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# The Market Price of Credit Risk

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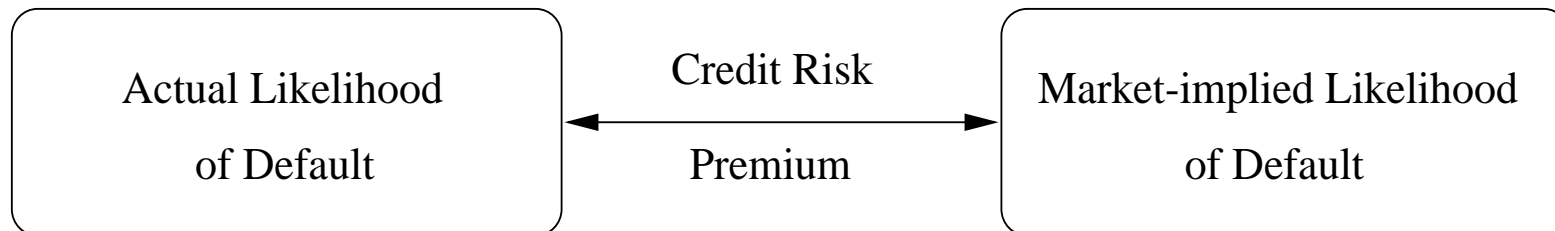
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## We live in a dangerous world

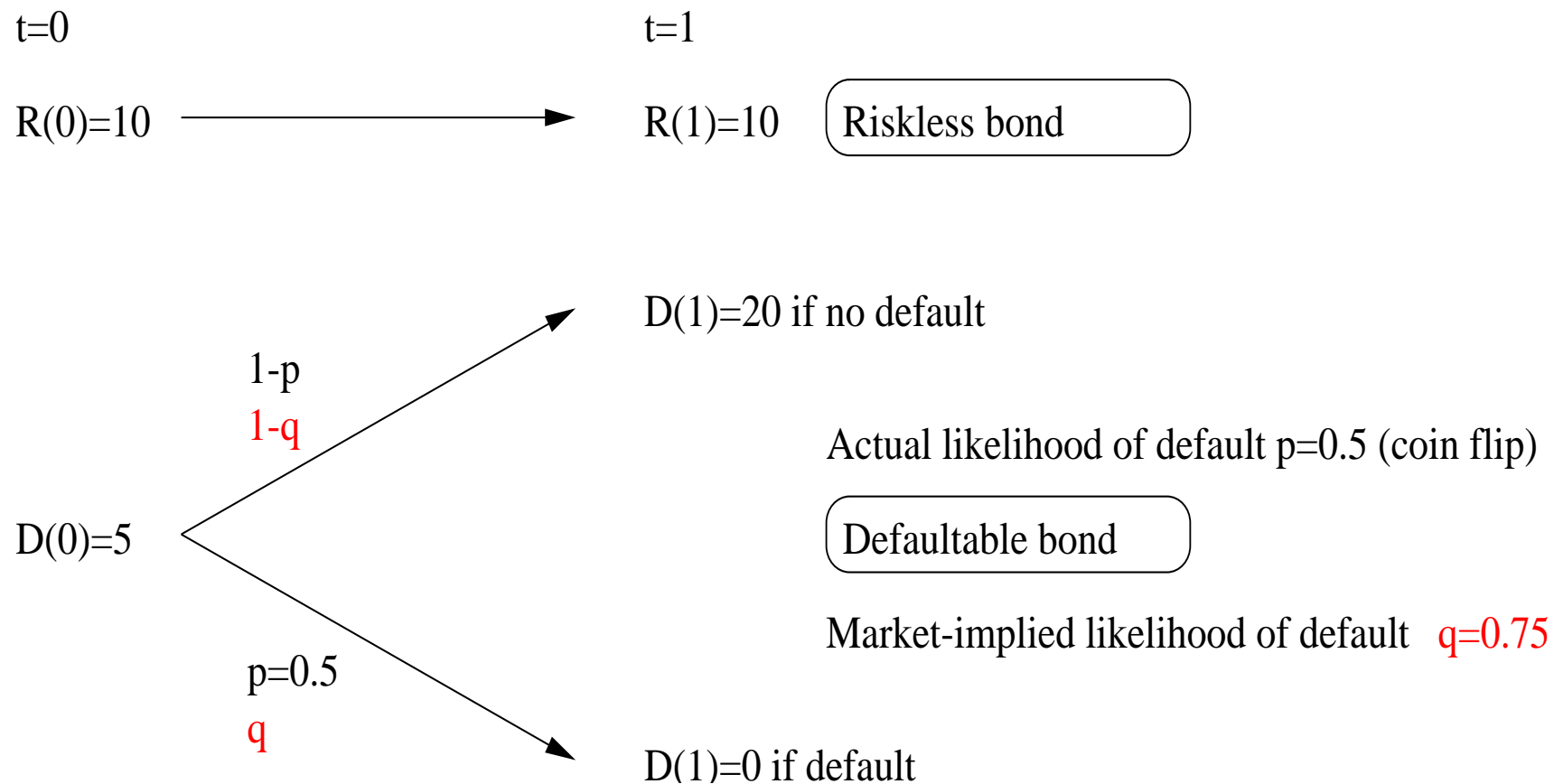
- Issuers of defaultable securities share a common dependence on the economic environment
  - Aggregate credit risk cannot be diversified away
  - Undiversifiable or *systematic risk* commands a premium
    - Risk-averse investors must be compensated for assuming systematic credit risk
  - The credit premium is empirically well-documented, and theoretically complex
    - Why is it important to understand it?
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## How is a credit model used?

- To forecast the actual probability of default
  - Model must reflect historical default experience
  - *Actual* likelihood of default
- To estimate the value of default sensitive securities
  - Model must fit market prices
  - *Market-implied* likelihood of default



# What's the difference?



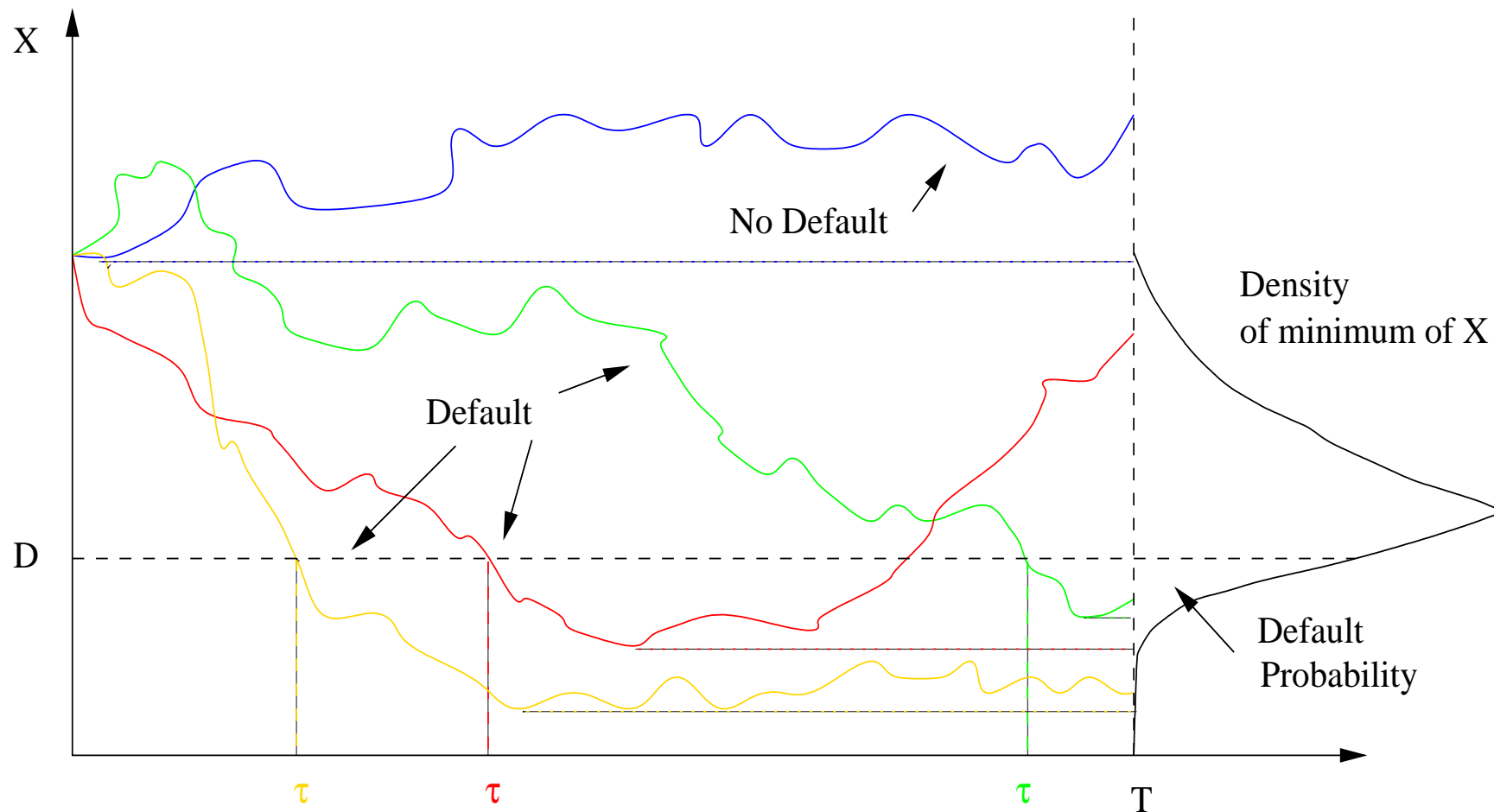
## First passage structural credit model

- Default occurs when firm value  $X$  falls below a barrier  $D$ :

$$\tau = \inf\{t > 0 : X_t \leq D\}$$

- Requires
    - A model of firm value process  $X$
    - A model of default barrier  $D$
  - Identifies equity as a down-and-out call option on the firm
  - Default probability given by the distribution of  $\min_{s \leq T} X_s$
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# First passage structural credit model



## First passage credit risk premium

- Credit risk is exclusively driven by uncertainty about firm value
- Risk premium takes a familiar form ( $X$  a  $(\mu, \sigma)$ -GBM)
  - Excess return on credit sensitive security is equal to its “risk” times the market price of that risk
  - Risk is measured in terms of diffusive price volatility
  - The market price of risk is given by

$$\frac{\mu - r}{\sigma},$$

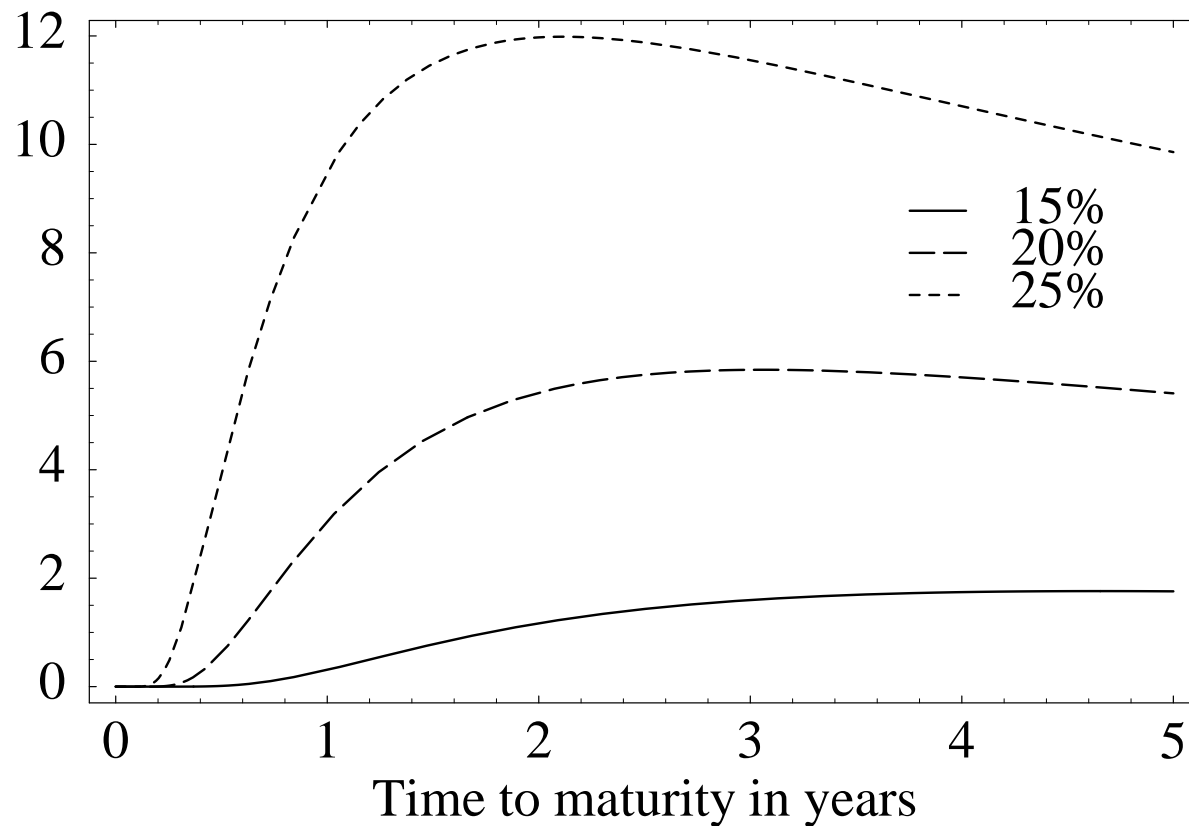
the excess return  $\mu - r$  on the firm per unit of firm risk  $\sigma$

## Caveats

This simple representation of the risk premium neglects the short-term uncertainty surrounding the default

- Distance of firm to default is always certain
- Default is *predictable*, it has an announcing sequence  $(\tau_n) \uparrow \tau$ 
  - Think of  $\tau_n$  as the first time at which assets  $X$  fall dangerously close to the default barrier  $D$
- Results in difficulties in fitting model to security prices
  - No jumps in defaultable security prices upon default
  - Zero short-term spreads

## First passage credit spreads



## What do investors really know?

- It is implicitly assumed that the information used to calibrate and run the model is publicly available
  - Enron, WorldCom, and Tyco: incorrect corporate statements
    - Asset value, volatility, and growth rate?
    - Default trigger level?
  - Relax the assumption that investors are completely informed
    - Distance of firm to default is uncertain
    - Default is *unpredictable* as in the classical reduced-form models
      - \* It has no announcing sequence
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## Incomplete information credit models

- Structure plus short-term uncertainty
  - Economic reasonability and flexibility
    - Intuitive model parameters that can be calibrated to the quality of information available to investors
  - Tractable pricing formulae and empirical plausibility
    - Non-zero short-term spreads
    - Jumps in defaultable security prices upon default
  - Unified perspective on credit models
    - Traditional structural models and intensity based models are special cases
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## $I^2$ credit model

1. *Uncertainty*: probability space  $(\Omega, \mathcal{G}, \pi)$  with filtration  $(\mathcal{G}_t)$
2. *Pre-default firm value*:  $X_t = X_0 e^{V_t}$ , for  $V$   $(m, \sigma)$ -Brownian motion
  - Corresponding historical log-asset low:  $M_t = \min_{s \leq t} V_s$
3. *Default time*  $\tau$ : first passage of  $X(\omega)$  to  $D(\omega)$
4. *Information*: default barrier  $D$  unobservable
  - $\log(D/X_0)$  has continuous distribution function  $G$
  - The filtration is defined by ( $\mathcal{G}_0$  is the set of  $\pi$ -null sets)

$$\mathcal{G}_t = \mathcal{G}_0 \vee \sigma(V_s : s \leq t) \vee \sigma(N_s : s \leq t)$$

5. *Fractional recovery process*  $R$ : at  $\tau$ , a defaultable security recovers a fraction  $R_\tau$  of its pre-default value  $C_{\tau-}$

## Important consequences

- The default stopping time is unpredictable
- Firm value  $\mathcal{X}$  follows the *jump*-diffusion

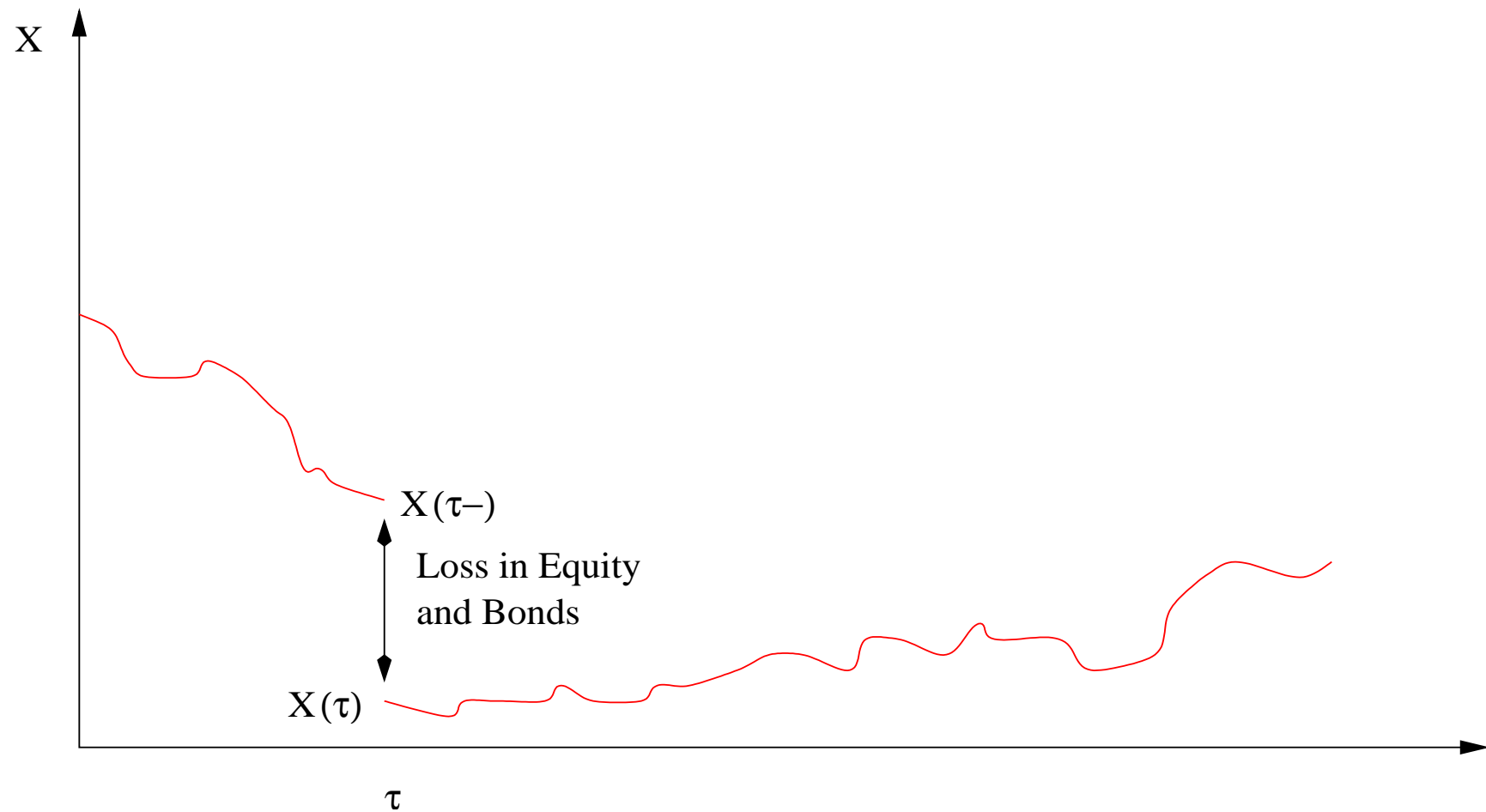
$$\frac{d\mathcal{X}_t}{\mathcal{X}_{t-}} = \mu dt + \sigma dW_t - J_t dN_t$$

where  $J_t \mathcal{X}_{t-}$  is the combined default loss in equity value  $S_t$  and debt value  $B_t$  if default were to occur at  $t$ , i.e.

$$J_t \mathcal{X}_{t-} = S_{t-} + (1 - R_t) \cdot B_{t-}$$

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# Jump in firm value



## Probability of default

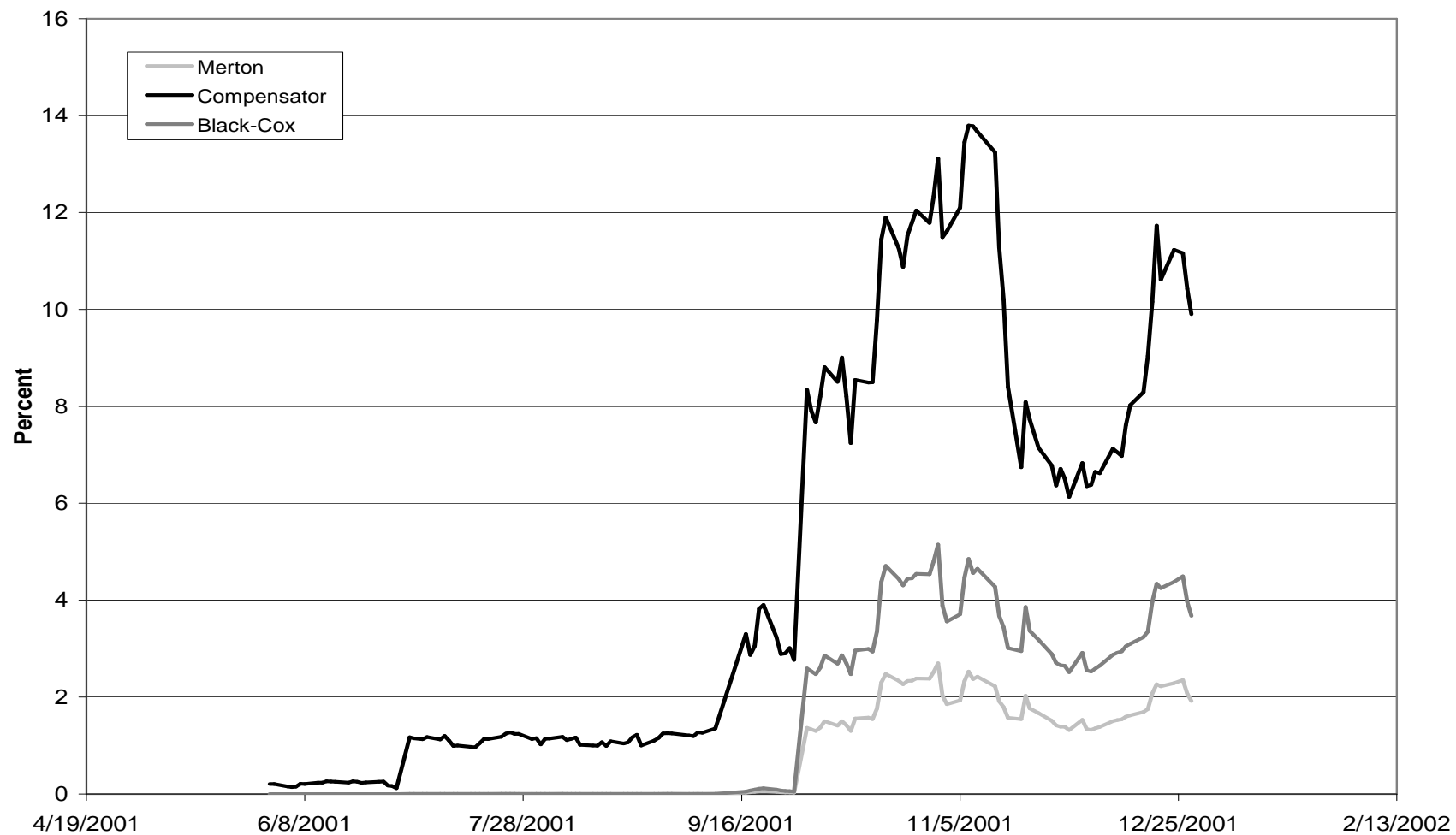
- Default trend  $A_t^\pi = -\log G(M_t)$ 
  - Constructed with techniques from enlargement of filtrations
  - The stopped trend  $A_{\cdot \wedge \tau}^\pi$  is the compensator in the Doob-Meyer decomposition of  $N$ , i.e.  $N - A_{\cdot \wedge \tau}^\pi$  is a martingale
  - Fair compensation for short-term credit risk:

$$A_t^\pi = \lim_{h \downarrow 0} \frac{1}{h} \int_0^t \pi[s < \tau \leq s + h | \mathcal{G}_s] ds$$

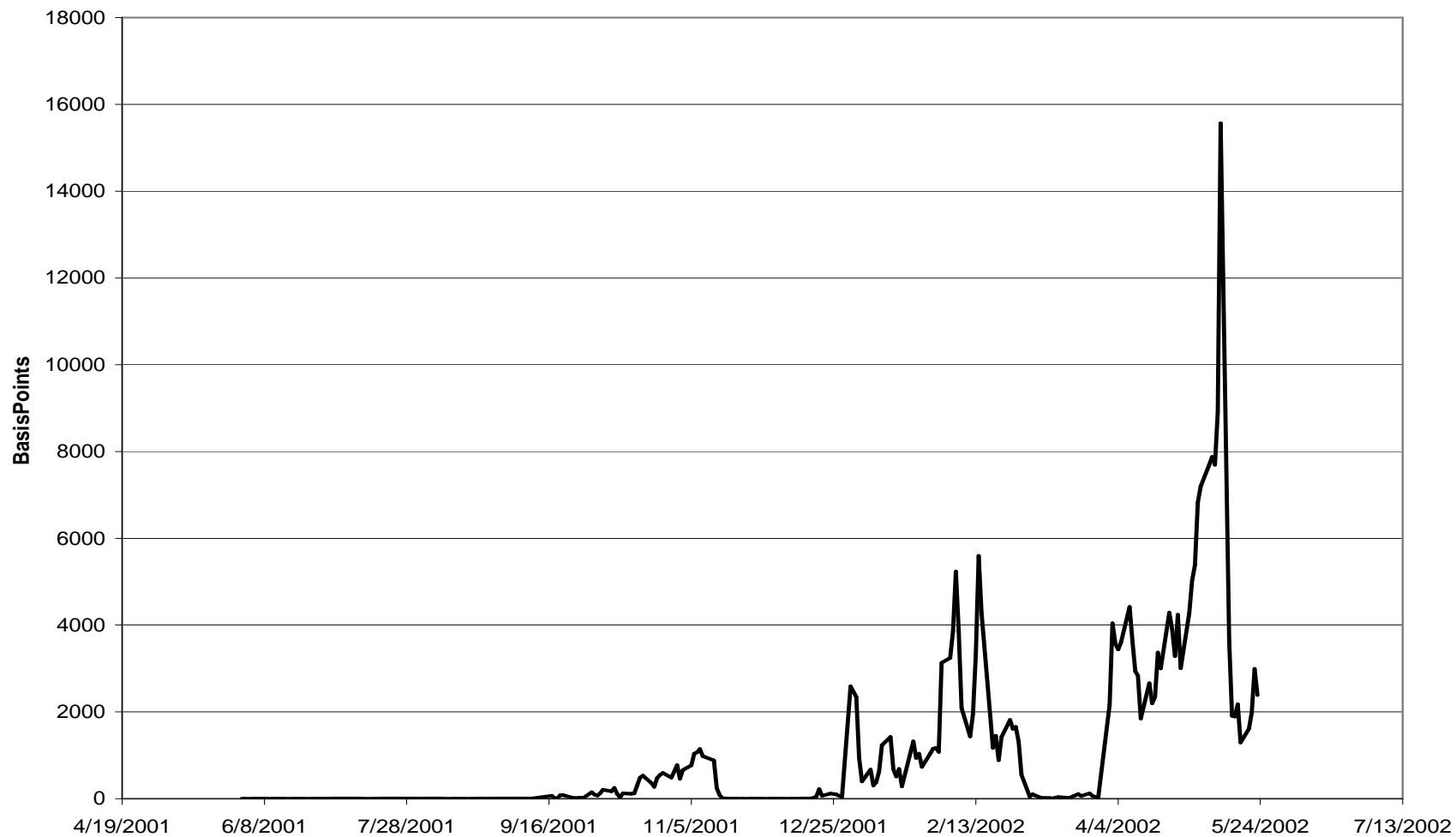
- Generalized reduced-form representation of the survival probability

$$\pi[\tau > T | \mathcal{G}_t] = E^\pi[e^{A_t^\pi - A_T^\pi} | \mathcal{G}_t]$$

## Early reaction: United default probabilities



## Non-zero short-term spreads of United



## Actuarial pricing principle

- Consider a defaultable zero-coupon bond with zero recovery
  - Payoff  $c_T = 1_{\{\tau > T\}}$  at maturity  $T$
- According to the *actuarial principle*, the fair price is

$$C_t = e^{-r(T-t)} E^P [c_T | \mathcal{G}_t] = e^{-r(T-t)} P[\tau > T | \mathcal{G}_t]$$

where  $P$  is the *physical* measure

- Implies that price spread covers only expected default loss
  - But investors are risk-averse and demand extra compensation, or a risk premium, for assuming the risk of losses
- Does not rule out arbitrage

## No-arbitrage pricing principle

- Need to account for risk aversion: generate lower security prices
- Standard approach: retain the form of the principle

$$C_t = e^{-r(T-t)} E^\pi [c_T | \mathcal{G}_t]$$

but substitute a *pricing measure* for  $\pi$

- Events such as  $\{\omega : \tau(\omega) \leq T\}$  are assigned new probabilities
    - They do not reflect the actual  $P$ -likelihood of default
    - They are consistent with market prices
  - If  $\pi$  is a pricing measure,  $C$  defined as above accounts for both expected loss and risk aversion
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## Pricing measures

- The set of pricing measures  $\mathcal{P}$  contains the measures  $Q$  such that
    1. Discounted price processes are  $Q$ -martingales
    2.  $Q$  and  $P$  agree on which sets in  $\mathcal{G}_T$  have measure zero
  - $\mathcal{P}$  is non-empty if and only if prices do not admit arbitrage
    - All pricing measures account for credit risk and each one corresponds to a particular risk premium
  - Markets are complete and default can be hedged perfectly if and only if  $|\mathcal{P}| = 1$
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## Characterizing the measures

- Each measure  $Q$  equivalent to  $P$  can be identified with its density  $Z = Z(Q) \in L^1(P)$  with respect to  $P$

- The  $P$ -martingale  $Z$  can be represented as

$$Z_t = \exp \left( - \int_0^t \alpha_s dW_s - \frac{1}{2} \int_0^t \alpha_s^2 ds + \int_0^t \log(1 + \beta_s) dN_s - \int_0^{t \wedge \tau} \beta_s dA_s^P \right)$$

where  $\alpha$  and  $\beta > -1$  are predictable and satisfy growth conditions

- This extends the familiar result which requires  $Z \in L^2(P)$ 
  - Kusuoka (1999), El-Karoui & Martellini (2001)
- Necessary and sufficient conditions on  $(\alpha, \beta)$  such that  $Q(\alpha, \beta) \in \mathcal{P}$ 
  - Express prices under  $Q$  in terms of  $Z(\alpha, \beta)$

## Martingales and risk premia

- The space of  $L^1(P)$ -martingales is spanned by
    - The Brownian motion  $W$ :  
represents diffusion-type uncertainty in the firm value
    - The compensated jump martingale  $N - A_{\cdot \wedge \tau}^P$ :  
represents jump-type uncertainty in the firm value
  - We use Jacod's (1977) martingale representation results
  - The credit risk premia are proportional to the martingale coefficients
    - $\alpha$  is the *diffusive* risk premium per unit of diffusive risk
    - $\beta$  is the *default event* risk premium
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## Diffusive risk premium

- Excess return  $\mu_C^P - \mu_C^Q = \alpha \cdot \sigma_C$
- Realized as a change to the drift in the security's price process
  - As in Black-Scholes, adjust for aversion towards diffusive risk  $\sigma_C$  by lowering the likelihood of favorable firm value states
- Proportional to the security's diffusive price volatility
  - Proportionality factor  $\alpha$  can be interpreted as the market price of diffusive firm value risk

## Default event risk premium

- For the default trend

$$A_t^Q = \int_0^t (1 + \beta_s) dA_s^P$$

for  $\beta > -1$  a predictable process. Therefore, heuristically,

$$Q[t < \tau \leq t + dt | \mathcal{G}_t] = (1 + \beta_t)P[t < \tau \leq t + dt | \mathcal{G}_t]$$

- Realized as a change to the default probability
  - Adjust for aversion towards default event risk by increasing the likelihood of bad states where default happens earlier
  - Not present in Black-Scholes and other structural credit models
- Analogous to the event risk premium in intensity-based models
  - Jarrow, Lando & Yu (2000), El-Karoui & Martellini (2001)

## Default insurance

- The “value” of default insurance paying 1 at default is given by

$$\begin{aligned}dA_t^Q &= E^Q[dN_t | \mathcal{G}_t] = Q[t < \tau \leq t + dt | \mathcal{G}_t] \\ &= (1 + \beta_t)P[t < \tau \leq t + dt | \mathcal{G}_t]\end{aligned}$$

- $\beta = 0$ : investors are indifferent towards default event risk
    - Value given by the  $P$ -default probability
  - $\beta \in (-1, 0)$ : investors love default event risk
    - Value lower than what is suggested by the  $P$ -default probability
  - $\beta > 0$ : investors are averse towards event risk
    - Value higher than what is suggested by the  $P$ -default probability
    - Empirical evidence: Driessen (2002)
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## Default-contingent claims

- Default-contingent claim  $(T, c_T, R)$ : pay  $c_T \in \mathcal{G}_T$  at  $T$  if there is no default by  $T$  and  $R_\tau \cdot C_{\tau-}$  at default otherwise
  - $c_T = 1$ : defaultable zero coupon bond with fractional recovery

- Fixing some martingale measure  $Q$ , a no-arbitrage price is given by

$$C_t = E^Q [e^{-r(T-t)} c_T 1_{\{\tau > T\}} + e^{-r(\tau-t)} R_\tau \cdot C_{\tau-} \cdot 1_{\{\tau \leq T\}} \mid \mathcal{G}_t]$$

- More tractable representation?
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## Generalized reduced-form pricing

- If the process defined by

$$Y_t = e^{-r(T-t)} E^Q [c_T \exp (A_t^Q(R) - A_T^Q(R)) | \mathcal{G}_t]$$

is continuous at default, then the claim admits a no-arbitrage price of  $C_t = Y_t(Q)$  on the no-default set  $\{\tau > t\}$  at time  $t \leq T$ . Here

$$A_t^Q(R) = \int_0^t (1 - R_s) dA_s^Q$$

is the pricing trend under fractional recovery

- Result holds in *all* credit models with unpredictable defaults
  - As in our context, a default intensity does not need to exist
  - If the intensity exists, results simplify to the formulae in Duffie & Singleton (1999)

## Simultaneous calibration

- Equity, debt and CDS markets plus historical default rates
    - Huang and Huang (2003), Jarrow (2001)
    - Generalized reduced-form formulae
  - Calibrate  $(X, \mu, \sigma, \alpha, \beta, R)$ 
    - Generalized least squares, bounded influence estimators
    - Minimization: Levenberg-Marquardt method
    - Subject to arbitrage conditions on  $\alpha$  and  $\beta$
    - Firm-specific  $(X, \mu, \sigma)$ , market  $(\alpha, \beta, R)$
    - Equilibrium pricing measure
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## Specification of equity

- Classical setting: European call with known strike and maturity
  - $I^2$ : European down and out call with stochastic strike and barrier
    - Values?
    - Maturity?
  - Stay tuned for some numbers...
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