

# How to Build an Effective Trading System

(and Build Confidence that It Will Be Profitable)

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# Disclaimer

- This is an educational presentation
- The purpose is to explain the author's method for developing trading systems
- This is not a trading system presentation
- Neither the author and presenter, Howard Bandy, nor the conference organizer, NAAIM, is liable for losses resulting from application of techniques described in this presentation

The Problem

The Solution

Practical Implementation

# The Problem

- Will the newly developed trading system be profitable when traded?
- How confident can we be?

# The Solution

- In a word –
  - Practice
- In more detail –
  - Tomorrow is out-of-sample
  - Study simulated out-of-sample trades made by the system
  - Every transition from in-sample to out-of-sample increases our confidence
  - If the out-of-sample results are satisfactory, trade the system

# Our Premises

- Mechanical systems
- Markets are somewhat inefficient
- We can detect patterns in historical data that precede profitable opportunities
- Those patterns persist long enough to make profitable trades

# Lord Kelvin - 1891

“When you can measure what you are speaking about, and express it in numbers, you know something about it; but when you cannot measure it, when you cannot express it in numbers, your knowledge is of a meager and unsatisfactory kind...”

# Trading System Development

1. Define the objective function
2. Decide what to trade and how to trade it
3. Design the trading system
4. Determine the in-sample period
5. Determine the out-of-sample period
6. Decide what to optimize
7. Perform walk forward runs
8. Evaluate out-of-sample results
9. Trade the system
10. Monitor the results



# Defining Best – Objective Function

- Psychology of trading experts have it backwards
- Cognitive dissonance
- Start by identifying what is important to you
- Create an objective function that incorporates those features
- Use this to compare alternative systems

# Defining Best – Objective Function

- A function that gives single-valued score
- A measure of the system
- Incorporates important features
- Score is reported for every test run
- Will be used during walk forward
- You select the objective function
- Take your time and get it right
- Don't start designing and testing without it

# What is Important?

- Drawdown
- Annual percentage gain
- Holding period
- Trading frequency
- Exposure
- Expectancy
- Equity smoothness
- Percent winners
- Win to loss ratio
- Recovery
- Thoughts from the audience

# Drawdown

- In a single trade, it is the maximum amount of loss at any time, relative to the best price
- In a system, it is the maximum decline in the account's equity at any time, measured from maximum equity up to that point
- Drawdown is probably the single most important metric – excessive drawdown is the most common reason traders stop using a system
- Given a smooth equity curve, add leverage as desired to the point where drawdown becomes limiting

# Expectancy

- Expectancy is the amount or percentage that is gained or lost by the average trade
- $\text{Expectancy} = \% \text{ winners} * \text{average profit per win} + \% \text{ losers} * \text{average loss per loss}$
- Expectancy must be positive
- No money management scheme can turn a system with negative expectancy into a winning system
- Poor money management can turn any system into a losing system

# Objective Function Choices

- Net Profit
  - Often the default
  - Usually a poor choice
- Reward equity growth and equity smoothness
- Penalize drawdowns
- Examples:

K-ratio

CAR/MDD

Ulcer Performance Index

RAR/MDD

# Good Objectives

- Specific; Measurable; Realistic
- “My goal is to make a 15% annual profit trading common stocks, control drawdowns, cherry-pick trades, hold about one week, and be tradable without interfering with my day job.”

# Translated

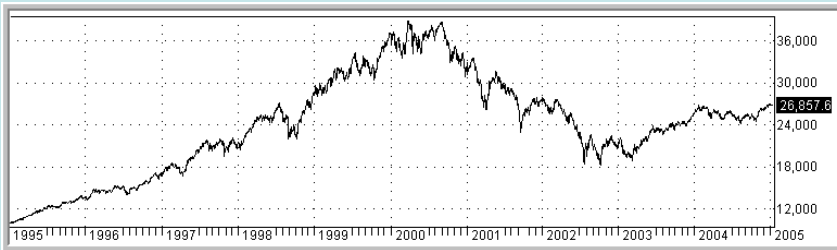
- Compound Annual Return  $> 15\%$
- Maximum System Drawdown  $< 15\%$
- Exposure  $\sim 30\%$
- Holding 3 to 7 days
- Use end-of-day data
- Evaluate in the evening
- Trade Market on Open



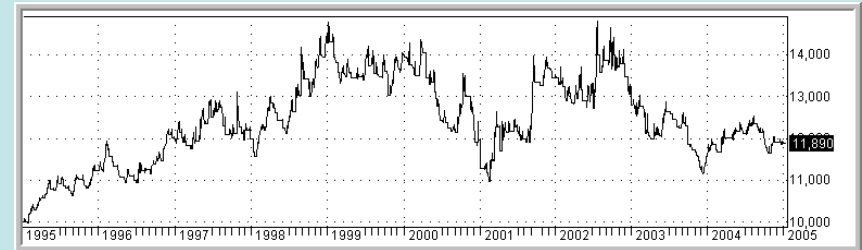
# Verify Your Objective Function

- Choose metrics that best fit your trading style and personality
- Run some optimizations
- Plot the equity curves of several variations
- Sort the results into order by ObFn
- You should prefer them in order by ObFn
- If not, modify the objective function until they are ranked correctly
- Will be used during walk forward

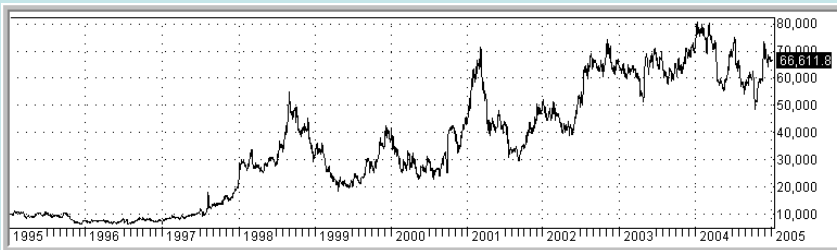
# Typical Equity Curves



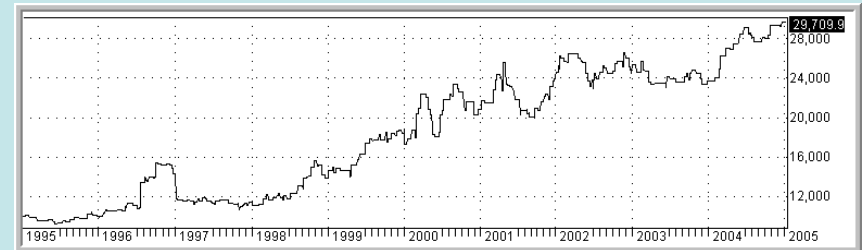
Buy and Hold



Breakout



Reversal



Cherry Pick

# Data and Issues

- Historical data for backtesting
- Current data for trading
- Liquidity
- Price reasonable
- Data cleanliness
  - Bad quotes
  - Unadjusted splits, distributions, restatements
  - Visual inspection
  - Consistency

# About Financial Data

- It is non-stationary
  - Cannot be made stationary
  - Autocorrelation is very weak
- Data = trends + cycles + patterns + noise
- Trading system is designed to recognize some signal portion
- Low signal to noise ratio
- Noise is everything the system does not model

# How to Trade

- End-of-day, intraday
- MOO, MOC, limit orders, stops
- Single issues
- Portfolios
- Position size
- Risk management

# Models and Modeling

1. Build a model
  - Trial and error
  - Deduction (reasoning)
  - Induction (analysis of data)
  - Loop of
    - Conjecture
    - Experiment
    - Observe
    - Modify
2. Validate that the model represents signal, not noise (out-of-sample testing)
3. Monitor to determine whether the model and the underlying are in sync (statistical tests)

# Models and Reality

- Our trading models are static
- The reality we are trying to model is dynamic
- Our hope:
  - We can build a model of the data,
  - That recognizes some inefficiency,
  - And use that model to trade profitably,
  - As long as the model and reality stay in sync.

# What to Model – Something Easy

- Sector ETFs
- Sector Mutual Funds
- Indices
- Industry Monitor ID Groups
- Custom Indices (AddToComposite)
- Beware survivor bias



# Survivor Bias

- Companies that fail disappear
- Mergers and acquisitions change the characteristics of companies
- Companies currently in a list, group, fund, industry, or index may not have always been there
- Others that used to be members may be missing


# What to Trade – Something Profitable and Liquid


- Stocks, funds, ETFs, futures
- Single issue
- Portfolio
- Model one thing – trade another

# Liquidity

- \$100M per day
  - 500 issues
  - 300 of the S&P500
  - \$0.01 – \$0.02 spread
  - Very few gaps on 1 minute chart
- \$20M per day
  - 1500 issues
  - \$0.01 - \$0.04 spread

# 50 Most Liquid Issues

Ticker	Date/Time	Liquidity 
SPY	1/25/2008	37,112,352,768
QQQQ	1/25/2008	9,951,163,392
AAPL	1/25/2008	9,467,742,208
IWM	1/25/2008	8,113,359,872
EEM	1/25/2008	4,033,025,280
GOOG	1/25/2008	4,032,880,128
XLF	1/25/2008	3,451,907,584
C	1/25/2008	3,276,669,440
MSFT	1/25/2008	2,844,540,672
RIMM	1/25/2008	2,800,754,176
DIA	1/25/2008	2,586,996,736
BIDU	1/25/2008	2,570,369,536
XDM	1/25/2008	2,460,446,976
INTC	1/25/2008	2,372,244,224
GS	1/25/2008	2,351,161,344
XLE	1/25/2008	2,021,823,744
BAC	1/25/2008	1,979,942,400
CSCO	1/25/2008	1,759,962,240
GE	1/25/2008	1,740,475,648
QID	1/25/2008	1,677,708,544
SDS	1/25/2008	1,583,930,368
FXI	1/25/2008	1,558,116,736
JPM	1/25/2008	1,536,514,048
OIH	1/25/2008	1,492,351,872
MER	1/25/2008	1,492,062,976

Ticker	Date/Time	Liquidity 
T	1/25/2008	1,327,251,584
FCX	1/25/2008	1,281,904,768
EWZ	1/25/2008	1,280,348,800
FSLR	1/25/2008	1,275,334,272
SLB	1/25/2008	1,230,756,480
WMT	1/25/2008	1,218,315,520
IBM	1/25/2008	1,196,087,680
COP	1/25/2008	1,193,484,288
EFA	1/25/2008	1,163,523,712
PFE	1/25/2008	1,163,429,632
CVX	1/25/2008	1,146,711,424
WFC	1/25/2008	1,109,311,104
MO	1/25/2008	1,078,918,784
MON	1/25/2008	1,073,577,600
RIG	1/25/2008	1,072,584,064
MRK	1/25/2008	1,054,499,648
WB	1/25/2008	1,038,890,496
AIG	1/25/2008	1,026,049,856
JNJ	1/25/2008	1,014,584,960
POT	1/25/2008	1,006,471,808
GLD	1/25/2008	999,926,336
HPQ	1/25/2008	995,904,192
ORCL	1/25/2008	974,322,944
MDY	1/25/2008	973,041,088
QCOM	1/25/2008	969,858,496

Daily average dollar volume for 20 days in early 2008

# Profitability

- Model XLF
  - Run ZigZag.afl to see potential
- Trade components
  - Use WatchList XLFComponents
  - Run XLFComponents.afl to see potential
- XLF is easier to model
- The components are more profitable to trade

# XLF ZigZag



# XLFComponents.afl

```
// XLFComponents.afl
//
// This AmiBroker program uses the ZigZag function
// to give perfect buy and sell signals based on the
// S&P Sector, XLF.
//
// To use this system,
// 1. Analysis >> Automatic Analysis
// 2. Pick >> select ZigZag.afl >> Open
// 3. Set the Watchlist to XLFComponents
// 4. Back test >> Individual Backtest
//
// Note that about half the components are
// more profitable than XLF itself when traded.
// using the signals computed from the XLF data.
//

// Take signals from the ticker XLF
SetForeign("xlf");

// Analyze using the Closing price
PricePoint = C;

// Set the ZigZag Percentage
Percentage = 10;

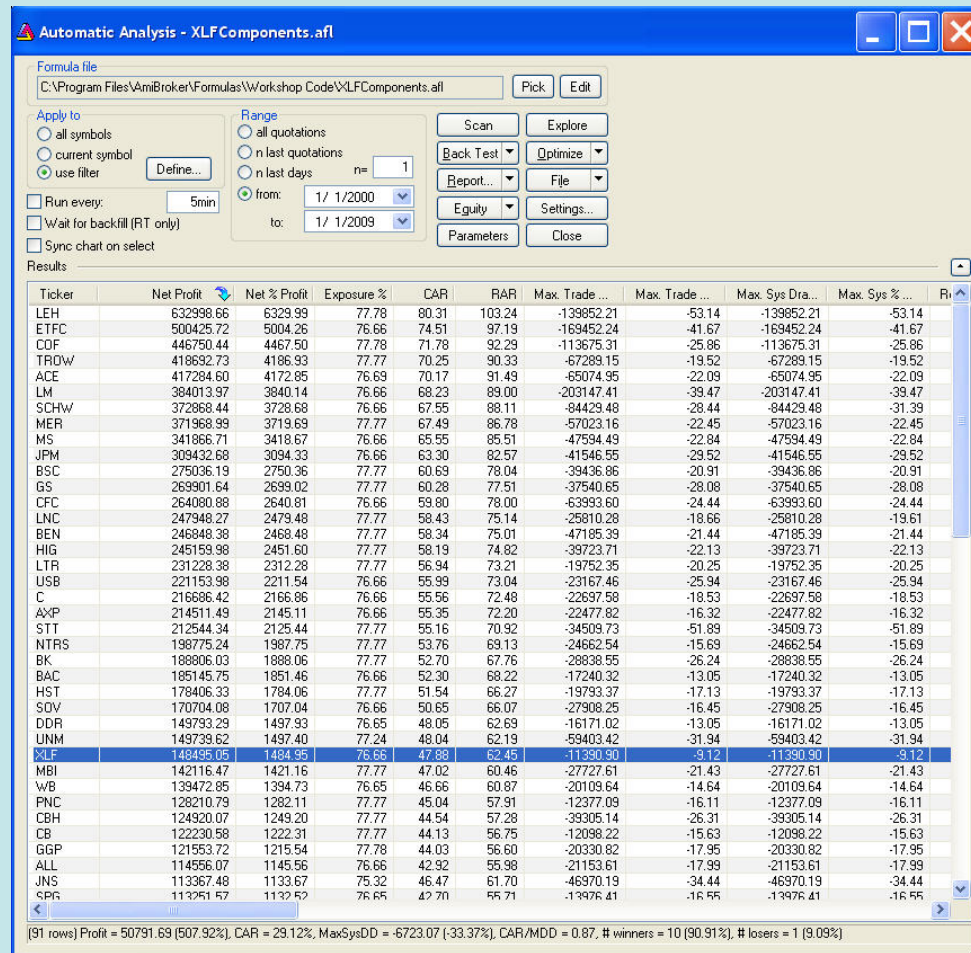
Z = Zig(PricePoint,Percentage);
Buy = Z<=Ref(Z,1) AND Z<=Ref(Z,-1);
Sell = Z>=Ref(Z,1) AND Z>=Ref(Z,-1);
Short = Sell;
Cover = Buy;

RestorePriceArrays();

// Take trades on tickers in watchlist.

Plot(C, "C", colorBlack, styleCandle);
PlotShapes(shapeUpArrow*Buy, colorBrightGreen);
PlotShapes(shapeDownArrow*Sell, colorRed);
Plot(Z, "Z", colorRed, styleLine|styleOwnScale);
```

# Trading XLF Components





# Creating a system

- A model is a combination of:
  - One or more entry methods
  - One or more exit methods
- A trading system is a combination of:
  - One or more models
  - One or more data series

that, together, give buy and sell signals for some tradable issue or portfolio.

# Types of Systems

- Trend following
  - Breakout
  - Moving average
- Mean reversion
- Pattern
- Seasonality
- Cycle
- Others?
- Every trade is a trend-following trade while you are in it

# Entries

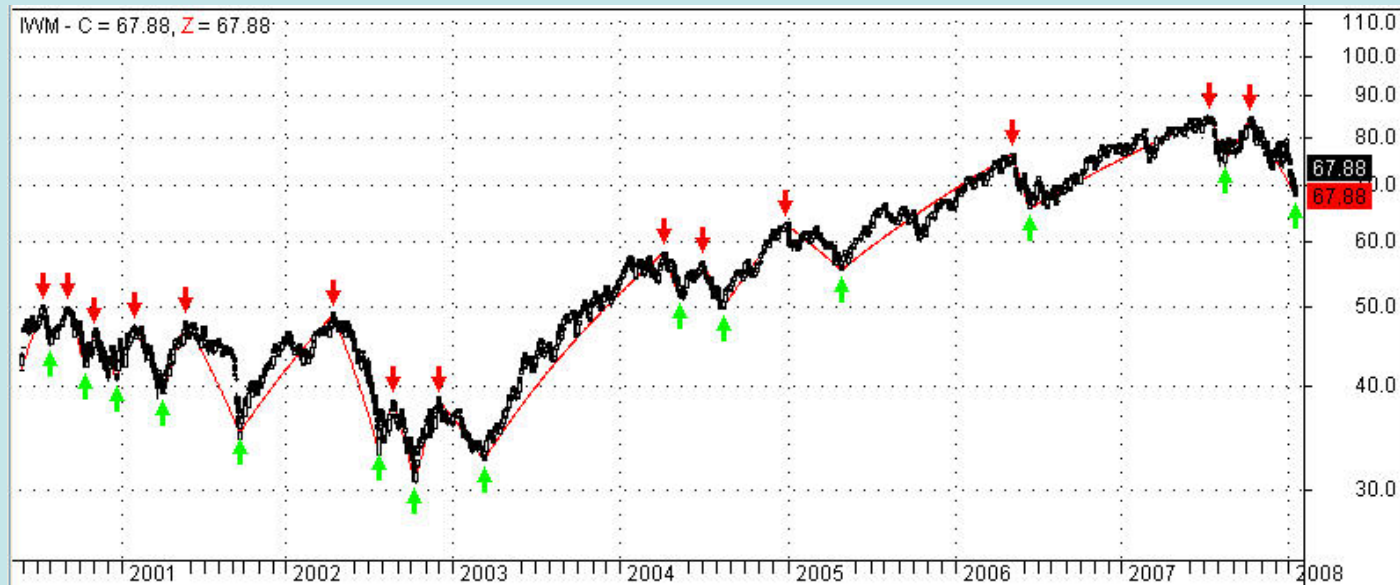
- Signals
  - Indicators
  - Patterns
  - Seasonality
  - Cycles
- Setups
- Filters
- Random – for comparison

# Exits

- Signals – Indicators, patterns, seasonality, cycles
  - Same as entry – other direction
  - Same logic – different parameter values
  - Different logic
- Timed holding period
- Profit target
- Trailing stop
- Maximum loss stop

# Indicator Exits

- Indicators introduce lag
- No need to be symmetric
- Rises look different than falls



# Stops are Not Reasons to Sell

- Best exits come from signals and indicators
- Mean reversion (short holding periods) – profit targets and timed holding periods
- Trend following (longer holding periods) – trailing stops
- Maximum loss stop is for emergency protection only
- Stops hurt systems

# Short Holding Periods

- Advantages:
  - Drawdown increases as square root of holding period
  - Allows selective trading
  - Gives many trading opportunities
  - Tighter distribution of trade results
  - More data points for statistics

# Short Holding Periods

- Disadvantages:
  - Increased trading
  - Higher commissions
  - Tax consequences
  - Fund restrictions
  - Portfolio restrictions



# Terminal Relative Wealth

- The value of a trading account after some time, expressed as a ratio to its starting value
- Depends on exactly two numbers:
- $TRW = (1+e)^n$ 
  - e == expectancy as a decimal fraction
  - n == number of trades
- (Drawdowns may vary considerably)

# Code Signals First, Then Stops

- Begin by coding your entry
- If you use more than one entry, test each separately
- Add your exit using logic appropriate for the type of system
- If you use more than one exit, test each separately
- Add stops only for protection

# Reality Check

- Be certain the system is tradable
  - All the data is available when you need it
  - There is enough time to compute signals
  - Assumptions about liquidity and slippage are realistic
  - No future leak

# Brains? Or Bull Market?

- Beware of long-only systems in strong bull markets
- Safeguards:
  - Look for profitable shorts
  - Look at periods or tickers when price is flat or falling



# Simulated Trading

- An automated series of:
  1. Evaluate alternatives in-sample
  2. Select the best alternative
  3. Simulate trading out-of-sample
- Move forward in time and repeat steps 1, 2, and 3
- If out-of-sample results are satisfactory, trade the system

# In-Sample

- In-sample – the period of time (and the data and trades associated with it) where the alternatives of logic and parameter values are evaluated
- In-sample results are always good
- In-sample results have no value in estimating the future performance of the system

# Out-of-Sample

- Out-of-sample – the period of time (and the data and trades associated with it) where the trading system is tested on data it has never seen before
- Immediately follows the in-sample period
- Caution – making decisions based on out-of-sample data results in that data becoming part of the in-sample data

# In-sample – Out-of-sample





# In-sample Period Length

- How long should the in-sample period be?
- Opinions include:
  - A long time period
    - Pro: Include many different conditions
    - Con: Cannot accurately model everything
  - A short time period
    - Pro: Stay synchronized with current conditions
    - Con: Learn noise instead of signal
- Experiment
- My recommendation – as short as practical

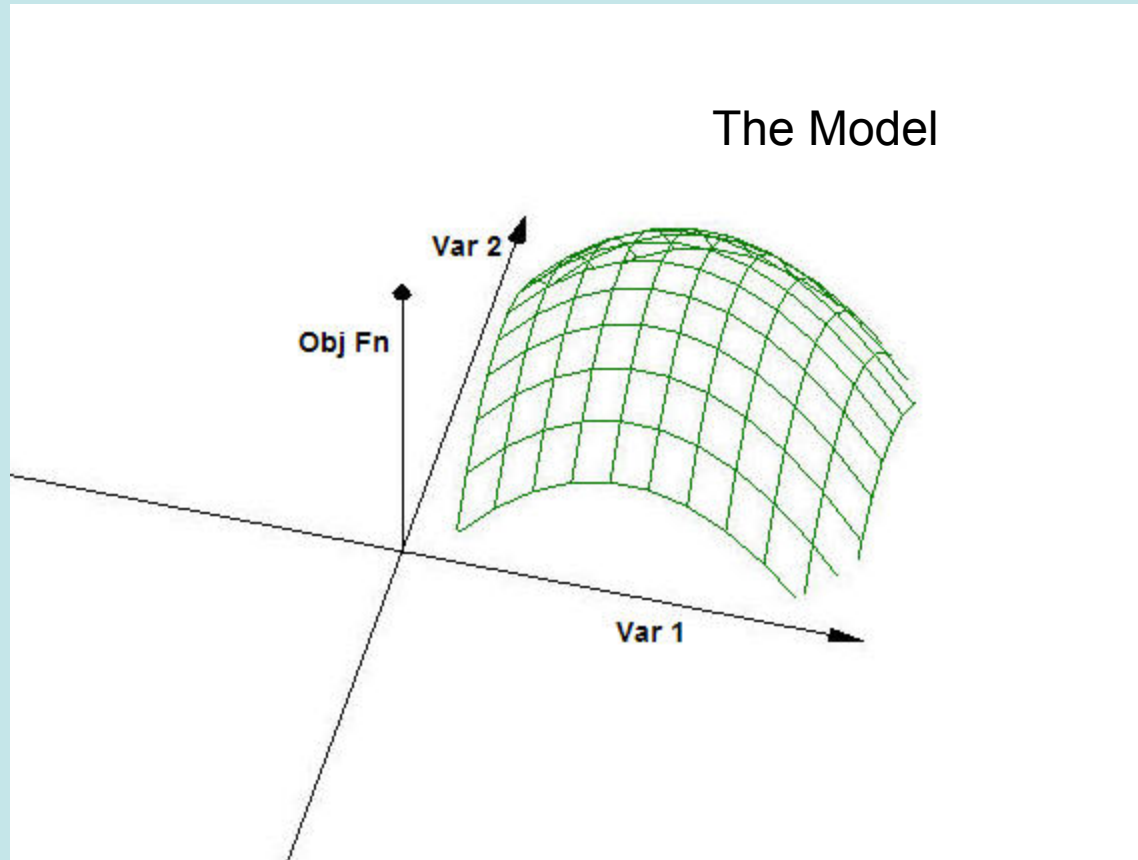
# Out-of-Sample Period Length

- As long as the model and the market remain in sync
- Unrelated to length of in-sample period

# Optimization

- A search for the best values for logic and parameters
- Any time two or more alternatives are considered, you might as well consider thousands
- Rough runs to determine ranges
- Thorough runs to locate maxima

# Which Way is Up?



# How to Optimize

- One dimension at time
  - Takes less time
  - Can get stuck
  - Finds local maxima
- Multiple dimensions
  - Exhaustive search
  - Long runs
  - Detect interactions and global maxima
- Use preliminary runs to select the range

# Reoptimization

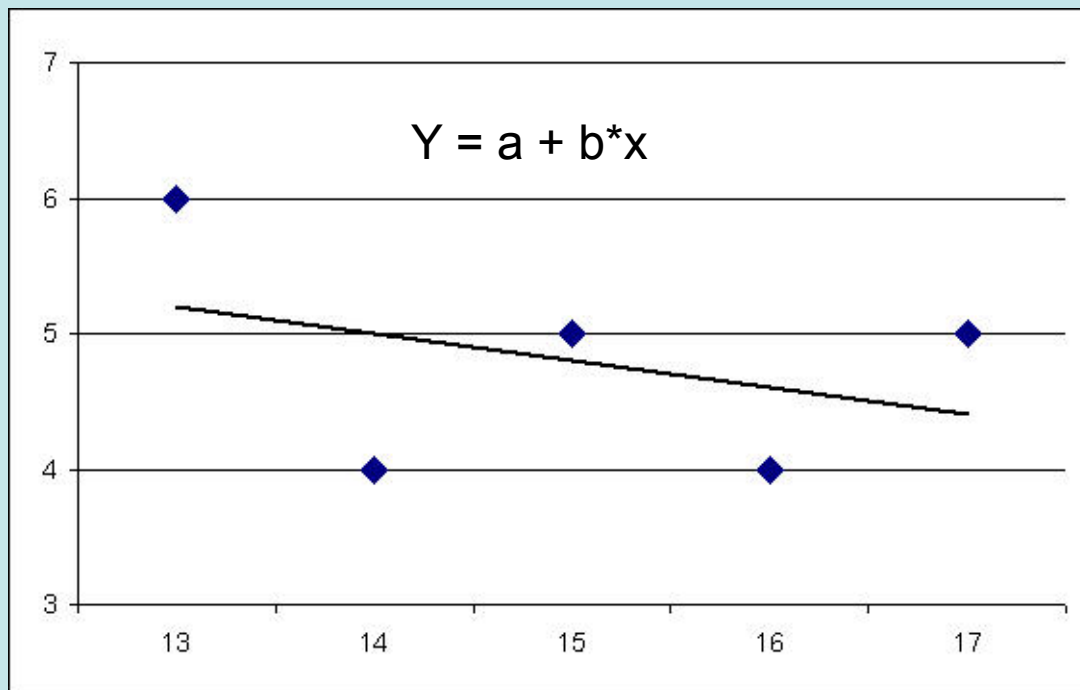
- Length of out-of-sample period determines reoptimization schedule
- You may reoptimize at any time

# Degrees of Freedom

- Every data point contributes one degree of freedom
- Every alternative considered uses up one degree of freedom
- Curve-fit or over-fit means there are no degrees of freedom left over

# Fit the Signal

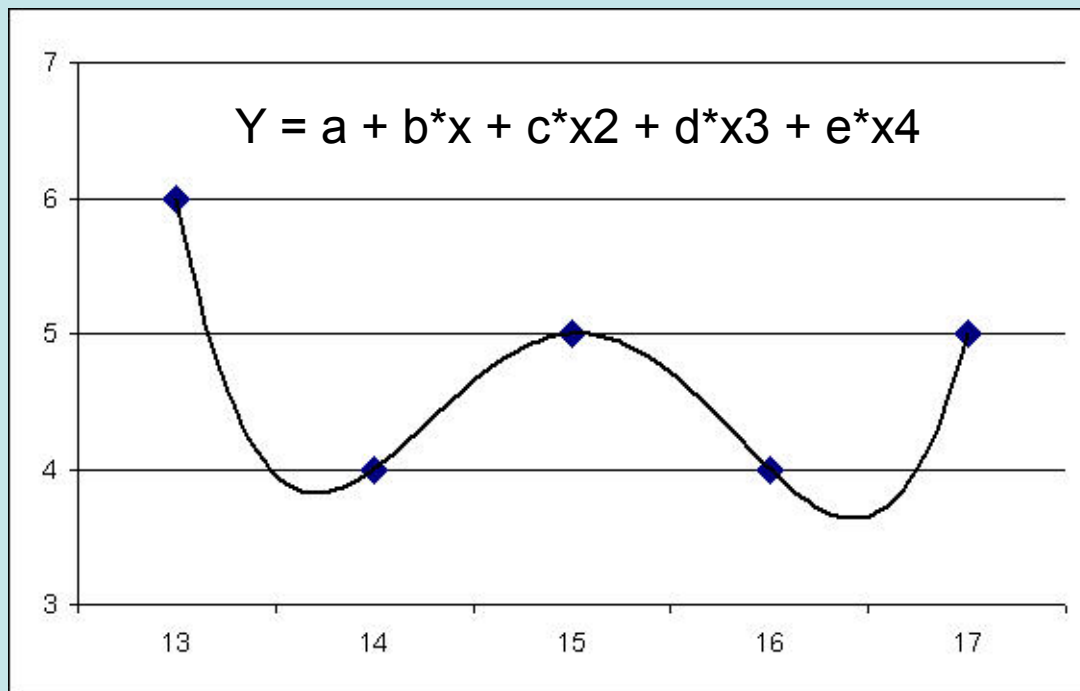
5 data points – 2 coefficients – three residual degrees of freedom





# Fit the Noise – Curve-fit

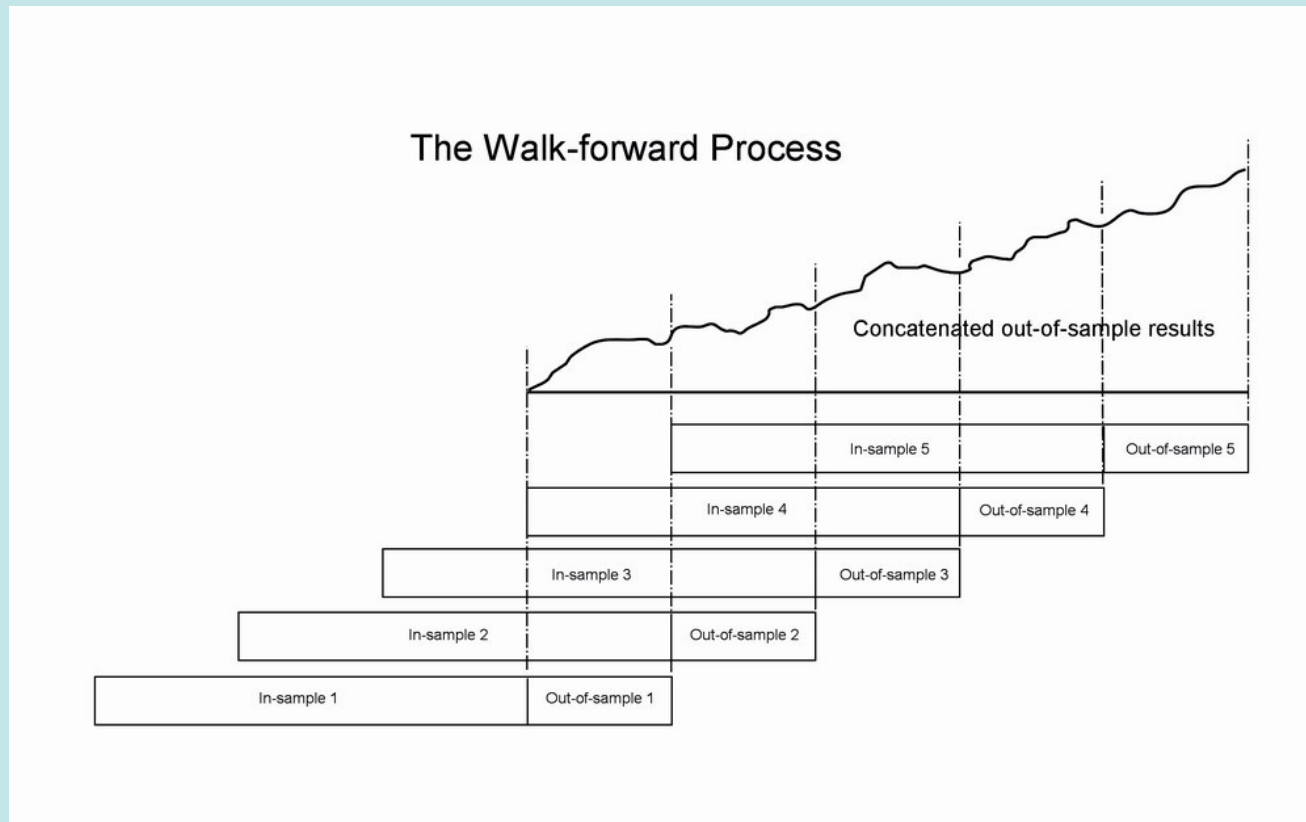
5 data points – 5 coefficients – zero residual degrees of freedom



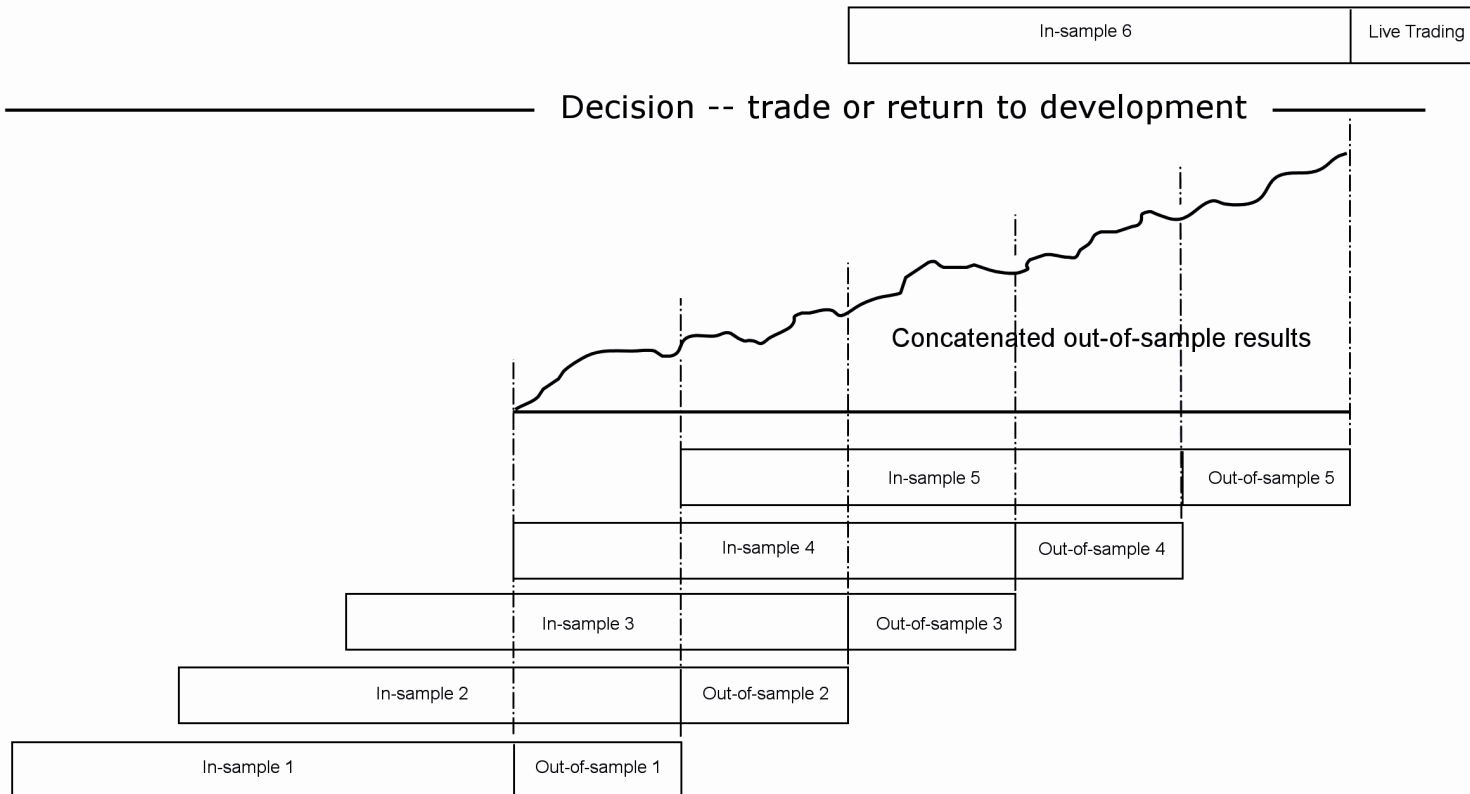
# Walk Forward

- A sequence of steps, each consisting of optimizing over an in-sample period and testing over an out-of-sample period
- Automatically, advancing dates each step:
  - Optimize in-sample
  - Choose best
  - Test out-of-sample
- Accumulate out-of-sample results
- Best chosen strictly by objective function

# The Walk Forward Process



# Decision to Trade



# Validation

- Evaluate out-of-sample results
- Decide whether to trade the system or not
- Out-of-sample results indicate how the system will react to various conditions
- In-sample results have no value in determining the likely profitability of the system

# Trading

- Next Day Open (NDO)
  - Update data after close
  - Compute signals in evening
- Trade on Close of signal bar
  - Real time data feed
  - Compute price ahead
  - Anticipate signals

# Monitor Results

- Compare real time results with out-of-sample test results
- All systems fail
- Use statistical tests to determine if the system is broken
- Use statistical process control techniques, if possible
- When to reoptimize

# 5 Wins in a Row – Now What?

- After a long string of winning trades, do you change anything?
- Probably not
  - Your system and the market are in sync
  - This is just what you hoped for, stay with it
  - Do not penalize good results



# 4 Losses in a Row – Now What?

- Review the trade statistics from your out-of-sample runs.
- What is the typical ratio of winning trades to losing trades?
- Is this unusual?
- Use the runs test for a statistical answer
- Or use the binomial distribution

# The Binomial Distribution

- Assume your out-of-sample shows 60% winners, 40% losers
- The probability of any trade being a loser is 0.40
- The probability of two successive losers is  $0.40 * 0.40 = 0.16$  Expect this regularly
- Three losers in a row = 0.064 Start to worry
- Four losers in a row = 0.0256 It is broken

# Practical Implementation

# Everything You Need

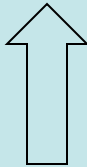
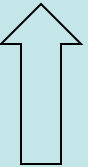
- Everything you need is available today
- AmiBroker trading system development platform
- Any end-of-day and most real-time data sources
- Quotes Plus is a good data vendor

# Trading System Development

1. Define the objective function
2. Decide what to trade and how to trade it
3. Design the trading system
4. Determine the in-sample period
5. Determine the out-of-sample period
6. Decide what to optimize
7. Perform walk forward runs
8. Evaluate out-of-sample results
9. Trade the system
10. Monitor the results

# Metrics Available

Search the AmiBroker User's Guide for "getperformancestats"

10000.00	"InitialCapital"	13	"WinnersQty"
16925.16	"EndingCapital"	56.52	"WinnersPercent"
6925.16	"NetProfit"	10888.27	"WinnersTotalProfit"
69.25	"NetProfitPercent"	837.56	"WinnersAvgProfit"
16.91	"ExposurePercent"	6.51	"WinnersAvgProfitPercent"
409.52	"NetRAR"	6.00	"WinnersAvgBarsHeld"
24.00	"CAR"	4	"WinnersMaxConsecutive"
141.90	"RAR"	3254.77	"WinnersLargestWin"
		6	"WinnersLargestWinBars"
23	"AllQty"		
100.00	"AllPercent"	Typical	Metric
301.09	"AllAvgProfitLoss"	value	name
2.57	"AllAvgProfitLossPercent"		
5.52	"AllAvgBarsHeld"		

# Metrics Available

10	"LosersQty"	-1707.12	"MaxTradeDrawdown"
43.48	"LosersPercent"	-11.66	"MaxTradeDrawdownPercent"
-3963.11	"LosersTotalLoss"	-2071.76	"MaxSystemDrawdown"
-396.31	"LosersAvgLoss"	-13.80	"MaxSystemDrawdownPercent"
-2.55	"LosersAvgLossPercent"	3.34	"RecoveryFactor"
4.90	"LosersAvgBarsHeld" ,	1.74	"CAR/MDD"
2	"LosersMaxConsecutive"	10.28	"RAR/MDD"
-1210.84	"LosersLargestLoss"	2.75	"ProfitFactor"
4	"LosersLargestLossBar"	2.11	"PayoffRatio"
		883.56	"StandardError"
		3.39	"RRR"
		5.37	"UlcerIndex"
		3.46	"UlcerPerformanceIndex"
		2.31	"SharpeRatio"
		0.0967	"KRatio"

# Buy on Open of Next Bar

- `SetTradeDelays(1,1,1,1);`
- `BuyPrice = Open;`
- Sometimes called Next Day Open (NDO)
- Normal when using end-of-day data,
- Processing in the evening,
- Trading market on open



# Buy on Close of Current Bar

- `SetTradeDelays(0,0,0,0);`
- `BuyPrice = Close;`
  
- Often the best entry
- Must anticipate the signal

# Designing Entries

- Start with an indicator
  - Pick an entry method
  - Hold 2 days
    - or ---
- Start with desirable result
  - Identify good entry points
  - Look for leading indicators

# Lag

- Lag makes entries late
- Low lag indicators:
  - AMA
  - Zero Lag MACD
  - Regression
- Zero lag indicators:
  - Patterns
  - Statistics
  - Seasonality

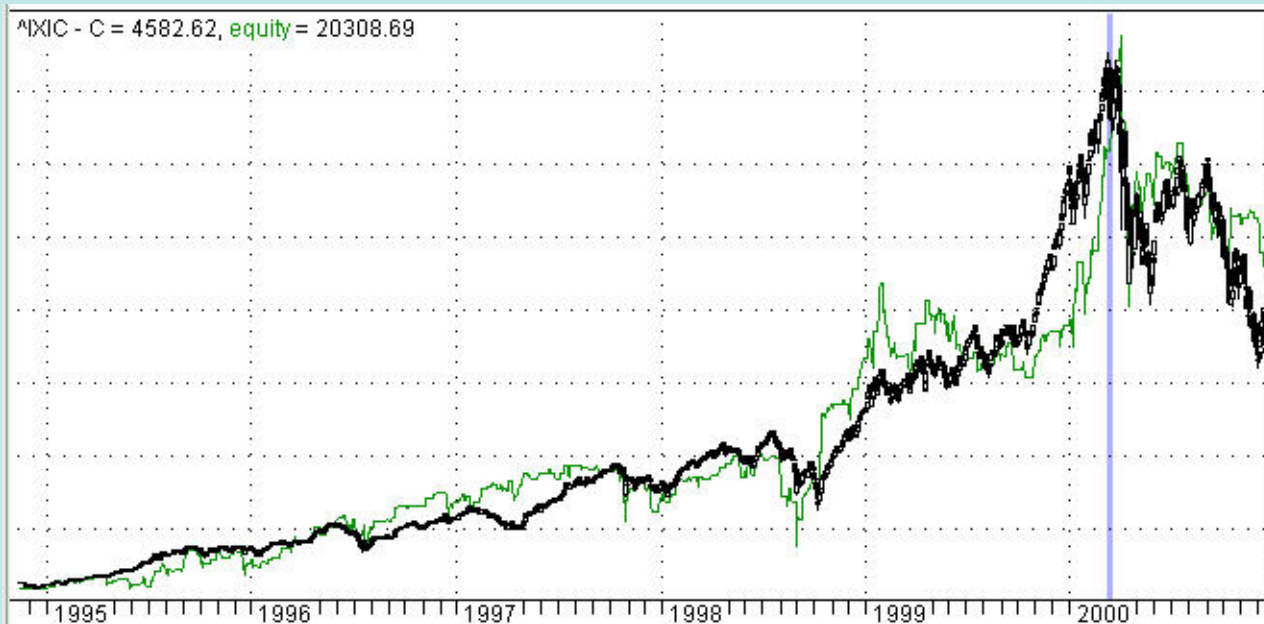
# Be Wary of In-sample Results

- The next few slides illustrate the in-sample and out-of-sample results of several systems
- It is impossible to tell whether results are in-sample or out-of-sample without performing the validation yourself

# System 1 – In-Sample



# System 1 – Out-Of-Sample



# System 2 – In-Sample



# System 2 – Out-Of-Sample





# System 3 – In-Sample



# System 3 – Out-Of-Sample



(CMO Oscillator)

# An Optimization Example

```
[C:\Program Files\AmiBroker\Formulas\Workshop Code\Optimization.a

File Edit Tools Help

Optimization AFL

// Optimization.af1
//
// A very simple example to illustrate
// optimization
//
MALength1 = Optimize("MALength1",1,1,31,2);
MALength2 = Optimize("MALength2",2,2,32,2);
HoldDays = Optimize("HoldDays",1,1,10,1);

MA1 = MA(C,MALength1);
MA2 = MA(C,MALength2);

Buy = Cross(MA1,MA2);
Sell = Cross(MA2,MA1) OR BarsSince(Buy)>=HoldDays;

e=Equity();

Plot(C,"C",colorBlack,styleCandle);
Plot(e,"equity",colorGreen,styleLine|styleOwnScale);
```

Search for the best values for these three variables

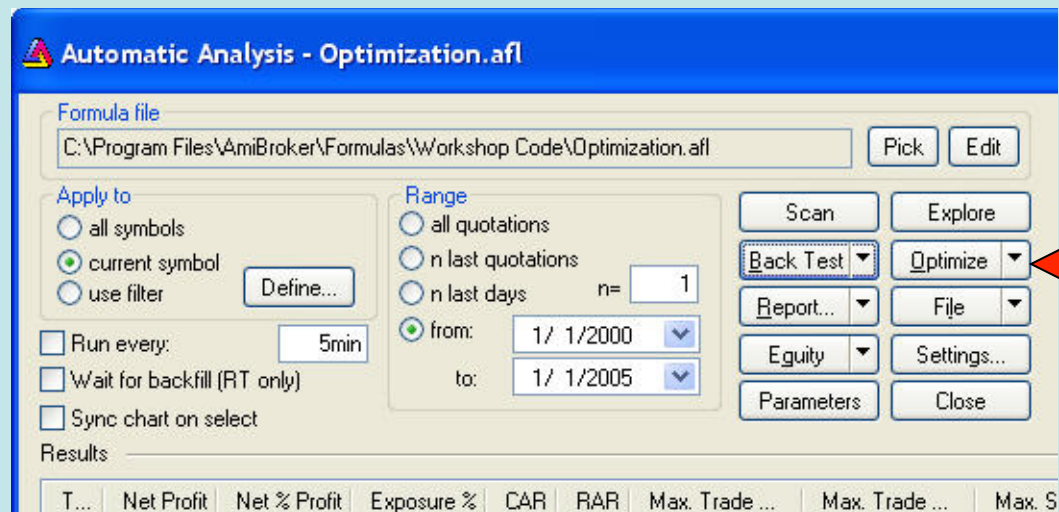


# Equity Curve – Before



**Backtest using default values**

# Optimization Settings



**To begin, Click Optimize**

# Optimization Results

Automatic Analysis - Optimization.afl

Formula file: C:\Program Files\AmiBroker\Formulas\Workshop Code\Optimization.afl

Apply to:  all symbols,  current symbol,  use filter

Range:  all quotations,  n last quotations,  n last days (n=1),  from: 1/ 1/2000 to: 1/ 1/2005

Buttons: Scan, Explore, Back Test, Optimize, Report..., File, Equity, Settings..., Parameters, Close

Results

No.	Net Profit	Net % Profit	Exposure %	CAR	RAR	Max. Trade ...	Max. Trade ...	Max. Sys Dra...	Max....	D...	M...	M...	H...
2070	16416.14	164.16	34.63	21.46	61.95	-1369.00	-10.34	-2464.74	00	271.14	11	4	9
2326	16464.06	164.64	36.23	21.50	59.35	-1404.74	-10.34	-3174.65	95	247.63	11	4	10
1814	15958.68	159.59	32.88	21.03	63.96	-1402.55	-9.83	-2389.52	00	247.48	11	4	8
111	1354.88	13.55	1.91	2.58	134.77	-146.93	-1.30	-180.18	00	228.30	29	14	1
1832	12392.11	123.92	26.11	17.51	67.03	-1289.21	-8.24	-2093.66	23	205.91	15	6	8
2075	5816.61	58.17	22.93	9.61	41.90	-1079.81	-10.34	-1079.81	00	205.36	21	4	9
1819	5256.61	52.57	21.10	8.82	41.81	-933.64	-8.36	-1193.05	00	193.80	21	4	8
2088	12012.90	120.13	28.26	17.10	60.52	-1260.73	-8.24	-3122.29	25	190.89	15	6	9
2329	8395.23	83.95	29.14	12.97	44.52	-1141.10	-10.34	-1969.34	00	184.91	17	4	10
1802	5668.97	56.69	25.24	9.40	37.26	-1019.86	-8.36	-1485.67	88	178.53	19	2	8
2058	5972.21	59.72	26.91	9.82	36.50	-1005.94	-8.36	-1781.87	81	162.39	19	2	9
2071	13700.26	137.00	31.85	18.85	59.18	-1438.94	-10.34	-3516.29	00	155.94	13	4	9
1576	10209.02	102.09	23.73	15.12	63.72	-1248.21	-8.24	-1666.44	50	148.91	15	6	7
2074	5930.24	59.30	25.64	9.77	38.09	-1098.97	-10.34	-1884.22	53	148.33	19	4	9
2342	13929.97	139.30	34.79	19.08	54.83	-1426.14	-10.34	-3351.87	39	145.53	11	6	10
1818	4991.10	49.91	23.65	8.44	35.69	-969.56	-8.36	-1369.51	60	144.86	19	4	8
368	2397.20	23.97	3.66	4.39	119.97	-280.90	-2.73	-909.92	00	141.76	31	14	2

Number of rows: 2560

Three variables (indicated by three blue arrows pointing to the M..., M..., and H... columns)

Sorted by Objective Function (indicated by a red arrow pointing to the D... column)

Sorted by Objective Function

# Optimal Values Entered


```
[C:\Program Files\AmiBroker\Formulas\Workshop Code\Optimization.
File Edit Tools Help
Optimization AFL
// Optimization.af1
//
// A very simple example to illustrate
// optimization
//
MALength1 = Optimize("MALength1", 11, 1, 31, 2);
MALength2 = Optimize("MALength2", 4, 2, 32, 2);
HoldDays = Optimize("HoldDays", 9, 1, 10, 1);

MA1 = MA(C, MALength1);
MA2 = MA(C, MALength2);

Buy = Cross(MA1, MA2);
Sell = Cross(MA2, MA1) OR BarsSince(Buy) >= HoldDays;

e=Equity();

Plot(C, "C", colorBlack, styleCandle);
Plot(e, "equity", colorGreen, styleLine|styleOwnScale);
```





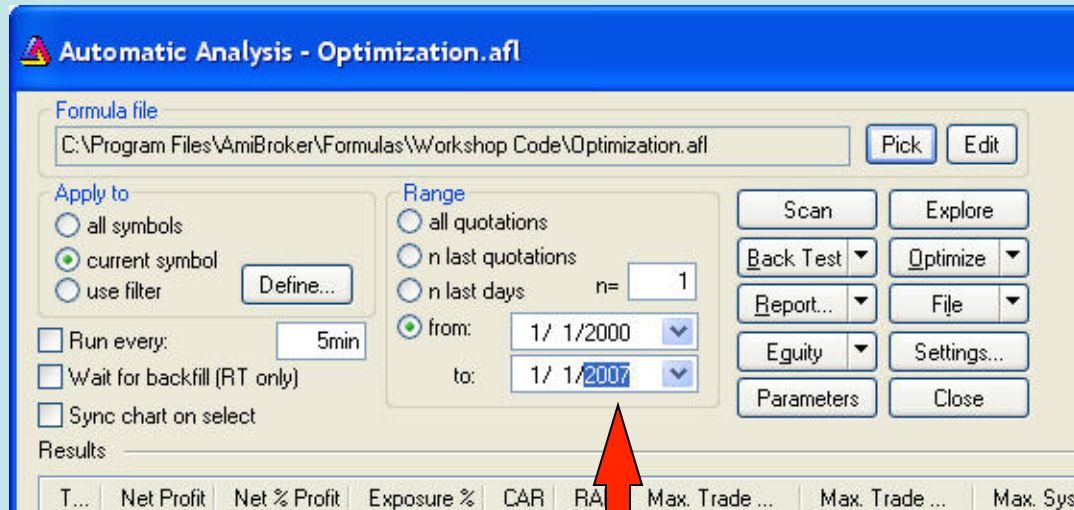
# Equity Curve – After



This is In-Sample, and it looks good



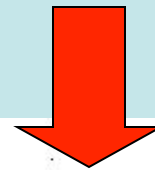
# Settings to Test OOS



Set "to" date later

# Equity Curve – Out-Of-Sample

2005 and 2006 are Out-Of-Sample, and look good

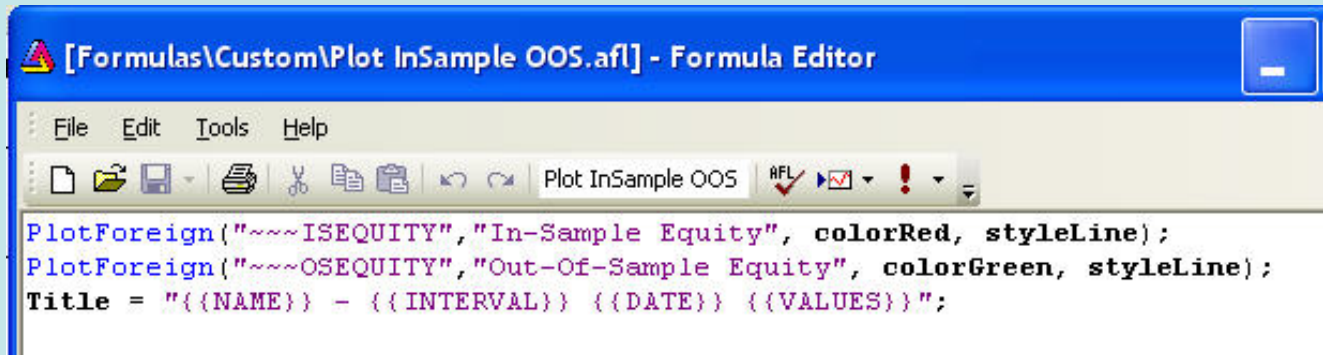


# Walk Forward Example

- AmiBroker has native walk forward testing from Version 5.05

# Install Plot InSample OOS.afl

Copy to AmiBroker\Formulas\Custom

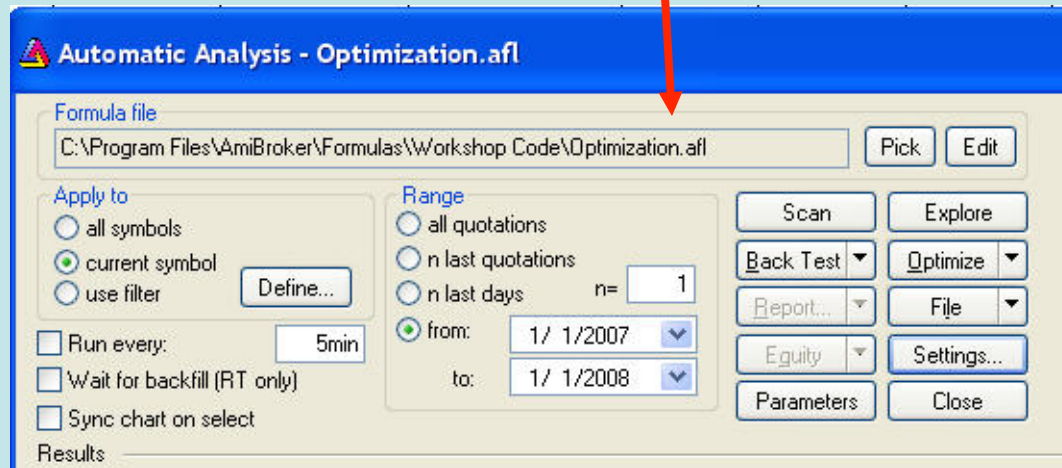


The screenshot shows the AmiBroker Formula Editor window titled "[Formulas\Custom\Plot InSample OOS.afl] - Formula Editor". The window has a menu bar with "File", "Edit", "Tools", and "Help". Below the menu bar is a toolbar with various icons for file operations and editing. The main text area contains the following code:

```
PlotForeign("~~~ISEQUITY", "In-Sample Equity", colorRed, styleLine);  
PlotForeign("~~~OSEQUITY", "Out-Of-Sample Equity", colorGreen, styleLine);  
Title = "{{(NAME)}} - {{(INTERVAL)}} {{(DATE)}} {{(VALUES)}}";
```

# Select the System to Test

Automatic Analysis > Pick – as usual



# Note Optimization Statements

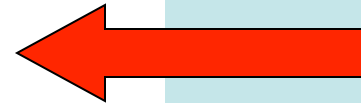
```
[C:\Program Files\AmiBroker\Formulas\Workshop Code\Optimization.afl]
File Edit Tools Help
Optimization AFL
// Optimization.afl
//
// A very simple example to illustrate
// optimization
//
MALength1 = Optimize("MALength1",11,1,31,2);
MALength2 = Optimize("MALength2",4,2,32,2);
HoldDays = Optimize("HoldDays",9,1,10,1);

MA1 = MA(C,MALength1);
MA2 = MA(C,MALength2);

Buy = Cross(MA1,MA2);
Sell = Cross(MA2,MA1) OR BarsSince(Buy)>=HoldDays;

e=Equity();

Plot(C,"C",colorBlack,styleCandle);
Plot(e,"equity",colorGreen,styleLine|styleOwnScale);
```



# Settings

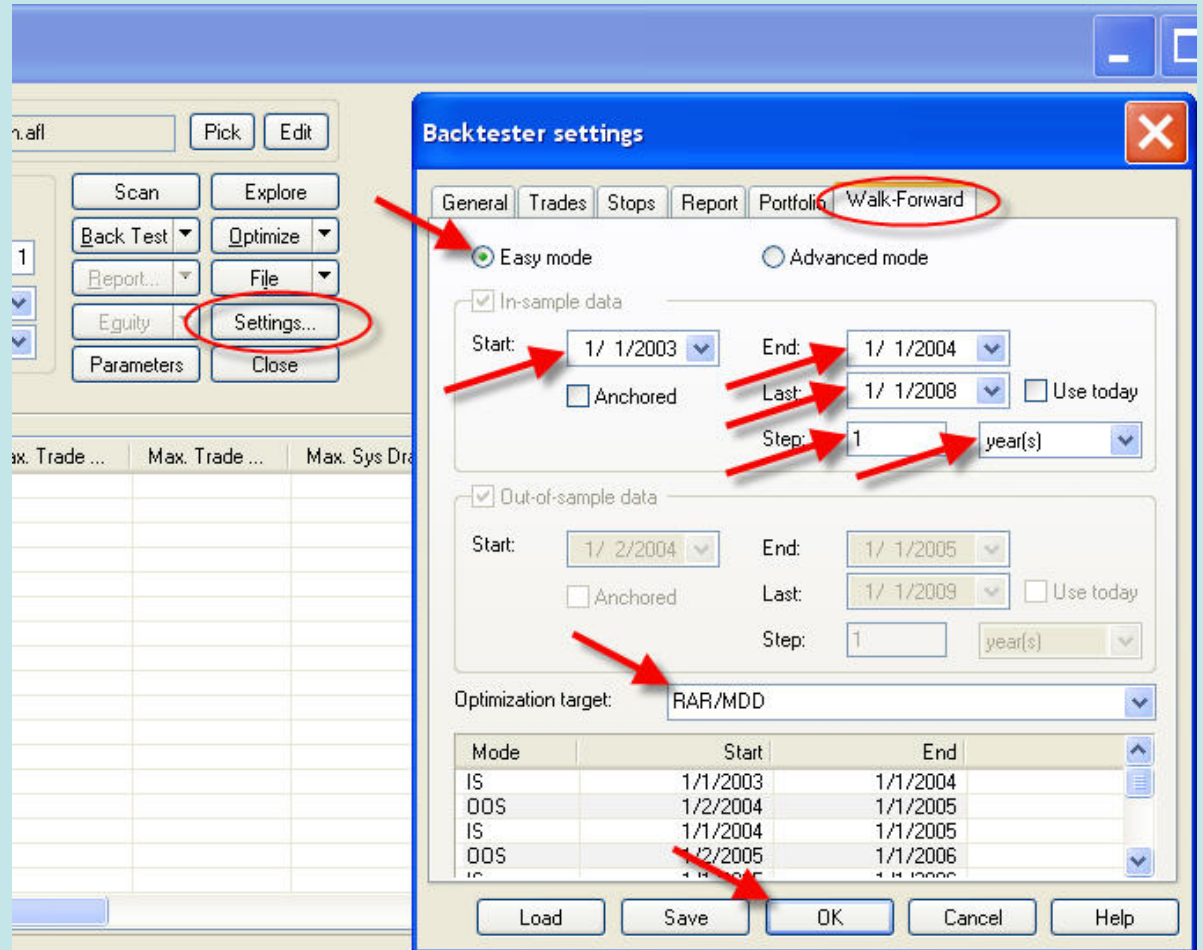
Settings

Walk Forward

Set Dates

Select Objective

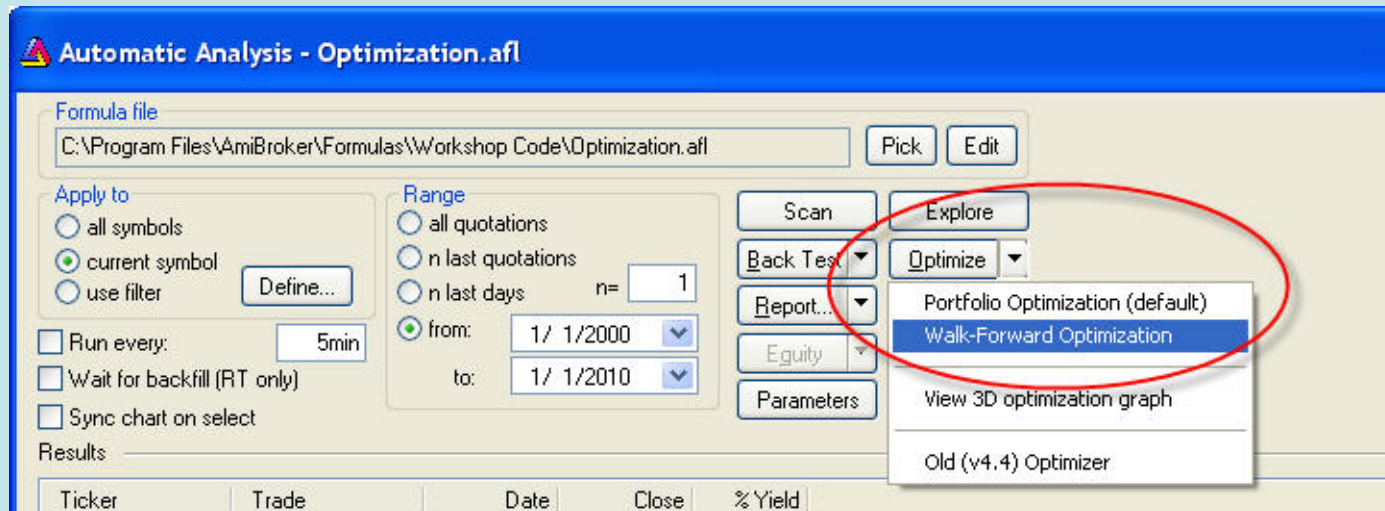
OK



# Start Walk Forward Run

Optimize

Walk Forward





# Results Window

Automatic Analysis - Optimization.afl

Formula file: C:\Program Files\AmiBroker\Formulas\Workshop Code\Optimization.afl

Apply to:
 

- all symbols
- current symbol
- use filter

Range:
 

- all quotations
- n last quotations
- n last days n= 1
- from: 1/ 1/2003 to: 1/ 1/2004

Buttons: Scan, Explore, Back Test, Optimize, Report..., File, Equity, Settings..., Parameters, Close

Results:

No.	Net Profit	Net % Profit	Exposure %	CAR	RAR	Max. Trade	Recovery Fa...	CAR/MDD	RAR/MDD	Profit Factor	Payoff Rati
1	-797.12	-7.97	27.78	-8.01	-28...	-380	-0.72	-0.73	-2.62	0.75	0.9
2	997.90	9.98	18.25	10...	54...	-368	1.31	1.37	7.52	1.59	1.2
3	1242.91	12.43	9.92	12...	12...	-194	5.49	6.21	62.56	3.71	2.0
4	281.80	2.82	7.94	2.83	35...	-202	1.21	1.21	15.29	1.50	1.5
5	221.08	2.21	5.95	2.22	37...	-146	0.91	0.95	15.98	1.55	1.3
6	-404.57	-4.05	5.56	-4.07	-73...	-228	-0.70	-0.71	-12.75	0.43	0.4
7	298.25	2.98	5.95	3.00	50...	-168.76	1.07	1.08	18.07	1.57	1.0
8	254.58	2.55	5.16	2.56	49...	-156.94	0.95	0.96	18.57	1.49	1.2
9	80.83	0.81	5.16	0.81	15...	-204.67	0.33	0.34	6.62	1.13	0.9
10	163.12	1.63	3.97	1.64	41...	-156.94	1.04	1.05	26.34	1.68	0.7
11	352.58	3.53	3.57	3.55	99...	-58.53	4.20	4.40	123.29	5.20	1.4
12	253.22	2.53	3.17	2.55	80...	-63.42	3.99	4.09	128.68	3.86	1.2
13	405.36	4.05	3.17	4.08	12...	-25.64	15.81	16.58	522.40	16.81	2.4
14	378.13	3.78	3.17	3.80	11...	-36.40	10.39	10.61	334.18	7.13	2.3
15	258.60	2.59	3.17	2.60	81...	-166.86	1.55	1.60	50.43	1.91	0.6
16	258.60	2.59	3.17	2.60	81...	-166.86	1.55	1.60	50.43	1.91	0.6
17	-90.84	-0.91	13.89	-0.91	-6.58	-344.69	-0.12	-0.12	-0.84	0.94	1.0

Running...

Optimizing...

Optimization step 1274 of 2560 (49%)

49%

Elapsed time: 10 seconds  
Est. time left: 11 seconds

Cancel

# Two Tabs

Minimize “Optimizing” window to reveal these

The screenshot shows a software interface with a menu bar (Symbol, Analysis, Tools, Window, Help) and a toolbar. Two browser tabs are visible: "XLF (Daily)" and "Walk Forward". The "Walk Forward" tab is active and displays a table with the following data:

Mode	Begin	End	No.	Net Profit	Net % Profit	Exposure %	C
IS	1/1/2003	1/1/2004	162	765.32	7.65	3.57	7.
OOS	1/1/2004	1/1/2005	1	191.46	1.91	2.38	1.
IS	1/1/2004	1/1/2005	91	403.07	4.03	2.38	4.

# Walk Forward Tab

Displays in-sample and out-of-sample results for each step

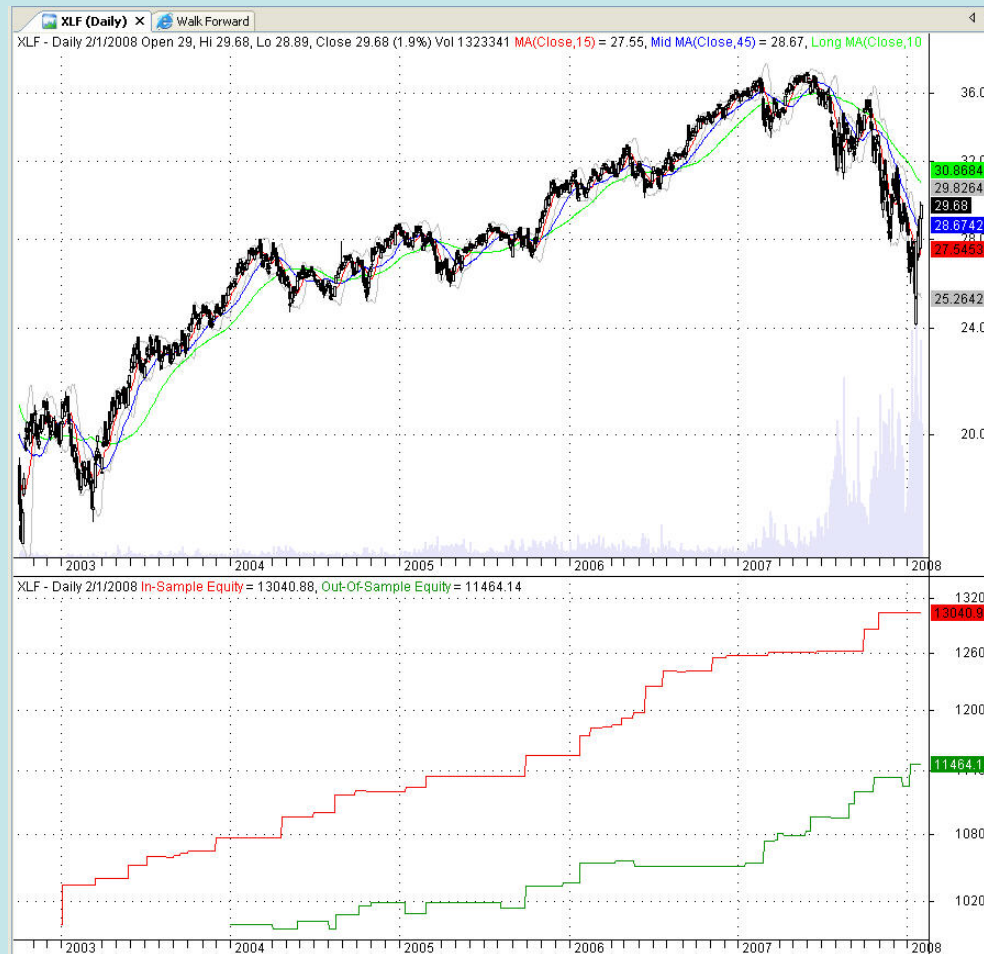
Best values for parms

Based on RAR/MDD

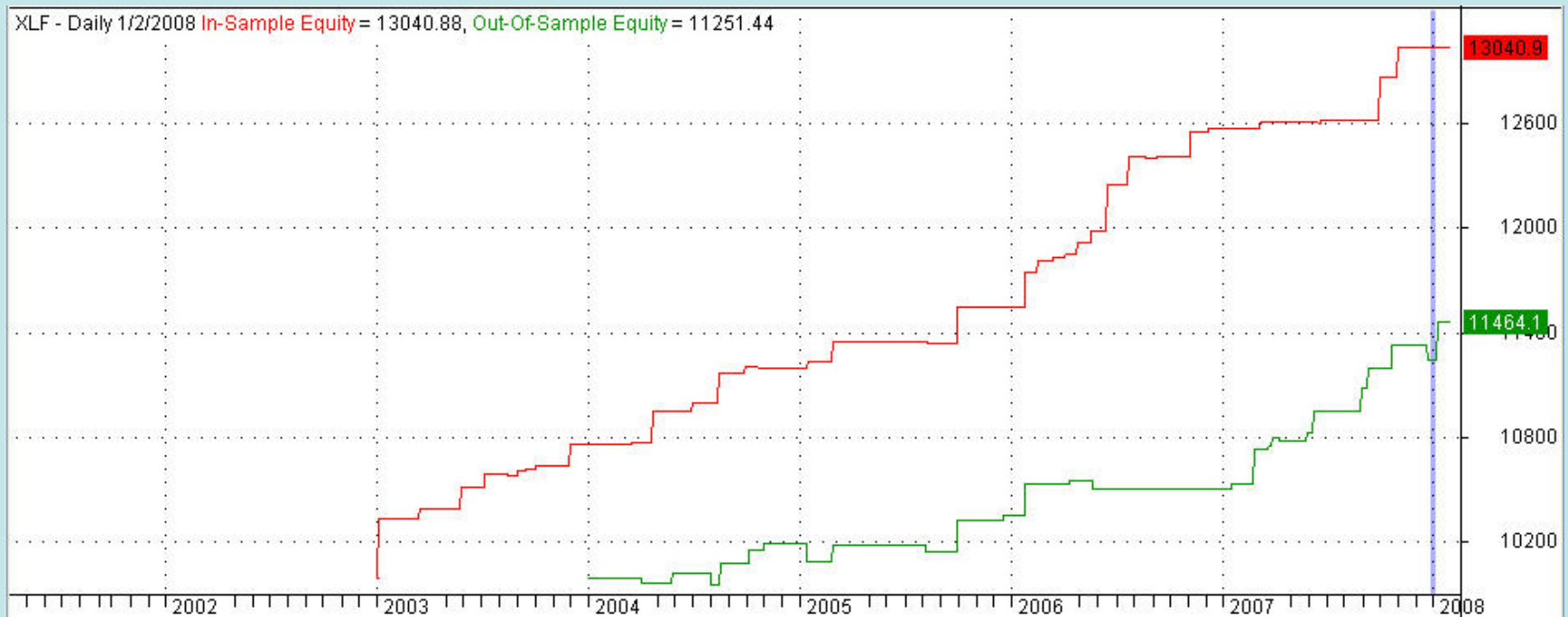
Completed.

Mode	Begin	End	No.	Net Profit	Net % Profit	Exposure %	CAR	RAR	Max. Trade Drawdown	Max. Trade % Drawdown	Max. Sys Drawdown	Max. Sys % Drawdown	Recd	MDD	RAR/MDD	Profit	MALength1	MALength2	HoldDays
IS	1/1/2003	1/1/2004	162	765.32	7.65	3.57	7.70	215.51	-9.13	-0.09	-9.13	-0.09		99.32	2501.05		3	22	1
OOS	1/2/2004	1/1/2005	1	191.46	1.91	2.38	1.92	80.64	-61.62	-0.61	-61.62	-0.61		3.12	131.18		3	22	1
IS	1/1/2004	1/1/2005	91	403.07	4.03	2.38	4.04	169.76	-8.12	-0.08	-8.12	-0.08		51.82	2176.37		21	12	1
OOS	1/2/2005	1/1/2006	1	163.69	1.64	1.98	1.66	83.42	-99.96	-1.00	-99.96	-1.00		1.66	83.45		21	12	1
IS	1/1/2005	1/1/2006	78	313.25	3.13	1.59	3.17	199.57	-7.21	-0.07	-7.21	-0.07		44.52	2804.90		27	10	1
OOS	1/2/2006	1/1/2007	1	142.56	1.43	1.20	1.45	120.94	-48.81	-0.48	-48.81	-0.48		3.02	252.53		27	10	1
IS	1/1/2006	1/1/2007	89	886.73	8.87	4.78	9.00	188.16	-3.32	-0.03	-3.32	-0.03		91.19	6090.80		17	12	1
OOS	1/2/2007	1/1/2008	1	709.60	7.10	5.18	7.16	138.18	-78.20	-0.72	-78.20	-0.72		9.87	190.63		17	12	1
IS	1/1/2007	1/1/2008	192	371.13	3.71	1.99	3.74	187.88	-2.72	-0.03	-2.72	-0.03		137.88	6921.46		31	24	1
OOS	1/2/2008	1/1/2009	1	189.04	1.89	3.70	20.29	547.85	0.00	0.00	0.00	0.00		N/A	N/A		31	24	1

# Chart Tab



# I.S. and O.O.S. Equity Curves



# Just for NAAIM

A system using weekly data

# ETF Selection Example

- Nine S&P Sector ETFs
- Weekly data – Hold 1 to 3 sectors
- Compute signals after Friday's close
- Trade Monday's open
- Two methods in one system
  - Trend following
  - Mean reversion
- 6 mo in-sample, 6 mo out-of-sample

# ETF Selection – Code

```
// NAAIM.afl
//
SetTradeDelays(1,1,1,1);
BuyPrice = Open;
SellPrice = Open;
TimeFrameSet(inWeekly);

NumberPositions = Optimize("NumPos",2,1,3,1);
SetOption("MaxOpenPositions", NumberPositions);

PositionSize = -100 / NumberPositions;

Trend = Optimize("Trend",1,1,2,1);
ROCLen = Optimize("ROCLen",5,2,20,2);
MALen = Optimize("MALen",5,2,20,2);

if (Trend == 1)
{
  // Buy Strength
  Strength = ROC(C,ROCLen);
  Buy = Strength > 0;
  Sell = Strength < 0;
  PositionScore = Strength;
}
else
{
  // Buy Weakness
  Z = (C - MA(C,MALen)) / StDev(C,MALen);
  Buy = Z < 0 AND Z > Ref(Z,-1);
  Sell = Z < Ref(Z,-1);
  PositionScore = -Z;
}
```

Optimize:

Number to hold

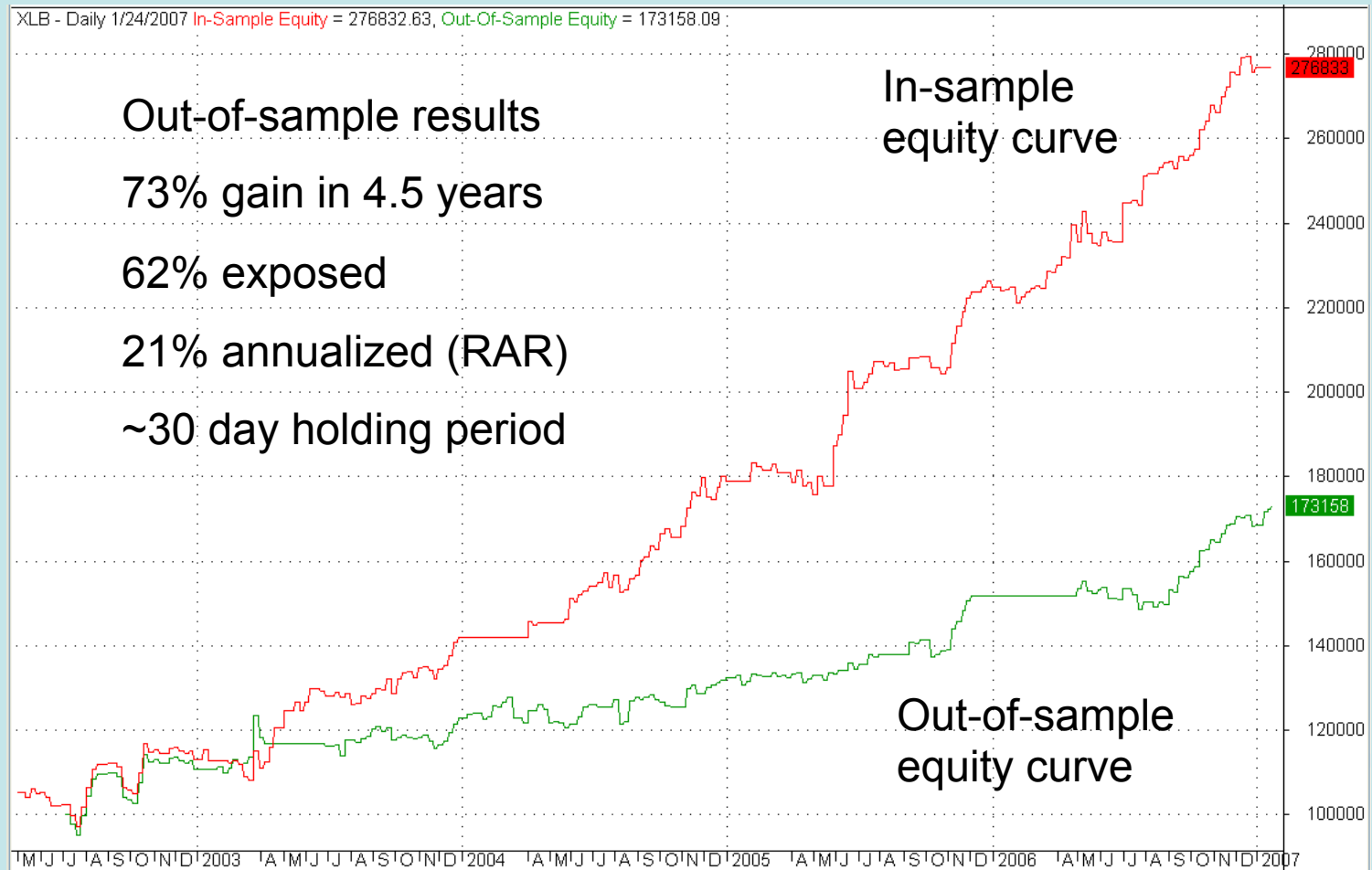
Three Variables



# ETF Selection – Walk forward

Mode	Begin	End	No.	Net Profit	Net % Profit	Exposure %	CAR	RAR	Avg Bars Held	Max. Sys % Drawdown	NumPos	Trend	ROCLen	MALen
IS	1/1/2002	7/1/2002	6	2367.01	2.37	44.98	5.00	11.12	3.06	-5.93	3	2	2	2
OOS	7/2/2002	1/1/2003	1	10821.82	10.82	48.73	23.90	49.04	3.00	-6.53	3	2	2	2
IS	7/1/2002	1/1/2003	6	10821.82	10.82	48.73	23.90	49.04	3.00	-6.53	3	2	2	2
OOS	1/2/2003	7/1/2003	1	4851.15	4.85	26.93	10.38	38.57	3.10	-5.86	3	2	2	2
IS	1/1/2003	7/1/2003	2	16681.16	16.68	71.09	37.96	53.39	4.70	-6.16	2	1	2	2
OOS	7/2/2003	1/1/2004	1	6444.22	6.44	76.95	13.83	17.97	3.86	-4.27	2	1	2	2
IS	7/1/2003	1/1/2004	39	11064.88	11.06	94.01	24.31	25.86	13.17	-2.59	3	1	14	2
OOS	1/2/2004	7/1/2004	1	2665.25	2.67	88.01	5.64	6.41	8.56	-5.66	3	1	14	2
IS	1/1/2004	7/1/2004	485	8581.20	8.58	28.83	18.73	64.98	4.00	-0.61	2	2	2	18
OOS	7/2/2004	1/1/2005	1	4198.28	4.20	50.17	8.60	17.14	3.70	-4.65	2	2	2	18
IS	7/1/2004	1/1/2005	33	15429.74	15.43	99.92	33.35	33.37	21.25	-3.05	3	1	12	2
OOS	1/2/2005	7/1/2005	1	-777.75	-0.78	71.85	-1.62	-2.25	7.88	-4.44	3	1	12	2
IS	1/1/2005	7/1/2005	304	13142.36	13.14	57.69	29.37	50.91	3.50	-4.03	1	2	2	12
OOS	7/2/2005	1/1/2006	1	12850.02	12.85	50.00	28.68	57.36	4.25	-2.78	1	2	2	12
IS	7/1/2005	1/1/2006	546	11908.28	11.91	53.24	25.31	47.54	4.91	-1.94	3	2	2	20
OOS	1/2/2006	7/1/2006	1	1139.97	1.14	21.85	2.39	10.95	3.13	-2.78	3	2	2	20
IS	1/1/2006	7/1/2006	3	11272.28	11.27	78.36	24.95	31.84	4.59	-3.33	3	1	2	2
OOS	7/2/2006	1/1/2007	1	9266.10	9.27	87.25	20.30	23.27	6.67	-3.65	3	1	2	2
IS	7/1/2006	1/1/2007	9	13186.06	13.19	93.57	29.48	31.50	13.17	-1.36	3	1	4	2
OOS	1/2/2007	7/1/2007	1	2074.87	2.07	100.00	48.37	48.37	5.00	-0.61	3	1	4	2

# EFT Selection – Equity Curves



# How to Build an Effective Trading System

(and Build Confidence that It Will Be Profitable)

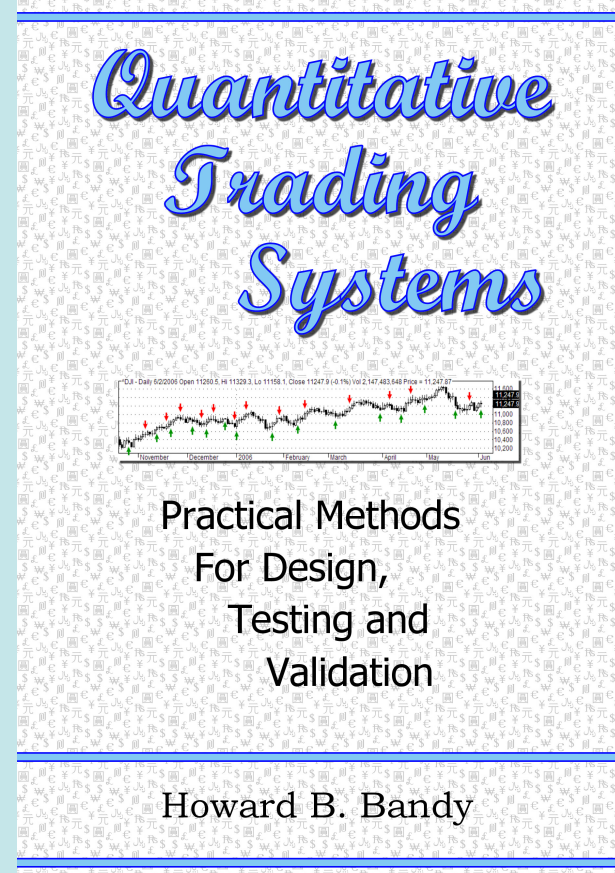
# Trading System Development

1. Define the objective function
2. Decide what to trade and how to trade it
3. Design the trading system
4. Determine the in-sample period
5. Determine the out-of-sample period
6. Decide what to optimize
7. Perform walk forward runs
8. Evaluate out-of-sample results
9. Trade the system
10. Monitor the results

# Questions and Comments

# Quantitative Trading Systems

- Expands on topics presented today
- Subtitled “Practical Methods for Design, Testing, and Validation”
- Published in 2007
- Very well received
- Shipped to over 35 countries



# Contact Information

- To discuss or schedule a seminar, workshop, custom programming, or consulting:
- Dr. Howard B. Bandy
- (520) 705-1239 (cell)
- [howard@BlueOwlPress.com](mailto:howard@BlueOwlPress.com)

# Resources

- AmiBroker [www.amibroker.com](http://www.amibroker.com)
- Quotes Plus [www.quotes-plus.com](http://www.quotes-plus.com)
- Quantitative Trading Systems  
[www.quantitativetradingsystems.com](http://www.quantitativetradingsystems.com)
- [www.quantitativetradingsystems.com/resources](http://www.quantitativetradingsystems.com/resources)



**The End**