A Puzzle

- So replace it by r.
- Then why not use

$$\frac{e^{r\Delta t} - d}{u - d}$$

as the risk-neutral probability?

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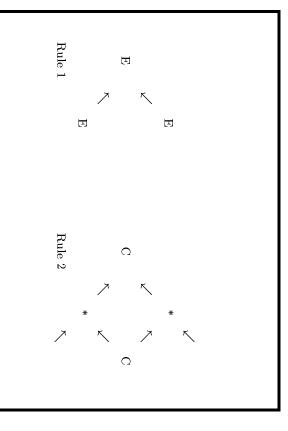
Traversal Sequence

- Can the standard quadratic-time binomial tree algorithm for American options be improved?
- By an order.
- By a constant factor.
- It helps to skip nodes.
- Note the traversal sequence of backward induction on the tree.
- By time.

Diagonal Traversal of the Tree (Curran, 1995)

Properties of the propagation of early exercise nodes (E) and non-early-exercise nodes (C) during backward induction.

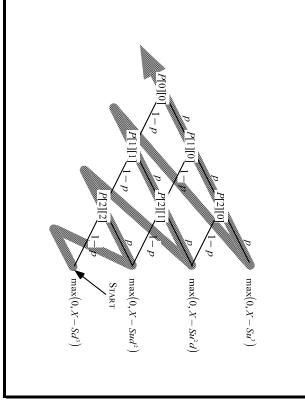
- 1. A node is an early-exercise node if both its successor nodes are exercised early.
- A terminal node that is in-the-money is considered an early exercise node.
- A terminal node that is out-the-money is considered a non-early-exercise node.
- 2. If a node is a non-early-exercise node, then all the earlier nodes at the same horizontal level are also non-early-exercise nodes (assume ud=1).



Diagonal Traversal of the Tree (continued)

- An early-exercise node is trivial to evaluate.
- The difference of the strike price and the stock price.
- A non-early-exercise node must be evaluated by backward induction.
- Suppose we traverse the tree diagonally.
- Convince yourself that this procedure is well-defined

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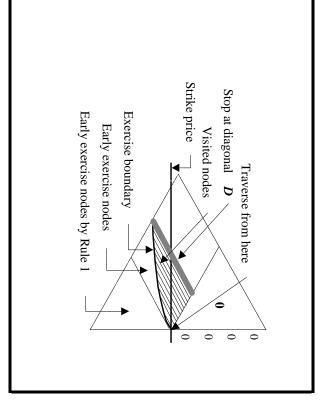
Diagonal Traversal of the Tree (continued)

- Nothing is achieved if the whole tree needs to be explored.
- Need a stopping rule.
- The process stops when a diagonal *D* consisting *entirely* of non-early-exercise nodes has been encountered.
- By Rule 2, all early-exercise nodes have been found.

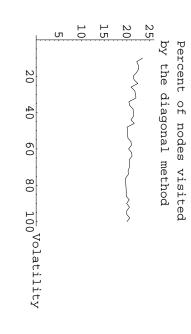
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Diagonal Traversal of the Tree (continued)

- When the algorithm finds an early exercise node in traversing a diagonal, it can stop immediately and move on to the next diagonal.
- By Rule 1 and the sequence by which the nodes on the diagonals are traversed, the rest of the nodes on the current diagonal must all be early-exercise nodes
- They are hence computable on the fly when needed.
- Also by Rule 1, the traversal can start from the zero-valued terminal node just above the strike price.
- The upper triangle above the strike price can be skipped since its nodes are all zero valued.



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Diagonal Traversal of the Tree (continued)

- It remains to calculate the option value.
- It is the sum of the discounted option values of the nodes on D, each multiplied by the probability that the stock price hits the diagonal for the first time at that node.
- How do the payoff influence the root?
- Cannot go from the root to a node at which the option will be exercised without passing through D.

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Diagonal Traversal of the Tree (continued)

- For a node on D which is the result of i up moves and j down moves, the said probability is $\binom{i+j-1}{i}p^i(1-p)^j$.
- A valid path must pass through the node which is the result of i up moves and j-1 down moves.
- Call the option value on this node P_i .
- The desired option value then equals

$$\sum_{i=0}^{a-1} \binom{i+j-1}{i} p^i (1-p)^j P_i e^{-(i+j) r \Delta t}.$$

Diagonal Traversal of the Tree (continued)

- Since each node on D has been evaluated by that time, this part of the computation consumes O(n) time.
- The space requirement is also linear in n since only the diagonal has to be allocated space.
- \bullet This idea can save computation time when D does not take long to find.

IΛ

 $X-Su^id^j$

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Diagonal Traversal of the Tree (continued)

- Rule 2 is true with or without dividends.
- Suppose now that the stock pays a continuous dividend yield $q \le r$ (or $r \le q$ for calls by parity).
- Recall $p = \frac{e^{(r-q)\Delta t} d}{u d}$.
- Rule 1 continues to hold since, for a current stock price of Su^id^j :

Diagonal Traversal of the Tree (concluded)

$$\begin{split} & \left(pP_u + \left(1-p\right)P_d\right)e^{-r\Delta t} \\ = & \left[p\left(X - Su^{i+1}d^j\right) + \left(1-p\right)\left(X - Su^id^{j+1}\right)\right]e^{-r\Delta t} \\ = & Xe^{-r\Delta t} - Su^id^j\left(pu + \left(1-p\right)d\right)e^{-r\Delta t} \\ = & Xe^{-r\Delta t} - Su^id^je^{-q\Delta t} \\ \leq & Xe^{-r\Delta t} - Su^id^je^{-r\Delta t} \end{split}$$

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Sensitivity Analysis of Options

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Sensitivity Measures ("The Greeks")

- Understanding how the value of a security changes relative to changes in a given parameter is key to
- Duration, for instance.
- We now ask same questions of options
- Let $x \equiv \frac{\ln(S/X) + (r + \sigma^2/2)\tau}{\sigma\sqrt{\tau}}$ (recall p. 253).
- $N'(y) = (1/\sqrt{2\pi}) e^{-y^2/2} > 0$, the density function of standard normal distribution.

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Delta

- Defined as $\Delta \equiv \partial f/\partial S$
- -f is the price of the derivative.
- S is the price of the underlying asset.
- The delta of a portfolio of derivatives on the same underlying asset is the sum of their individual deltas
- The delta used in the BOPM is the discrete analog.

Delta (concluded)

• The delta of a European call on a non-dividend-paying stock equals

$$\frac{\partial C}{\partial S} = N(x) > 0. {(57)}$$

• The delta of a European put equals

$$\frac{\partial P}{\partial S} = N(x) - 1 < 0.$$

• The delta of a long stock is 1.

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Delta Neutrality

- A position with a total delta equal to 0 is delta-neutral.
- A delta-neutral portfolio is immune to small price changes in the underlying asset.
- Creating one serves for hedging purposes.
- A portfolio consisting of a call and $-\Delta$ shares of stock is delta-neutral.
- Short Δ shares of stock to hedge a long call.
- Hedge a position in a security with a delta of Δ_1 by shorting Δ_1/Δ_2 units of a security with a delta of Δ_2 .

Theta (Time Decay)

- Defined as the rate of change of a security's value with respect to time, or $\Theta \equiv -\partial f/\partial \tau$.
- For a European call on a non-dividend-paying stock,

$$\Theta = -rac{SN'(x)\,\sigma}{2\sqrt{ au}} - rXe^{-r au}Nig(x-\sigma\sqrt{ au}ig) < 0\,.$$

- The call loses value with the passage of time.
- For a European put,

$$\Theta = -rac{SN'(x)\,\sigma}{2\sqrt{ au}} + rXe^{-r au}N(-x+\sigma\sqrt{ au}).$$

Can be negative or positive.

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Gamma

- Defined as the rate of change of its delta with respect to the price of the underlying asset, or $\Gamma \equiv \partial^2 \Pi/\partial S^2$.
- Measures how sensitive delta is to changes in the price of the underlying asset.
- A portfolio with a high gamma needs in practice be rebalanced more often to maintain delta neutrality.
- Delta ~ duration, gamma ~ convexity.
- The gamma of a European call or put on a non-dividend-paying stock is $N'(x)/(S\sigma\sqrt{\tau}) > 0$.

Vegaª (Lambda, Kappa, Sigma)

- Defined as the rate of change of its value with respect to the volatility of the underlying asset $\Lambda \equiv \partial \Pi/\partial \sigma$.
- Volatility often changes over time.
- A security with a high vega is very sensitive to small changes in volatility.
- The vega of a European call or put on a non-dividend-paying stock is $S\sqrt{\tau}\,N'(x)>0$.
- Higher volatility increases option value.

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Rho

- Defined as the rate of change in its value with respect to interest rates $\rho \equiv \partial \Pi/\partial r$.
- The rho of a European call on a non-dividend-paying stock is

$$X\tau e^{-r\tau}N(x-\sigma\sqrt{\tau})>0.$$

• The rho of a European put on a non-dividend-paying stock is

$$-X\tau e^{-r\tau}N(-x+\sigma\sqrt{\tau})<0.$$

^aVega is not Greek.

Numerical Greeks

- Needed when closed-form formulas do not exist.
- Take delta as an example.
- A standard method computes the finite difference,

$$\frac{f(S+\Delta S)-f(S-\Delta S)}{2\Delta S}$$

• The computation time roughly doubles that for evaluating the derivative security itself.

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An Alternative Numerical Delta

- Use the intermediate results of the binomial tree algorithm (Pelsser and Vorst, 1994).

 When the election reaches the end of the first new terms are the conductions.
- When the algorithm reaches the end of the first period, f_u and f_d are computed.
- These values correspond to derivative values at stock prices Su and Sd, respectively.
- Delta is approximated by

$$\frac{f_u - f_d}{Su - Sd}.$$

• Almost zero extra computational effort.

Numerical Gamma

- At the stock price (Suu + Sud)/2, delta is approximately $(f_{uu} f_{ud})/(Suu Sud)$.
- At the stock price (Sud + Sdd)/2, delta is approximately $(f_{ud} f_{dd})/(Sud Sdd)$.
- Gamma is the rate of change in deltas between (Suu + Sud)/2 and (Sud + Sdd)/2, that is,

$$\frac{\int_{uu}^{uu} \int_{ud}^{Jud} - \int_{ud}^{Jud} \int_{sdd}^{Jud}}{(Suu - Sdd)/2}.$$
 (58)

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Finite Difference Fails for Numerical Gamma

• Numerical differentiation gives

$$\frac{f(S+\Delta S)-2f(S)+f(S-\Delta S)}{(\Delta S)^2}.$$

- Why doesn't it work?
- Why did the binomial tree version work?

Other Numerical Greeks

• The theta can be computed as

$$rac{f_{ud}-f}{2(au/n)}$$
 .

- In fact, the theta of a European option will be shown to be computable from delta and gamma.
- For vega and rho, there is no alternative but to run the binomial tree algorithm twice.

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Extensions of Options Theory

Pricing Corporate Securities (Black and Scholes, 1973)

- Interpret the underlying asset interpretated as the total value of the firm.
- The option pricing methodology can be applied to pricing corporate securities.
- Assume:
- A firm can finance payouts by the sale of assets.
- If a promised payment to an obligation other than stock is missed, the claim holders take ownership of the firm and the stockholders get nothing.

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Risky Zero-Coupon Bonds and Stock

- Consider XYZ.com.
- Capital structure:
- -n shares of its own common stock, S.
- Zero-coupon bonds with an aggregate par value of X.
- What is the value of the bonds, B?
- What is the value of the XYZ.com stock?

Risky Zero-Coupon Bonds and Stock (continued)

- ullet On the bonds' maturity date, if the total value of the firm V^* is less than the bondholders' claim X, the firm declares bankruptcy and the stock becomes worthless.
- If $V^* > X$, then the bondholders obtain X and the stockholders $V^* X$.

Stock	Bonds	
0	V^*	$V^* \leq X$
$V^* - X$	X	$V^* > X$

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Risky Zero-Coupon Bonds and Stock (continued)

- The stock is a call on the total value of the firm with a strike price of X and an expiration date equal to the bonds'.
- This call provides the limited liability for the stockholders.
- The bonds are a covered call on the total value of the firm.
- \bullet C stands for this call and V the total value of the firm.

Risky Zero-Coupon Bonds and Stock (continued)

- Thus nS = C and B = V C.
- Knowing C amounts to knowing how the value of the firm is divided between stockholders and bondholders.
- Whatever the value of C, the total value of the stock and bonds at maturity remains V^* .
- The relative size of debt and equity is irrelevant to the firm's current value V.

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Risky Zero-Coupon Bonds and Stock (continued)

• From Theorem 12 (p. 253) and the put-call parity,

$$\begin{split} nS &= VN(x) - Xe^{-r\tau}N(x - \sigma\sqrt{\tau}), \\ B &= VN(-x) + Xe^{-r\tau}N(x - \sigma\sqrt{\tau}). \\ -x &\equiv \frac{\ln(V/X) + (r + \sigma^2/2)\tau}{\sigma\sqrt{\tau}}. \end{split}$$

• The continuously compounded yield to maturity of the firm's bond is $(1/\tau) \ln(X/B)$.

Risky Zero-Coupon Bonds and Stock (concluded)

• Define default premium as the yield difference between risky and riskless bonds,

$$(1/\tau)\ln(X/B) - r$$

$$= -\frac{1}{\tau}\ln\left(N(-z) + \frac{1}{\omega}N(z - \sigma\sqrt{\tau})\right).$$

$$\equiv Xe^{-r\tau}/V.$$

$$-\omega \equiv Xe^{-r\tau}/V.$$

$$-z \equiv (\ln \omega)/(\sigma\sqrt{\tau}) + (1/2) \sigma\sqrt{\tau} = -x + \sigma\sqrt{\tau}$$

1 Note that ω is the debt-to-total-value ratio

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A Numerical Example

- XYZ.com's assets consist of 1,000 shares of Merck as of March 20, 1995.
- Merck's market value per share is \$44.5
- XYZ.com's securities consist of 1,000 shares of common stock and 30 zero-coupon bonds maturing on July 21,
- Each bond promises to pay \$1,000 at maturity.
- n = 1000, $V = 44.5 \times n = 44500$, and

$$X = 30 \times n = 30000$$
.

			<u> </u>	—Call—	ļ	—Put—
Option	Strike	Exp.	<u>\</u>	Last	<u>%</u>	Last
Merck	30	Jul		151/4	:	:
441/2	35	Jul		91/2	10	1/16
441/2	40	Apr		43/4	136	1/16
441/2	40	Jul		51/2	297	1/4
441/2	40	Oct	58	6 10	10	1/2
441/2	45	Apr		7/8	100	11/8
441/2	45	May		13/8	50	13/8
441/2	45	Jul		115/16	147	13/4
441/2	45	0ct	367	23/4 188	188	21/16

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A Numerical Example (continued)

- The Merck option relevant for pricing is the July call with a strike price of X/n = 30 dollars.
- Such an is selling for \$15.25.
- So XYZ.com's stock is worth $15.25 \times n = 15250$ dollars
- The entire bond issue is worth

$$B = 44500 - 15250 = 29250$$
 dollars—\$975 per bond.

A Numerical Example (continued)

- The XYZ.com bonds are equivalent to a default-free zero-coupon bond with X par value plus n written European puts on Merck at a strike price of 30.
- By the put-call parity.
- The difference between B and the price of the default-free bond is the value of these puts.
- The table next page shows the total market values of the XYZ.com stock and bonds under various debt amounts X.

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Promised payment	Current market	Current market	Current total
to bondholders	value of bonds	value of stock	value of firm
X	B	nS	V
30,000	29,250.0	15,250.0	44,500
35,000	35,000.0	9,500.0	44,500
40,000	39,000.0	5,500.0	44,500
45,000	42,562.5	1,937.5	44,500

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A Numerical Example (continued)

- If the promised payment to bondholders is \$45,000, the relevant option is the July call with a strike price of 45000/n = 45 dollars.
- Since that option is selling for \$115/16, the market value of the XYZ.com stock is $(1+15/16) \times n = 1937.5$ dollars.
- The market value of the stock decreases as the debt-equity ratio increases.

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A Numerical Example (continued)

- There are conflicts between stockholders and bondholders.
- An option's terms cannot be changed after issuance.
- But a firm can change its capital structure.
- There lies one difference between options and corporate securities.
- So parameters such volatility, dividend, and strike price are under partial control of the stockholders.

A Numerical Example (continued)

- Suppose XYZ.com issues 15 more bonds with the same terms to buy back stock.
- The total debt is now X = 45,000 dollars.
- Table on p. 309 says the total market value of the bonds should be \$42,562.5.
- The *new* bondholders pay $42562.5 \times (15/45) = 14187.5$ dollars.
- The remaining stock is worth \$1,937.5.

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A Numerical Example (continued)

 $\bullet\,$ The stockholders therefore gain

$$14187.5 + 1937.5 - 15250 = 875$$

 $dollar_{i}$

• The *original* bondholders lose an equal amount,

$$29250 - \frac{30}{45} \times 42562.5 = 875. \tag{59}$$

A Numerical Example (continued)

- Suppose the stockholders distribute \$14,833.3 cash dividends by selling $(1/3) \times n$ Merck shares.
- They now have \$14,833.3 in cash plus a call on $(2/3) \times n$ Merck shares.
- The strike price remains X = 30000.
- This is equivalent to owning two-thirds of a call on n Merck shares with a total strike price of \$45,000.
- Since n such calls are worth \$1,937.5 from table on p. 306, the total market value of the XYZ.com stock is $(2/3) \times 1937.5 = 1291.67$ dollars.

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A Numerical Example (concluded)

- The market value of the XYZ.com bonds is hence $(2/3) \times n \times 44.5 1291.67 = 28375$ dollars.
- $\bullet\,$ Hence the stockholders gain

$$14833.3 + 1291.67 - 15250 \approx 875$$

dollars.

• The bondholders watch their value drop from \$29,250 to \$28,375, a loss of \$875.

Other Examples

- Subordinated debts as bull call spreads.
- Warrants as calls.
- Callable bonds as American calls with 2 strike prices.
- Convertible bonds.

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Barrier Options

- Their payoff depends on whether the underlying asset's price reaches a certain price level *H*.
- A knock-out option is an ordinary European option which ceases to exist if the barrier H is reached by the price of its underlying asset.
- A call knock-out option is sometimes called a down-and-out option if H < S.
- A put knock-out option is sometimes called an up-and-out option when H > S.

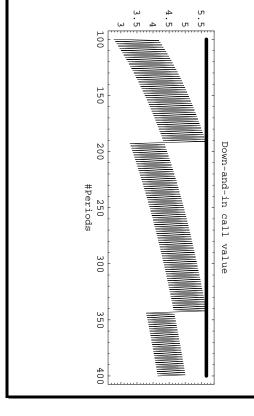
Barrier Options (concluded)

- A knock-in option comes into existence if a certain barrier is reached.
- A down-and-in option is a call knock-in option that comes into existence only when the barrier is reached and H < S.
- An up-and-in is a put knock-in option that comes into existence only when the barrier is reached and H > S.
- Formulas exist for all kinds of barrier options.

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Binomial Tree Algorithms

- Barrier options can be priced by binomial tree algorithms.
- ullet Convergence is erratic because H is not on a price level
- Hence the algorithms are useless.
- Solutions will be presented later.



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Foreign Currencies

- ullet S denotes the spot exchange rate in domestic/foreign terms.
- \bullet σ denotes the volatility of the exchange rate.
- r denotes the domestic interest rate.
- \hat{r} denotes the foreign interest rate.
- A foreign currency is analogous to a stock paying a known dividend yield.
- Foreign currencies pay a "continuous dividend yield" equal to \hat{r} in the foreign currency.

Foreign Exchange Options

- Foreign exchange options are settled via delivery of the underlying currency.
- A primary use of foreign exchange (or forex) options is to hedge currency risk.
- Consider a U.S. company expecting to receive 100 million Japanese yen in March 2000.
- Those 100 million Japanese yen will be exchanged for U.S. dollars.

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Foreign Exchange Options (continued)

- The contract size for the Japanese yen option is JPY6,250,000.
- The company purchases 100,000,000/6,250,000 = 16 puts on the Japanese yen with a strike price of \$.0088 and an exercise month in March 2000.
- This gives the company the right to sell 100,000,000 Japanese yen for $100,000,000 \times .0088 = 880,000$ U.S. dollars.

Foreign Exchange Options (concluded)

• The formulas derived for stock index options in Eqs. (55) on p. 266 apply with the dividend yield equal to \hat{r} :

$$C = Se^{-\hat{r}\tau}N(x) - Xe^{-r\tau}N(x - \sigma\sqrt{\tau}), \tag{60}$$

$$P = Xe^{-r\tau}N(-x + \sigma\sqrt{\tau}) - Se^{-\hat{r}\tau}N(-x).$$
 (60')

$$-x \equiv \frac{\ln(S/X) + (r - \hat{r} + \sigma^2/2)}{\sigma\sqrt{\tau}}.$$

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Path-Dependent Derivatives

- Let S_0, S_1, \ldots, S_n denote the prices of the underlying asset over the life of the option.
- S_0 is the known price at time zero.
- S_n is the price at expiration.
- The standard European call has a terminal value depending only on the last price, $\max(S_n X, 0)$.
- Its value thus depends only on the underlying asset's terminal price regardless of how it gets there.

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Path-Dependent Derivatives (continued)

- In contrast, some derivatives are path-dependent in that their terminal payoffs depend "critically" on the paths.
- The (arithmetic) average-rate call has a terminal value given by

$$\max\left(\frac{1}{n+1}\sum_{i=0}^{n}S_{i}-X,0\right).$$

• The average-rate put's terminal value is given by

$$\max\left(X - \frac{1}{n+1}\sum_{i=0}^n S_i, 0\right).$$

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Path-Dependent Derivatives (continued)

- Average-rate options are also called Asian options
- They are useful hedging tools for firms that will make a stream of purchases over a time period because the costs are likely to be linked to the average price.
- They are mostly European.

Path-Dependent Derivatives (concluded)

- A lookback call option on the minimum has a terminal payoff of $S_n \min_{0 \le i \le n} S_i$.
- A lookback put option on the maximum has a terminal payoff of $\max_{0 \le i \le n} S_i S_n$.
- The fixed-strike lookback option provides a payoff of $\max(\max_{0 \le i \le n} S_i X, 0)$ for the call and $\max(X \min_{0 \le i \le n} S_i, 0)$ for the put.
- Lookback call and put options on the average are called average-strike options.

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Average-Rate Options

- Average-rate options are notoriously hard to price.
- The binomial tree for the averages does not combine.
- A straightforward algorithm is to enumerate the 2^n price paths for an n-period binomial tree and then average the payoffs.
- But the exponential complexity makes this naive algorithm impractical.
- As a result, the Monte Carlo method and approximation algorithms are some of the alternatives left.

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