

# THE CAPITAL ASSET PRICING MODEL

$$R_i = R_f + \beta_i(R_m - R_f)$$

EXAMPLE 1: FIND THE BETA  
OF GOOGLE (IN EXCEL)

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$$R_i = R_f + \beta_i(R_m - R_f)$$



$$R_i - R_f = \beta_i(R_m - R_f)$$

IF WE REARRANGE  
THIS EQUATION

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

$$R_i - R_f = \beta_i(R_m - R_f)$$

DEPENDENT VARIABLE



THIS LOOKS VERY MUCH  
LIKE A LINEAR REGRESSION

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

$$R_i - R_f = \beta_i(R_m - R_f)$$

INDEPENDENT VARIABLE

THIS LOOKS VERY MUCH  
LIKE A LINEAR REGRESSION

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

$$R_i - R_f = \beta_i(R_m - R_f)$$



SLOPE OF THE REGRESSION LINE

THIS LOOKS VERY MUCH  
LIKE A LINEAR REGRESSION

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

$$R_i - R_f = \beta_i(R_m - R_f)$$

↑  
RETURNS OF GOOGLE  
- RISK FREE RATE

WE WANT TO FIND  
THE BETA FOR GOOGLE

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

$$R_i - R_f = \beta_i(R_m - R_f)$$

RETURNS OF AN INDEX THAT  
REPRESENTS THE MARKET -  
RISK FREE RATE

NASDAQ

**EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)**

**LET'S GO THROUGH THE STEPS WE'LL NEED TO DO**

**STEP 1: DOWNLOAD THE HISTORICAL  
PRICES FOR GOOGLE AND NASDAQ  
FROM A FINANCIAL SITE (YAHOO  
FINANCE)**

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STEP 3: DOWNLOAD THE HISTORICAL YIELDS FOR A 5 YR TREASURY BOND (RISK FREE RATE)

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**STEP 4: SUBTRACT THE YIELDS FROM GOOGLE AND NASDAQ RETURNS**

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# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 1: DOWNLOAD THE HISTORICAL PRICES FOR GOOGLE AND NASDAQ FROM A FINANCIAL SITE (YAHOO FINANCE)

YAHOO FINANCE HAS HISTORICAL PRICES FOR STOCKS AND SECURITIES

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

Alphabet Inc. (GOOG) - NasdaqGS  
**697.77** ↓7.30(1.04%) 2:30am

NASDAQ Composite (^IXIC) - Nasdaq GIDS  
**4,557.95** ↓32.52(0.71%) 3:45am

Historical Prices

Historical Prices

Get Historical

Set Date Range

Start Date: Jan 1 2010 Eg. Jan 1, 2010  
End Date: Feb 1 2016

Set Date Range

Start Date: Jan 1 2010 Eg. Jan 1, 2010  
End Date: Feb 1 2016

- Daily
- Weekly
- Monthly
- Dividends Only

Get Prices

**FOR 6 YEARS (JAN 1, 2010 - FEB 1, 2016)**

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# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 2: CONVERT THE PRICES TO RETURNS

THE FILES FROM THE PREVIOUS STEP LOOK LIKE THIS

| Date      | Open   | High    | Low     | Close  | Volume   | Adj Close |
|-----------|--------|---------|---------|--------|----------|-----------|
| 2/1/2016  | 750.46 | 757.86  | 743.27  | 752    | 10278400 | 752       |
| 1/4/2016  | 743    | 752     | 673.26  | 742.95 | 2632600  | 742.95    |
| 12/1/2015 | 747.11 | 779.98  | 724.17  | 758.88 | 2026100  | 758.88    |
| 11/2/2015 | 711.06 | 762.708 | 705.85  | 742.6  | 1801600  | 742.6     |
| 10/1/2015 | 608.37 | 730     | 599.85  | 710.81 | 2333600  | 710.81    |
| 9/1/2015  | 602.36 | 650.9   | 589.38  | 608.42 | 2398400  | 608.42    |
| 8/3/2015  | 625.34 | 674.9   | 565.05  | 618.25 | 2661500  | 618.25    |
| 7/1/2015  | 524.73 | 678.64  | 515.18  | 625.61 | 2955500  | 625.61    |
| 6/1/2015  | 536.79 | 543.74  | 520.5   | 520.51 | 1660600  | 520.51    |
| 5/1/2015  | 538.43 | 544.19  | 521.085 | 532.11 | 1723100  | 532.11    |

WE TAKE THE  
ADJUSTED CLOSING  
PRICE ON EACH  
DAY TO CALCULATE  
THE RETURNS

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 2: CONVERT THE PRICES TO RETURNS

|           | GOOG      | NASDAQ    |
|-----------|-----------|-----------|
| Date      | Adj Close | Adj Close |
| 2/1/2016  | 752       | 4620.37   |
| 1/4/2016  | 742.95    | 4613.95   |
| 12/1/2015 | 758.88    | 5007.41   |
| 11/2/2015 | 742.6     | 5108.67   |
| 10/1/2015 | 710.81    | 5053.75   |
| 9/1/2015  | 608.42    | 4620.16   |
| 8/3/2015  | 618.25    | 4776.51   |
| 7/1/2015  | 625.61    | 5128.28   |
| 6/1/2015  | 520.51    | 4986.87   |
| 5/1/2015  | 532.11    | 5070.03   |

WE CAN CALCULATE THE  
MONTHLY RETURNS FROM  
PRICES

$$\text{RETURN} = \frac{\text{NEW PRICE} - \text{OLD PRICE}}{\text{OLD PRICE}}$$

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 2: CONVERT THE PRICES TO RETURNS

|           | GOOG    | NASDAQ  |
|-----------|---------|---------|
| Date      | Returns | Returns |
| 2/1/2016  | 1%      | 0%      |
| 1/4/2016  | -2%     | -8%     |
| 12/1/2015 | 2%      | -2%     |
| 11/2/2015 | 4%      | 1%      |
| 10/1/2015 | 17%     | 9%      |
| 9/1/2015  | -2%     | -3%     |
| 8/3/2015  | -1%     | -7%     |
| 7/1/2015  | 20%     | 3%      |
| 6/1/2015  | -2%     | -2%     |
| 5/1/2015  | -1%     | 3%      |

WE CAN CALCULATE THE  
MONTHLY RETURNS FROM  
PRICES

$$\text{RETURN} = \frac{\text{NEW PRICE} - \text{OLD PRICE}}{\text{OLD PRICE}}$$

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 1: DOWNLOAD THE HISTORICAL PRICES FOR GOOGLE AND NASDAQ FROM A FINANCIAL SITE (YAHOO FINANCE)

STEP 2: CONVERT THE PRICES TO RETURNS

STEP 3: DOWNLOAD THE HISTORICAL YIELDS FOR A 5 YR TREASURY BOND (RISK FREE RATE)

STEP 4: SUBTRACT THE YIELDS FROM GOOGLE AND NASDAQ RETURNS

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 3: DOWNLOAD THE HISTORICAL YIELDS FOR A 5 YR TREASURY BOND (RISK FREE RATE)

$^FVX$  IS THE SYMBOL FOR 5 YEAR TREASURY BONDS

SEARCH AND DOWNLOAD THE YIELDS  
FOR THIS BOND FROM YAHOO FINANCE

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 3: DOWNLOAD THE HISTORICAL YIELDS FOR A 5 YR TREASURY BOND (RISK FREE RATE)

**^FVX IS THE SYMBOL FOR 5 YEAR TREASURY BONDS**

Treasury Yield 5 Years (^FVX) - Chicago Options ★ Watchlist  
**1.22 ↓0.02(1.61%)** 2:59PM EST

Historical Prices

Get Historical

Set Date Range

Start Date: Jan 1 2010 Eg. Jan 1, 2010  
End Date: Feb 1 2016

Daily  
 Weekly  
 Monthly  
 Dividends Only

Get Prices

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 3: DOWNLOAD THE HISTORICAL YIELDS FOR A 5 YR TREASURY BOND (RISK FREE RATE)

| Tbond     | Adj Close |
|-----------|-----------|
| Tbond     | 1.383     |
| Adj Close | 1.335     |
|           | 1.758     |
|           | 1.654     |
|           | 1.528     |
|           | 1.375     |
|           | 1.541     |
|           | 1.548     |
|           | 1.628     |
|           | 1.467     |

THE ADJ. CLOSE COLUMN IN THIS FILE REPRESENTS THE YIELD %

DIVIDE BY 100 BEFORE STEP 4  
(SUBTRACTING FROM THE RETURNS)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

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# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 4: SUBTRACT THE YIELDS FROM GOOGLE AND NASDAQ RETURNS

| Date      | GOOG Returns | NASDAQ Returns |
|-----------|--------------|----------------|
| 2/1/2016  | 1%           | 0%             |
| 1/4/2016  | -2%          | -8%            |
| 12/1/2015 | 2%           | -2%            |
| 11/2/2015 | 4%           | 1%             |
| 10/1/2015 | 17%          | 9%             |
| 9/1/2015  | -2%          | -3%            |
| 8/3/2015  | -1%          | -7%            |
| 7/1/2015  | 20%          | 3%             |
| 6/1/2015  | -2%          | -2%            |
| 5/1/2015  | -1%          | 3%             |

-

| Tbond Yield |
|-------------|
| 1%          |
| 1%          |
| 2%          |
| 2%          |
| 2%          |
| 1%          |
| 2%          |
| 2%          |
| 2%          |
| 1%          |

=

| GOOG r-rf | Nasdaq rm-rf |
|-----------|--------------|
| 0%        | -1%          |
| -3%       | -9%          |
| 0%        | -4%          |
| 3%        | -1%          |
| 15%       | 8%           |
| -3%       | -5%          |
| -3%       | -8%          |
| 19%       | 1%           |
| -4%       | -3%          |
| -2%       | 1%           |

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STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |

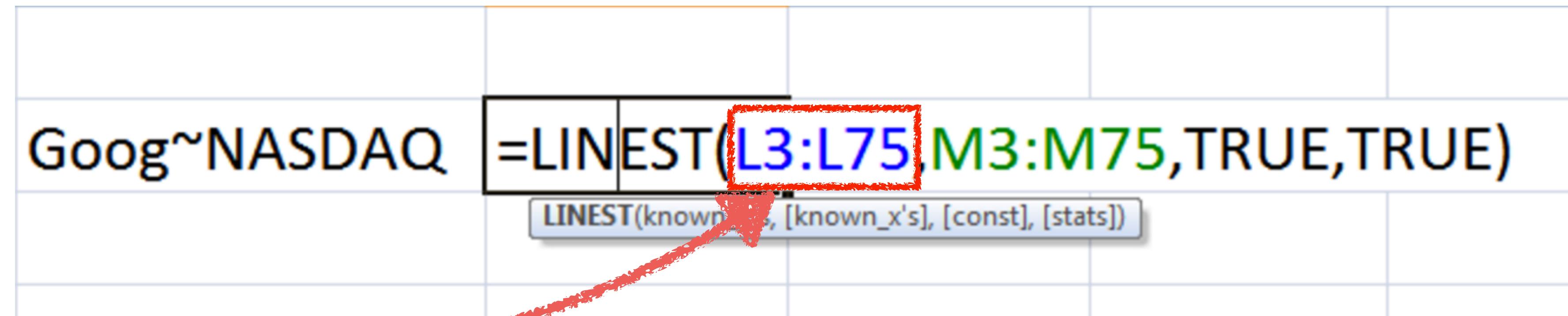
THE LINEST() FUNCTION IN  
EXCEL CAN BE USED FOR LINEAR  
REGRESSION

THIS FUNCTION USES THE ORDINARY  
LEAST SQUARES METHOD

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |

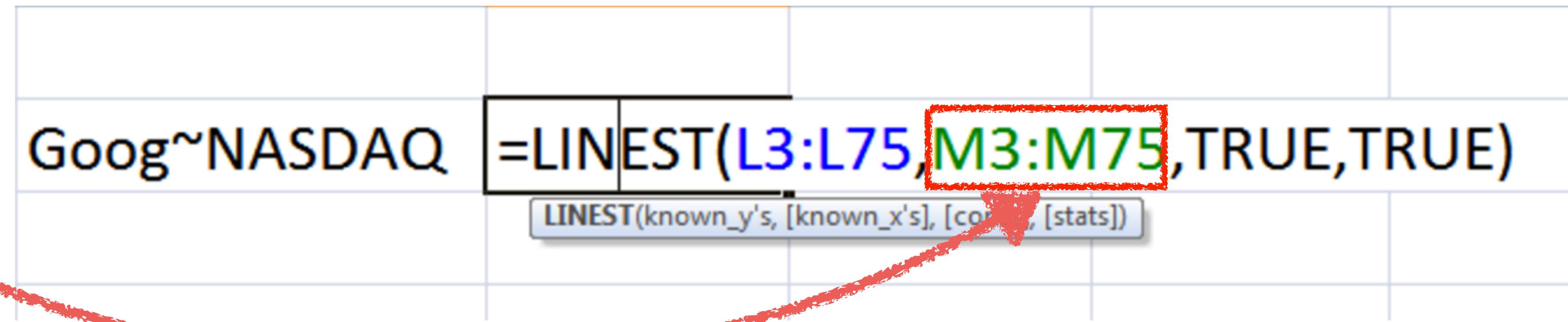


THE DEPENDENT  
VARIABLE

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |



THE INDEPENDENT  
VARIABLE(S)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |

Goog~NASDAQ =LINEST(L3:L75,M3:M75,TRUE,TRUE)

LINEST(known\_y's, [known\_x's], [const], [stats])

SHOULD THERE BE  
AN INTERCEPT

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |

Goog~NASDAQ    =LINEST(L3:L75,M3:M75,TRUE,TRUE)  
LINEST(known\_y's, [known\_x's], [const], [stats])

WHETHER IT SHOULD CALCULATE  
SOME OF THE RELEVANT  
STATISTICS (LIKE R-SQUARE)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

| GOOG | Nasdaq |
|------|--------|
| r-rf | rm-rf  |
| 0%   | -1%    |
| -3%  | -9%    |
| 0%   | -4%    |
| 3%   | -1%    |
| 15%  | 8%     |
| -3%  | -5%    |
| -3%  | -8%    |
| 19%  | 1%     |
| -4%  | -3%    |
| -2%  | 1%     |

Goog~NASDAQ 0.95886

THE RESULT OF LINEST() IS THE SLOPE  
THIS IS THE BETA WE WANT TO FIND

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

LINEST() IS MORE OFTEN USED AS AN  
ARRAY FORMULA

- 1) TO GET THE CO-EFFICIENTS FOR  
MULTIPLE INDEPENDENT VARIABLES
  
- 2) TO GET THE RELEVANT REGRESSION  
STATISTICS LIKE R-SQUARED

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS  
LINEST() IS MORE OFTEN USED AS AN ARRAY FORMULA

|                | Slope | Intercept |         |
|----------------|-------|-----------|---------|
| SE             |       |           | SE      |
| r <sup>2</sup> |       |           | sev     |
| F              |       |           | df      |
| ssreg          |       |           | ssresid |

THE ARRAY RESULT HAS 5 ROWS

# COLUMNS = # INDEPENDENT VARIABLES + 1

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS  
LINEST() IS MORE OFTEN USED AS AN ARRAY FORMULA

|                | Slope | Intercept |         |
|----------------|-------|-----------|---------|
| SE             |       |           | SE      |
| r <sup>2</sup> |       |           | sev     |
| F              |       |           | df      |
| ssreg          |       |           | ssresid |

SELECT AN AREA OF THE  
REQUIRED SIZE (5 ROWS, 2 COLS)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS  
LINEST() IS MORE OFTEN USED AS AN ARRAY FORMULA

|       | Slope       | Intercept |         |
|-------|-------------|-----------|---------|
|       | 0.958859788 | 0.005303  |         |
| SE    | 0.160220029 | 0.007086  | SE      |
| r2    | 0.335305325 | 6%        | sev     |
| F     | 35.81596028 | 71        | df      |
| ssreg | 0.130901804 | 0.259494  | ssresid |

ENTER THE FORMULA

HIT CTRL  
+SHIFT+ENTER

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS  
LINEST() IS MORE OFTEN USED AS AN ARRAY FORMULA

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|-------|-------------|-----------|---------|
|       | 0.958859788 | 0.005303  |         |
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| r2    | 0.335305325 | 6%        | sev     |
| F     | 35.81596028 | 71        | df      |
| ssreg | 0.130901804 | 0.259494  | ssresid |

LET'S PARSE  
THIS RESULT

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
| r2    | 0.335305325 | 6% sev           |
| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

BETA FOR GOOGLE

THE SLOPE OF THE  
REGRESSION LINE

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
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THE INTERCEPT OF  
THE REGRESSION LINE

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
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| F     | 35.81596028 | 71 df            |
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THE SECOND ROW IS THE STANDARD  
ERROR FOR THE CORRESPONDING CO-  
EFFICIENT

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
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| F     | 35.81596028 | 71 df            |
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**STANDARD ERROR**

**THIS TELLS US THE MAGNITUDE THE CO-EFFICIENT MIGHT BE OFF BY**

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
| r2    | 0.335305325 | 6% sev           |
| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

## STANDARD ERROR

STANDARD ERROR CAN BE USED TO  
CALCULATE A TEST STATISTIC ( T-STATISTIC )

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

STANDARD ERROR → T-STATISTIC

THE IDEA IS TO VERIFY WHETHER THE RELATIONSHIP  
BETWEEN THIS VARIABLE AND DEPENDENT VARIABLE

IS 1) A FLUKE (DUE TO SOME  
CHANCE VARIATION IN THE DATA)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

**STANDARD ERROR** → **T-STATISTIC**

THE IDEA IS TO VERIFY WHETHER THE RELATIONSHIP BETWEEN THIS VARIABLE AND GOOGLE RETURNS

IS 1) A FLUKE (DUE TO SOME CHANCE VARIATION IN THE DATA)

OR 2) A REAL RELATIONSHIP  
(STATISTICALLY SIGNIFICANT)

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
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| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

## STANDARD ERROR

THIS AND OTHER STATISTICS THAT LINEST() PROVIDES  
HELP YOU FIND OUT HOW WELL (ACCURATELY) THE  
REGRESSION LINE EXPLAINS THE HISTORICAL DATA

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
| r2    | 0.335305325 | 6% sev           |
| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

R-SQUARED

WHAT % OF THE VARIATION IN THE  
DEPENDENT VARIABLE HAS BEEN EXPLAINED

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

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SUM OF SQUARES OF REGRESSION  
NUMERATOR IN R-SQUARED

$$R^2 = \frac{SSR}{SST} = \frac{\sum (\hat{y}_i - \bar{y})^2}{\sum (y_i - \bar{y})^2}$$

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

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SUM OF SQUARES OF REGRESSION

THE AMOUNT OF VARIATION  
IN Y THAT'S EXPLAINED

$$R^2 = \frac{SSR}{SST} = \frac{\sum (\hat{y}_i - \bar{y})^2}{\sum (y_i - \bar{y})^2}$$

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

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|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
| r2    | 0.335305325 | 6% sev           |
| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

**SUM OF SQUARES OF RESIDUALS**

THE AMOUNT OF VARIATION IN Y THAT HAS  
NOT BEEN EXPLAINED

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

|       | Slope       | Intercept        |
|-------|-------------|------------------|
|       | 0.958859788 | 0.005303         |
| SE    | 0.160220029 | 0.007086 SE      |
| r2    | 0.335305325 | 6% sev           |
| F     | 35.81596028 | 71 df            |
| ssreg | 0.130901804 | 0.259494 ssresid |

## THE F-STATISTIC

THIS IS A TEST STATISTIC THAT WE CAN USE TO TELL  
IF THE TRUE VALUE OF R-SQUARED IS 33% OR NOT

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

IN A REGRESSION

THE F-STATISTIC

VS THE T-STATISTIC

TELLS US IF THE  
ENTIRE MODEL  
IS STATISTICALLY  
SIGNIFICANT

TELLS US IF THE  
EACH CO-EFFICIENT  
IS STATISTICALLY  
SIGNIFICANT

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

IN A REGRESSION

THE F-STATISTIC

TELLS US HOW  
GOOD THE  
OVERALL  
MODEL IS

VS THE T-STATISTIC

TELLS US HOW  
IMPORTANT THE  
INCLUSION OF EACH  
VARIABLE IN THE  
MODEL IS

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

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DEGREES OF FREEDOM

NUMBER OF DATA POINTS - NUMBER OF VARIABLES - 1

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

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DEGREES OF FREEDOM

USEFUL TO CALCULATE THE F-STATISTIC

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STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

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**STANDARD ERROR OF Y**

IF YOU USE THIS REGRESSION TO PREDICT THE  
GOOGLE RETURNS, IT COULD BE OFF BY ~6% PTS

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

**STANDARD ERROR OF Y**

$$\sigma_{est} = \sqrt{\frac{\sum(Y - Y')^2}{N}}$$

**SQRT(AVERAGE OF SQUARED ERROR)**

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

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**STANDARD ERROR OF Y**

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# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

THE LINEST() FUNCTION IN EXCEL IS  
PRETTY COOL, BUT FOR SEVERAL  
REASONS IT MAKES SENSE TO USE  
A PROGRAMMING LANGUAGE LIKE  
R TO DO REGRESSION

# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

## STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

THE LINEST() FUNCTION IN EXCEL IS PRETTY COOL, BUT FOR SEVERAL REASONS IT MAKES SENSE TO USE A PROGRAMMING LANGUAGE LIKE R TO DO REGRESSION

- 1) YOU CAN EASILY AUTOMATE A NUMBER OF THE MANUAL STEPS PRE-REGRESSION
- 2) REGRESSION IN R IS MUCH MORE POWERFUL

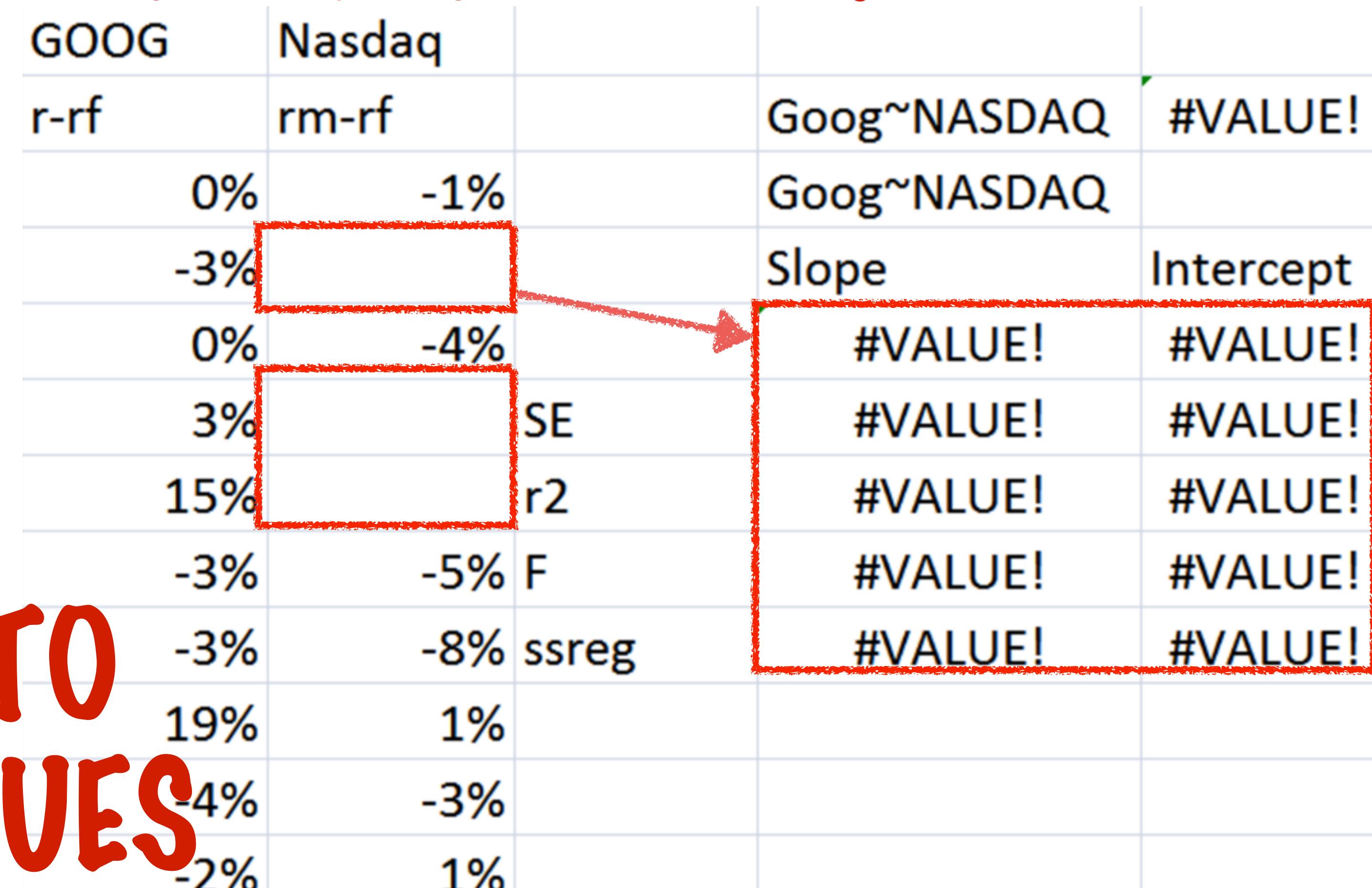
# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

2) REGRESSION IN R IS MUCH MORE POWERFUL

ONE SIMPLE EXAMPLE  
IS THAT IF THERE ARE  
MISSING VALUES IN  
THE DATA, LINEST WILL  
THROW AN ERROR

R ENABLES YOU TO  
HANDLE THESE ISSUES



# EXAMPLE 1: FIND THE BETA OF GOOGLE (IN EXCEL)

STEP 5: REGRESS THE ADJUSTED GOOGLE RETURNS AGAINST NASDAQ RETURNS

2) REGRESSION IN R IS MUCH MORE POWERFUL

LINEST() ENABLES YOU TO  
CALCULATE THE TEST STATISTICS

R DOES

BUT DOES NOT DIRECTLY GIVE YOU  
THE STATISTICAL SIGNIFICANCE OF  
THE MODEL OR CO-EFFICIENTS