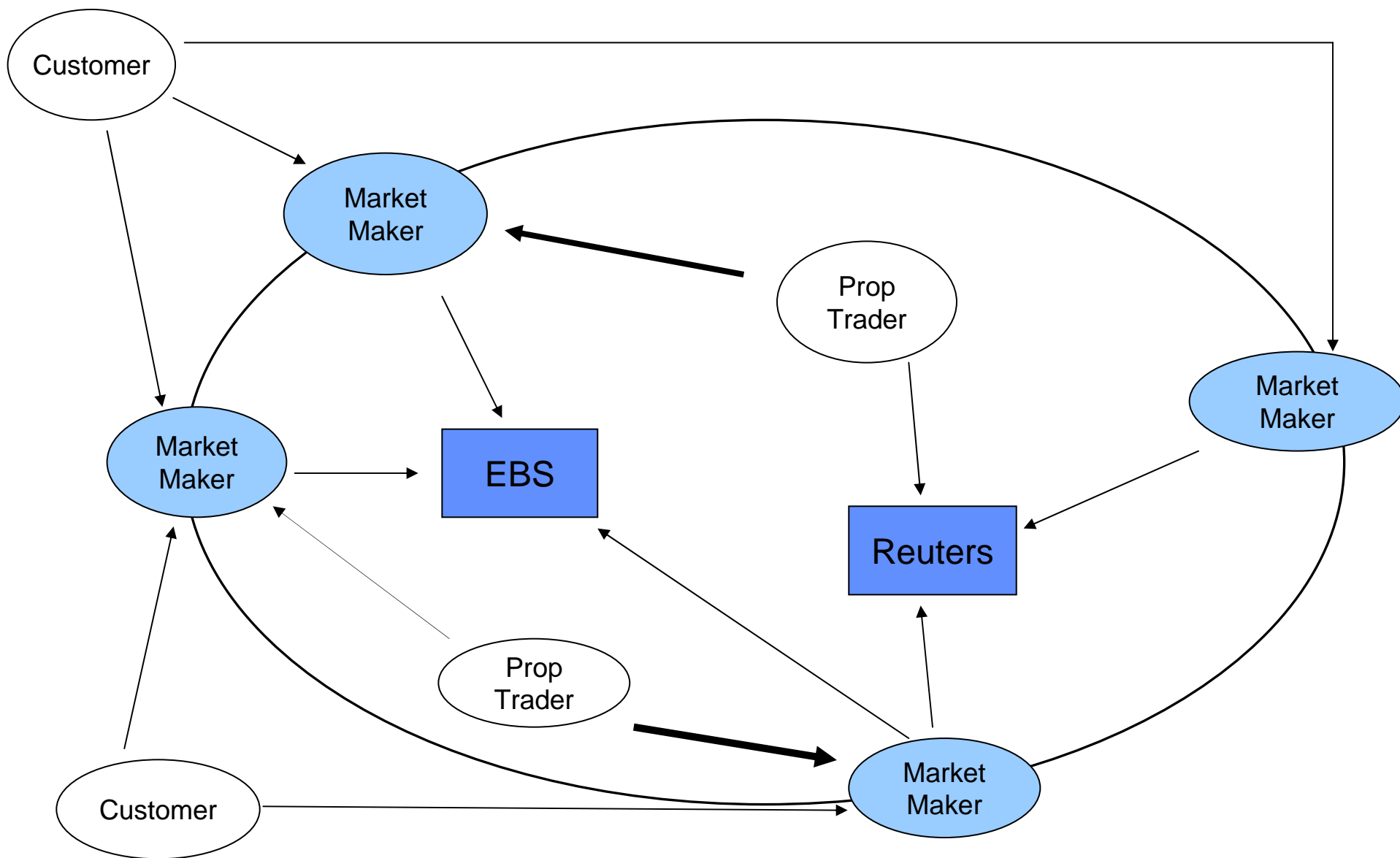
- **EBS** and **Reuters** (D-2000/3000) are the **interbank trading systems**
- In **2001** they accounted for just under **40%** of **spot** interbank trading. In **2004** they accounted for over **90%** of **all** interbank FX
- Over **97%** in the **three major currency pairs**: EuroDollar DollarYen and SterlingDollar
- About **70%** of **spot** FX turnover is **interdealer** and **30%** is **customer** trades -- in total currently about **\$ 800 billion** per day of which **\$ 120 billion** is carried by EBS
- Interdealer turnover has fallen as **EBS** and **Reuters** improve efficiency of interbank trading



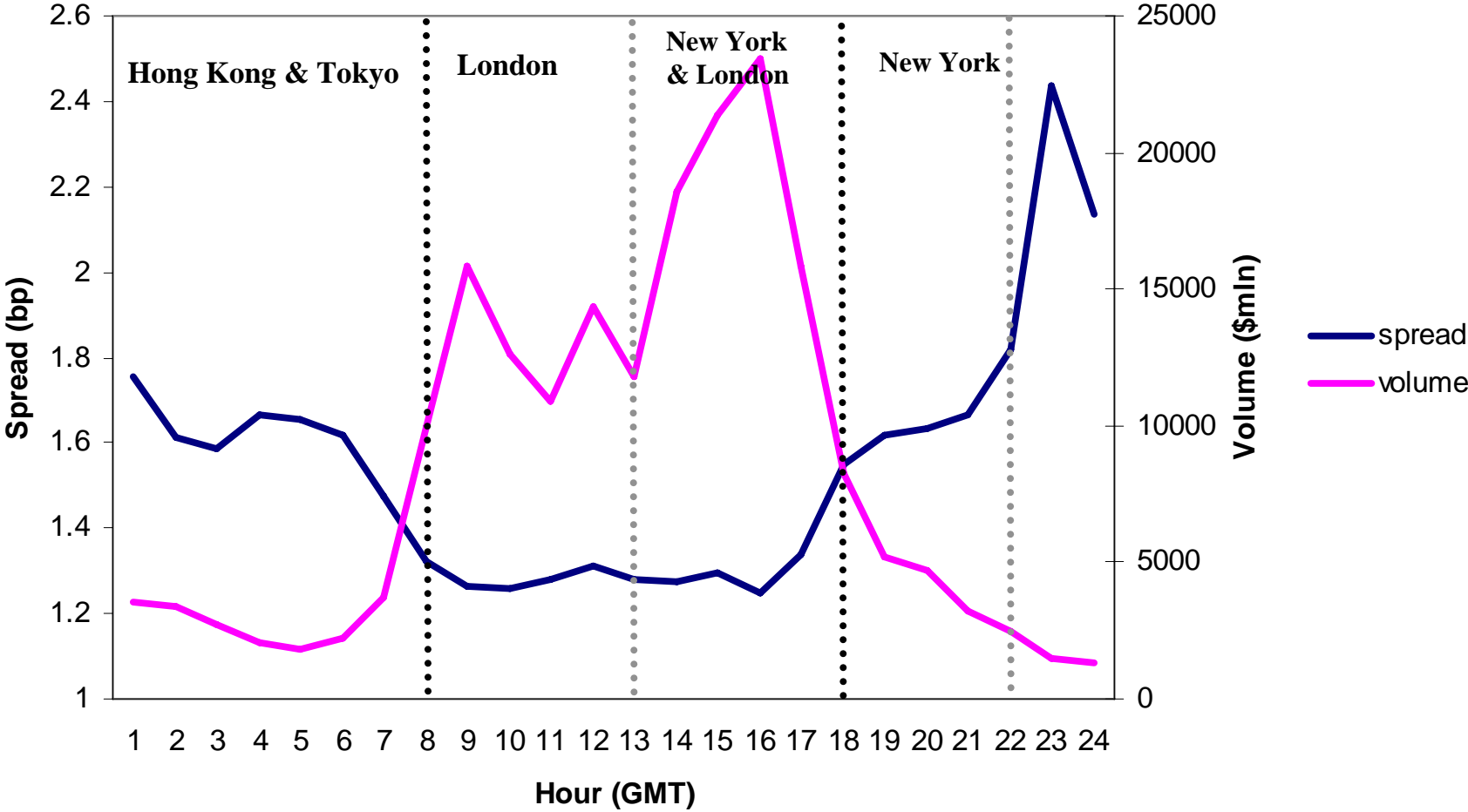
FX Market Structure

- General **customers** can **interact with** the global FX market only through market participants: the **FX market makers**
- Customers deal with **more than one** market maker
- Market makers deal with each other to **clear excess inventory**
- **Proprietary traders** are usually within banks - and so deal primarily with their **own bank's market maker** (often at reduced spreads) - or directly with EBS/Reuters
- Also deal with **other banks' market makers**

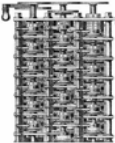




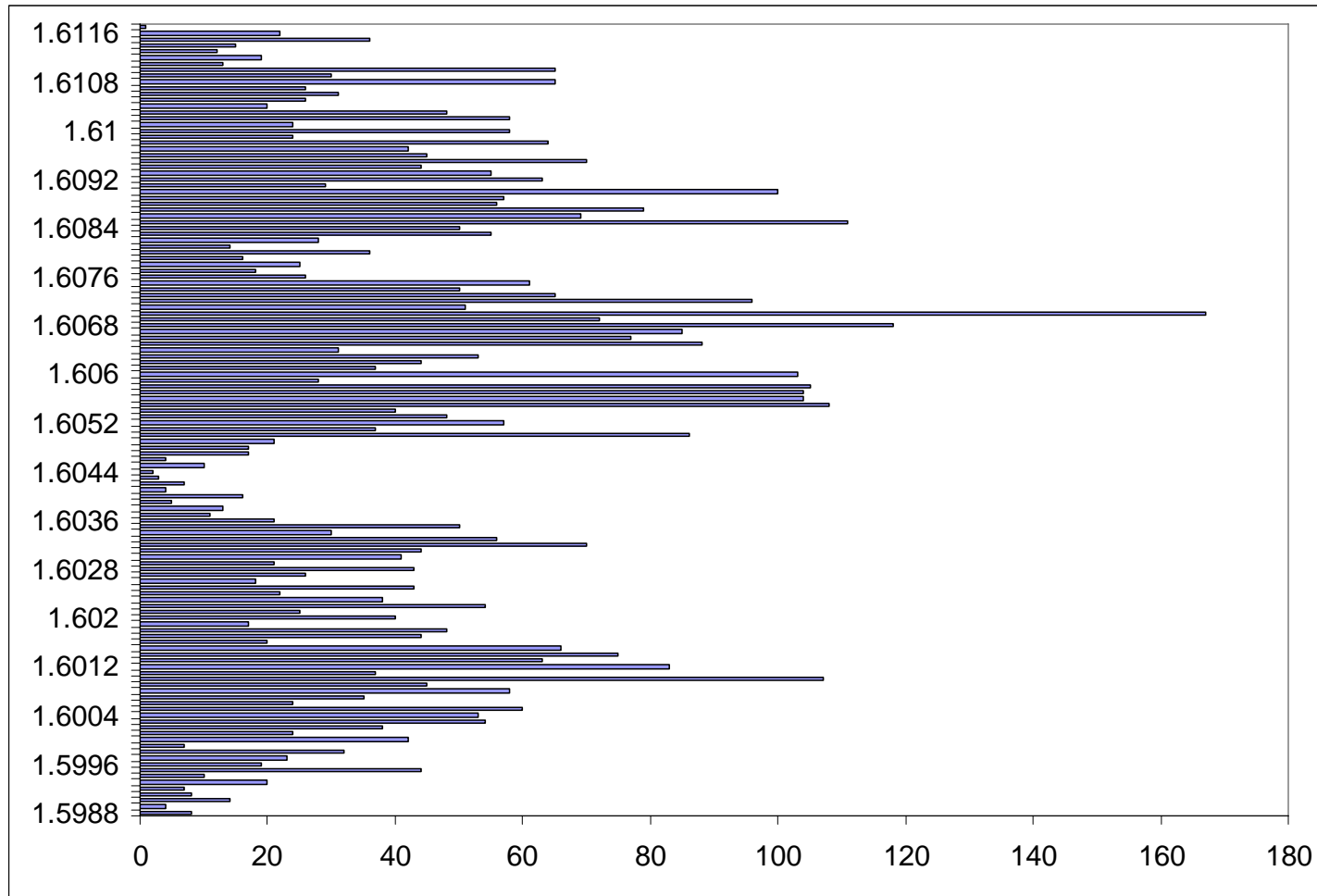
Global Market: EUR/USD Spread and Volume



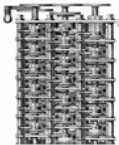
Source: Stacy Williams, HSBC Investment Bank



Global Market: Average GBPEUR Liquidity by Rate

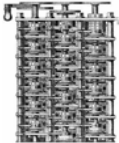


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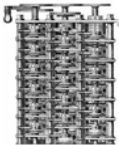
Customer Terminology Example

- Customers leave **limit orders** with market makers:
 - Two types: **Take Profit** orders and **Stop Loss** orders
 - These have very different effects when they are activated by a price move in the market. A **take profit** order acts in the **opposite direction** to the market move that triggers it, a **stop loss** order acts in the **same direction** as the market move that triggers it
 - An example will make the difference clear. We will use the **DollarYen** exchange rate: the price of a dollar in terms of Yen



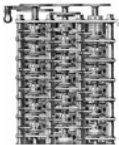
Customer Terminology Example

- A customer has bought dollars at a price of 100 Yen; if the price rises to 105 there will be a profit. If the customer leaves a limit order to sell the dollars at a price of 107 Yen this would be a **take profit** order. When there is a *rise* in the market price the order is to *sell*. The resulting transaction acts in the **opposite direction** to the move that triggered it
- If the customer had again bought dollars at a price of 100 Yen but the price was now 95 a limit order could be left to close the position – that is to sell the dollars – if the price fell to 92. This would stop the loss getting any bigger and is thus known as a **stop-loss** order. In this case a *fall* in the market price triggers a *sell* and so the order acts in the **same direction** as the move that triggered it



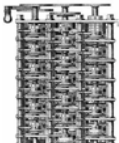
3 Structure of the FX Market

- Both EBS and Reuters provide **double auction markets** (buy and sell markets) in virtually all currency pairs
- However, the **market has segmented**: **EBS** has the greatest turnover and liquidity in **EuroDollar** and **DollarYen** while **Reuters** is the main market for **SterlingDollar** and for the **Euro** against **non-Dollar** currencies



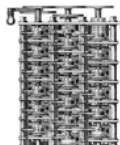
FX Market Terminology

- **Bid** : Price market maker will pay to **buy** the currency
- **Ask** (or **Offer**): Price at which market maker will **sell** the currency
- **Depth**: **Total amount available** at a particular price
- **Pip**: **Minimal price change** e.g. 100th of a cent for dollar crosses
- **Regular Amount**: A **characteristic size** set for each currency pair
- typically 20 million dollars
- **Regular Price**: The **price nearest** the **best price** at which the **regular amount** is **available** to deal
 - Note the **depth profile** is usually **bimodal** with peak depth at prices a few pips worse than the best prices



FX Market Makers Private Information

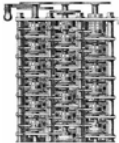
- Market makers have **private information**
 1. **Order flow** from their own customers:
 - Direction
 - Size
 - Type of customer
 2. Their own **customer order** book:
 - Type of order
 - Price
 - Size
 - Type of customer

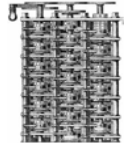
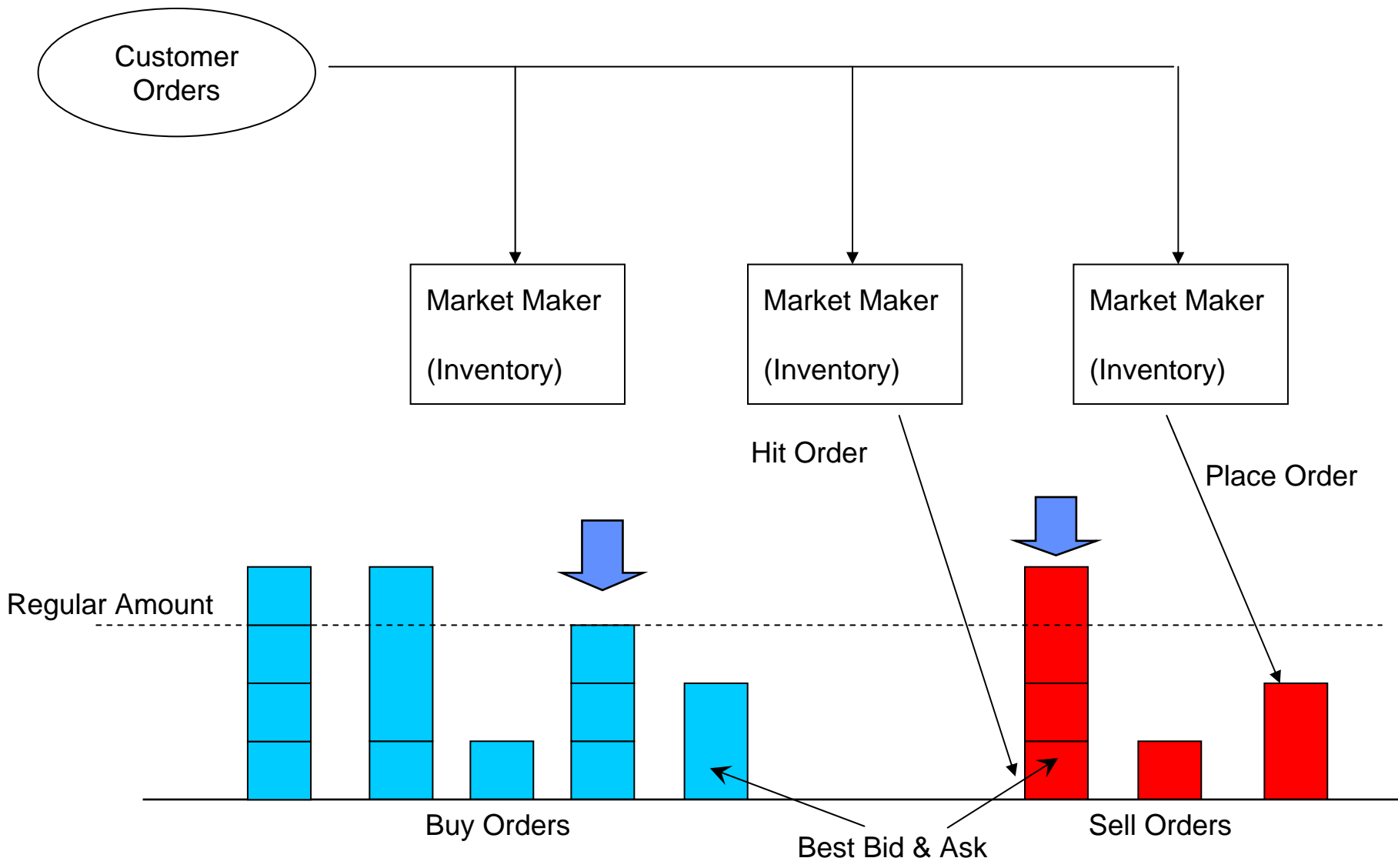


FX Market Makers Limited Information

- Market makers see **limited information** on EBS or Reuters
 1. **Best bid and offer** price
 2. **Size at best bid (offer)** but only **if not regular**
 3. **Price** where **bid (offer)** first goes **regular** (possibly best price)
 4. **Every transaction** showing only restricted information:
 1. **Price**
 2. If **buyer** or seller initiated (if **hit ask** or bid)

Note, **size** of transaction is **NOT shown**





EBS Screen

EBS - Spot | TWBE T02 | Sep 25 14.58 | Page 1 | 1 BBBB Credit Limit | 2 JLLL Credit Limit | 3 MMMM Credit Limit | 0

Rates					
EUR/USD	0.9791 - 92	USD/SGD	1.7812 - 17		
USD/CHF	1.4955 - 57	AUD/USD	0.5395 - 01		
EUR/CHF	1.4615 - 17	EUR/JPY	120.20 - 22		
USD/JPY	123.09 - 11	USD/HKD	7.7975 - 85		

Trader Deals					
14:37	SELL	1	123.10	TWTW	USD/JPY
14:43	BUY	5	1.5611	TWTW	GBP/USD
14:45	BUY	2	1.5610	TWTW	GBP/USD
14:49	SELL	2	1.4955	NYNY	USD/CHF
14:51	SELL	10	0.9790	TWTW	EUR/USD

EBS Deals					
14:39	123.12	Paid			USD/JPY
14:40	123.12	Paid			USD/JPY
14:40	123.11	Given			USD/JPY
14:42	0.9789	Given			EUR/USD
14:51	0.9790	Given			EUR/USD

USD/JPY 123.09 - 11					
07	10	09	11	27 - Sep	11
		bid	offer		

EUR/USD 0.9791 - 92					
89	9	91	92	27 - Sep	92
		bid	offer		

USD/CHF 1.4955 - 57					
52	3	55	57	27 - Sep	57
		bid	offer		

GBP/USD 1.5610 - 15					
10	7	10	15	27 - Sep	17
		bid	offer		

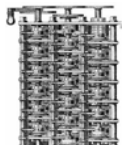
EUR/JPY 120.20 - 22					
19	7	20	22	27 - Sep	22
		bid	offer		

EUR/CHF 1.4615 - 17					
10	10	15	17	27 - Sep	18
		bid	offer		

USD/JPY 123.07 BID					
off	0	of 12	50E.1C		

SELL REQUEST EUR/USD					
send	quit	89	0.97		
		10			

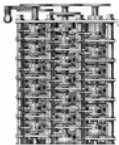
GBP/USD 1.5610 BID					
47345	Buy	2	@ 1.5610	TWTW	
off	2	of 10	50E.1D		



4 Modelling FX Investment

- Consider an investor holding a **self financing currency portfolio** and **rebalancing** this portfolio **to a fixed mix** at regular intervals – say daily or weekly
- This **rebalancing strategy** is determined by a **square matrix** $A = (\alpha_{kj})$ where α_{kj} is the **proportion** of the current holding g_{t-1}^j in currency j that is to be used to purchase currency k at **exchange rate** π_t^{kj} and proportional **transaction cost** δ_t^{kj}
- The resulting **portfolio dynamics** are given by

$$g_t^k = \sum_{j=1}^K \alpha_{kj} (1 - \delta_t^{kj}) \pi_t^{kj} g_{t-1}^j = \sum_{j=1}^K \alpha_{kj} (1 - \delta_t^{kj}) \frac{p_t^j}{p_t^k} g_{t-1}^j$$

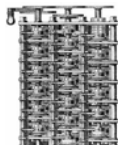


Portfolio Dynamics

- Assume that **exchange rates** and **transactions costs** are driven by a **stationary ergodic process** and the latter are sufficiently **small**
- Then the **portfolio growth dynamics** are given in vector form by

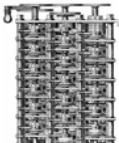
$$\mathbf{g}_t = \mathbf{B}_t \mathbf{g}_{t-1} \quad t = 1, 2, \dots \quad g_0 \text{ fixed}$$

- As a consequence of a stochastic version of the Perron-Frobenius theorem -- or alternatively the Birkhoff ergodic theorem -- for **any fixed rebalance strategy** A the resulting **portfolio holding grows exponentially fast almost surely**
Dempster, Evstigneev & Schenk Hoppe (2003, 2004)



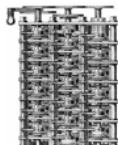
Balanced Growth and Risk Management

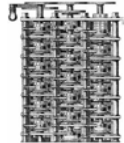
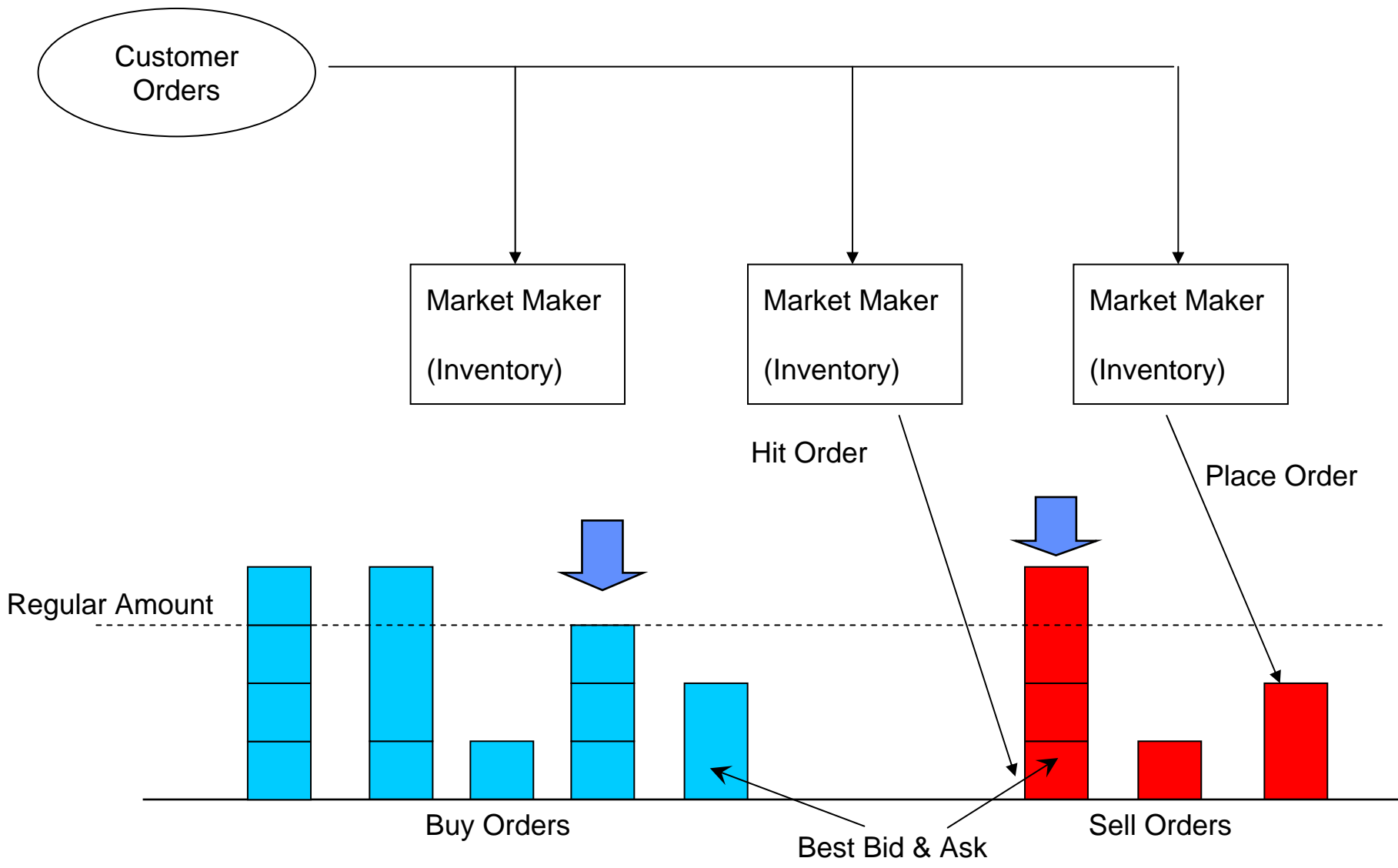
- Moreover for **each rebalance strategy** A the **initial portfolio** currency holdings g_0 can be **chosen so that** the resulting **portfolio growth** is **balanced** – all currency holdings rise or fall together almost surely after each rebalance with **maximal expected** positive **growth rate** – the **stochastic turnpike** Arkin & Evstigneev (1986)
- Using **global optimization** we may theoretically choose a **different initial** set of **portfolio** currency holdings so as to **optimize final portfolio value** over a **finite horizon** subject to a probabilistic **maximum drawdown** constraint – an **NP-hard** problem
- By stochastic turnpike theory the resulting **portfolio** holdings **will converge to balanced growth** at the (maximal) **turnpike rate**



4 Modelling Market Makers

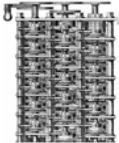
- The model of the FX market shown earlier provides a **structure for simulation**
- Treat **market makers** as the **active agents** with **customer order flow exogenously determined**
- Treat customers initially as generating a **fixed sequence of orders**
- How should market makers respond?





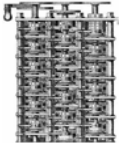
Market Maker Behaviour

- What is **optimal market maker behaviour**?
- Model **market maker actions** – conditional on:
 - ‘Public’ market information
 - ‘Public’ events
 - Private market information
 - Private events



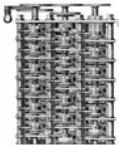
Market Maker Actions

- Take a **bid/ask price** by hitting limit order of size S
- Place a **limit buy/sell order** at price P of size S
- **Cancel** some or all (size S) of an existing buy/sell order
- **Change** existing buy/sell order to new price and size P and S
- **Do nothing** at this time
- Modelling market reaction in terms of **spread** as a **random walk** between two **partially absorbing barriers**



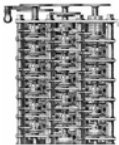
Market Maker Public Information

- Best **bid and ask** prices (and so spread)
- **Size** at best bid and best ask
- **Regular bid distance** from best bid
- **Regular ask distance** from best ask
- **Volatility** of best prices
- Short-term **technical indicators** (trend, etc.)
- **Inter-dealer** activity in **number** (not size) of trades and **buy/sell balance**



Market Maker Public Events

- **Best bid** price changes
- **Best ask** price changes
- **Liquidity at best bid** changes
- **Liquidity at best ask** changes
- **Regular bid** price changes
- **Regular ask** price changes



EBS Screen

EBS EBS - Spot

TWBE T02 Sep 25 14.58 Page 1

1 BBBB Credit Limit 2 JLLL Credit Limit 3 MMMM Credit Limit 0

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USD/JPY	123.	09	11	123.	27 - Sep
07	10	09	11	11	
		bid	offer		

EUR/USD	0.97	91	92	0.97	27 - Sep
89	9	91	92	92	
		bid	offer		

USD/CHF	1.49	55	57	1.49	27 - Sep
52	3	55	57	57	
		bid	offer		

GBP/USD	1.56	10	15	1.56	27 - Sep
10	7	10	15	17	
		bid	offer		

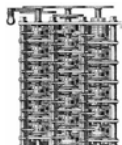
EUR/JPY	120.	20	22	120.	27 - Sep
19	7	20	22	22	
		bid	offer		

EUR/CHF	1.46	15	17	1.46	27 - Sep
10	10	15	17	18	
		bid	offer		

USD/JPY	123.	07	BID
off	0	of 12	50E.1C

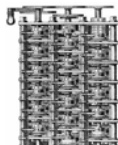
SELL REQUEST	EUR/USD
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10	
send	quit

GBP/USD	1.56	10	BID
47345	Buy	2	@ 1.5610 TWTW
off	2	of 10	50E.1D



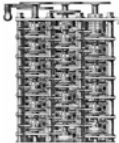
Market Maker Private Information

- Inventory
- Customer deals: net buy/sell balance
- Customers deals: volume (both number and size)
- Structure of customer limit orders
- Own limit orders with inter-dealer market



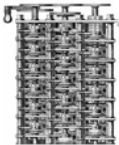
Market Maker Private Events

- **Buy** (from us) order executed with customer
- **Sell** (to us) order executed with customer
- **Other** market maker **hits our limit buy/sell order** (event also known to the other MM)



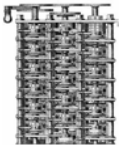
Market Maker Stylized Behaviour

- Market makers are **risk averse** but **must deal continuously** to generate revenues
- Continuous small profits on **small trades** – e.g. 10 million dollars – are **preferable to** occasional large profits on **big trades with related losses!**
- **Large customer orders** in inventory are dealt as **many small trades** Lyons (2001)
- **Prices and amounts** of bid and ask **quotes** are **asymmetric** depending on both the current market and customer order inventory
- **Gaming behaviour** as for example bidding when selling off inventory is **standard**
- The interdealer **market** is **mean reverting on very short time scales** creating opportunities for proprietary traders as a result



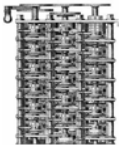
What is 'Optimal' Market Maker Behaviour?

- Market makers seek to benefit from the random fluctuations of prices: buy low, sell high!
- MMs are **not profit maximizers** but they are **profit satisfiers** with **bounded rationality** Simon (1955)
- **Continual small profits** are taken rather than risking large losses
- MMs may be considered to be **utility maximizers with high risk aversion** captured by high curvature of a concave utility function



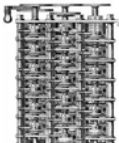
Simple Model

- **Random walk**
 - **Discrete time**
 - Integer **price in pips**
 - **Unbiased**: $P(\text{up}) = P(\text{down})$
 - Extension to biased case
- Two **partially absorbing barriers** represented by limit orders in the market book
- Our limit order may not be cleared at best bid / ask

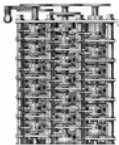
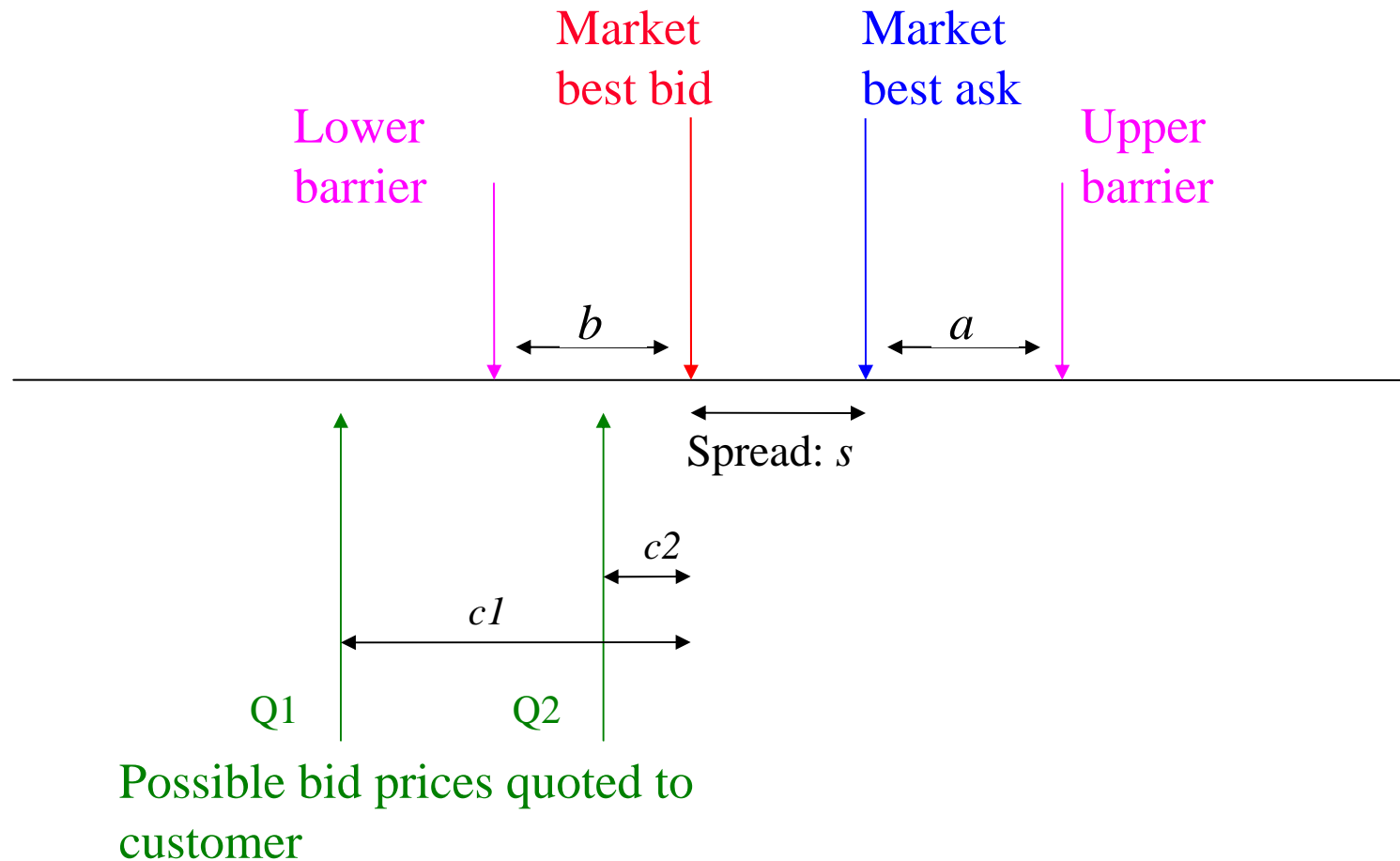


Customer Order Treatment

- Consider trying to **dispose of positive inventory** (from customers) **by selling** into the interdealer market
 - Where should the absorbing **barriers** be **placed**?
 - **Upper barrier** is a **limit sell order** in the market book
 - **Lower barrier** is a **stop-loss (trigger)** level – hit the best market bid
- **Customer** was **quoted lower bid than** market **best bid**
- **Guaranteed profit? Possibly not** depending on lower barrier placement
- Disposing of **negative customer inventory** by buying in the interdealer market is **similar**

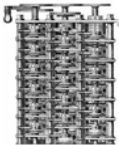


Asymmetric Barriers & Market Prices



Placing the Barriers

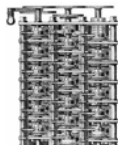
- Consider **symmetric barrier placement** ($a = b$)
- For **risk-averse** market makers with a concave utility of return **symmetric placement is never optimal**
- We find $a = b = 0$ i.e. **immediately close** the position **at** the market **best bid**
- What about **asymmetric barrier placement**?
 - Maximize **CARA** (exponential) **utility** function



CARA Utility

$$U := \frac{-1}{\lambda} \left(P_U e^{-\lambda r_U} + P_L e^{-\lambda r_L} \right)$$

- r_U and r_L denote the **returns** at the upper and lower barriers respectively
- P_U and P_L denote the **probabilities of absorption** at the upper and lower barriers respectively
- λ is the **risk aversion parameter**

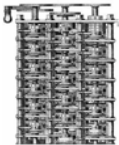


Barrier Placement and Utility

- Find the **unique utility maximum** in a and b from the **first order conditions**

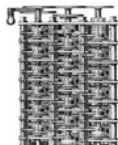
$$\frac{\partial U}{\partial a} = \frac{be^{-\lambda(c+a+s-1)}}{\lambda(a+b)^2} \left(1 - e^{\lambda(a+b+s-1)} + \lambda(a+b) \right) = 0$$

$$\frac{\partial U}{\partial b} = \frac{ae^{-\lambda(c-b)}}{\lambda(a+b)^2} \left(1 - e^{-\lambda(a+b+s-1)} - \lambda(a+b) \right) = 0$$

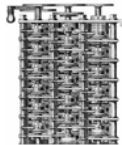
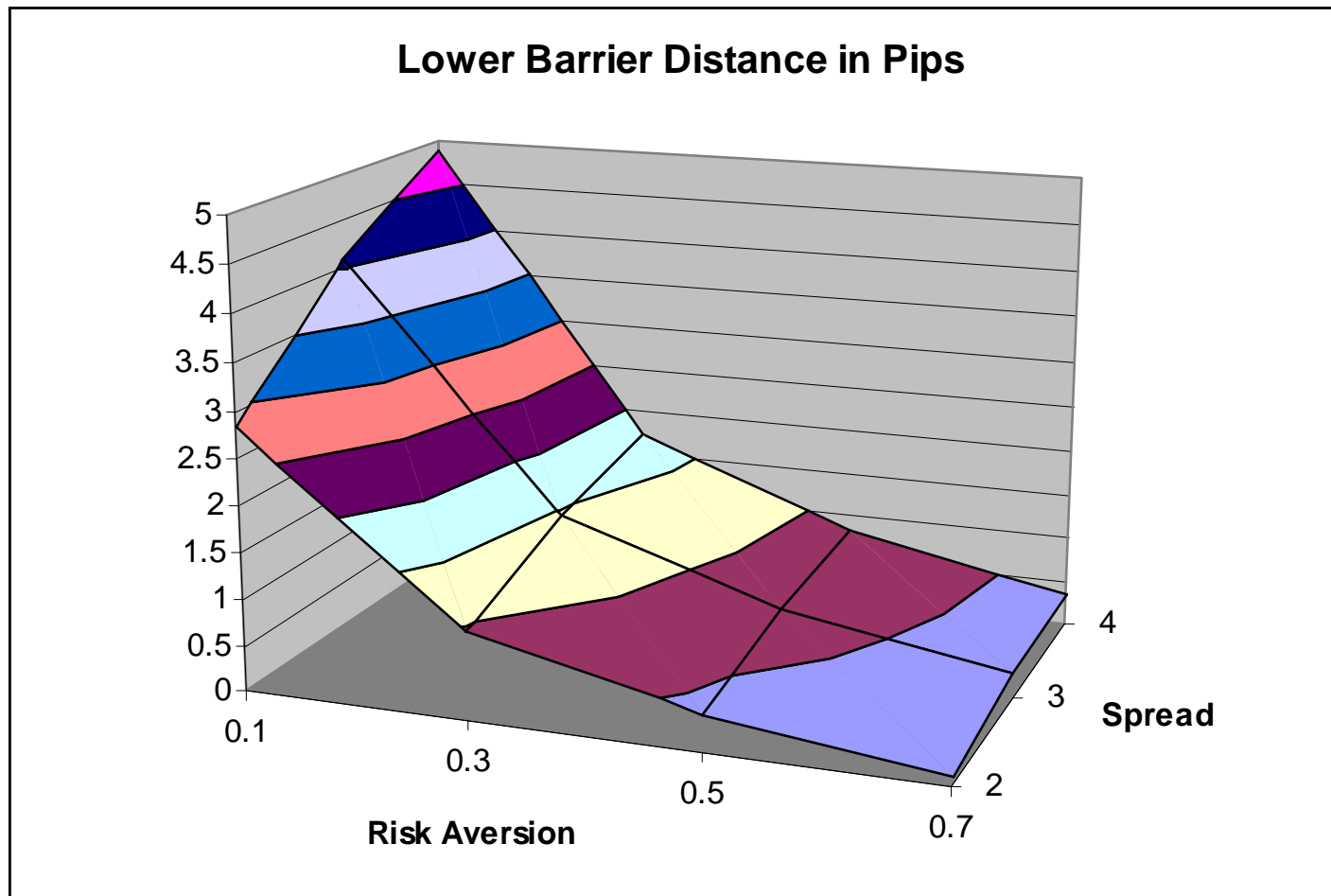


Asymmetric Barrier Placement

- **Utility decreases** as the upper barrier moves **above the** market **best ask** (for all spreads and values of risk aversion)
- So always **place sell order** at market **best ask**
- **Lower barrier** placement depends on spread and risk aversion
- Place **below** market **best bid**



CARA Utility



Conclusions & Directions for Future Work

- Have shown increasingly **profitable** FX investment strategy with **transaction costs**
- Choosing a **symmetric fixed mix trading strategy** with **minimal inventory levels** at days end for diagonal entries and **balanced positions** off diagonal entries this model applies to **market makers** providing the theoretical results can be extended to allow **customer order flows into and out of the portfolio**
- Detailed **simulation** modelling of the customers – market maker – interbank **trading system** is in progress
- In particular **modelling** of the **market makers actions** using **Markov chain** models and corresponding **simulations** of the interbank global FX market is in progress
- Investigation of the **two layer market** and other **agent based alternatives** in the future

