

Statistics and Quantitative Analysis U4320

Segment 2: Descriptive Statistics

Prof. Sharyn O'Halloran

Types of Variables

- Nominal Categories
 - Names or types with no inherent ordering:
 - Religious affiliation
 - Race
 - Marital status
- Ordinal Categories
 - Variables with a rank or order
 - University Rankings
 - Level of education
 - Academic position

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2

Types of Variables (con't)

- Interval/Ratio Categories
 - Variables are ordered and have equal space between them
 - Salary measured in dollars
 - Age of an individual
 - Number of children
 - Thermometer scores measure intensity on issues
 - Views on abortion
 - Whether someone likes China
 - Feelings about US-Japan trade issues
 - Any dichotomous variable
 - A variable that takes on the value 0 or 1.
 - A person's gender (M=0, F=1)

3

Note on thermometer scores

- Make assumptions about the relation between different categories.
 - For example, if we look at the liberal to conservative political spectrum:

Strong Dem Dem Weak Dems IND Weak Rep Rep Strong Rep



- Distance among groups is the same for each category.

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Measuring Data

Discrete Data

- Takes on only integer values
 - whole numbers no decimals
 - E.g., number of people in the room

Continuous Data

- Takes on any value
 - All numbers including decimals
 - E.g., Rate of population increase

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Discrete Data

Example: Absenteeism for 50 employees

I	II	III	IV	V
Absences x	Frequency f	Relative Frequency f/N	$x - \bar{X}$	$f(x - \bar{X})^2$
0	3	.06	-4.86	70.8
1	2	.04	-3.86	29.8
2	5	.10	-2.86	40.9
3	8	.16	-1.86	27.7
4	7	.14	-0.86	5.2
5	2	.04	0.14	.04
6	13	.26	1.14	16.9
7	2	.04	2.14	9.2
8	4	.08	3.14	39.4
9	0	.00	4.14	0
10	1	.02	5.14	26.4
11	2	.04	6.14	75.4
12	0	.00	7.14	0
13	1	.02	8.14	66.3
N=50		1.00		S = 408.02

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6

Discrete Data (con't)

Absenteeism for 50 employees

I	II	III	IV	V
Absences x	Frequency f	Relative Frequency f/N	$x - \bar{X}$	$f(x - \bar{X})^2$
0	3	.06	-4.86	70.8
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4	7	.14	-0.86	5.2
5	2	.04	0.14	.04
6	13	.26	1.14	16.9
7	2	.04	2.14	9.2
8	4	.08	3.14	39.4
9	0	.00	4.14	0
10	1	.02	5.14	26.4
11	2	.04	6.14	75.4
12	0	.00	7.14	0
13	1	.02	8.14	66.3
N=50		1.00		S = 408.02

Frequency

- Number of times we observe an event
 - In our example, the number of employees that were absent for a particular number of days.
 - Three employees were absent no days (0) through out the year

Relative Frequency

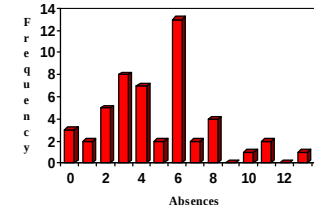
- Number of times a particular event takes place in relation to the total.
 - For example, about a **quarter** of the people were absent exactly 6 times in the year.
- Why do you think this was true?

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Discrete Data: Chart

- Another way that we can represent this data is by a chart.



- Again we see that more people were absent 6 days than any other single value.

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Continuous Data

Example: Men's Heights

Height	Midpoint	Frequency (f)	Relative Frequency (f / N)	Percentile (Cumulative Frequency)
58.5-61.5	60	4	.02	.02
61.5-64.5	63	12	.06	.08
64.5-67.5	66	44	.22	.30
67.5-70.5	69	64	.32	.62
70.5-73.5	72	56	.28	.90
73.5-76.5	75	16	.08	.98
76.5-79.5	78	4	.02	1.00
		N=200	1.00	

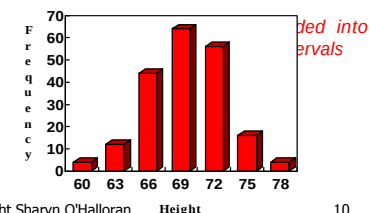
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Continuous Data (cont)

- Note: must decide how to divide the data
 - The interval you define changes how the data appears.
 - The finer the divisions, the less bias.
 - ut more ranges make it difficult to display and interpret.

Chart

Can represent information graphically



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Continuous Data: Percentiles

- The Nth percentile
 - The point such that n-percent of the population lie below and (100-n) percent lie above it.

What interval is the 50th percentile?

Height Example

Height	Midpoint	Frequency (f)	Relative Frequency (f / N)	Percentile (Cumulative Frequency)
58.5-61.5	60	4	.02	.02
61.5-64.5	63	12	.06	.08
64.5-67.5	66	44	.22	.30
67.5-70.5	69	64	.32	.62
70.5-73.5	72	56	.28	.90
73.5-76.5	75	16	.08	.98
76.5-79.5	78	4	.02	1.00
		N=200	1.00	

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Continuous Data: Income example

- What interval is the 50th percentile?

Average Income in California Congressional Districts

Cells	Freq	Tally	Relative Frequency
\$0-\$20,708	1	X	0.019
\$20,708-\$25,232	3	XXX	0.057
\$25,232-\$29,756	7	XXXXXXX	0.135
\$29,756-\$34,280	15	XXXXXXXXXXXXX	0.289
\$34,280-\$38,805	8	XXXXXXXXXX	0.154
\$38,805-\$43,329	4	XXXX	0.077
\$43,329-\$47,853	8	XXXXXXXXXX	0.154
\$47,853-\$52,378	6	XXXXXX	0.115

n = 52

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12

Measures of Central Tendency

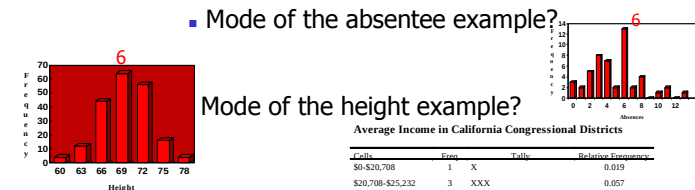
- Mode
 - The category occurring most often.
- Median
 - The middle observation or 50th percentile.
- Mean
 - The average of the observations

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13

Central Tendency: Mode

- The category that occurs most often.



Mode of the height example?

- What is the mode of the income example?

Average Income in California Congressional Districts

Income	Freq	Tally	Relative Frequency
\$0-\$20,708	1	X	0.019
\$20,708-\$25,232	3	XXX	0.057
\$25,232-\$29,756	7	XXXXXXX	0.135
\$29,756-\$34,280	15	XXXXXXXXXXXXX	0.289
\$34,280-\$38,805	8	XXXXXXXXXX	0.154
\$38,805-\$43,329	4	XXXX	0.077
\$43,329-\$47,853	8	XXXXXXXXXX	0.154
\$47,853-\$52,378	6	XXXXXX	0.115

n = 52

14

Central Tendency: Median

- The middle observation or 50th percentile.

Median of the height example?

Height Example

Height	Midpoint	Frequency (f)	Relative Frequency (f/N)	Percentile (Cumulative Frequency)
58.5-61.5	60	4	.02	.02
61.5-64.5	63	12	.06	.08
64.5-67.5	66	44	.22	.30
67.5-70.5	69	64	.32	.62
70.5-73.5	72	56	.28	.90
73.5-76.5	75	16	.08	.98
76.5-79.5	78	4	.02	1.00
		N=200	1.00	

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15

Median of the absentee example?

Absentee Example

I	II	III	IV	V
Absences	Frequency f	Relative Frequency f/N	$x - \bar{x}$	$f(x - \bar{x})$
0	3	.06	-4.86	-20.8
1	2	.04	-3.86	-20.8
2	6	.12	-2.86	-34.9
3	8	.16	-1.86	-29.7
4	7	.14	-.86	-6.2
5	2	.04	0.14	.08
6	13	.26	1.14	16.9
7	2	.04	2.14	9.2
8	4	.08	3.14	10.4
9	6	.12	4.14	6.6
10	1	.02	5.14	-6.4
11	2	.04	6.14	-7.6
12	6	.12	7.14	6.6
13	1	.02	8.14	-6.3
	N=50	1.00		S = 49.02

Central Tendency: Mean

- The average of the observations.
- Defined as:

$$\frac{\text{The sum of observations}}{\text{Number of observations}}$$

- This is denoted as:

$$\bar{X} = \frac{\sum_{i=1}^N X_i}{N}$$

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16

Central Tendency: Mean (con't)

■ Notation:

- x_i 's are different observations
 - Let x_i stand for the each individual's height:
 - x_1 (Sam), x_2 (Oliver), x_3 (uddy), or observation 1, 2, 3
 - x stands for height in general
 - x_1 stands for the height for the first person.
- When we write Σ (the sum) of x_i we are adding up all the observations.

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17

Central Tendency: Mean (con't)



■ Example: Absenteeism

- What is the average number of days any given worker is absent in the year?
 - First, add the fifty individuals' total days absent (**243**).
 - Then, divide the sum (**243**) by the total number of individuals (**50**).
 - We get 243/50, which equals **4.86**.

Absentee Example

I	II	III	IV	V
Absences	Frequency	Relative Frequency	$x - \bar{x}$	$f(x - \bar{x})$
x	f	f/N		
0	3	.06	-4.86	-29.0
1	2	.04	-3.86	-15.4
2	5	.10	-2.86	-14.3
3	8	.16	-1.86	-14.9
4	7	.14	-.86	-6.0
5	2	.04	0.14	.3
6	13	.26	1.14	14.8
7	2	.04	2.14	8.3
8	4	.08	3.14	12.6
9	0	.00	4.14	0
10	1	.02	5.14	5.1
11	2	.04	6.14	12.3
12	0	.00	7.14	0
13	1	.02	8.14	8.1
	N=50	1.00		S = -499.02

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1

Central Tendency: Mean (con't)

- Alternatively use the frequency
 - Add each event times the number of occurrences
 - 0 3 1 2 , which is [lect2.xls](#)

Absentee Example

I	II	III	IV	V
Absences	Frequency	Relative Frequency	$x - \bar{x}$	$f(x - \bar{x})$
x	f	f/N		
0	3	.06	-4.86	-29.0
1	2	.04	-3.86	-15.4
2	5	.10	-2.86	-14.3
3	8	.16	-1.86	-14.9
4	7	.14	-.86	-6.0
5	2	.04	0.14	.3
6	13	.26	1.14	14.8
7	2	.04	2.14	8.3
8	4	.08	3.14	12.6
9	0	.00	4.14	0
10	1	.02	5.14	5.1
11	2	.04	6.14	12.3
12	0	.00	7.14	0
13	1	.02	8.14	8.1
	N=50	1.00		S = -499.02

$$\bar{X} = \frac{\sum_{i=1}^N x_i f_i}{N}$$

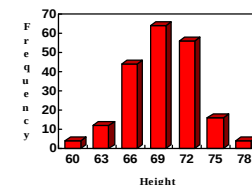
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Relative Position of Measures

■ For **Symmetric Distributions**

- If your population distribution is symmetric and unimodal (i.e., with a hump in the middle), then all three measures coincide.
 - Mode = 6
 - Median = 6
 - Mean = $4 \frac{3}{7} = 6$



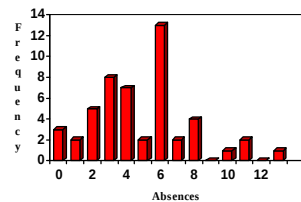
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20

Relative Position of Measures

- For **Asymmetric Distributions**

- If the data are skewed, however, then the measures of central tendency will not necessarily line up.



- Mode = 6, Median = 4.5, Mean = 4.6

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21

Example: International Economic Data

- One source is the World Penn Tables
- Penn World Data Request Form:
<http://bi.ednet.bris.ac.uk:80/dataserv/penn.htm>
- Select data format, dates, countries, and indicators
- Read into an Excel sheet
 - [World Penn.xls](#)

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22

Example: Descriptive Statistics

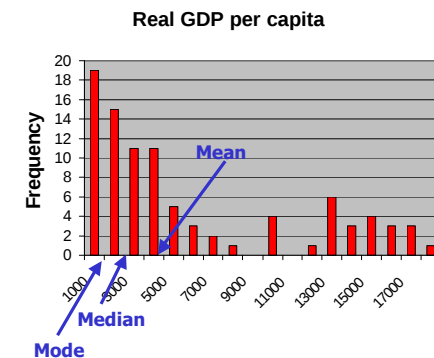
STATISTIC	REAL GPD	GOV'T SHARE OF GPD	OPENNESS
Mean	5386.6	19.0	70.7
Standard Error	555.9	1.0	5.2
Median	3073.0	17.6	59.4
Mode	2176.0	17.6	#N/A
Standard Deviation	5331.9	9.1	49.6
Sample Variance	28429209.9	83.2	2464.7
Kurtosis	-0.5	6.7	12.2
Skewness	1.0	1.9	3.0
Range	17577.0	61.2	324.4
Minimum	409.0	4.0	16.6
Maximum	17986.0	65.2	341.0
Sum	495569.0	1748.1	6504.6
Count	92.0	92.0	92.0

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23

Example: Real DP per capita (Laspeyres index)

- Mean: 537
- Median: 3073
- Mode: 2176



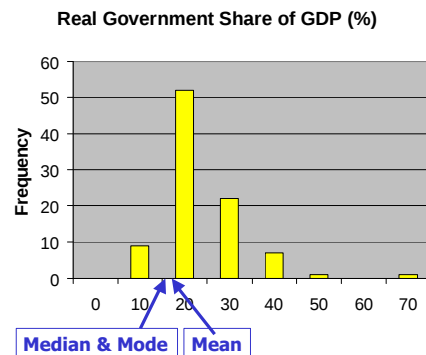
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24

Example:

Real Government Share of GDP (%)

- Mean: 1
- Median: 1
- Mode: 1

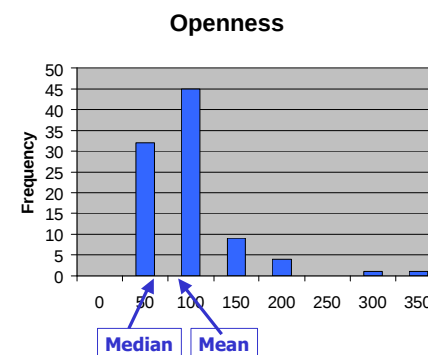


25

Example: Openness

(Exports + Imports)/Nominal GDP

- Mean: 71
- Median: 5
- Mode: N/A



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26

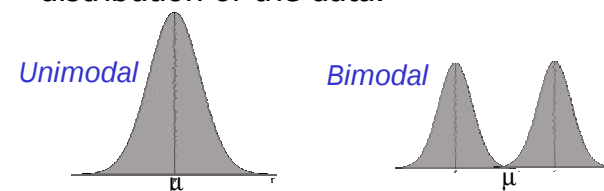
Which Measures for Which Variables?

- **Nominal** variables which measure(s) of central tendency is appropriate?
 - Only the mode
- **Ordinal** variables which measure(s) of central tendency is appropriate?
 - Mode or median
- **Interval-ratio** variables which measure(s) of central tendency is appropriate?
 - All three measures

27

Measures of Deviation

- Need measures of the deviation or distribution of the data.



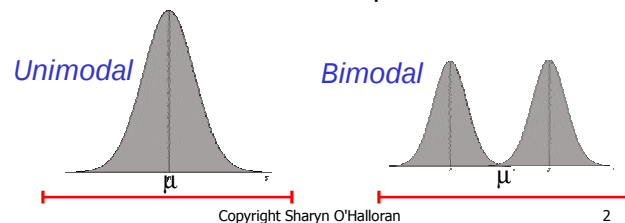
- Every different distributions even though they have the same mean and median.
- Need a measure of dispersion or spread.

2

Measures of Deviation (con't)

Range

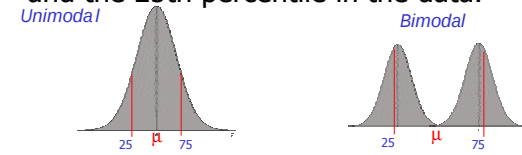
- The difference between the largest and smallest observation.
- Limited measure of dispersion



Measures of Deviation (con't)

Inter-Quartile Range

- The difference between the 75th percentile and the 25th percentile in the data.



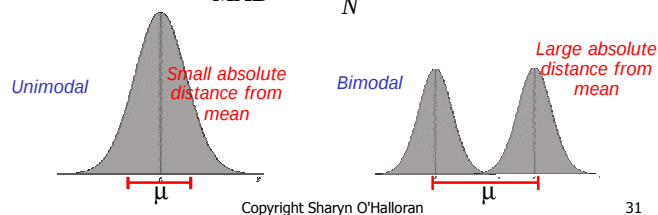
- Better because it divides the data finer.
- But it still only uses two observations
- Would like to incorporate all the data, if possible.

Measures of Deviation (con't)

Mean Absolute Deviation

- The absolute distance between each data point and the mean, then take the average.

$$MAD = \frac{\sum_{i=1}^N |X_i - \bar{X}|}{N}$$



Measures of Deviation (con't)

Mean Squared Deviation

- The difference between each observation and the mean, quantity squared.

$$s^2 = \frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N}$$

- This is the **variance** of a distribution.

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32

Measures of Deviation (cont')

■ Variance of a Distribution

- Note since we are using the square, the greatest deviations will be weighed more heavily.
- If we use a frequency table, as in the absenteeism case, then we would write this as:

$$s^2 = \frac{\sum_{i=1}^N f(x_i - \bar{X})^2}{N}$$

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33

Measures of Deviation (cont')

■ Standard deviation

- The square root of the variance:

$$s = \sqrt{\frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N}}$$

- gives common units to compare deviation from the mean.

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34

Absentee Example: Variances

- From above, the mean = 4.6.
- To calculate the variance, take the difference between each observation and the mean.
- Column 5 then squares that differences and multiplies it by the number of times the event occurred.

$$\text{Variance} = \frac{408.02}{50} = 8.16$$

$$\text{Standard Deviation} = \sqrt{8.16} = 2.86$$

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35

ABSENTEES				
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2	5	.10	-2.86	40.9
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8	4	.08	3.14	39.4
9	0	.00	4.14	0
10	1	.02	5.14	26.4
11	2	.04	6.14	75.4
12	0	.00	7.14	0
13	1	.02	8.14	66.3
N=50		1.00		S = 408.02

Descriptive Statistics for Samples

- Consistent estimators of variance standard deviation:

$$s^2 = \frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N - 1} \quad s = \sqrt{\frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N - 1}}$$

- Why n-1?

- We use n-1 pieces of data to calculate the variance because we already used 1 piece of information to calculate the mean.
- So to make the estimate consistent, subtract one observation from the denominator.

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36

Descriptive Statistics for Samples (con't)

Absentee Example:

- If sampling from a population, we would calculate:

$$s^2 = \frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N-1} \text{ and } s = \sqrt{\frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N-1}}$$

$$\text{Variance} = \frac{408.02}{49} = 8.33$$

$$\text{Standard Deviation} = \sqrt{8.33} = 2.88$$

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37

Descriptive Statistics for Samples (con't)

Sample estimators approximate population estimates:

- Notice from the formulas, as n gets large:
 - the sample size converges toward the underlying population, and
 - the difference between the estimates gets negligible.
- This is known as the law of large numbers.
 - We will discuss its relevance in more detail in later lectures.
- Mostly dealing in samples
 - Use the (n-1) formula, unless told otherwise.
 - Don't worry the computer does this automatically

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Example of Variance: International Economic Data

STATISTIC	REAL GDP	GOV'T SHARE OF GDP	OPENNESS
Mean	5386.6	19.0	70.7
Standard Error	555.9	1.0	5.2
Median	3073.0	17.6	59.4
Mode	2176.0	17.6	#N/A
Standard Deviation	5331.9	9.1	49.6
Sample Variance	28429209.9	83.2	2464.7
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Skewness	1.0	1.9	3.0
Range	17577.0	61.2	324.4
Minimum	409.0	4.0	16.6
Maximum	17986.0	65.2	341.0
Sum	495569.0	1748.1	6504.6
Count	92.0	92.0	92.0

Real DP

$$s^2 = \frac{(2587058117)^2}{92-1} = 28429210$$

$$s = \sqrt{28429210.08} = 5331.9$$

$$s^2 = \frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N-1} \text{ and } s = \sqrt{\frac{\sum_{i=1}^N (X_i - \bar{X})^2}{N-1}}$$

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Examples of data presentation

use it, don't abuse it

- Start axes at zero.
- Misleading comparisons
 - government spending not taking into account inflation.
 - Nominal vs. Real
- Selecting a particular base years.
 - For example, a university presenting a budget breakdown showed that since 1966 the number of staff increased only slightly.
 - but they failed to mention the huge increase during the 5 years before.

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40



HOMEWOR

- Lab

- Define one variable of each type
 - nominal, ordinal and interval
- Print out summary statistics on each variable.
 - There will be three statistics that you will not be expected to know what they are:
 - urtosis, SE urtosis, Skewness, SE Skewness.
 - The others though should be familiar.

- Excel

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41