# 18.600: Lecture 36 Call functions and Black-Scholes

Scott Sheffield

MIT

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- ▶ Let's give C a name: we'll call it the **call function** of X.
  - 1. C(K) is an expectation:  $E[\max(X K, 0)]$ .
  - 2. C(K) is area between y = F(x) and y = 1 and x = K.
  - 3. C(K) is an anti-anti-derivative of the density function f.

Note that C(0) = E[X] and  $\lim_{K\to\infty} C(K) = 0$ . C is convex with slope increasing from -1 to 0.

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So now any random variable X comes with a pdf f = f<sub>X</sub>, a cdf F = F<sub>X</sub> (an anti-derivative of f<sub>X</sub>) and this call function C = C<sub>X</sub> (an anti-anti-derivative of f).

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- Wonder if C is good for anything....

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- Weird fact: If X is a real world random quantity (such as the price of gold or euros or stock shares at a future date) and we use risk neutral probability, then sometimes the call function C (or a related "put function") is what we can look up online. One then uses the quoted C values to work out F<sub>X</sub> and f<sub>X</sub>.

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- Grand story goal: Say something about the link between probability and the real world. What is the probability that price of Microsoft stock will rise by more than ten dollars over the next month? What is the probability that price of oil will drop more than ten percent next year? How can I (using internet and math) come up with a reasonable answer?

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► Can look up C(K) values for stock (say GOOG) at cboe.com, apply smoothing, take derivatives, approximate F<sub>X</sub> and f<sub>X</sub>.

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- For simplicity we focus on call functions in this lecture.

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**Surprise:** No need to guess  $\mu$ . It is fixed by  $X_0, r, \sigma, T$ .

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- Write this as

$$e^{-rT}E[\max\{0, e^N - K\}] = e^{-rT}E[(e^N - K)1_{N \ge \log K}]$$
$$= \frac{e^{-rT}}{\sigma\sqrt{2\pi T}} \int_{\log K}^{\infty} e^{-\frac{(x-\mu)^2}{2T\sigma^2}} (e^x - K) dx.$$

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- We need to compute  $\frac{e^{-rT}}{\sigma\sqrt{2\pi T}} \int_{\log K}^{\infty} e^{-\frac{(x-\mu)^2}{2T\sigma^2}} (e^x K) dx$  where  $\mu = rT + \log X_0 T\sigma^2/2$ .
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- Price of European call is  $\Phi(d_1)X_0 \Phi(d_2)Ke^{-rT}$  where  $d_1 = \frac{\ln(\frac{X_0}{K}) + (r + \frac{\sigma^2}{2})(T)}{\sigma\sqrt{T}}$  and  $d_2 = \frac{\ln(\frac{X_0}{K}) + (r \frac{\sigma^2}{2})(T)}{\sigma\sqrt{T}}$ .

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- Nonetheless, "implied volatility" has become a standard part of the finance lexicon. When traders want to get a rough sense of how a financial derivative is priced, they often ask for the implied volatility (a number automatically computed in many financial software packages).

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- Where arguments for assumption break down: Fluctuation sizes vary from day to day. Prices can have big jumps. Past volatility does not determine future volatility.
- Fixes: variable volatility, random interest rates, Lévy jumps....