

#### MARKET-BASED SYSTEMS

University of St Andrews Department of Computer Science Distinguished Lecture Series, March 2008

Lecture 3

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# The Contents

NB This is a 3-hour partial tutorial overview of Market-Based Systems ... in three 60min chunks

- partial as in incomplete: we can't cover everything in three hours
- partial as in biased: this is my version of the story...
- Lecture I: Rationale and Background

Here we'll find out why computer scientists should care about market-based systems, review some notable applications, and also cover some of the background economics. They call economics "the dismal science" for a reason, so that background economics stuff won't delay us too long...

• Lecture 2: Artificial Trading Agents for Fun and Profit

This lecture tells the story of some of the best-known algorithms used for autonomous "traderrobots", and how they were found to consistently beat human traders.

• Lecture 3: What's hot, what's not, and where next: Tales from the City

Looks at work on automatic optimization and design of trader-agents, and online market mechanisms, with particular reference to the current hot topics in the automated trading technology in the financial markets.



#### Recap of Lectures 1& 2...

- Transition to utility-scale/"cloud" computing & service-oriented business models gives need for automated trading strategies/software
- Human traders do a lot, quickly
- More than zero intelligence is necessary
- Non-economists at HP and at IBM motivated to develop trader "robots"
- The Autonomous Agents academic research community start playing games
- 1997: ZIP open-sourced
- 2001: IBM do ZIP a very nice favour
- The financial markets start to take an interest
- But there was something that IBM didn't know...



### GA-optimization of ZIP traders

- Meanwhile at MIT & HP Labs...
  - Genetic Algorithms (GAs) to optimize ZIP-trader parameters to particular markets
    - First presented at CIFEr'98, New York, Mar'98; & ASCMA98, Minneapolis, May '98
    - Tech report in 2001: http://www.hpl.hp.com/techreports/2001/HPL-2001-99.html
  - if GA-tuned ZIP traders had been used by IBM, maybe ZIP would have dominated
- ZIP-trader marketplaces have 8 control parameters
  - initially set by educated guesswork
- Trivial to use a genetic algorithm (GA) to optimize the 8 parameters
  - genome: a single point in the eight-dimensional real hyperspace **R**<sup>8</sup>
    - actually, points constrained to lie within the unit hypercube in 8-space
    - vanilla GA: with annealing mutation; population size 30; 500 generations



## ZIP: quantitative margin adjustments

ZIP algorithm is adaptive: adjusts margins up or down using machine learning rules

 $[\mu_{\mu}\mu_{\mu}]$ 

- Quote-price  $p_i(t)$  set by limit price  $\lambda_i$  and margin  $\mu_i(t)$ :  $p_i(t) = \lambda_i \cdot (1 + \mu_i(t))$ 
  - Seller A  $\mu_i(t)$  in  $[0,\infty]$  forall  $t; \mu_i(t) + =$  raises margin;  $\mu_i(t) =$  lowers margin
  - raises margin;  $\mu_i(t)$  += lowers margin Buyer  $\mu_i(t)$  ir
- $[\gamma_l, \gamma_h]$  g rule to adjust actual output A wrt desired D using rate  $\beta$ : • ZIP uses Widro
  - $A(t+1) = A(t) + \Delta(t); \text{ where } \Delta(t) + \beta \cdot (D(t) A(t))$
  - With momentum (damping) factor  $\gamma$  in [0,1]:  $A(t+1) = \gamma \cdot A(t) + ((1))$
- So for ZIP we have:
  - $\mu_{i}(t+1) = (p_{i}(t) + \Delta_{i}(t)) / \lambda_{i} 1$

-  $\underline{A}_i(t) = \beta_i \cdot (\tau_i(t) - p_i(t))$ ; where target price  $\tau_i(t) = (A_i(t) + R_i(t) \cdot q(t))$ ; A() & R() stochastic

Giving:

University of

BRISTOI

 $\mu_i(t+1) = (p_i(t) + \Gamma_i(t)) / \lambda_i - 1;$  where  $\Gamma_i(0)=0$  and  $\Gamma_i(t+1) = \gamma_i \cdot \Gamma_i(t) + ((1 - \gamma_i) \cdot \Delta_i(t))$ 

#### The Genetic Algorithm: not a lot of code

See e.g.:

D. Goldberg Genetic Algorithms Addison-Wesley, 1986

M. Mitchell An Introduction to Genetic Algorithms MIT Press, 1998

```
/*population size*/
POP SIZE=30;
/*number of generations to evolve for*/
MAX GENS=200;
/*create initial population at random*/
generate random population(Pop1[]);
/*evolve...*/
for(g=0;g<MAX GENS;g++)</pre>
{ /*evaluate fitness of each member of population*/
   for(i=0;i<POP SIZE;i++)</pre>
   { evaluate fitness(Pop1[i]);}
   /*identify the best member*/
   elite=find fittest(Pop1[]);
   /*breed new population using tournament selection*/
   for(i=0;i<POP SIZE;i++)</pre>
   { /*randomly pick 3 distinct possible parents*/
     parents[1]=irandpick1st(POP SIZE);
     parents[2]=irandpick2nd(POP SIZE,parents[1]);
     parents[3]=irandpick3rd(POP SIZE,parents[1],parents[2]);
     /*sort them into order of fitness*/
     sort fitness(parents[]);
     /*the two fittest parents "breed" to make a kid*/
     Pop2[i]=breed new kid(parents[1], parents[2]);
   /*preserve the elite*/
   Pop2[0]=Pop1[elite];
   /*new population replaces old population*/
   Pop1[]=Pop2[];
```



### GA optimizing from "easy" genomes

 Initial population genomes seeded with original parameter values as used in the initial ZIP trader studies. 200 generations; populationsize=30.



Slight improvement: shows that the GA can improve on the parameter values used by the inventor of the ZIP algorithm



# GA optimizing from "zero" genomes

- Initial population genomes all seeded with positively unhelpful (0,0,0,0,0,0,0,0) values
- 200 generations; populationsize=30



Definite improvement: shows that the GA can improve even when commenced inconveniently with traders that (initially) have no adaptation or memory



### GA optimizing from "hard" genomes

• Initial population genomes all seeded with absolutely ridiculous parameter values: each value deliberately way too high or way too low. 200 gens; populationsize=30.



Definite improvement: shows that the GA can improve even when initiated from trader genomes with maliciously/idiotically poorly-chosen parameter values



#### If the computer twiddles the knobs...

#### ... why limit the number of

#### knobs?

- ZIP60, and ZIP100, both have too many parameters for a human to set by hand without dying of boredom.
- But a small cluster of PCs can happily spend a couple of days/weeks finding the right settings for the 60 or 100 knobs.
- And, on a decent-sized HPC facility, you get the twiddling done in a few minutes.
- "Real-world" trading algorithms are now routinely being developed and deployed that assume the availability of adaptation, learning, and/or optimization.
- But if all the traders (or just the majority of traders) in the marketplace are robots, why use a human-compatible marketplace?



#### Now evolve the auction mechanism too

- If you're going to use trading agents instead of humans, then why use market mechanisms designed by humans for humans?
- Use GA to search a space of possible auction types
- GA simultaneously co-adapts ZIP trader parameters, as before
- Fitness measure: *minimize* root mean square deviation of transaction prices from equilibrium price
  - (front-weighted average of Smith's  $\alpha$ , as before)
- Problem: how to encode for a range of auction styles?

 D. Cliff. Evolution of market mechanism through a continuous space of auction-types. Computational Intelligence in Financial Engineering (CIFEr), Hawaii, May 2002. http://www.hpl.hp.com/techreports/2001/HPL-2001-326



#### A continuum of auction mechanisms

- Let  $Q_s$  denote the probability that the next quote comes from a seller,
  - i.e.  $Q_s$  denotes the probability that the next quote is an offer/ask
  - NB probability of a quote coming from a buyer  $Q_b = 1.0 Q_s$
- In the English Auction,  $Q_s = 0.0$
- In the Dutch Auction,  $Q_s = 1.0$
- In a CDA a quote is equi-probable from either the seller-side or the buyer-side, so  $Q_s$ =0.5
- What if we interpret these 3 human-designed mechanisms (0.0, 0.5, & 1.0) as points on a  $Q_s$  continuum?
  - e.g. how about auction based on  $Q_s=0.1$ ?

#### Konstandard values of Quare easily implementable in online e-marketplaces

Doing it for real: really not a lot of code.

#### Real $q_s=0.1$ ;

r=uniform\_random\_real(0.0,1.0);
if(r<q\_s)
{ get\_next\_quote(sellers); }</pre>

else

{ get\_next\_quote(buyers); }



#### Doing it for real: manually, with humans

• Spin-the-wheel...





#### Effects of shock-changes to schedules

- Maybe the fact that a single unchanging schedule is used for the duration of each experiment is too simplistic?
  - The ZIP traders don't have to deal with any changes in supply/demand
  - Over-fitting?
- Using same experiment set-up, see what  $Q_s$  evolves when, partway through each evaluation, there is a sudden "shock" change in the supply and demand schedules

http://www.hpl.hp.com/techreports/2002/HPL-2002-128



#### Lots of results...

- data in orange is significantly different from CDA Q<sub>s</sub>=0.5 (Wilcoxon-Mann-Whitney@1%)
- The non-CDA auctions are all better than CDA
- D. Cliff. "Explorations in evolutionary design of online auction market mechanisms", Journal of Electronic Commerce Research and Applications. 2(2):162-175, 2003.
- Hypothesis: there are exploitable regularities in most markets, most of the time.

M1 only:  $Q_s = \sim 0.0$ M2 only:  $Q_s = \sim 0.0$ M3 only:  $Q_s = \sim 0.16$ 

MIM2 "shock": Q<sub>s</sub>=~0.25 M2MI "shock": Q<sub>s</sub>=~0.50 M2M3 "shock": Q<sub>s</sub>=~0.56 M3M2 "shock": Q<sub>s</sub>=~0.14

MIM2MI "shock": Q<sub>s</sub>=~0.51 M2MIM2 "shock": Q<sub>s</sub>=~0.50 M2M3M2 "shock": Q<sub>s</sub>=~0.58 M3M2M3 "shock": Q<sub>s</sub>=~0.52 MIM2M3 "shock": Q<sub>s</sub>=~0.56



#### That was just the start

- Replications and extensions by postgraduate students...
  - Zengchang Qin (Bristol, 2002) replicated & extended to pure English/Dutch auctions
  - Vibhu Walia (Birmingham, 2002) demonstrated evolution of hybrid auctions in ZI-C traders
  - Neil Robinson (Sussex, 2002) evolved hybrid auction mechanisms for MBC of UDC
  - David Shipp (Leeds, 2004) explored longer sequences of supply/demand shocks
  - Dan Wichett (Birmingham, 2004) explored co-adaptive dynamics of heterogeneous gene-pools
- Andrew Byde (HP) demonstrated GA-evolution of optimally hybrid n<sup>th</sup>-price sealed-bid auctions, regardless of intelligence of traders
- Dave Cliff (HP) developed new 60-parameter super-variant of ZIP traders
  - 60-dimensional hyperspace better than the original 8-parameter version
  - evolutionary control of dimensionality demonstrated to be beneficial
- See www.ziptrader.org and www.ziptrader.org/zip60; IEEE TransEC: 2008



#### New Scientist May 25<sup>th</sup>, 2002



TRADING PLACES: who needs people to do business?

lem. The idea is that for every set of trailing

conditions, there is an ideal marketplace, and

ir's this the GA seeks. It evolves by putting

a range of parameters through a series of

mutations until it maximises profit. For

example, Cliff's GA found that one of the

most critical factors is the number of

"traders" allowed to bid at any one time.

Today's markets use a system known as

a continuous double auction, where buyers

and sellers simultaneously yell offers at each

other, with the sellers slowly lowering their

asking prices and the buyers gradually

The GA found that the fittest market of

this sort was one that allowed three buyers

to make hids for every sell offer, generating

2 per cent more profit than a typical mar-

ket, in the real world, with trillions of dol-

lars percolating through the markets, this

small gain might translate into hundreds of

One enactal difference between the evolved

marketplace and a human one is that traders

have to reveal their maximum and mini-

mum prices to the auctioneer program,

though not to each other, before the mar-

ket can be set up for trading. This gives it

But this strategy would only work if

the information were kept confidential and

was known only to the marketplace itself,

says Lawrence Barwick, head of proprietary

trading at the Battk of America in London.

"If it's closed like that and everybody has

to play by the same rules then it could

Duncan Graham-Brown

key data on which to base its evolution.

hillions of dollars, says Cliff.

increasing their offers.

#### Market maker

Earn megabucks from natural selection

A STOCE market that's not only run by comparing hur designed by them how would generate hundreds, of billioms of dollary worth of exma profit for their human controllers. So says artificial intelligence exper David Cliff, who applied the principles of evolution to allow his obtwart in develop the toleal marketylace.

Cliffs software control a supper-suddion wer that can exchentrate buying and selling in a new type of stock mainter our schere the traders are all software-based agents. The date could even introduce an ethical dimension to trading. Cliff found that in his mark kerplace, tower people paid inflated prices and everyone was able to maintake profit.

Last year, New Scientist reported on research toom IIM which showed that offsware agents trading commodities such as precious metab or offse beam comperformed their human coasterparts, earning on avenue? Jee commore (1) August. 2001, p. 211, Orice of the software agents used in that experiment was developed by Cliff, who works at flewleft Packard's research lab in threst.

But Cliff found is odd that there software agonts were being thorhorned into computer models of mainseplaces designed by people for people. So he wit about designing a maskeeplace that is better suited to artificial beying and willing agents.

To do this, he designed a range of possible markets using software incorporating a genetic algorithm, a type of program, impleted by evolution. The GA user a process similar to narual selection to "evolve" continually urnil it reaction the best solution to a prob-

#### 25 May 2002 + New Scientist + www.rendcientist.com

#### Quantum foot in the door

ALL amound us are tiny doors that lead to the next of the Universe. Predicted by Enstein's expections, these government wormholes offer a faulte-than-light short not to the rest of the coarso- of head in principle. Now physicilla believe three sould open these doors wide enough to sites someone to travel through. Quantym comholes are thooght to

Quantum scalar than even protons and electrons, and unit now no one has modeled what happens when isomething passes through one. So Sean Howen at Earth Wennes University in Kerees and Has dis Shinkai at the Riken Institute of Physical and Chemical Research in Japan desided to do the same.

They have house that any nutter transfing through sids positive energy to the workshow. That suespectually subpressed in this a black hole, a supermassion region with a gravitational and so strong not news light can excapt. The there's a way to step any would be transfer being crushed into oblavor. And it less with a strange mergy field mechanisms' phote traditions is a suggive energy field that dampers normal positive energy. Similar effects have been shown engeriomatally to exist. Their tradition could therefore in

used to offset the positive energy of the traveling matter, the researchers have found. Add just the right encount and it should be possible to prevent the sometoid collegating—it bit more and the worshould could be sidened just encough for someours to pass through. It would be a disclose operation.

however. Add loo much negative energy, the scientists discovered, and the wormbole will briefly applied two a new universe that expends at the speed of light, mach as astrophysicits any cors dol momentary after the top bang.

For now, such space travel remains in the means of throught experiments, the CERN Large Hadron Collider in Southerstand is expected to generate over mini black hale per second, is potential source of weinhelds through which physicists could by to send quartumsized particules. But sending a person wendule be another thing. To keep the wendule be allerated by sould that a negative feel aquivalent to the every tat would be literated by converting the mass of Jupite. Duarties Chait New J. was an analyticity op.00001

work."

#### The Economist Nov 30<sup>th</sup>, 2002

The Economist November 30th 2022



#### The future's still not clear

 Intends national champion, by pushing Grein Lyonnais into the arms of Cardin Apricole Burk when Coldin Apricole Burk to pay 644 per share 6444, the lowest price her was pequented to accept, he lost patterno, and Parlba, the autoint's written, bid 6434 billion, or 62% a share, for the tailse, a sey president over the market value and a quarter more than the source contained a bar's bid document than there contained a up area.
 The lowers from the sudden sale are Cri-

The rootent and Carifa Lyoonasi's chief extensive, Jean Psyntheside. Having refused to pay 64.4 a share in a private deal, Carida Agricole importedly offered that amount in the public auction, only to lose. Part of the problem is that Chiefd Agricole's decentral ined, immutal structure makes it difficult for in-Tharons' is the countryside to agree on anything quickly.

Air Peyrnevade, who wants to keep his bask independent, has so far maintained what one Peench hanker calls a Sowet baance of power between the bank's biggest thareholders. As soon as one lecous too large, be courte airofder. This time though, hermiselactuated, uringing out him ringottations with Criefit Agricole to a point where Mr Mer mopped heliuving that the two hunths had any mel desire to menge.

Mr Peyrelevade now faces the likelyhood that sere Parihas or, itsis possibly, Sotishe Generalie, will bid for the whole of Criedit Evonatis once a shareholder pace designed upvetter the basin from takeover rinds at the end of June 2003. Ether hand would fold Criedit Evonatis's wholesale backing business into their own opentions. To zweid data, Mr Peyrelevade may have to run back to Criedir Agricole, which already owns to 5%, with more concluatory words to 5%.

For now, sore Parihas desies that it intends to buy the whole of Codelt Ipromain. But Michel Peberean, its individual promain is unlikely to have paid such a high prior for the stake unless he has designs on the whole. With Colds Eponnais in its grip, and Paribas would increase its share of the Prench retail banking market from \$5.10.14%.

One likely opposent of any such moves would be acts, the French insuitator subalitary of Germany's Alitary, which owers about 10% of Cifelit Internative Strench backers are pripating thermolyers for a battle to exho the one that Barque Nationale of Phris (awy, Pariha and Socialie Genfeale waged in 1999, which ended with new weating nonrote of Parihas. As one backer says. "Two Parihas is usually the witner."

#### **Robo-traders**

Pinancial markets

#### Computerised trading agents may help humans build better markets

THANKS to slumping markets, investment banks are shedding many of their highly paid traders. When markets recover, the banks might be sempted to replace them with rather chesper talent. One alternative has been around for a while but has yet to calch ot: autonomous trading agents-computers programmed to act like the human version without such pesky costs as holidays, hunch breaks or bonuses. Program trading has, of course, been done before; some blamed the 1987 stockmarket crash on computers instructed with simple decision making rules. But robots can be untarter than that. Dave Cliff, a researcher at Hewlett-Packard Laboratories in Bristol, England, has been creating trading robots for seven years. In computer simulations he lets them evolve "genetically", and so allowy them to adapt and fir models of real-world financial markets. His experiments have suggested that a redesign of some markets

#### finance and economics 77

#### ould lead to greater efficiency.

Last year, a ornearch group at take showed that Mr Cliff's artificial traders could considering best the human variety, in various kinds of marker. Nearly all take the shape of an auction, forweld known the shape of an auction, forweld anyown to the taglish auction, forweld anyown to the alsensooms of Christian's and Sotheby's, where sellers keep mum on their offer price, and huyers increase their bids by stages until only one emeatins.

At the other externs in the Dunch auction, familiar to xrth cornery fully tradess in the Nephritarile as well as to bidder site American Trassary bords. Here, buyers remain silent, and a softer reduces his price until it is accepted. Most markets for shares, cornorations, furging exchange and derivatives are a hybrid of these two types, buyers and softers can aeronous their hid or offer prices at any time, and deals are constantly being closed, a secalled "continuous double succion".

Mr Giff's revel idea was to apply his evolutionary computer programs to marlengiarcs themselves. Why not, he thought try and see what types of auction would let trades converge most quickly towards an equilibrium prior. The results were surprising. In his trodes, sourchors that let buyens and sellers hid at any timelace most of today's financial exchangeswere less efficient than ones that required relatively more bids from either huyers or sellers.

These "revolved surfaces" also withricod hig machen shocks, such as crashes and partice, better than today's real-world versions. Mr Chil's more recent sessies, which will be presented in Sydorps, surfaclia, on December rath, show that the best type of autorn for any machen depende rescally on even alight differences in the tumbler of Dyoper and selfers.

Bank of America has been investigaing these new auctions, along with robotic tradens, for possible tuse in electronic secharges. The hope is that today's financial auctions and online marketplaces, might work better by becoming mass like their Diglish and Dusch forebase. But what to call such multi-sthuic hybrid? Here's introducing the 'Odfharange'.





#### Financial News, 24 March 2005

"Algorithmic Trading has the potential to replace human traders completely, according to one of the scientists who pioneered the use of advanced trading systems in the financial markets. Speaking at last week's Financial News Trading for Investors conference in London, David Cliff, head of complex adaptive systems research at Hewlett-Packard, said:"I don't see why everything a trader does can't be done by a machine. I don't want to say when it will happen as the technology is not there yet."

http://www.efinancialnews.com/





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🙆 Internet

## The Trade, Jan-Mar 2005, p.30

"Traders under threat from rise of machines', screamed a recent headline in the Financial News. It seems a professor of complex adaptive systems who dresses like the bad guy in a Bond movie has been talking about traders being an unnecessary cost who can be replaced by algorithms."

Richard Balarkas, Global Head of AES Sales, Credit Suisse

http://www.thetrade.ltd.uk/cissue\_realitycheck.htm





#### HP Labs & London Stock Exchange

- Alas, NDAs mean I can say very little about this project
- I can tell you that I led the HP side of it from the outset



- Five years ago it was abundantly clear that:
  - The current wave of M&A activity in the exchange-operator space was coming soon
  - Algorithmic Trading & Automated Execution increasing very rapidly
  - New technology (e.g. Net/Web/DMA/STP) lowering barriers to entry for disruptive technologies, and for disruptive new companies
- Technology innovations could give LSE an edge
- HP Labs team worked with LSE's nascent R&D unit
- HP: global revenues of \$80bn p.a.; \$4bn R&D spend; \$200m of that on HPLabs; HP established in 1939 centralised innovation established at HP Labs in 1966
- LSE: a UK-based SME; significant revenue slice from data provisioning; enjoys accidental privilege of national monopoly status; R&D unit a recent addition in its 200yr history.

#### And then I became a banker...

- Joined Deutsche Bank London FX Complex Risk Group
  - Wondered when I would be shown the secret technology
- Started out on a tour around the trading floor on "rotation", learning what everyone did and how it fitted together: Spot & Derivs; Prop & Client; Trading & Sales
- Coming in as a techie, with expertise in Computer Science & AI, thought I would be able to help out a lot of folk by coming up with whizzy innovative solutions to their problems, but...
  - Dissatisfaction/distrust of technology was much higher than I expected
  - A lot of the solutions needed did not need a PhD to solve
  - A lot of the solutions needed did not actually need any technology innovation
  - My impression is that the above three points are true:
  - At many investment banks, not just Deutsche
  - And in <u>many</u> asset classes, not just FX



### Algorithmic Trading in Foreign Exchange

- FX is interestingly different from equities
  - No single central exchange pumping out price/vol data; still a lot of OTC
  - Massively liquid: \$1,900bn/day, 24\*7
  - Regulatory structure is <u>pleasantly relaxed</u> (verging on the non-existent)
  - Approx 2-3 years or more behind equities wrt uptake of algorithmics
  - Oh, and there's not much in the way of historical data. Really there isn't.
- Deutsche Bank London FX Trading Floor
  - biggest & best in Europe
  - 70% of DB London FX spot trades go through a single robot (>>£1bn/day)
  - <u>aggressively</u> developing more advanced technologies
  - My main job was to help improve the robot for high-frequency trading



# What I did at DB (I): Price Discovery



# • EBS screen (pre-ICAP)

#### • The whole curve





# Really Reality: Reuters FX dealing

cf Price "Ladders" showing a list of ~180 prices

- Reuters D2000-2 spot USD/DEM supply and demand cur internal order-book data (hidden by the GUI) – usually
- EBS must have this sort of data too, but their GUL es
- At DB, I worked on ways to recover the hidden curves from what EBS does show



• J. Danielsson & R. Payne "Measuring & explaining liquidity on an electronic limit order book: evidence from Reuters D2000-2". Manuscript, London School of Economics (2003). www.riskresearch.org

### What I did at DB (2): Execution Logic

- Pre-existing hand-coded "points" in strategy space
- Smooth interpolation between the points
  - generated stochastic "hybrid" strategies
- Not a million miles from what I had previously done on ZIP etc
- No pretty pictures, and no details here either ③



#### What I did at DB (3):Visualisation



FIG. 4: (Color) The Min the correlations between the years 1993 and 1994.

FIG. 11: (Color) Currenc June 2004. FIG. 12: (Color) Currency tree (MST) for a 2 week period in July 2004.





- All three of these areas still hold some interesting challenges
- Will come to some future research challenges in a bit
- But first: some observations on technology innovation...



#### Innovation at HP & DB: spot the differences

- Research & Development Process
  - HP:Well established processes & checkpoints; woven into the company's DNA
    - Recruit skilled scientists and engineers; separate paths for managers & techies
    - Innovation workshops & training in creative/innovative thinking
    - Mapping of Intellectual Property "landscape" and of business sector "ecosystems"
    - Patent Strategy Review Panels staffed by senior technologists
    - Execution is an issue: mañana, mañana...
  - DB: Often ad-hoc, accidental, introspection-based, suck-it-and-see
    - Recruit immensely bright and quick-witted talent, from diverse educational backgrounds
    - Lack of formal innovation process(es) gives great speed and agility
    - Execution is almost immediate: Is it done yet? Is it working? How much has it made?
- Performance/Effectiveness Timescales & Measures
  - HP: 20-year patent lifetime; delay on feedback means intangibility is an issue
    - "10% success bankrolls the 90% of failures"; plus a specific success, squeezing ink onto paper
  - DB: 3-month P&L driven; conservatism is favoured: better out than down



#### Innovation at HP & DB: why the differences?

- HP has, from its outset, been a technology company
  - Makes its money from excelling in particular technologies
  - The specific technology HP excels in has changed from decade to decade over 60yrs
  - Hewlett invented HP's first patent; the patent made the money; that set the trend
  - HP employment contract lays claim to all IP of its employees, now and forevermore
- Corporate/Investment Banks have traditionally not been technology companies
  - Successful CIBs excel in customer relationship management
  - Successful CIBs excel in innovation too, but not necessarily innovating technology
    - An innovation might be a new financial product; a new business model
  - My DB contract non-compete clauses, stated that on departure:
    - No stealing DB's customers
    - No poaching DB's staff
    - Er, that's it
- But technology is now inter-woven and on the critical path for all CIBs
  - CIBs are fast becoming technology companies, partially at least
  - even if they don't realise it yet



### Financial Times January 9th, 2007

Banks lay traps for copycats The starting pistol has been fired on the race to register financial patents. write Saskia Scholtes and Gillian Tett

INTELLECTUAL PROPERTY

growth of painting in financial services any is roundailocet of necker arms race is an our rate rates

dustry, those filling

 propertion dot dispar.
 Parks statement, disparse di disparse disparse disparse disparse disparse disparse dispar finding the formula the increasing complexity of financial instruments and trading options has sparred supports of patents

the 1960s." -

Beware the 'patent trolls' of finance

on & Taft, a UK

as an inter-

law firm. "The patent office has very limited resources

#### If you look at chemical compounds. it is clear what they are - but financial ideas tend to be amorphous'



#### Don't all rush at once

- Data from USPTO database of granted patents, June 2007, results of keyword searches:
- "algorithmic trading": 0
- "trading algorithm": 2
  - 6892186(HP), 5101353(Lattice); + 2 irrelevant
- "implementation shortfall": I
  - 7110974(Lehman).
- "volume weighted average price": 6
  - 7228289(Trading Tech.), 7110974(Lehman), 6462758 (Reuters); 6098051+6012046+5845266(Optimark).
- "automated execution"+"financial": 6
  - 7209896+7181424(Nasdaq), 7085739(Accenture),
     6112189+6098051+6012046(Optimark) + 19 irrelevant + 8 designs.



#### So why don't CIBs have Laboratories?

- Just because big companies like HP (and IBM, and MSFT, and Xerox, etc) have centralised research & development labs, doesn't mean that CIBs should too
- In fact, the idea of a central internal R&D Lab/function is starting to look distinctly last-century
- The new buzzwords on the Tech Innovation street:
  - Open Innovation
  - R&D replaced by A&D
- Attractively Darwinian
- R&D risk is borne by the investors in the start-ups
  - Not by the customers of the products
- Start-up exit strategy is acquisition by a gorilla
  - Not bubble-style IPO



#### A few examples from my time at Deutsche...



#### Flextrade FX Algo Platform





### Codefarm Automated Credit/CDO Structuring





#### Complexity Science for real: www.eurobios.com

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| Complexity Science 🗌   | Supply Chain<br>Management<br>&<br>Logistics  | R&D Project<br>Management<br>optimisation<br>Marketing & CRM<br>efficiency  | Risk Management<br>&<br>Predictive analysis                                       |                                      |
|  |   |   |   |                                      |
|  | Supply Chain Simulator (SCS)  | Project Portfolio Optimizer /<br>R&D  | Risk Simulator / Enterprise   | +                                    |



#### Oh, and Syritta Algorithmics too, one day...





#### The truth lies in the middle

- Rol for an industrial R&D Lab has time horizons way longer than are commonly acceptable in CIBs that culture will not change in a hurry
- But the basic practice of an R&D Lab can be incorporated into a CIB community, whether cash or dreivs, trading or sales, or any cross-product too
- What I call the "P-I-P-E-R" loop: Predict Invent Protect Exploit Repeat
  - Anticipate/guess at likely future scenarios
  - Imagine the opportunities and problems in those scenarios
  - Plan to exploit the opportunities, and to avoid/ameliorate the problems
  - Protect the intellectual property/capital thereby generated
  - Exploit get your Rol
- This takes practice/training, but it is way cheaper than setting up Central Labs
  - If you are practiced/trained, you can better evaluate the offerings of A&D innovators
- It's this practice of technology innovation that students should get educated in



#### Some predictions for the next few years

- "Semantic web" machine-readable semantic tags on ticker news-feeds and real-time Natural Language Processing on time-based media (voice channels, video feeds) combine to allow algo trades to be triggered/modified by text/voice/video data
- Algorithms structuring & executing cross-asset trades on basis of searching vast databases for high-order nonlinear correlations will become the de facto norm
- "Arms-race" co-adaptive dynamics in algorithm sophistication continues to drive up complexity of algorithms; so hand-design gives way to machine-design & optimization
- Barriers to entry continue to lower: plug-and-play piping & interfaces & algos & services
- Speed & Latency:
  - Co-location "proximity servers" give way to direct hosting on exchange servers
  - Algorithms move into silicon (FPGA, ASIC, etc) for nanosecond execution
  - Exchange API via a motherboard/backplane (...leading to stochastic polling?)
- Trader Interfaces: "ungameability" (impact-reducing obfuscation) is a hot topic
  - More sophistication needed to for X-asset "battlefield command" "head-up display"



## When you have HPC/Grid/Utility capacity...

#### You can do this...



...and then wrap a GA around it?



# Trader HUD/UUI

- Human traders will be around for several more years
- But the job could get <u>much</u> more complex
- The trader's human-computer interface is an area <u>ripe</u> for productive innovation
  - numeric tickers & spreadsheets not enough
- Lots of numeric data can instead be combined into dynamic graphic displays
  - with audio warnings
  - maybe with haptic input/feedback
- It's easy to get this sort of stuff very wrong
- Combat aircraft could hold some clues...





## Trader HUD/UUI





### Good interfaces <u>support</u> good people...

#### ...they don't replace them





St Andrews: Market-Based Systems — Copyright © 2007, Dave Cliff

#### New Scientist June 2<sup>nd</sup>, 2007

# Where have all the traders gone?



Time is running out for Wall Street's high rollers. A new breed of traders is muscling in. former Wall Street trader, he should have felt says Robert Matthews

at home amid all the screens, phones and bustle of billions of dollars in trades. But that was just it: there wasn't any bastle. In fact, there were hardly any traders. "You could hear a pindrop," he recalls. Then it sank in: machines had taken over the role of people and computer servers don't make any noise. There's a guiet revolution happening all over the financial world. Gone are the days of Gordon Gekko lookalikes screaming obscenities and dumping a loss-making stock onto an unsuspecting market. Investors have realised that the processing speed and sheer volume of trades a computer can make can help them to outwit the sharpest of dealers. As a result, they are investing heavily in what has fast become an arms race between investors. Their goal is to develop the best "algorithmic trading" systems - software that helps decide which trades are the most profitable, and then does the deals. Ten years ago, algo-trading was almost non-existent, but according to a recent report by Bailey, now at the Boston-based consulting firm Alte Group, one-third of all trading decisions in US markets are now made by machines. He predicts that by 2010 more than half will be done this way. At Deutsche Bank in London, over 50 per cent of a category of foreign currency trades, called "spot trades", are now carried out without human Intervention every day. All this will have an

RAD BAILEY was visiting the trading

oor of an investment bank in New

York City when he first noticed it. As a

"70 per cent of foreign currency trades are carried out without human intervention"

impact on more than just high-rolling investors. Even if you don't own any shares you can bet that millions of those owned by your pension fund are already being bought and sold using "algo" trading techniques.

It's not hard to see why algorithmic trading is so attractive. Machines can make multiple trades, monitor thousands of stocks and do it all at breakneck speed. Crucially, they can do it without anyone noticing. There are big profits to be made in buying and selling shares that other traders haven't yet realised are being lucratively traded. The more discreetly you can do this - by spreading the deal over lots of small trades, for example - the less likely other traders are to wake up to the opportunity and dilute your profit potential. Such discretion is near impossible for a

human, as it requires constant monitoring of the market to make sure your trades don't alter stock prices in an unfavourable direction. These algos slice up big transactions, then

As a result, investment houses are becoming increasingly tech-savvy. Eavesdrop-on traders today and you are more likely to hear talk of "low latency access" (which we'll get to later) than of what they'd like to do to a rival's neck. "Anyone who's been on Wall Street since

the early 1990s will have had to reinvent themselves," says Batley. Back then, success as a trader hinged on an instinct for what the market was "thinking", plus reactions fast enough to make the most of the opportunities the market presented. In the early years of computerised trading, when machines were simply communication tools, hitting a key a few tenths of a second faster than a competitor could make a real difference to your profit margin. Nowadays human traders straggle to keep up. "Silicon is taking over from carbon on Wall Street," says Balley, as beige boxes proliferate across trading floors. Computers have the edge over humans in

many ways. Take something as simple as reaction time. When a human trader sees a stock change price, he might react in a few hundred milliseconds. A computerised trader is at least 10 times faster: depending on how much you are willing to fork out to speed things up. A few hundred milliseconds ssight seem insignificant, but if the price changes by a fraction of a per cent in the split-second before a trade worth many millions, it could mean a swing of tens of thousands of dollars. The key for any trader is "low latency" market access - that is, minimal delay between placing an order and seeing it fulfilled.

To achieve this, traders naturally have ultra-fast software, running on top-of-the-line computers with the very best processors and mentory capacity. But there is a more direct, and perhaps less obvious, way to speed things up: moving closer to the source. Trading companies pay top dollar to snuggle their servers as close as possible to those of the stock exchange. With access to such "proximity servers", their electrons can beat those of their rivals to the punch. Last year one of the biggest hitters in the algo-based trading world, Deutsche Bank, paid an undisclosed sum to proximity server supplier BT Radiana to shave milliseconds off its trading times. Stealth-trading is another area in which

machines have the upper hand. For example many of the leading brokerage firms now have computers running so-called volumeweighted average price (VWAP) algorithms

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#### Bloomberg Markets, June 2007



Kearns, a computer scientist who has a doctorate from Harvard University, says the code is part of a dream he's been chasing for more

PHOTOGRAPHS BY BRAD TRENT



### Euromoney Algorithmic Trading, July 2007

### My family and other algorithms

by Professor Dave Cliff, University of Bristol

In the summer of 1996, I invented a trading algorithm that outperforms human tradders. The algorithm, known by the acronym 'ZIP' (for zero-intelligence-plus) is embarrassingly simple. Being very simple makes ZIP very fast, which, nowadays, with major players running their algorithmic trading operations on proximity-servers huddled as close as physically possible to the main servers on major exchanges, is a notable point in ZIP's favour. Another thing that makes ZIP attractive to many people is that you can use it for free (and I've been told that some major algo houses do exactly that) full details of the algorithm, including the 'C' source-code, were published on the web in 1997 and have been available there ever since.

In the to years since it was invented, other algorithms have come along to challenge ZIP; but over the same period I've been involved in the development of various extended versions of the original ZIP - there is now a whole family of ZIP algorithms, and the original has been re-christened 'ZIP8' (for reasons that will become clear later). This family of extended ZIPs demonstrate significant improvements in performance, with little or no increase in latency. The most recent of the ZIPs to be given away for free goes by the name of 'ZIP6' o'. I will come back to ZIP60 later.

#### ZIP - the basics

In 1996 I was working as a lecturer in computer science and artificial intelligence at the University of Sussex, and supplementing my meagre academic salary by day-trading equity options on LIFFE, the main London futures exchange. The good folk at Hewlett-Packard labs in Bristol offered me a seven month stint working with them as a visiting academic, and told me that I could come up with my own research project for my stay there. In those days, trading at LIFFE was still based heavily on face-to-face open-outcry trading



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CHAPTER 00 | EUROMONEY HANDBOOKS



#### New Scientist June 2<sup>nd</sup>, 2007

limit the amount bought and sold in each trade to a specified proportion of the total value of trades in those stocks on that day. The idea is to avoid drawing other traders' attention to what you are doing, and so prevent rivals getting in on the act.

Or at least that's how it used to be, until the Darwinian imperative kicked in. "At the start of the decade, if you used a simple slice-anddice program, you got a big improvement in trading performance," says Richard Balarkas, an algorithmic-trading expert at Credit Suisse in London. Now those big improvements have evaporated. People started using monitoring algorithms to spot trades where, for example, someone was selling 5000 shares every 15 minutes, he says. "It's what we call 'signalling risk', and it has become a real issue. Other people can make money from working out what you're trying to do."

#### Arms race

As a result, the arms race has accelerated Pattern-spotting software now looks for signs of algos trying to sneak their transactions. cento the market, and studies the size of the transactions to make a guess at what's coing on. That in turn has led to the development of algos which create smokescreens by combining their transaction strategies with a small amount of randomness in, say, the timing of the trades.

This particular arms race now seems to be heading towards some kind of stalemate, driven by the fact that there's a limit to how arnall and apparently random a transaction can be. "It's getting to the point where there is so much noise that it's going to be hard to detect. market opportunities," says Balarkas. And that is pushing algo traders to find new ways of reaching their ultimate goal: "adding alpha",

Everyone has heard the stories of kids sticking pins in stock market listings and outperforming Wall Street's finest. There is a solerns truth behind such aneodotesinvestment managers who try to beat the market with their cunning usually fail. According to David McCraw of Aberdeen Asset Management, based in Edinburgh, UK, two out of three investment managers secured woese returns than those achieved by tracker funds that automatically follow the overall market. In the jargon, these managers fail to add "alpha"- roughly speaking, the measure of extra return on investment achieved. immained to a tracker.

Being able to predict where the market is heading would be one way to beat the trackers - but that is easier said than done. 'Any pension fund trader will have hundreds of trades to make, and there's an awful lot of Information to assimilate," says Balarkas. "It's

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Balarkas says human traders will still have plenty to keep them occupied, for the time being at least. "People who think computers are going to put them out of business really don't understand traders," he says.

of 'dark pools o really impossible to expect of analyse it all equipped with ju reorptors, two aural receptors

Traders now ve

from the beate

Human traders are increasingly relying on computerised sidekicks to bell all the data down to a "buy" or "sell" punchline.

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Another strategy for stealing a march on trackers is to look for signs of "liquidity" - the presence of buyers and sellers for particular stocks, which opens up a chance to trade. As before, there's scope for cunning. Trade too eagerly, and you could ruin the price, wait too long and the window of opportunity will slam shut as others beat you to it. This has led to the emergence of "sniper" algos, which wait for a suitable buyer or seller to emerge and then conduct the trade as fast as possible, before the price can be affected by other traders.

The obvious place to find such liquidity is in the big stock markets of London and New York, Looking in the obvious places, however, pools of liquidity". These are groups of buyers and sellers trading specific stocks in markets outside the mainstream exchanges. "If the big stock markets are the equivalent of regular stores, these dark pools are like ellay," says Batley. "Around 15 per cent of US esarket liquidity is hidden away in them." Algos are being designed that go "fishing" in the dark pools, dangling small numbers of shares in the markets like bait. The speed with which they get snapped up indicates the liquidity level and the likelihood of profitable trading.

As with much else in algo-trading, implementing this simple idea is getting harder all the time as the competition. between financial institutions for custom increases with Darwinian relentlessness. "As soon as one bank has a system significantly University and founder of Spritta, a UK-based consultancy firm that develops algo-trading software. Banks are finally realizing it's the only way to preserve their profit margins.

Some banks are trying to protect their algos using patent and copyright laws, but they can do little to hold back the real driving force for change: the continued battle for supremacy in which only the fittest algos survive. So instead of trying to deny the inevitable, some programmers are turning to evolutionary concepts for inspiration in designing new algos. Cliff is one of them. In the mid-1990s, he designed one of the first commercially successful algos. It didn't make the decision about when to buy or sell, but in experiments where human traders were pitted against his system it turned a bigger

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of the para is that you're also th information," he says. Insta different parameter values and exathem, looking for clues as to why some work better than others. On some days it turns out that only a handful of the 6ct values are really needed to get the algo to work well. All this requires truckloads of computing power and investment banks just cannot get enough of it. Much of it is hired from companies offering metered access to glant computer clusters, but going - we have people, and they are still in many banks it's not unusual to see desktop PCs pressed into service, running trading analysis programs whenever they fall idle. For the company's most treasured algorithm processing, the number-crunching is done on Aston University, Dirmingham, UK

The

ore unleashing the algo upon 's rather like the fly-by-wire the latest fighter aircraft, The pilot can only instruct rm manoeuvres that the ill tolerate." nan traders will still have occupied, for the time nnty to k being at least. "People who think computers are going to put them out of business really don't understand traders," he says. "We don't have algos that predict where the market is much better at it." The guestion is, for how much longer? .

Robert Matthews is visiting reader in science at

Meet and more investors on the 22 financial exchanges are relying on algorithmic loading infimite to tell their when its key and will their shady and shares

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ware presidential and

#### End of the road for human traders?

- Human traders are just humans; humans are just animals
- Animals are the result of 4 billion years of trial-and-error evolution;
- For 99.9999% of those 4bn yrs
  - humans and their ancestors were **not** evolving to become traders
  - Rather, they were evolving to satisfy the Four Fs
- For last 2000/200/20 years humans have tried to adapt to trading in markets
- But we humans are **not** purpose-built to trade...

...we're limited in speed and in bandwidth; and trading just keeps getting harder/faster/higher-bandwidth

- ZIPs (and other "robot" traders) are purpose-built to trade; this gives them a distinct advantage
- No convincing argument in principle for why human traders could never be replaced by machine traders, but the technology isn't quite there yet



# If you won't believe me, will you believe IBM?

#### "The trader is dead, long live the trader!"

- 20-page IBM Consulting (+EIU) report from www.ibm.com/services/fm2015
- "Power will shift from the traders who have benefited from merely facilitating transactions, to the buyers & sellers who take positions on either end of the trade..."
- "Transparency and speed are driving firms to develop a true client orientation and optimize risk/return efficiency, and are pushing them to become specialist enterprises – a task that will require a conscientious approach to innovation and significant modification of their operating models."





### The Joker's Prerogative: question authority

"Traders who think computers ARENT going to hugely change their business really don't understand technology"

J, TOR





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#### Summary

- Market-based systems are worth knowing about.
- Know you know everything that I know.



#### Thanks

- Collaborators, Colleagues, Competitors
  - At HP: Andrew Byde, Janet Bruten, Steve Gjerstad, Chris Preist, John Cartlidge
  - At MIT: Rod Brooks, Jake Beale, Won-Suk Chun, and the FABLab UROPs
  - At London Stock Exch: David Birch, Howard Miller, Laura Pandit, Tom Stenhouse
  - At Deutsche Bank: Tony Hall, Gio Pilliteri, Rhomaios Ram, Phil Wood.
  - At Southampton: Nick Jennings, Krishnen Vytelingum
  - The IBM guys
- At St Andrews:
  - Ian Sommerville for the invite & hosting
  - You lot, for listening. 🙂

