

Financial crises

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Risk 2001 Europe

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- What are market crises?
- Market crises and risk models
- Expectations and market crises
- Warning signals

- What are market crises?
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What are market crises?

Crises, bubbles, and volatility

- Sharp changes in asset prices
 - Non-price impact: positions, transactions volume, expectations, real economy, financial and payments systems integrity
- What happens in a crisis?
 - Volatility spike, correlation breakdown, liquidity impasse
- Systemic risk
 - Contagion: related and unrelated markets, via sentiment, hedging, same and similar fundamentals
 - Credit contraction
 - Payment systems impaired
- Focus on two crises: one localized, one general
 - The ERM Crisis of 1992-1993
 - The Asian/Russian crisis of 1997-1998

What are market crises?

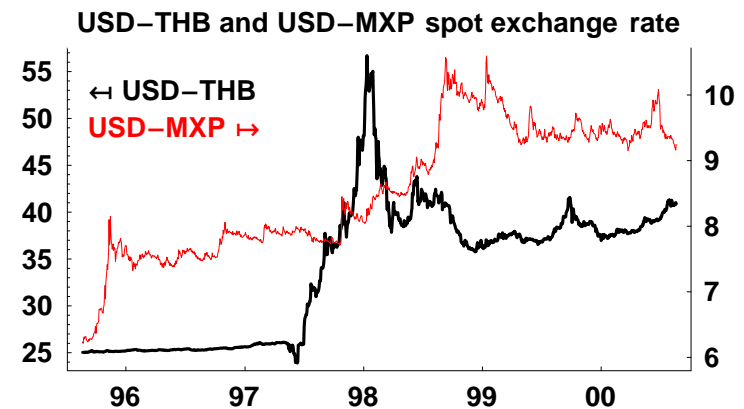
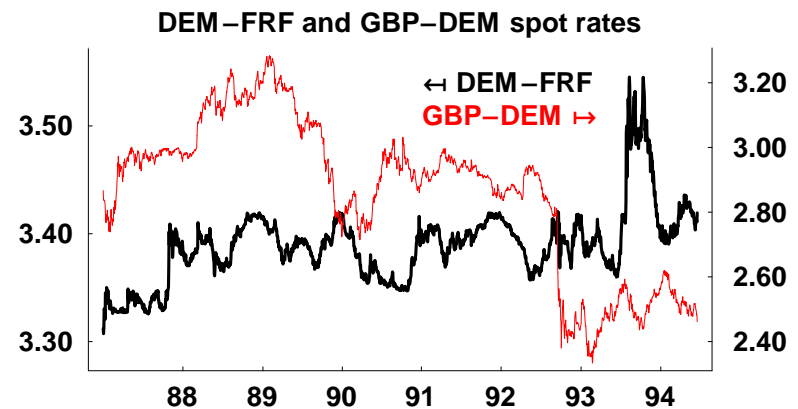
Currency crises

- Special role of currency crises in postwar crises
 - One of the only asset prices subjected to price controls. Other example gold until speculative run undermined Bretton Woods.
- Involve the banking system in an essential way: short-term capital inflows and outflows
- Speculative attack pattern therefore not typical for other assets
- Have shown a special tendency to impact other markets, spread out of control
 - October 1987 U.S. stock market crash may have been precipitated by currency dispute
- And today: Japanese yen, Turkish lira, Brazilian real, Argentinean peso...

What are market crises?

Brief description of the events

- “Black Wednesday”
 - Sterling leaves ERM 16 Sept. 1992
- Breaking the USD-THB peg
 - First speculative attack 14-15 May 1997
 - Float 2 July 1997
- Russia/LTCM phase 1998
 - FOMC rate cuts 29 Sept., 15 Oct.



What are market crises?

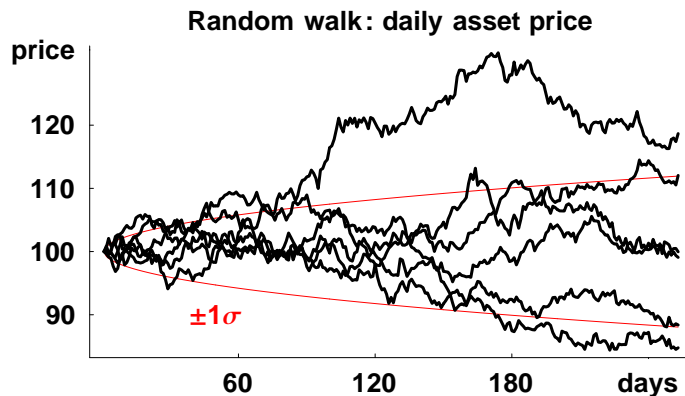
Identifying crises

- No precise way of identifying crises
 - Difficult enough to define a sharp asset price move
 - Sharp asset prices changes enough to define crisis?
 - Actually quite common
 - Not every big move is a crisis: gold in September 1999
- Changes in
 - Behavior of asset prices: volatility and liquidity
 - Relationships among asset prices: correlation and liquidity
 - Market sentiment as expressed through derivatives prices
- Basic tool is normal distribution
 - Need normal distribution to determine what is large or frequent
- Extreme value theory: tail events follow a particular class of distributions, parameters estimated from data

- What are market crises?
- [Market crises and risk models](#)
- Expectations and market crises
- Warning signals

Market crises and risk models

The standard model



1 Asset price follows random walk

2 Expected asset return is zero

Some implications of the classical assumptions:

- Asset return is normally distributed
- The confidence interval widens in proportion to the square root of time.
- Return volatilities and correlations constant or change gradually
- The volatility of the random walk can be accurately estimated using the historical volatility over some recent period.

Market crises and risk models

The standard model

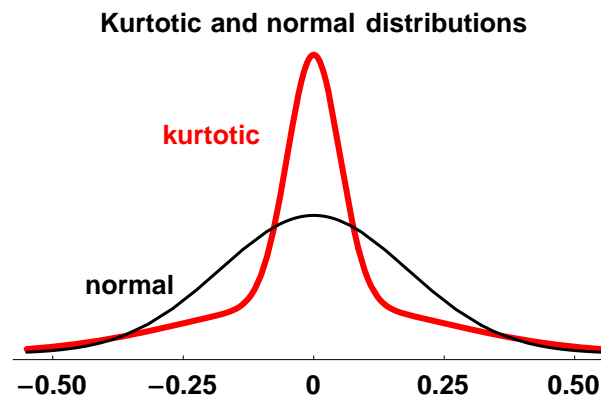
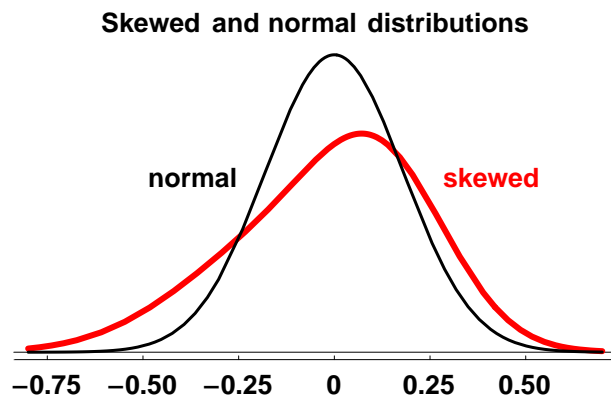
Normal distribution
describes asset
price returns very
well—up to a point

Anomalies are small
but economically
important



Market crises and risk models

Deviations from the standard model



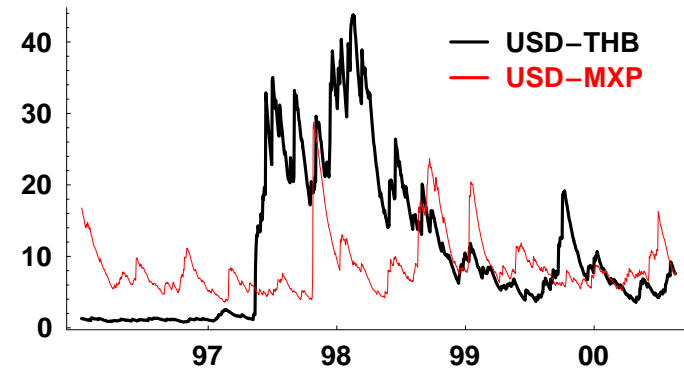
- Kurtosis
 - Large moves happen more frequently than is consistent with normality
- Skewness
 - Large moves happen more frequently in one direction than the other
 - Normal distribution is symmetric
- Time-varying volatility
 - RiskMetrics EWMA approach
 - But still large changes in volatility in crises

Market crises and risk models

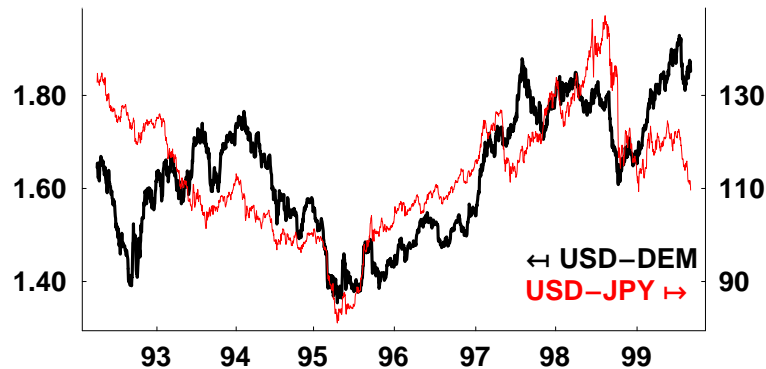
Volatility in crises

- Sudden and very large run-up in volatility
- Volatilities go up sharply in a crisis, particularly pegged currencies
- But volatilities may go up in the absence of a crisis, or due to events in local market

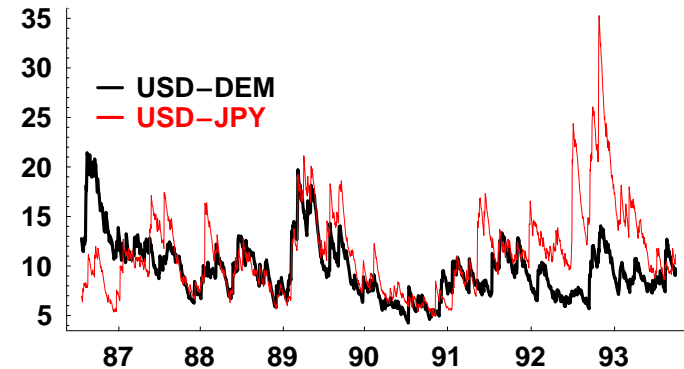
USD–THB and USD–MXP return volatility



USD–DEM and USD–JPY spot rates

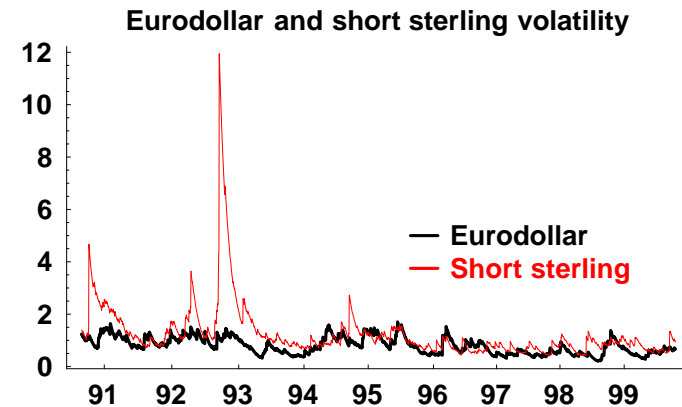
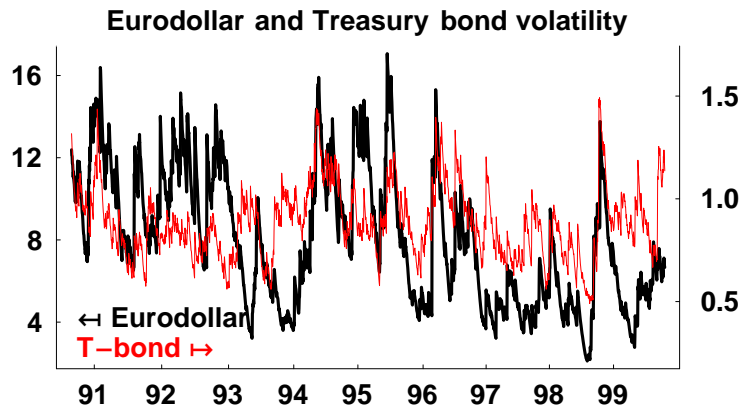


USD–DEM and USD–JPY return volatility



Market crises and risk models

Volatility in crises

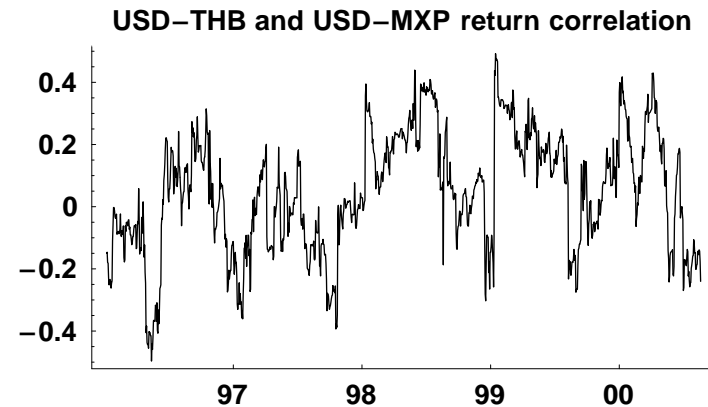


- Interest rate volatility
 - Exceptional volatility in interest rates due to currency crises
 - Bond volatility—but not money market volatility—exceptional during LTCM crisis
 - Fixed income volatility approximately of the order of magnitude of duration

Market crises and risk models

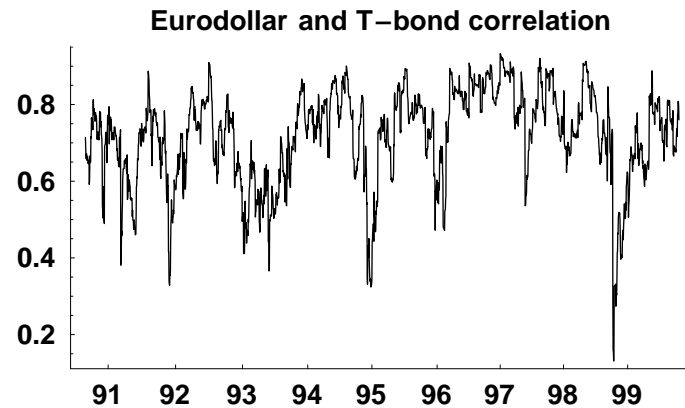
Correlations in crises

- Correlations change all the time and can change rapidly during crises: “correlation breakdown.”
- Changes in substitutability
- Correlations can be systematically different in crises from normal periods
 - Some correlations fall precipitously: interest rates along a curve
 - Some correlations rise precipitously: interest rates or equity indexes across markets

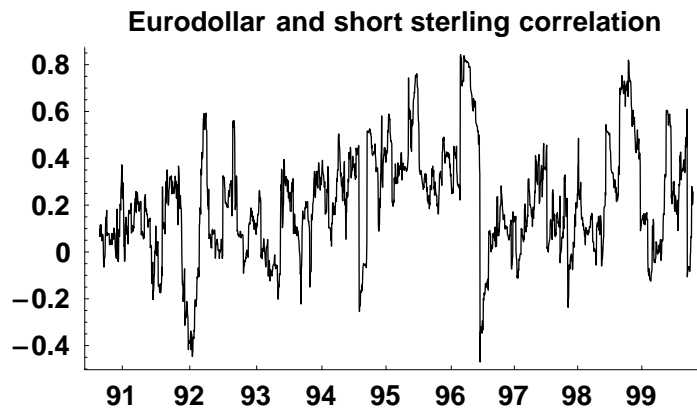


Market crises and risk models

Correlations in crises



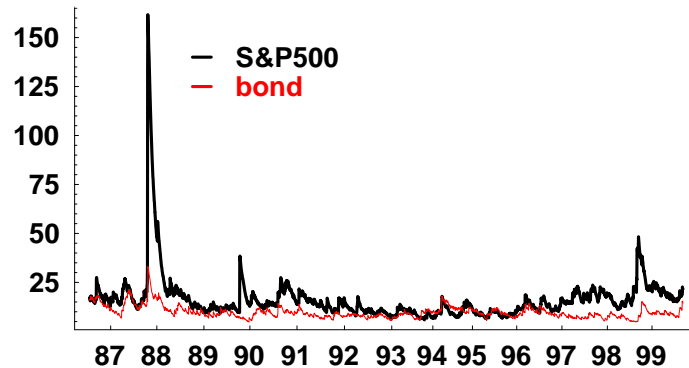
- Liquidity impact
- High correlation of money market rates during LTCM crisis due to expectations of monetary easing



Market crises and risk models

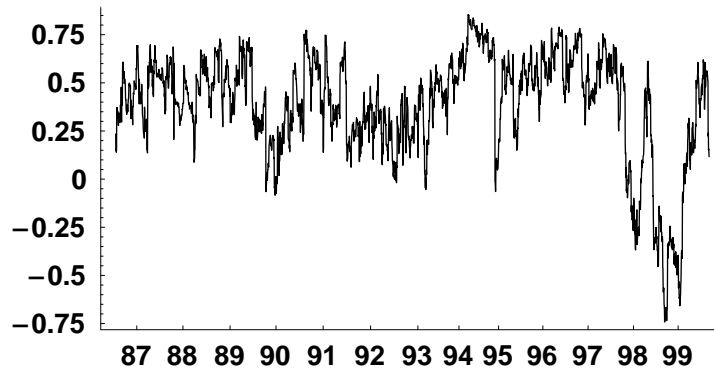
Correlations in crises

S&P500 and bond return volatility



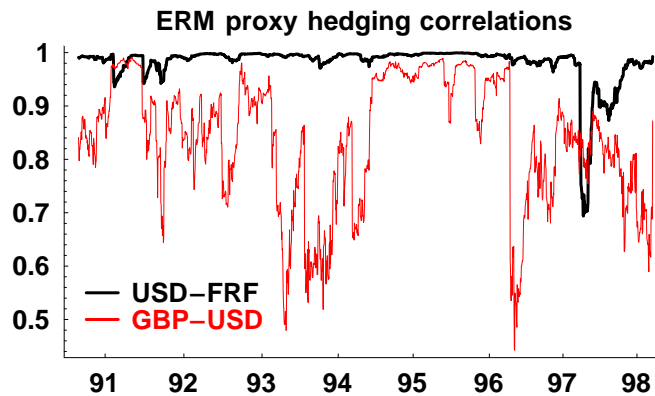
- Stock and bond correlation
- Generally positive
 - Drops to near zero during stress periods
 - During Asian and LTCM crises sharply negative
- Some correlations may rise

S&P500 and bond return correlation



Market crises and risk models

Correlations in crises



- Proxy hedging
 - Hedge in an asset that is highly correlated with the exposure but has a deeper market or lower financing rate.

Market crises and risk models

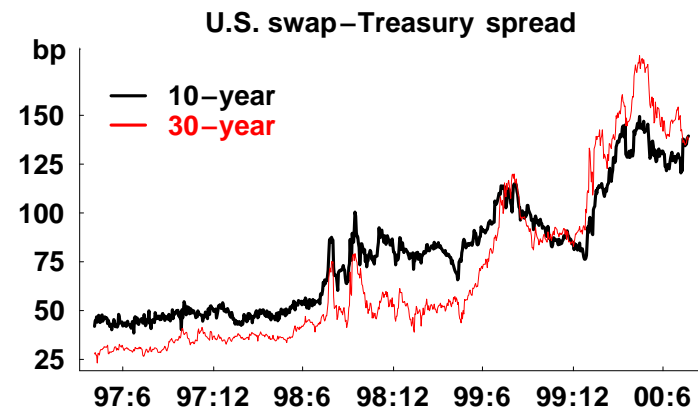
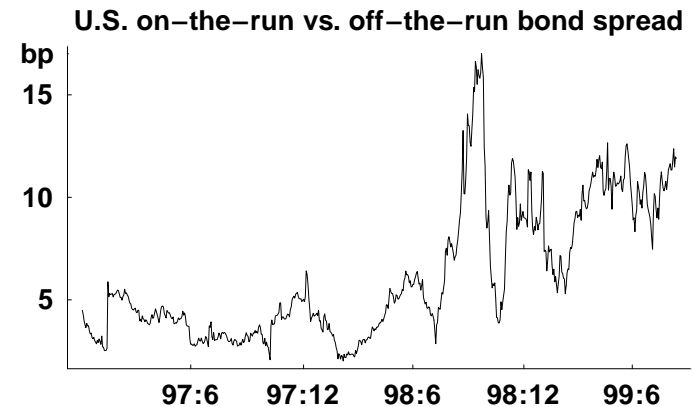
Liquidity in crises

- Flight to liquidity
 - Need to meet margin and collateral requirements
 - Expression of general anxiety: everyone want to know they can get into cash at low cost
 - Many market participants have similar trades on at any point in time
 - Primarily “carry trades,” dependent on exit timing to avoid loss
 - Convergence trades, yen carry trade, repo-financed trades
 - “I’m unwinding this position, I can always put it back on later.”

Market crises and risk models

Liquidity in crises

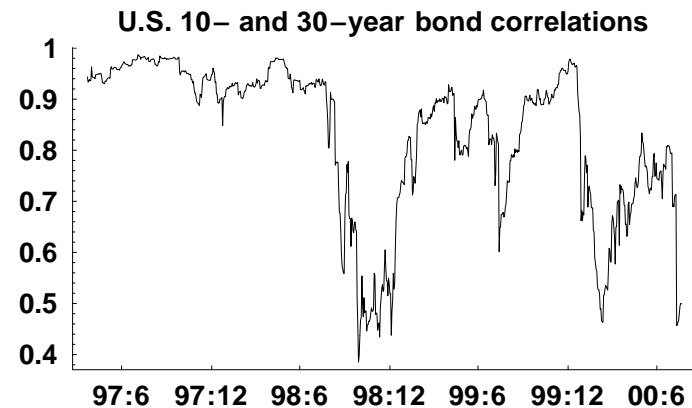
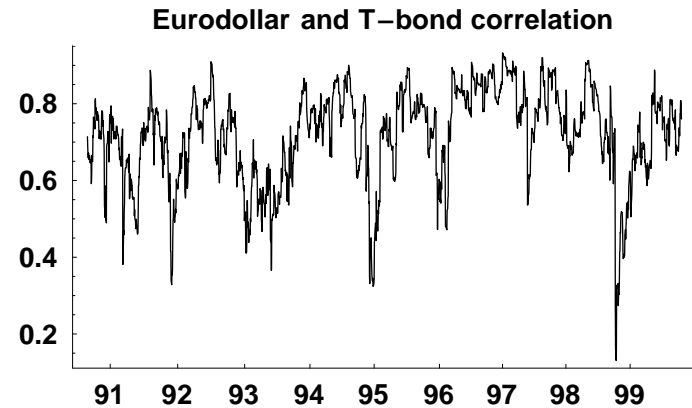
- Measuring liquidity
 - OFF vs. OTR
 - Bid-ask spreads
 - Average distance of prices from a fitted curve
 - Term structure of open interest on exchanges
 - Ratio of front to back OI
 - Short-term options, risk reversals
 - Vol of vol
 - Swap spreads



Market crises and risk models

Liquidity and correlation

- Liquidity can influence correlations among assets
- Futures not subject to squeezing or liquidity impasses



Market crises and risk models

Credit spreads

- Credit spreads rise sharply in crises
- Measuring market perceptions of credit risk
 - Spreads between risk free (government) and credit risky instruments
 - Spreads between commercial paper and Treasury bill rates
 - Japan premium
- Move together with liquidity indicators

- What are market crises?
- Market crises and risk models
- [Expectations and market crises](#)
- Warning signals

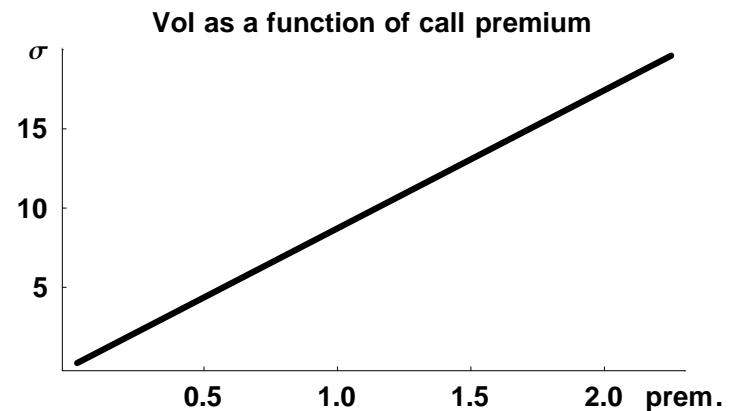
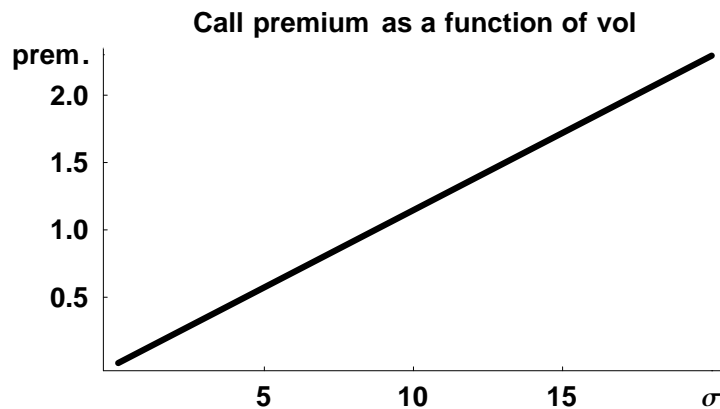
Expectations in market crises

Expectations and market prices

- Market expectations play crucial role in crises
 - Market participants try to anticipate events, position themselves for future
- Market expectation embedded in prices: efficient markets theory
- Even in efficient markets, entanglement of expectations with
 - Risk premiums
 - Liquidity
- How are expectations expressed?
 - Spot/cash prices
 - Forward prices equal to expected future spot prices
 - Forwards poor predictors of future prices, but everything else as bad
 - Predictive performance even worse for large moves
 - Interest rate and futures term structures and spreads
 - Option implied volatilities and volatility surfaces

Expectations in market crises

Implied volatility: background



- A measure of how much asset prices move around
- A measure of option prices themselves
 - Option markets can be viewed as markets for the “commodity” asset price volatility
 - Exposures to volatility are traded and volatility price discovery occur in option markets

Expectations in market crises

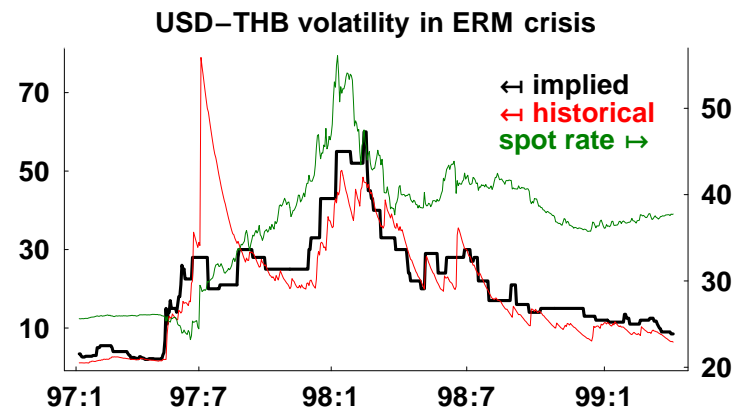
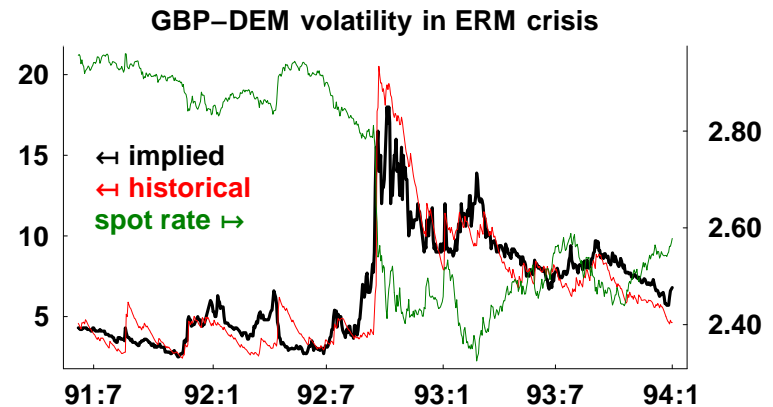
Implied volatility and future volatility

- Theory: implied volatility equal to expected future volatility
- Predictive performance not bad, and seems to have some value for predicting large moves
- Correlations between IV and spot important for hedging
- Self-insurance properties can disappear in crises

Expectations in market crises

Implied volatility behavior in crises

- Charts display historical EWMA volatility (RiskMetrics methodology) and 1-month implied volatility
- Implied typically mean-reverting, not far from historical
- In crises IV anticipatory:
 - Historical lags implied slightly
 - Historical then spikes much higher than implied, but decays rapidly
 - Implied continues to rise, then decays slowly



Expectations in market crises

The volatility smile: Black-Scholes "anomalies"

In the *Black-Scholes world*, each asset has a unique, unchanging implied volatility:

- 1 Implied volatility for options on a given underlying would remain constant over time.
- 2 One implied volatility for on a given underlying, regardless of moneyness (delta) and regardless of whether they are puts or calls.
- 3 One implied volatility for options on a given underlying, regardless of maturity.

Expectations in market crises

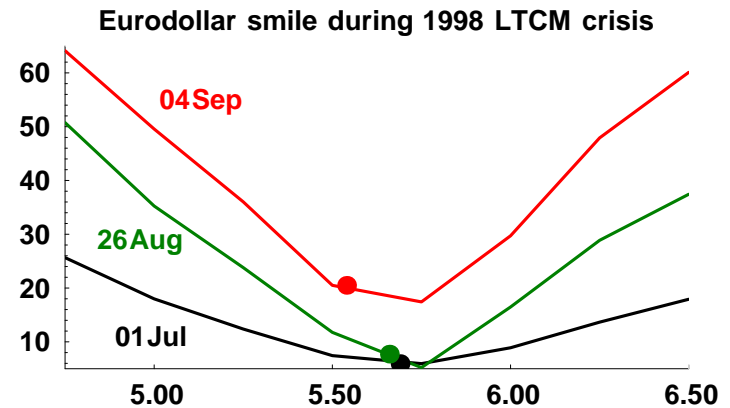
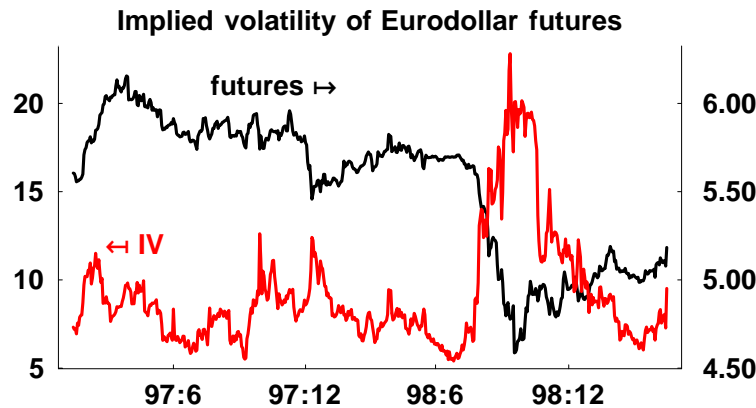
The volatility smile: Black-Scholes "anomalies"

In the *real world*

- 1 Implied vols always changing.
- 2 The **volatility smile**.
 - Out-of-the-money options tend to have higher volatilities than at-the-money.
 - Equally out-of-the-money puts and calls often have different volatilities.
- 3 Implied volatilities for options with different maturities are usually different. This is called the **term structure of volatility**.

Expectations in market crises

Behavior of the volatility smile



- Increase in curvature and skewness toward lower rate
- Accompanied by sharp rise in level of implied volatility

Expectations in market crises

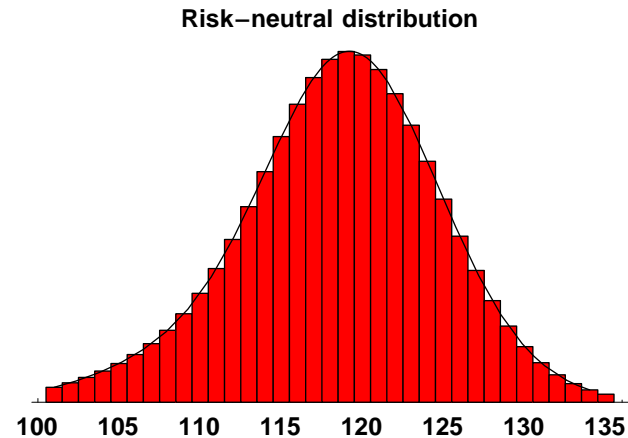
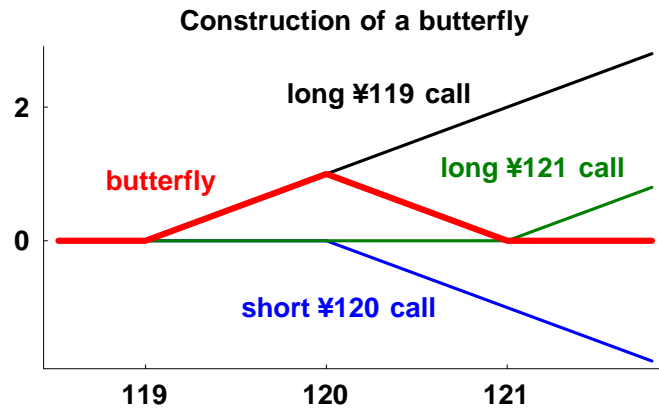
Implied probability distributions

Risk neutral distributions implied by derivatives prices

- Expectations and risk premiums jointly determine asset prices. Can be disentangled only with a model.
- **Risk neutral probabilities:** probabilities of future prices that are embedded in asset prices as they now stand
 - Example: odds at the racetrack are risk neutral, don't necessarily coincide with anyone's personal views
 - Incorporate risk preferences \Rightarrow risk neutral probabilities will fluctuate as risk aversion fluctuates, even with expectations stable
- Risk neutral probabilities can be extracted from current forward-looking asset prices, i.e. forwards, futures and options.

Expectations in market crises

Implied probability distributions



The Breeden-Litzenberger result

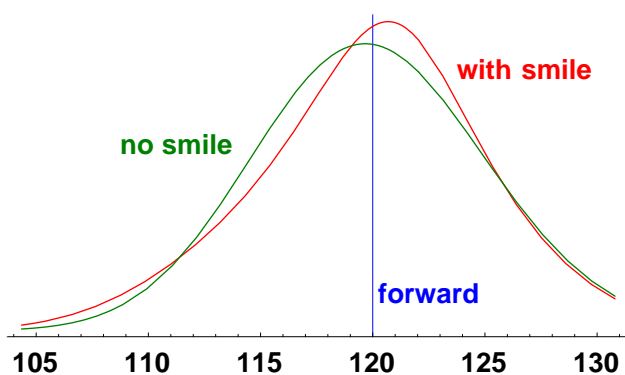
- Second difference of the call price with respect to the exercise price equals the risk neutral density (easy, huh?)
 - That means the curvature of the call function
- ⇒ With a nice dense set of options with different exercise prices but same maturity, just trace out risk neutral density mechanically

Expectations in market crises Implied probability distributions

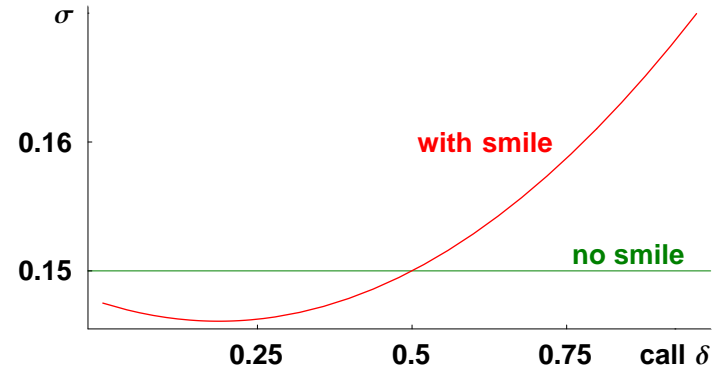
The impact of the smile

- Puts skewness and kurtosis into risk neutral distribution
- Slight alteration in option price, big alteration in curvature

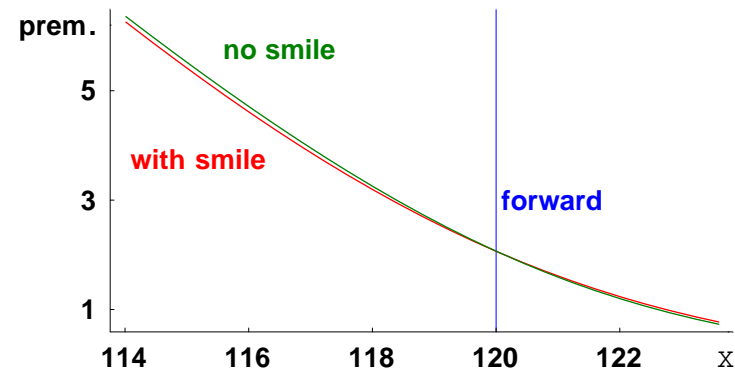
Risk neutral PDF with and without smile



Typical and Black-Scholes vol smile



Call value with and without smile

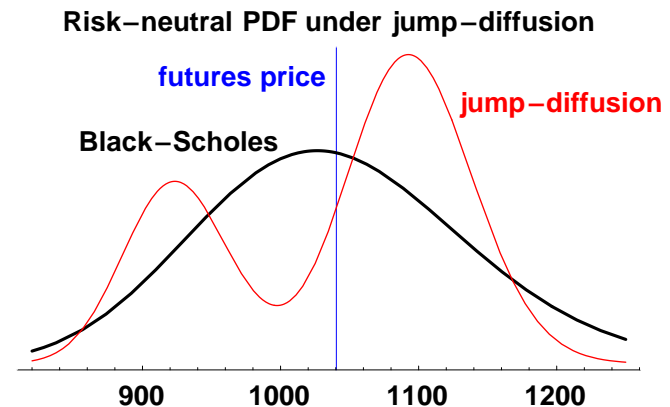


Expectations in market crises

Implied probability distributions

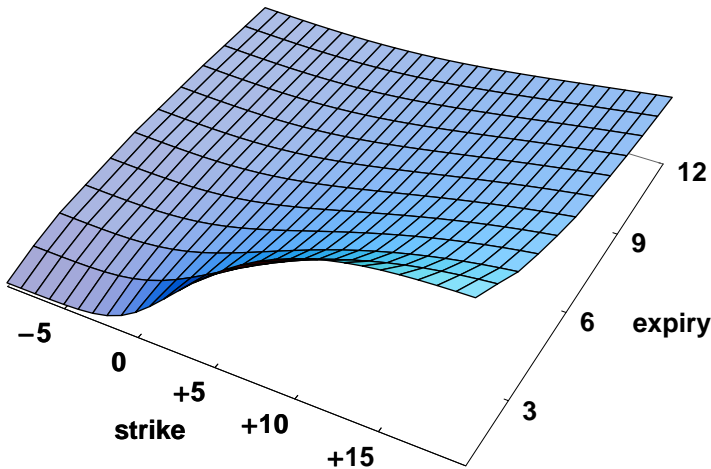
Jump-diffusions

- Combines random walk (diffusion) with jump process
 - Jump timing: Poisson-distributed \Rightarrow jump probability
 - Jump size: random or deterministic
- Use option prices to estimate jump probability = probability something bad occurs
- Estimates for S&P 500
 - 1-month options on 14Sep98
 - 3 parameters to estimate:
 - diffusion vol = 14%
 - jump probability = 32%
 - jump size = -0.15%

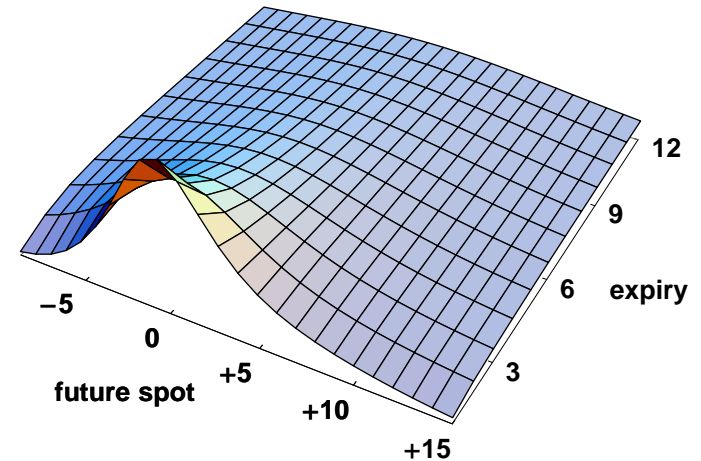


Expectations in market crises Implied probability distributions

USD–JPY implied volatility surface



USD–JPY risk–neutral PDF



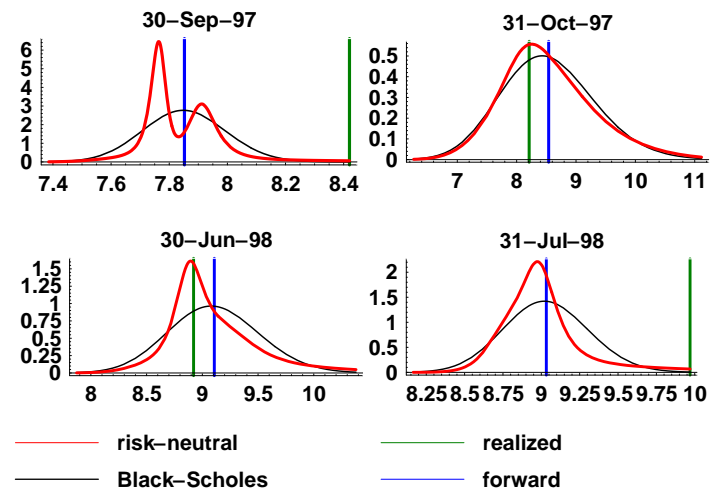
Risk neutral distribution over a range of horizons

- Vol surface → concise view of market expectations over the next year
 - Skew toward strong yen, dissipates for longer horizons
 - Variance increasing over time, as square-root-of-time rule would suggest
- Example USD-JPY 11Nov99
 - Forecast horizons from 1 month to 1 year

Expectations in market crises Implied probability distributions

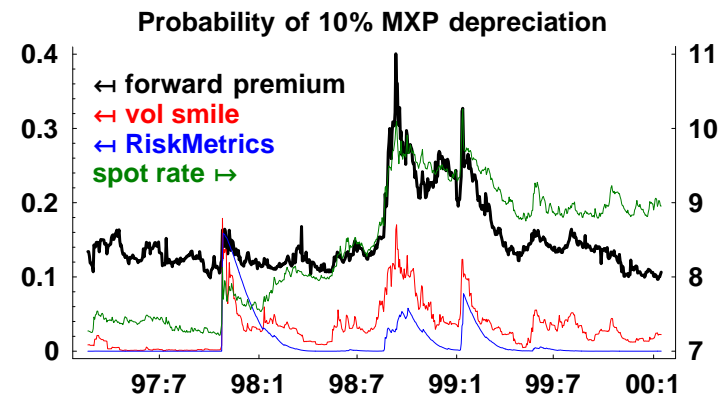
Option-based model using interpolation technique

- Bimodal distribution typical of jump-diffusion
- High variance can swamp kurtosis and skewness
- Poor forecasting by forwards in jump environment



Expectations in market crises Implied probability distributions

- Comparison of forecasts
 - Forward premium: assume depreciation of 10%
 - Volatility smile: implied PDF
 - RiskMetrics EWMA volatility
- Forwards consistently display high probability
- RiskMetrics tracks implied volatility closely but collapses to zero more often



- What are market crises?
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Warning signals

Is there any hope for warning?

- Suddenness of crises
- Macroeconomic predictors
 - Budget deficits, trade and capital flow data
 - Mixed record and long lead times
- Signaling ability of asset prices
 - Most analysis focuses on prediction of future levels or volatilities
 - Reactivity also important: what are the most sensitive indicators?

Warning signals

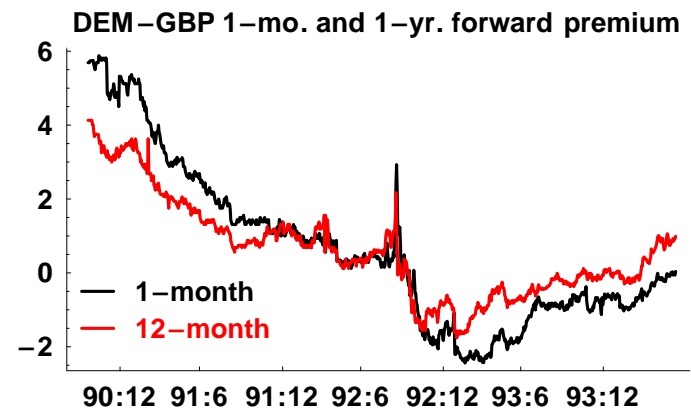
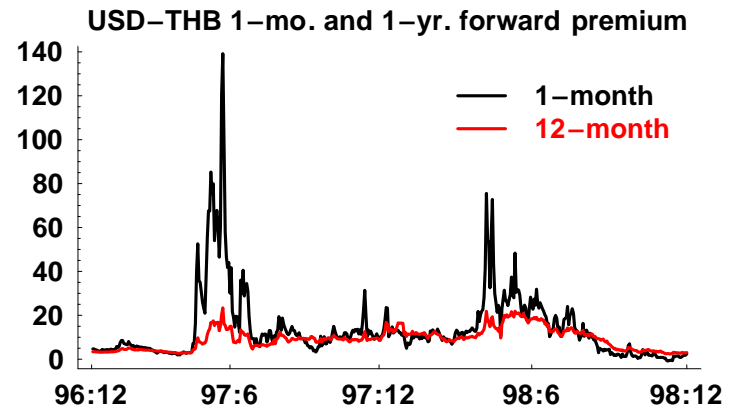
Options versus futures

- Option implied volatility potentially more powerful than forward rates
- Numerical example: assume forward price equal to mean future price, implied volatility equal to return standard deviation.
 - Scenario A: 2 outcomes. Future asset price \$0.90 or \$1.10 (probability 1/2 each). Forward = \$1.00, implied volatility = 10%.
 - Scenario B: 3 outcomes. Future asset price \$0.90 or \$1.10 (probability 45%), or \$0.50 (probability 10%). Forward price = \$0.95, implied volatility = 17.75%.

Warning signals

Behavior of forward foreign exchange

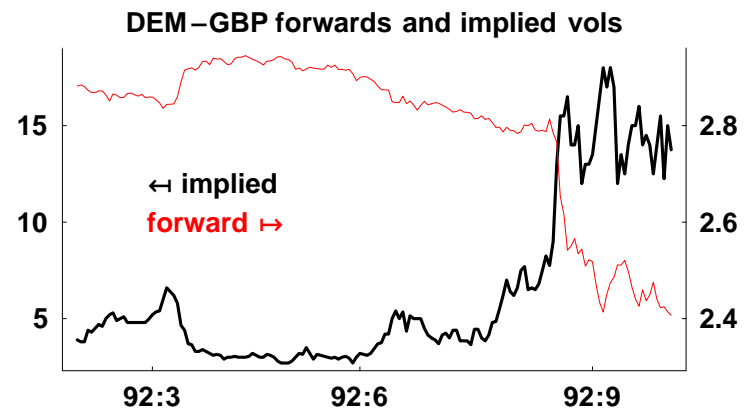
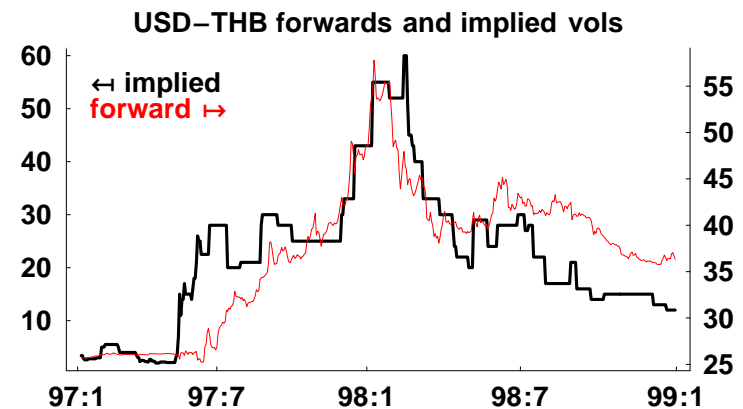
- Common features
 - Forwards indicate imperfect credibility of peg
 - But subdued until crisis begins
 - Sharp increase immediately prior to collapse of peg
- Differences
 - Sterling crisis: breaking of peg leads to rapid drop in premium
 - Thai baht: premium rises to wild levels after peg broken



Warning signals

Currency options and forwards

- Further reason options more sensitive: options less influenced by official intervention
 - Exchange intervention spot (sterling crisis) and forward (Thai baht)
 - Capital controls and informal restrictions on domestic rates
- Implied vols provide a few extra days of warning



Warning signals

Some statistical results

- Study of 11 different assets: FX, fixed income, commodities, equity indexes
- Signal: implied volatility high and rising (high vol of vol)
- Measures of signaling ability
 - Predictive test (Granger causality)
 - True versus false signal (hypergeometric distribution)
- Comparison among
 - Implied volatility
 - unweighted historical volatility
 - RiskMetrics (EWMA) volatility
- Implied superior to both, RiskMetrics superior to unweighted historical