

# **Empirical Methods in Finance - Exercise 2 week 1**

WG 08 - Subgroup 2

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# Data



## Source

- **WRDS (WHARTON RESEARCH DATA SERVICE)**
  - WRDS is a platform with aggregated and standardized financial data e.g. company financials & accounting, data on boards & directors, and market data. These are linked from different databases, such as BoardEx, Compustat (Global and North America) and CSMAR.

## Selected Database

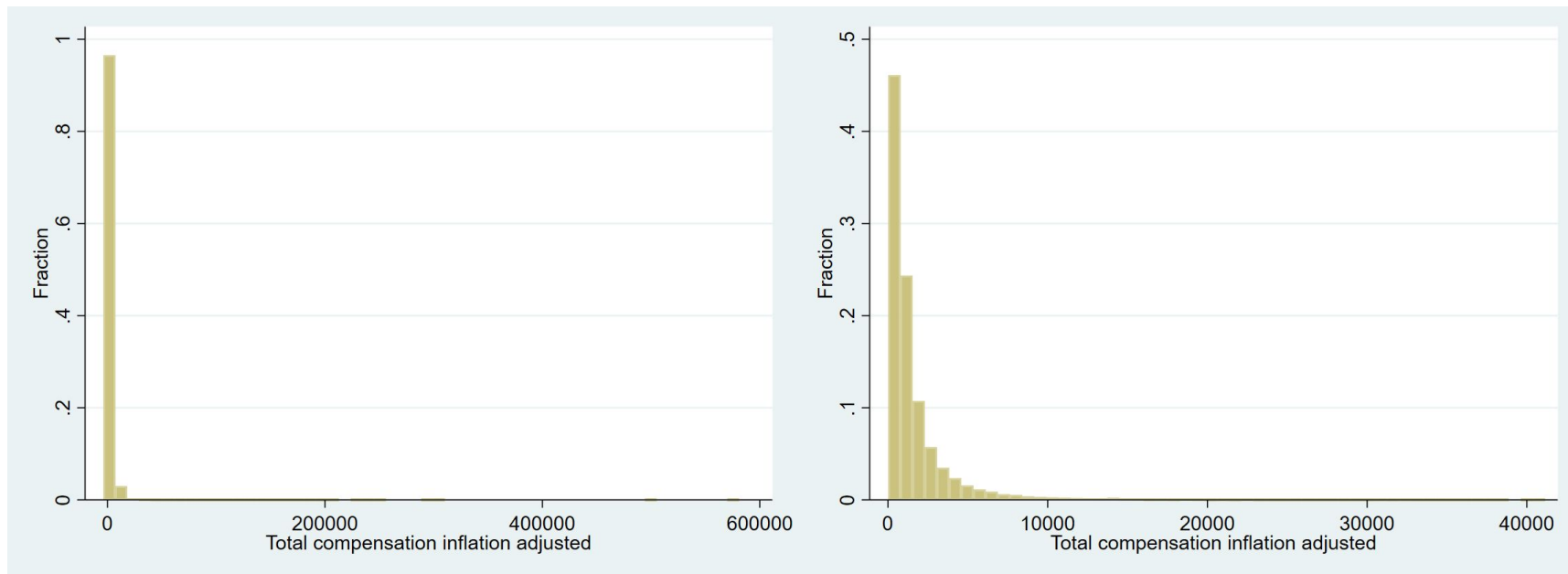
- **Compustat Execucomp**
  - To restrict the compensation data to CEOs only, we have used Execucomp database from Compustat. Since Execucomp provides only CEOs compensation data, we considered the sample to be only about CEOs.
    - 'Compustat' provides standardized North American and global financial statements and market data for over 80,000 active and inactive publicly traded companies that financial professionals have relied on for over 50 years
    - 'Execucomp' is Executive compensation data collected directly from each company's annual proxy

## Selected variables

- Total Compensation (\$) (TDC1), Executive ID number (EXECID), Value of Option Awards (\$) (OPTION\_AWARDS), Value of Stock awards (\$) (STOCK\_AWARDS), Bonus (\$), Salary (\$)

# Histogram of total compensation

- First, we adjusted for inflation by: `gen TDC1_ainf=TDC1/CPI_norm`
- Second, we winsorized by year: `winsorizeJ TDC1_ainf, suffix(_win) by(YEAR) cuts(0.5 99.5)`
- Third, we plotted two histograms:

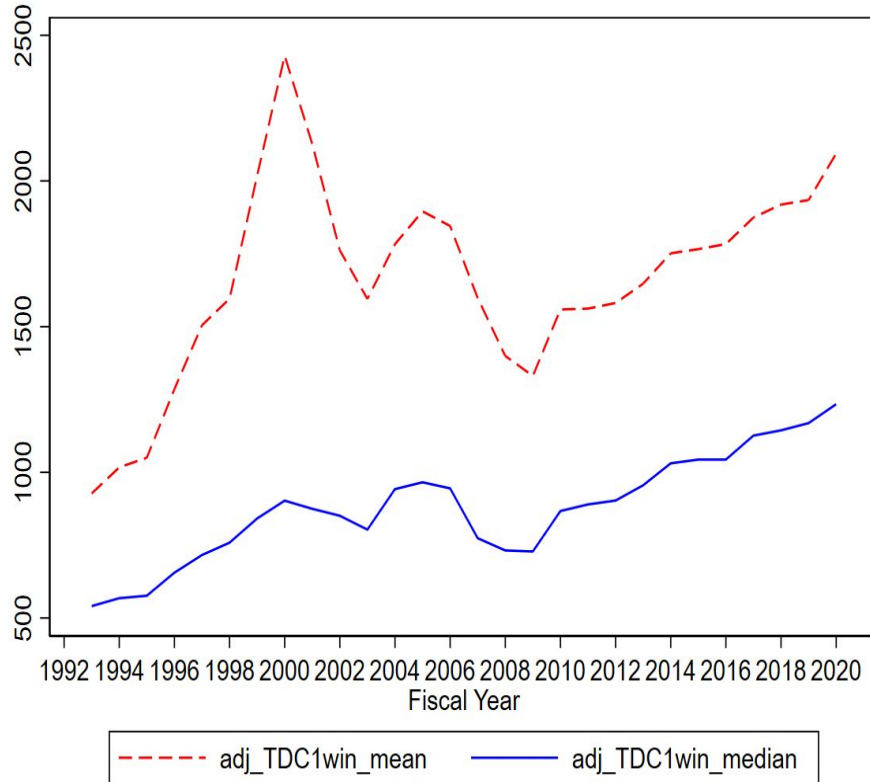


# Outliers total compensation

- Before winsorization there are some large outliers.
- After winsorization, outliers slightly reduced but still large outliers. Might need to winsorize at larger percentile on the right hand side.
- Left side outliers are negative, likely to be incorrect entries (negative compensation highly unlikely).
- Right side outliers not clear, could be an exceptionally highly paid CEO. Compensation of 580 million is possible, especially in case of large stock and option awards

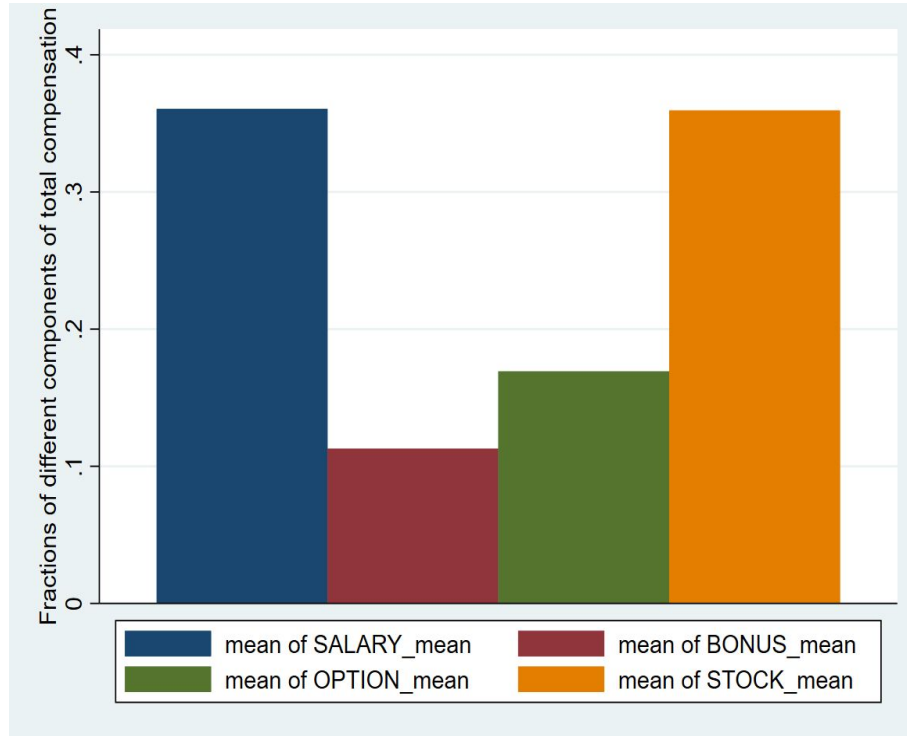
Total compensation inflation adjusted				
	Percentiles	Smallest		
1%	92.07786	-3707.343		
5%	187.6974	-2003.761		
10%	254.3022	-572.4933	Obs	289,782
25%	437.0135	-19.58275	Sum of wgt.	289,782
50%	865.0643		Mean	1732.773
		Largest	Std. dev.	3871.291
75%	1804.406	292163.1		
90%	3723.025	301847.4	Variance	1.50e+07
95%	5797.478	503713	Skewness	35.23337
99%	13497.44	580926.4	Kurtosis	3392.693

# Evolution of total CEOs' compensation over time: Mean and Median by year



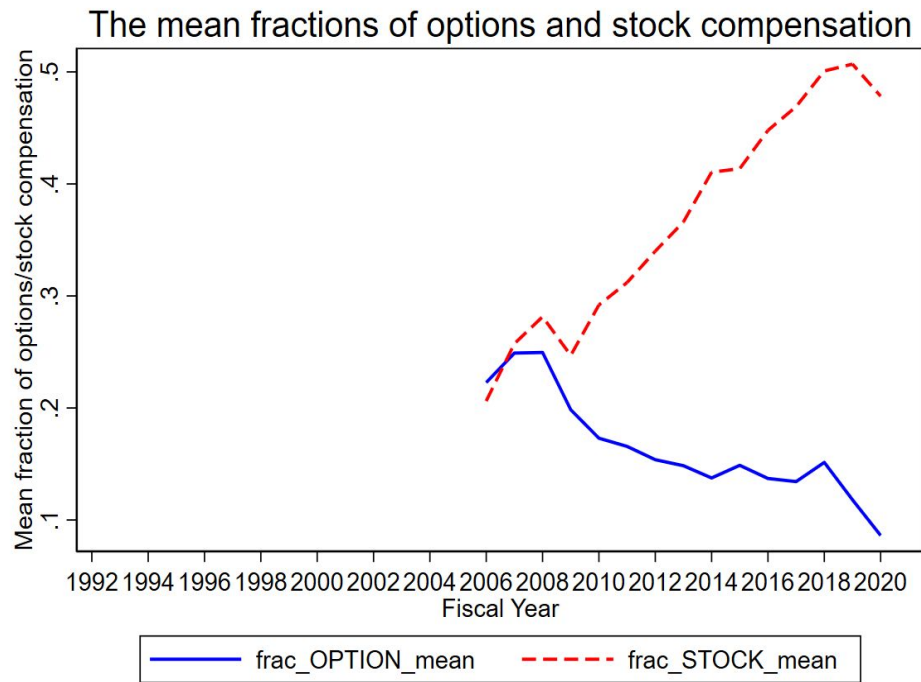
- Mean and median (expressed in thousands of US dollars) show similar patterns, with an overall increase from 1992 to 2020, consistent with the rising inequality in the American society with regard to compensations and wealth
- Mean clearly pulled up by extreme values, median more conservative proxy for the evolution of the total compensation of CEOs
- Difference in trends for mean and median: during the late '90s (years of the Dot-com bubble), the mean grew in a more pronounced way, probably due to very high values for the most paid CEOs

# Different components of total CEOs' compensation : Means for period 1993-2020



- Overall, in the period considered (1993-2020), salary (0.361%) and stock compensation (0.359%) are, on average, the largest components of the total CEOs' compensations
- However, data on stock and option awards are only available for the time period 2006-2020, while data on salary and bonus are available for the entire time period 1993-2020
- The reason for this lack of data before 2006 is due to a change in the accounting rules for companies which took place in 2006: FAS 123R. This new accounting standard implied that the costs associated with equity payment for employees have to be expensed on financial statements

# Evolution of stock and option compensation over time: Means by year



- As we can see from the graph on the left, the proportion of stock compensation and that of option payments have an opposite trend
- The stock compensation fraction for the CEO has been increasing over time; the option compensation method has a downward trend
- What are the drivers for this shift from stock options to stocks in the CEOs' compensations in recent years?

# Evolution of stock and option compensation over time: Reasons for the shift from options to stocks

- The first and most obvious reason for the change in the equity incentive awards for CEOs is the FAS 123R (2006), already mentioned before. Due to this new accounting standard, stock options started to be regarded as expenses to be reported by the companies granting them to their executives, thus lowering the incentive of options
- Another reason can be the drop in the stock market in 2008, which made executives clearly more reluctant to accept options compensation, since, in case of negative returns, stock options have no value for them. This consideration might also have contributed to the declining trend with regard to options in the years following the *Great Recession*
  - However, stock options may represent a better incentive for executives rather than stocks when the company and its stock price are expected to grow remarkably in the following years : in that case, the gain that executives will have from stock options will be larger than that from stocks; otherwise, they are more likely to prefer stocks over stock options



## References

- <https://www.investopedia.com/articles/06/fas123r.asp>
- <https://corpgov.law.harvard.edu/2014/10/02/what-has-happened-to-stock-options/>
- Data link:  
<https://wrds-www.wharton.upenn.edu/pages/get-data/compustat-capital-iq-standard-poors/compustat/execucomp/annual-compensation/>