Assume that a stock's log returns at any time scale have normal distribution.

• Suppose that its average annual log return is 100%, and its annual standard deviation ("volatility") of log returns is 200%.

What are its average (mu) and standard deviation (sigma) of daily log returns, assuming a year has 250 trading days?

```
trading.days <- 250
annual.ret <- 1
annual.vol <- 2

mu <- annual.ret / trading.days
sigma <- annual.vol / sqrt(trading.days)

prob1 <- list(mu = round(mu, 5), sigma = round(sigma, 5))</pre>
```

Average: 0.004

Standard Deviation: 0.12649

### Problem 2

Simulate 250 instances of the daily log returns described in 1.) with random seed set.seed(2015).

• Compute the net returns of these instances, and compute their average and standard deviation.

```
set.seed(2015)

logRet <- rnorm(250, mu, sigma)
netRet <- exp(logRet) - 1

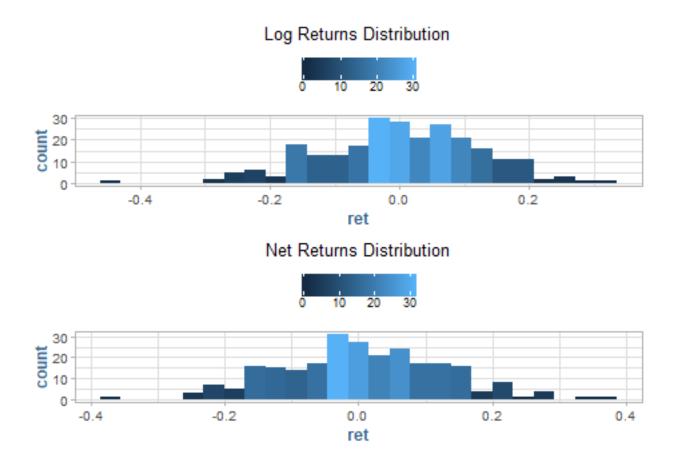
m <- round(mean(netRet), 5)
s <- round(sd(netRet), 5)</pre>
```

Average Net Return: 0.00695

Standard Deviation of Net Returns: 0.12108

Are the average (m) and standard deviation (s) of net returns same as the average and standard deviation of log returns computed in 1.)?

**Answer:** While not identical, they are close enough for practical purposes.



• Compute the quantity  $m - \frac{s^2}{2}$ .

prob3.a 
$$\leftarrow$$
 round(m - s^2/2, 5)

• 
$$m - \frac{s^2}{2} = -0.00038$$

How does this compare with the average log return mu computed in part 1.)?

**Answer:** This is a close approximation to the original value of mu. We should note the extremely small sample size (250), and that a larger sample size (2.5m) produces a closer approximation:

```
set.seed(2015)

logRet <- rnorm(2500000, mu, sigma)
netRet <- exp(logRet) - 1

prob3.b <- round(mean(netRet) - sd(netRet)^2/2, 5)</pre>
```

#### **2.5m samples =** 0.00399

Their equality can be proven analytically through a mathematical theorem called Ito's Lemma that lies at the foundation of Black-Scholes options pricing formula. Their numerical equality is not that good here because Ito's Lemma assumes we can divide a period into infinitesimally small sub-periods.

So divide a year into 25,000 sub-periods (think of these sub-periods roughly as minutes) instead.

```
set.seed(2015)

trading.periods <- 25e3

min_from_days <- function(days) {
   60 * 6.5 * days
}

min.avg <- annual.ret / trading.periods
min.sd <- annual.vol / sqrt(trading.periods)

min.logRet <- rnorm( min_from_days(250), min.avg, min.sd)
min.netRet <- exp(min.logRet) - 1

new.m <- mean(min.netRet)
new.s <- sd(min.netRet)
new.s <- sd(min.logRet)
new.sigma <- sd(min.logRet)

prob3.c <- round(new.m - new.s^2/2, 5)</pre>
```

Compare the new mu (average log return per minute) with the new  $m-\frac{s^2}{2}$  (m is now the average net return per minute).

```
• New mu = 0.00009
• New m - \frac{s^2}{2} = 0.00009
```

Also, compare the new sigma (standard deviation of log returns per minute) with the new s (standard deviation of net return per minute).

New sigma: 0.01267New s: 0.01268

• If we assume that the stock's initial price is \$1, what is the expected value of its log price log(P(t)) after t minutes expressed in terms of *mu*?

### Assuming:

 $\mu$  is the average daily log return,

 $\sigma$  is the standard deviation of the daily log return

There are x minutes in a day, then 1 day = x minutes and 1 minute =  $\frac{1}{x}$  day

For some minute i,

$$\mathbb{E}(r/minute) = \mathbb{E}(r_i) = \frac{\mu}{\sigma}$$

$$\mathbb{V}(r/minute) = \mathbb{V}(r_i) = \frac{\sigma^2}{x^2}$$

$$\sigma(r/minute) = \frac{\sigma}{x}$$

The expected return after t minutes is,

$$\begin{split} P_0 &= 1 \\ P_t &= P_0(1+R_1) \dots (1+R_t) \\ log(P_t) &= (logP_0) + log(1+R_1) + log(1+R_t) \\ P_t &= log(P_0) + r_1 + r_2 + r_t \\ \text{Since } log(1) &= 0 \\ P_t &= \sum_{i=1}^t r_i \\ \mathbb{E}(P_t) &= \mathbb{E}(\sum_{i=1}^t r_i), \\ \mathbb{E}(r_i) &= \frac{\mu}{x} \end{split}$$

• And what is the expected value of its price P(t) expressed in terms of mu and sigma?

$$\mathbb{V}(P_t) = \mathbb{V}(\sum_{i=1}^t r_i) = t \frac{\sigma^2}{x^2}$$
$$\mathbb{E}(P_t) = t \frac{\sigma}{x}$$

• Finally, express these expected values in terms of m and s instead.

$$mP_t = \frac{s}{r}\sqrt{t}$$

The continuously compounded rate of growth of a stock is log(P(t))/t.

• What is the expected continuously compounded rate of growth of the stock in part 4?

$$\frac{P_t}{t} = \sum_{i=1}^t \frac{r_i}{t}$$

$$\mathbb{E}\left[\frac{P_t}{t}\right] = \mathbb{E}\left[\sum_{\frac{r_t}{t}}\right] = t\frac{\frac{\mu}{x}}{t}$$

$$\mathbb{E}\left[\frac{P_t}{t}\right] = \frac{\mu}{x}$$