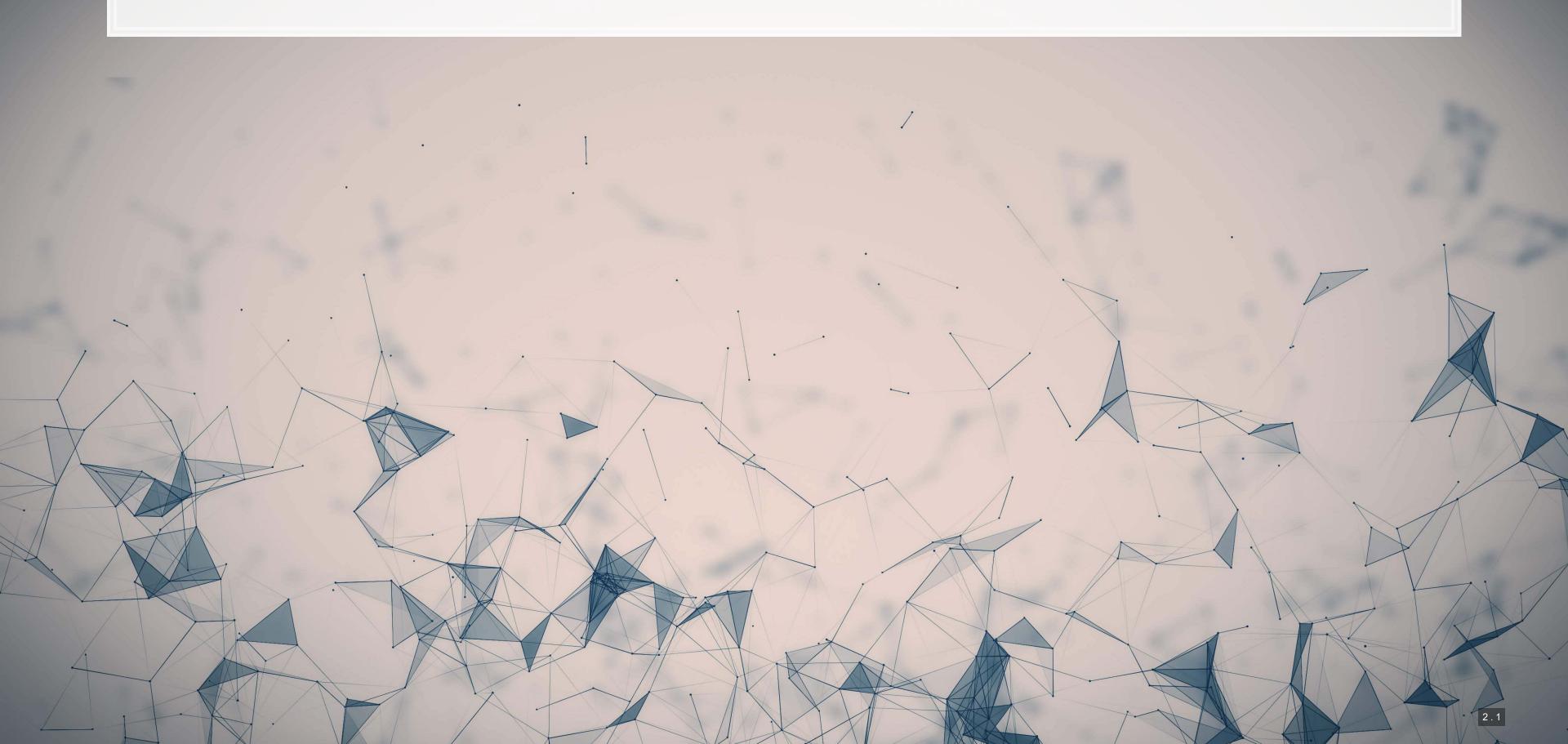
ACCT 101: Financial Statement Analysis

Session 11

Dr. Richard M. Crowley

rcrowley@smu.edu.sg http://rmc.link/

Front matter



Final exam details

- The exam will be done electronically on eLearn. Students in Singapore will take the exam at SMU; students abroad will take the exam simultaneously.
- 8 questions that consist of problem solving, journal entries, reasoning & explanations, preparation of partial or full statements, and financial statement analysis (including ratios). PV/PVA tables will be given (for bonds).
- These are comprehensive questions that integrate several topics. The following topics will be covered:
 - Accounts receivable and bad debt
 - Bank reconciliation
 - Inventory and COGS
 - Long term assets
 - Accrual accounting: processing information & adjusting
 - Liabilities
 - Stockholders' equity
 - Statement of cash flows
 - Financial ratios
- Ratios: you must use the formulas in these lecture slides. Formulas will not be provided in the exam papers.
- Not covered: Par value for common shares; periodic inventory systems
- Use sample (past year) exam papers with caution. The content, coverage, and difficulty level may be different.

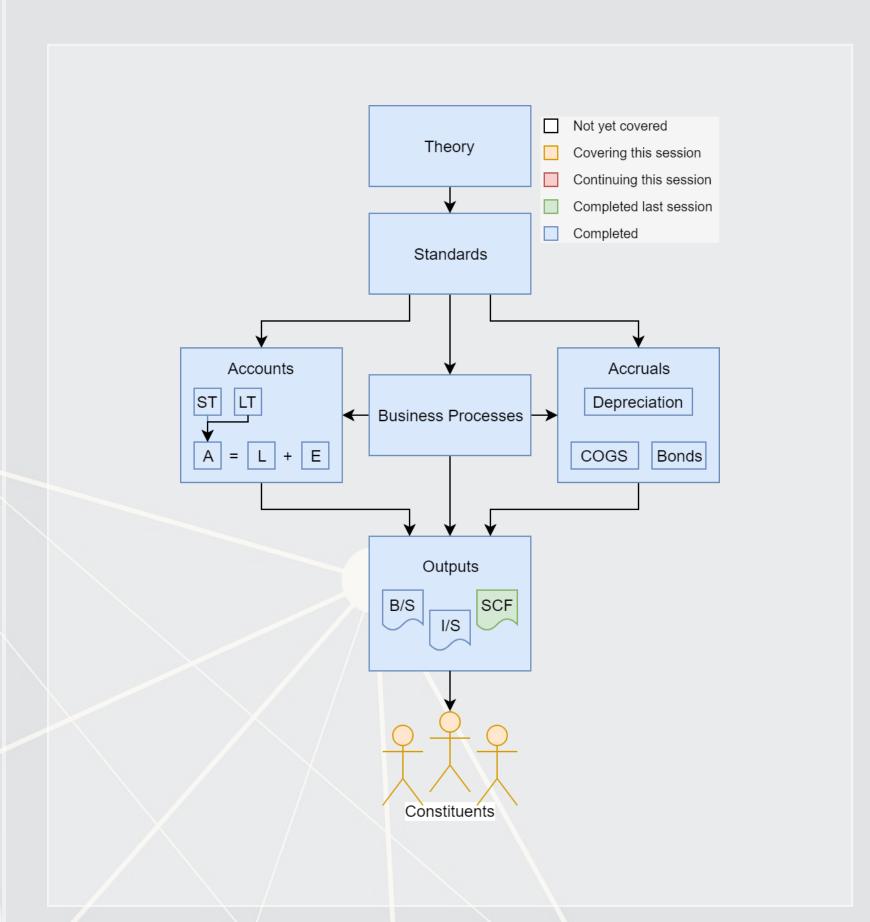
Final exam resources

- Practice final exams
 - These are old exams which I have made annotations to in order to keep them relevant
- Additional practices
- Additional selected book problems
- Review session by TAs
 - In mid-to-late November
- Office hours book online!
- eLearn practices (257 questions and counting!)
 - These can be very helpful to identify what you need to study
- All practices from quiz 1 and quiz 2

Final exam tips

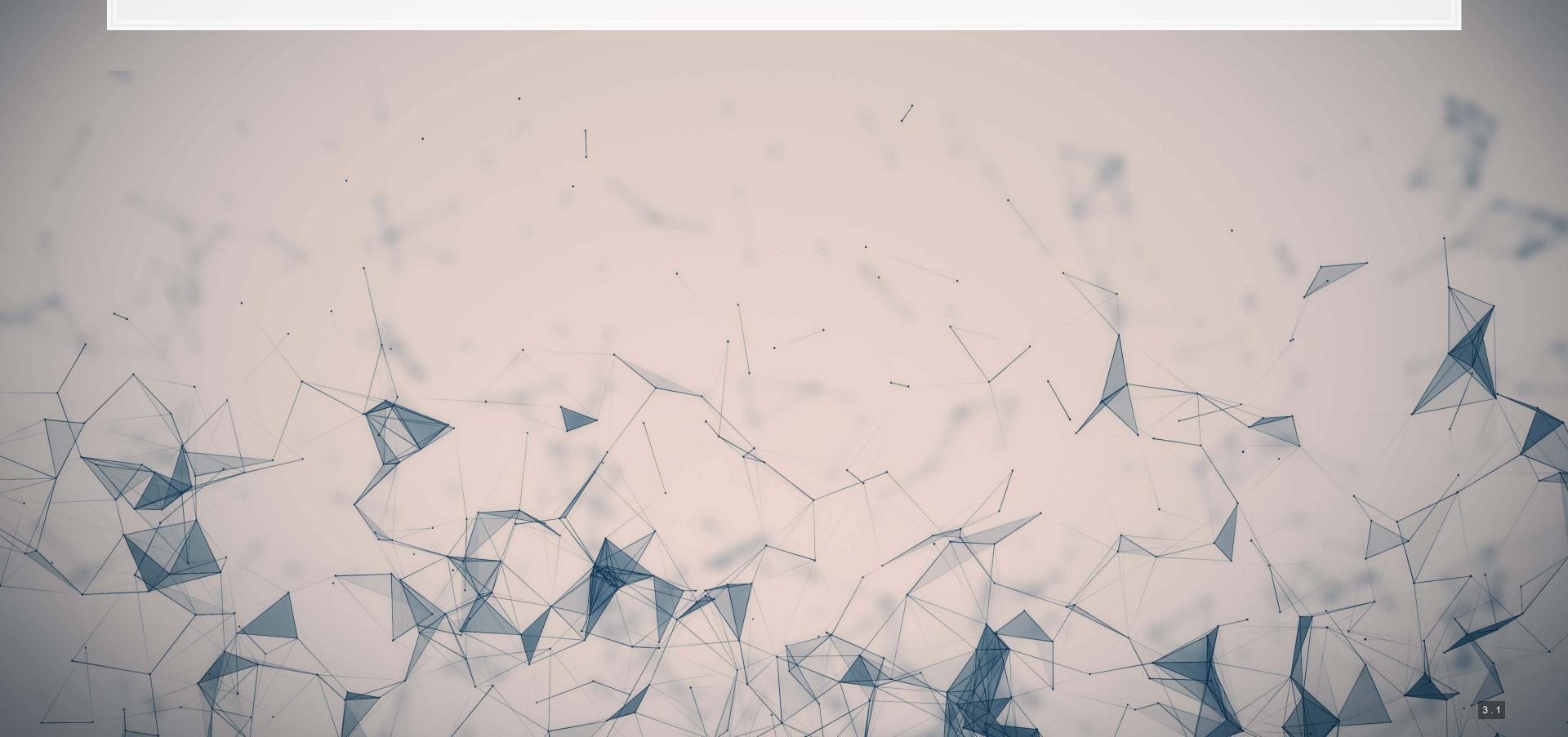
- Remember that everyone is taking the same exam if you find it difficult or long, others likely think the same.
- If you are stuck on a question, skip it and come back later. It's better to solve everything that you know well and then work on those you are stuck on.
- If you are really stuck on a topic while studying for finals, drop by my office hours and we'll get it worked out.
- Course grades will be curved.

Learning objectives



- 1. Learn about financial statement analysis
- 2. Calculate and interpret financial ratios

Financial statement analysis



What matters?

- 1. The business environment
 - Economy health
 - Other countries (particularly for multinational firms)
 - Industry demand
 - Resource scarcity or supplier concentration
 - Consumer concentration

What matters?

- 2. Historical financials
 - Financial statements and notes
 - Competitors statements



https://rmc.link/101class11-1

What matters?

- 3. Historical non-financials
 - Governance, Risk disclosures, Audit report
 - Shareholders, supplier relationships



https://rmc.link/101class11-2



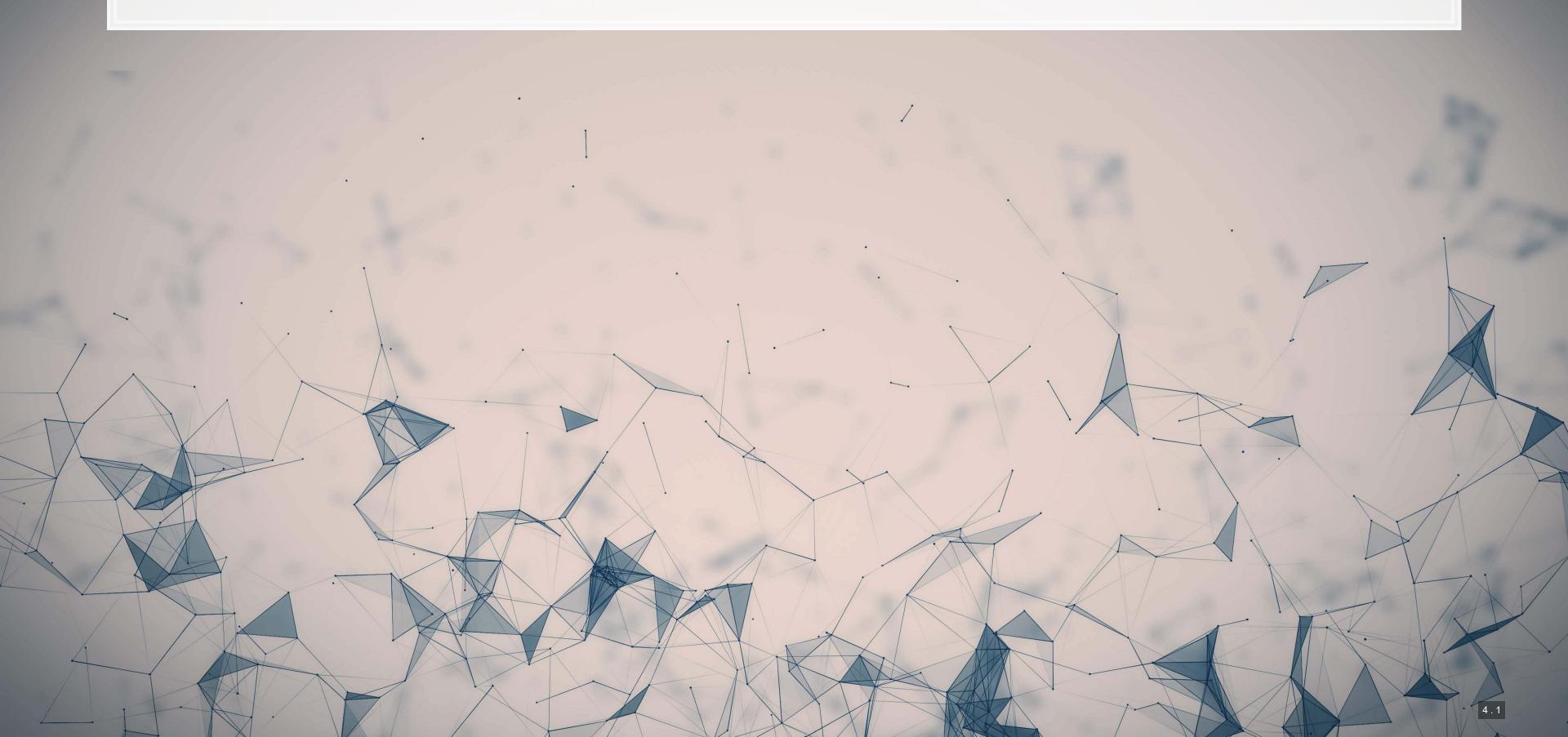
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Predicting firm value

- 1. Trend analysis (a.k.a. Horizontal analysis)
 - Compare dollar and percent changes across years
- 2. Common size financial statements (a.k.a. Vertical analysis)
 - Compare financials across years or firms
 - A subset of ratio analysis
- 3. Ratio analysis
- 4. Analytics

Only ratio analysis is on the final – we'll cover the others briefly.

Trend analysis



What is it?

- Comparing different years or quarters of data to see the trend in measures.
- Examples:
 - Revenue grew by 3% this year
 - Net income grew by 4% this quarter
 - Quarterly revenue decreased 2% year over year

Examples

Nike Rides Out its #MeToo Moment, WSJ

That is a reflection of a strong quarter: Nike reported earnings of 68 cents a share, beating analysts' estimates by 15 cents, and *grew revenue by 7%*.

China's Tencent Invests in Video, AI and Mobile Payments, as Earnings Soar, WSJ

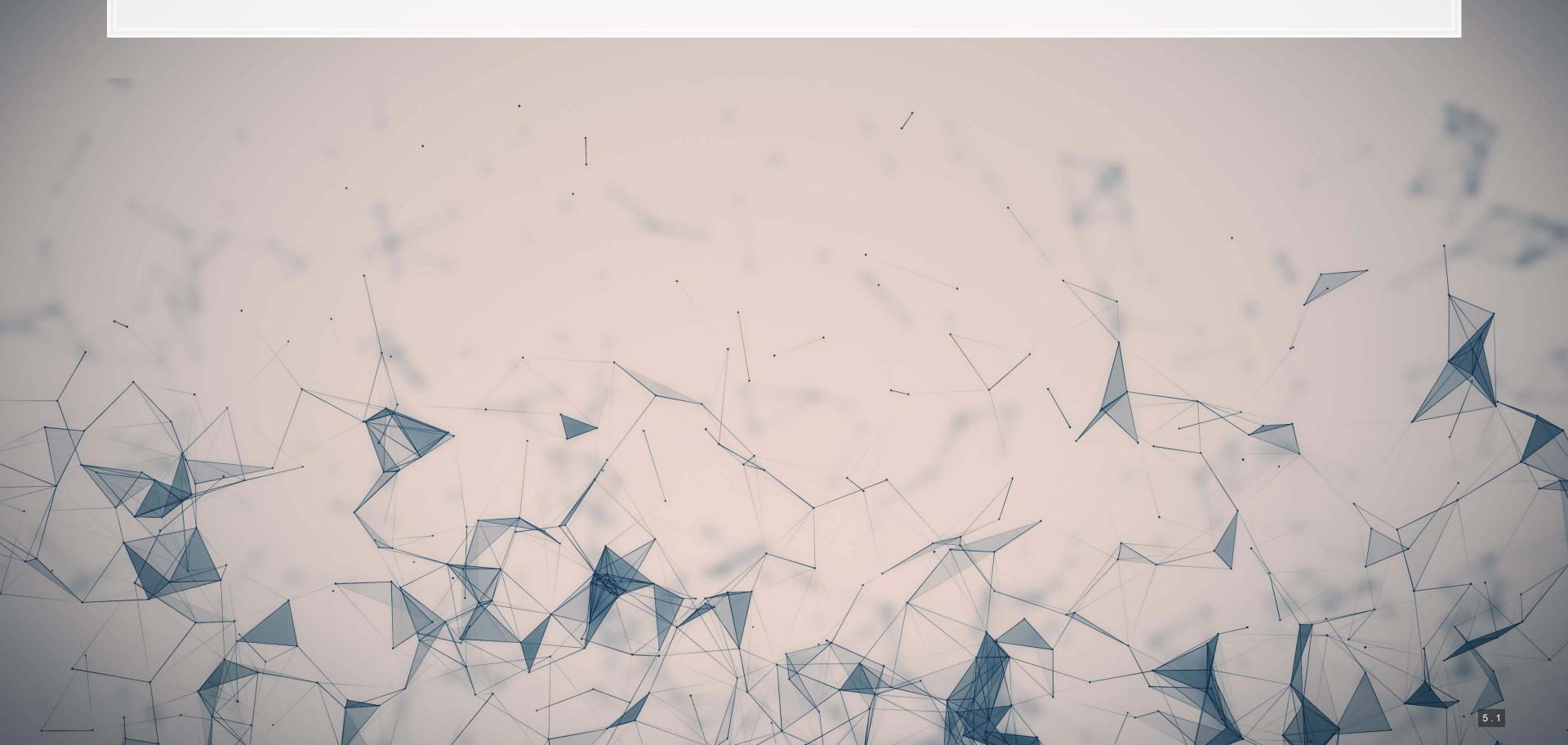
The plans emerged as the Shenzhen-based company said its *fourth-quarter revenue grew* 51% year over year to 66.4 billion yuan (\$10.2 billion), boosted by strong growth in mobile payments, digital content subscriptions and advertising on its flagship mobile social apps, WeChat and QQ.

How to do it

- 1. Get 2 financial statements from the same company (typically the income statement)
- 2. Find the percentage change from the old figures to the new figures

| Microso Partial Income In Millions o | Statement | | | |
|--|-----------|--------|---------------|---------------|
| Year ended June 30, | 2017 | 2016 | | |
| Revenue | | | | |
| Product | 51,190 | 61,502 | \Rightarrow | 17% decrease |
| Service | 32,760 | 23,818 | \Rightarrow | 38% increase |
| Total revenue | 89,950 | 85,320 | \Rightarrow | 5.4% increase |
| | | | | |
| Total cost of revenue | 34,261 | 32,780 | \Rightarrow | 4.5% increase |
| Gross profit | 55,689 | 52,540 | \Rightarrow | 6.0% increase |
| Research and development | 13,037 | 11,988 | \Rightarrow | 8.8% increase |
| Sales and marketing | 15,539 | 14,697 | \Rightarrow | 5.7% increase |
| | | | | |
| Net income | 21,204 | 16,798 | \Rightarrow | 26% increase |
| | | | | |

Common-size financial statements



What is it?

- Standardizing figures in a financial statement by dividing by another figure.
- Allows for comparing financial statements across companies
- Ex.:
 - Divide an income statement by revenue
 - $lacksymbol{lack}{ ext{Revenue}} = Gross\ Margin$
 - $extstyle rac{Net \ income}{Revenue} = Profit \ Margin$
 - Divide financial statements by total assets

Examples

Cheerios Could Get Pricier as General Mills Faces Rising Costs, WSJ

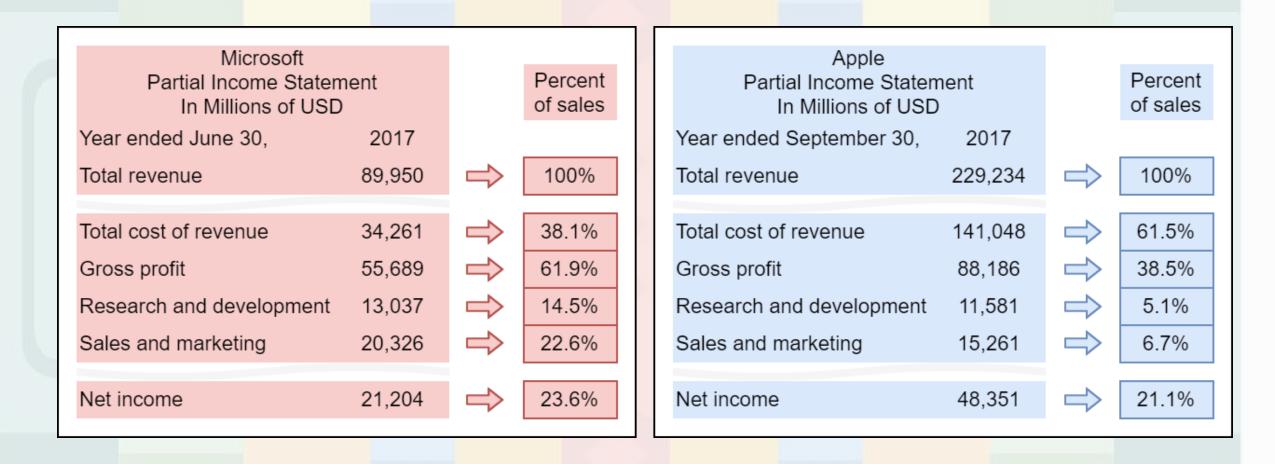
Fourteen of the last 15 packaged food makers to [report] earnings posted lower-than-expected gross margins, said J.P. Morgan analyst Ken Goldman.

Ford CEO Says Company Could Exceed 8% Margin Target, WSJ

The company is forecasting an 8% global profit margin by about 2022, a number that would put it closer to better-performing peers, including GM. Ford's 5% operating margin last year was disappointing...

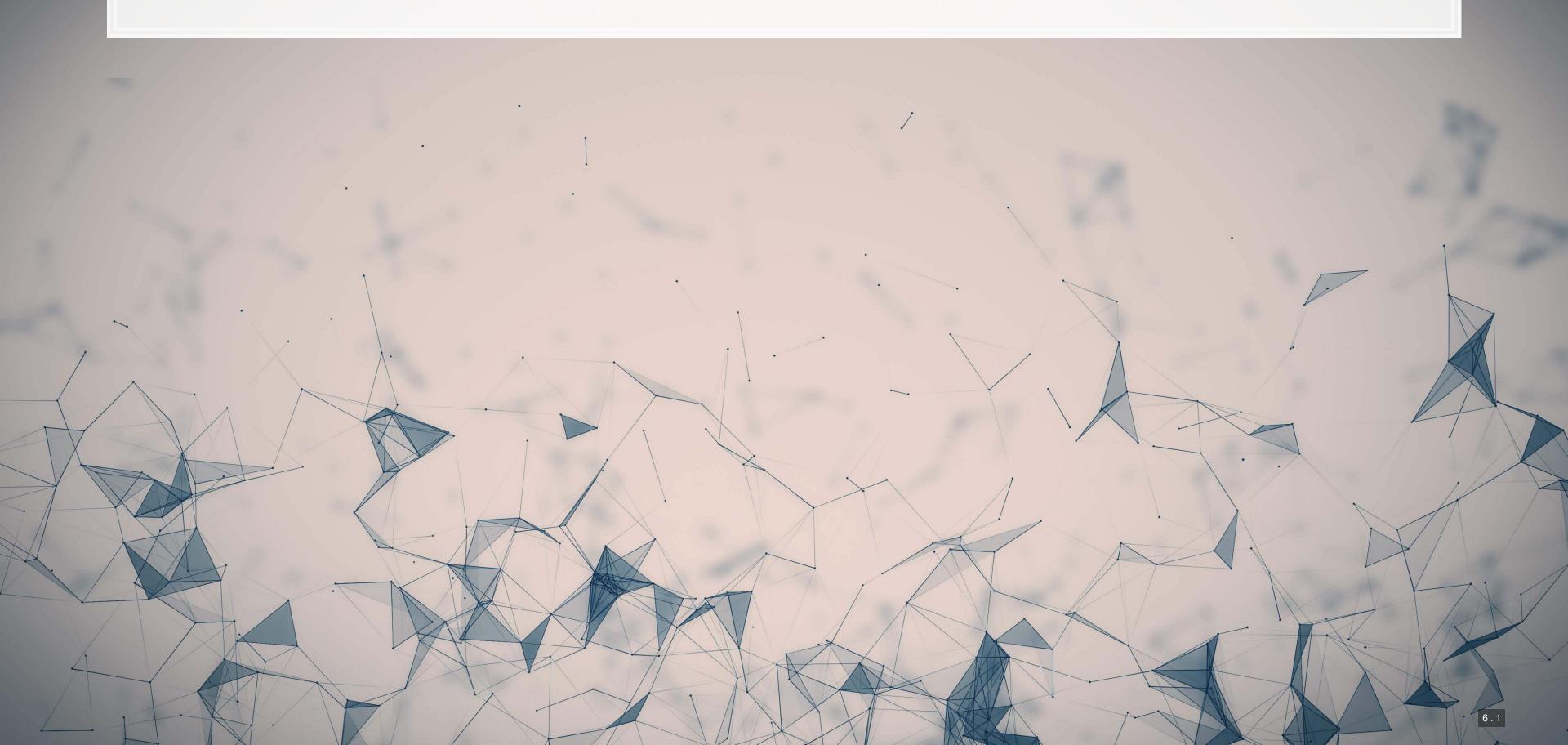
How to do it

- 1. Get a financial statement
- 2. Divide every number by the same amou<mark>nt (sales, total assets, etc.) to get the</mark> percent (of sales, of assets, etc.)



We can compare accross companies or years

Balance sheet ratios



What is ratio analysis?

Using various ratios of numbers from financial statements to better understand companies

All examples use the following data

| Microsoft Partial Income Statement In millions of USD | | | | | |
|---|--------|--------|--|--|--|
| Year ended June 30, | 2017 | 2016 | | | |
| Revenue | | | | | |
| Product | 51,190 | 61,502 | | | |
| Service | 32,760 | 23,818 | | | |
| Total revenue | 89,950 | 85,320 | | | |
| | | | | | |
| Total cost of revenue (COGS) | 34,261 | 32,780 | | | |
| Gross profit | 55,689 | 52,540 | | | |
| Research and development | 13,037 | 11,988 | | | |
| Sales and marketing | 15,539 | 14,697 | | | |
| | | | | | |
| Operating income | 22,326 | 20,182 | | | |
| Interest expense | 2,222 | 1,243 | | | |
| Net income | 21,204 | 16,798 | | | |

| Microsoft Partial Balance Sheet In millions of USD | | | | |
|--|---------|---------|--|--|
| Year ended June 30, | 2017 | 2016 | | |
| Current assets | | | | |
| Cash | 7,663 | 6,510 | | |
| Short term investments | 125,318 | 106,730 | | |
| A/R | 19,792 | 18,277 | | |
| Inventory | 2,181 | 2,251 | | |
| Total current assets | 159,851 | 139,660 | | |
| Total assets Current liabilities | 241,086 | 193,468 | | |
| A/P | 7,390 | 6,898 | | |
| Total current liabilities | 64,527 | 59,357 | | |
| Total liabilities | 168,692 | 121,471 | | |
| Total equity | 72,394 | 71,997 | | |

| MSFT Stock Quotes (price in USD, shares in millions, dividends paid in millions of USD) | | | | | |
|---|--------|--------|--|--|--|
| June 30, | 2017 | 2016 | | | |
| Price | 68.93 | 51.17 | | | |
| Shares | 7,708 | 7,808 | | | |
| Dividend paid | 12,040 | 11,329 | | | |
| | | | | | |

Caveats

- 1. There are a few differences between the ratios in these slides and in the book. These differences are due to simplifications I have made you can use these ratios on the final instead of the book's ratios without penalty.
- 2. Some ratios have many definitions. If you look online, you may find other definitions for some of these ratios. Don't use those on the final.



Inventory turnover

$$\frac{COGS}{\frac{1}{2}(Inventory_T + Inventory_{T-1})}$$

- How many times per year a company sells its inventory on hand
- A similar measure is *Inventory resident period*
 - A.k.a. Number of days' sales in inventory
 - Calculated as $\frac{365}{Inventory\ turnover}$
 - The number of days it take to sell the company's inventory

Microsoft's 2017 inv. turnover:
$$\frac{34,261}{\frac{1}{2}(2,181+2,251)}=15.46$$

Microsoft's 2017 inv. period:
$$\frac{365}{15.46}=23.6~days$$

Accounts receivable turnover

$$rac{Revenue}{rac{1}{2}(A/R_T+A/R_{T-1})}$$

- How many times per year a company collects its A/R on hand
- A similar measure is *Receivable collection period*
 - A.k.a. Number of days' sales in receivables
 - Calculated as $\frac{365}{Accounts\ receivable\ turnover}$
 - The number of days it take to collect the company's A/R

Microsoft's 2017 A/R turnover:
$$\frac{89,950}{\frac{1}{2}(19,792+18,277)}=4.73$$

Microsoft's 2017 A/R period:
$$\frac{365}{4.73}=77.2~days$$

Payable turnover

$$\frac{COGS}{\frac{1}{2}(A/P_T+A/P_{T-1})}$$

- How many times per year a company pays its A/P it owes
- A similar measure is *Payable outstanding period*
 - Calculated as $\frac{365}{Payable\ turnover}$
 - The number of days it take to pay the company's A/P

Microsoft's 2017 A/P turnover:
$$\frac{34,261}{\frac{1}{2}(7,390+6,898)}=4.80$$

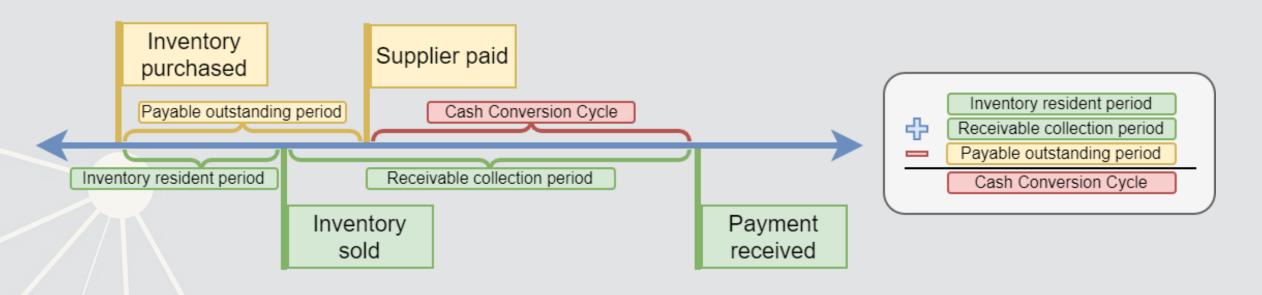
Microsoft's 2017 A/P period:
$$\frac{365}{4.80}=76.1~days$$

Cash conversion cycle

$$\frac{365}{Inventory\ turnover} + \frac{365}{A/R\ turnover} - \frac{365}{A/P\ turnover}$$
 \updownarrow

 $Receivable\ collection\ period+Inventory\ resident\ period-Payable\ outstanding\ period$

- Measures how long it takes from paying payables to receiving cash for a sale
- Can calculate from turnover ratios or periods



Microsoft's 2017 cash conversion cycle: $23.6 + 77.2 - 76.1 = 24.7 \ days$

Asset turnover

$$ext{Asset turnover} = rac{Net \ revenue}{rac{1}{2}(Assets_T + Assets_{T-1})}$$

Measures sales volume in relation to asset base

Microsoft's 2017 asset turnover:
$$\frac{89,950}{\frac{1}{2}(241,086+193,468))}=41.4\%$$

Current ratio

 $\frac{Current\ assets}{Current\ liabilities}$

- Measures a company's ability to pay current liabilities
- ullet This should usually be >2

Microsoft's 2017 current ratio: $\frac{159,851}{64,527}=2.48$

Quick ratio

$$rac{Cash + Short\ term\ investments + A/R}{Current\ liabilities}$$

- A.k.a. acid-test ratio
- Measures a company's ability to pay current liabilities
 - Only factors in liquid current assets
- This should be > 1

Microsoft's 2017 quick ratio:
$$\frac{7,663+125,318+19,792}{64,527}=2.37$$

Debt ratio

 $\frac{Total\ liabilities}{Total\ assets}$

- A.k.a. Debt to assets ratio
- Measures a company's leverage
 - Leverage = how much the company is financed by debt
- Higher = more leverage = more debt financing

Microsoft's 2017 debt ratio: $\frac{168,692}{241,086} = 70.0\%$

Times-interest-earned ratio

 $\frac{Income\ from\ operations}{Interest\ expense}$

- Measures a company's ability to cover interest payments
- ullet Higher is better, < 1 should cause some worry

Microsoft's 2017 times-interest-earned ratio: $\frac{22,326}{2,222}=10.05$



Calculate the following ratios for Microsoft in 2016

- Payable outstanding period
- Quick ratio
- Debt ratio
- Times-interest-earned ratio

Extra info: Microsoft's A/P in 2015 was \$6,591M

Solution

- Payable payment period (76.1 days in 2017)
 - $-365/rac{32,780}{rac{1}{2}(6,898+6,591)}=75.1~days$
- Quick ratio (2.37 in 2017)

$$\begin{array}{c} \bullet \quad \frac{6,510+106,730+18,277}{59,357} = 2.22 \end{array}$$

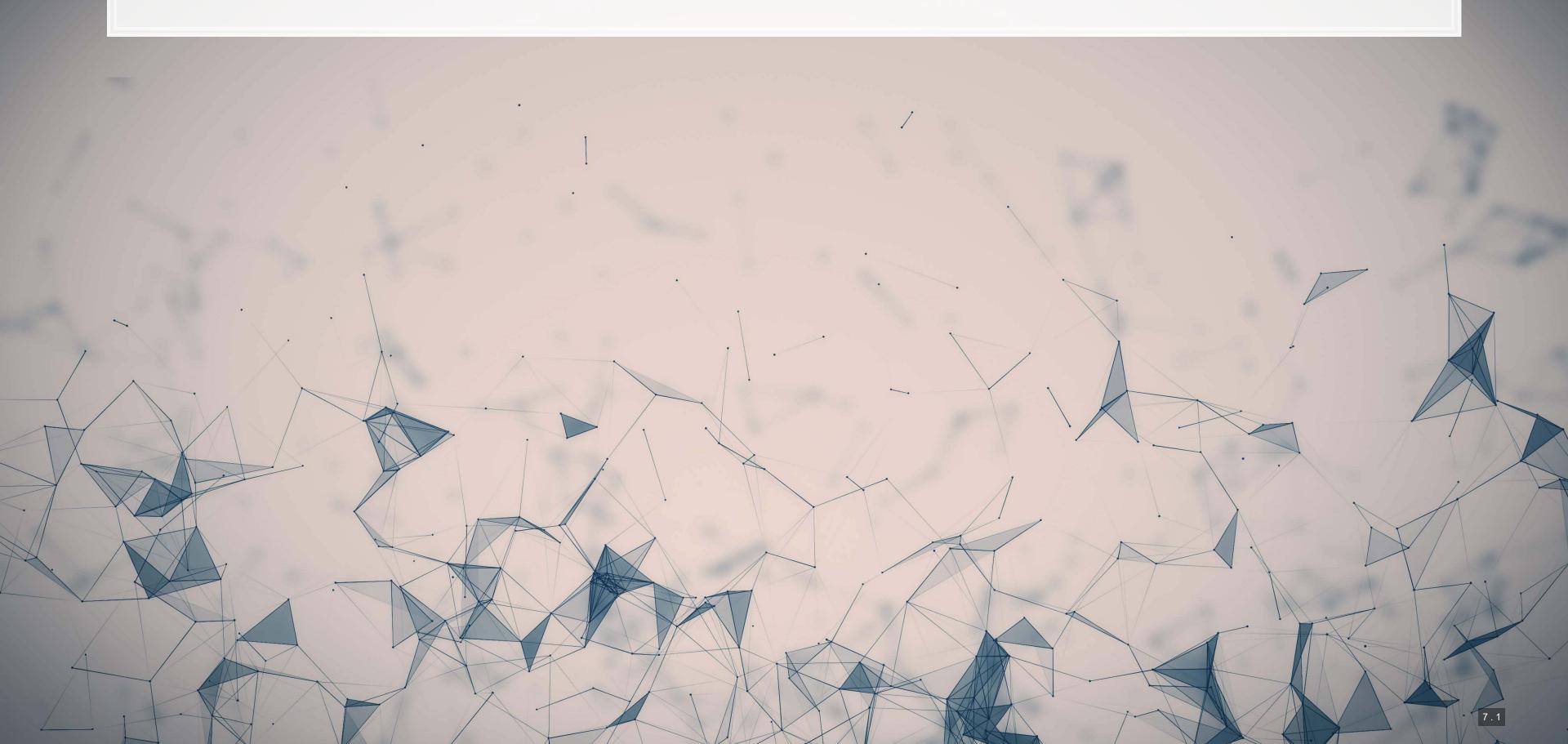
Debt ratio (70.0% in 2017)

$$\frac{121,471}{193,468} = 62.8\%$$

Times-interest-earned ratio (10.5 in 2017)

$$-\frac{20,182}{1,243} = 16.2$$

Income statement ratios



Profit Margin

$$rac{Profit}{Revenue}$$

- Gross profit margin tells you about the company's selling margins
- Operating profit margin tells you about its operating efficiency
- Net profit margin tells you about its overall profitability

Microsoft's 2017 gross profit margin:
$$\frac{55,689}{89,950}=61.9\%$$

Microsoft's 2017 operating profit margin:
$$\frac{22,326}{89,950}=24.8\%$$

Microsoft's 2017 net profit margin:
$$\frac{21,204}{89,950}=23.6\%$$

Return on assets (ROA)

$$rac{Net\ income}{rac{1}{2}(Assets_T + Assets_{T-1})}$$

- Measures overall profitability based on the company's size
- Very common measure in practice
- Higher is better

Microsoft's 2017 ROA:
$$\frac{21,204}{\frac{1}{2}(241,086+193,468))}=9.76\%$$

Return on equity (ROE)

$$rac{Net\ income}{rac{1}{2}(Equity_T+Equity_{T-1})}$$

- Measures overall profitability based on the company's size
 - Stockholder focussed
- Very common measure in practice
- Higher is better

Microsoft's 2017 ROE:
$$\frac{21,204}{\frac{1}{2}(72,394+71,997))}=29.4\%$$



Calculate the following ratios for Microsoft in 2016

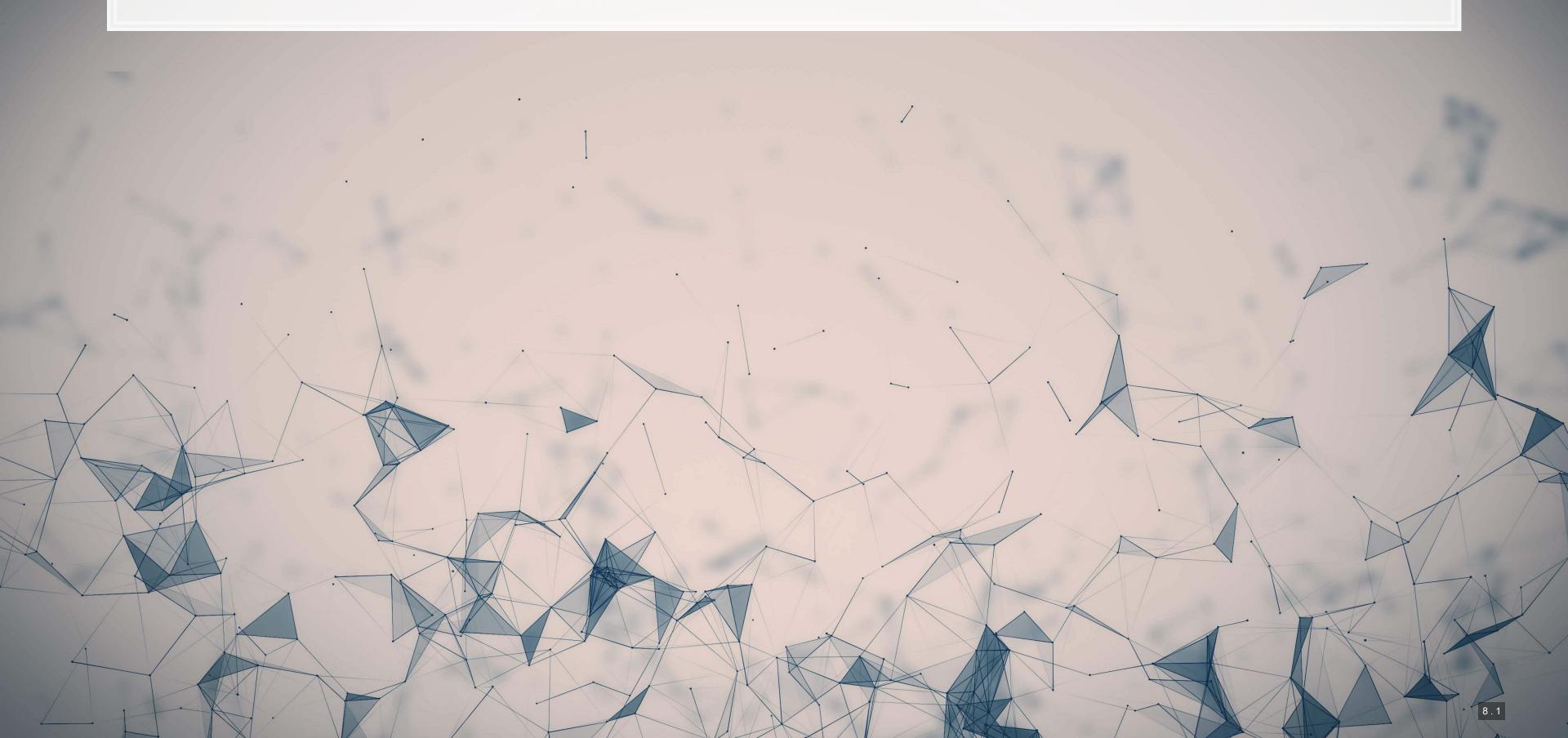
- Net profit margin
- Return on assets (ROA)
- Return on equity (ROE)

Extra info: Microsoft's 2015 total assets was \$176,223M and Microsoft's 2015 total equity was \$80,083M

Solution

- Net profit margin (23.6% in 2017)
 - $\begin{array}{cc} \frac{16,798}{85,320} = 19.7\% \end{array}$
- ROA (9.76% in 2017)
 - $\begin{array}{c|c} \hline & 16,798 \\ \hline & \frac{1}{2}(193,468+176,223) \end{array} = 9.09\%$
- ROE (29.4% in 2017)
 - $\begin{array}{c} \frac{16,798}{\frac{1}{2}(71,997+80,083)} = 22.1\% \end{array}$

Equity ratios



Earnings per share (EPS)

$$rac{Net\ income-Dividends\ on\ pref.\ shares}{rac{1}{2}(\#Shares_T+\#Shares_{T-1})}$$

- Measures the amount of profit tied to each share of stock
- Very common measure in practice
- Assume shares in year T and T-1 are the same if not stated
- Very easily manipulated

Microsoft's 2017 EPS:
$$\frac{21,204-0}{\frac{1}{2}(7,708+7,808))} = \$2.73/share$$

Price/earnings ratio (P/E ratio)

$$rac{Stock\ price}{EPS}$$

- A measure of if a stock is overpriced
- 6 to 8 is common, 20+ is common for tech firms
 - Higher = overpriced
 - Lower = underpriced
- Very common measure in practice
- Very easily manipulated, since EPS is easily manipulated

Microsoft's 2017 P/E ratio: $\frac{68.93}{2.73}=25.2$



Calculate the following ratios for Microsoft in 2016

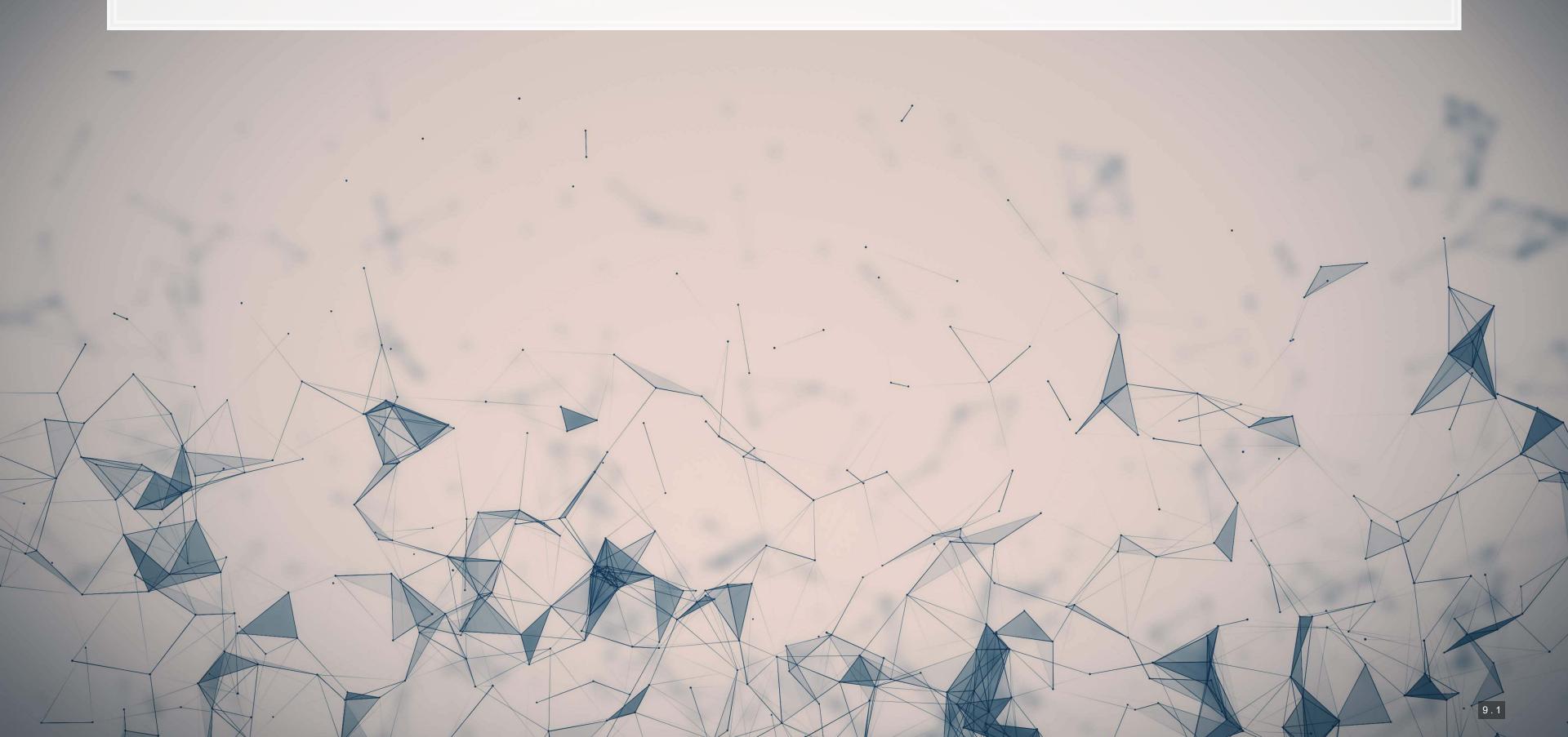
- EPS
- P/E Ratio

Extra info: Microsoft's 2015 outstanding shares was 8,027M

Solution

- $\begin{array}{l} \bullet \quad \mathsf{EPS} \, (\$2.73/share \, \mathsf{in} \, 2017) \\ \bullet \quad \frac{16,798-0}{\frac{1}{2} \, (7,808+8,027)} = \$2.12/share \end{array}$
- P/E Ratio (25.2 in 2017)
 - $\frac{51.17}{2.12} = 24.1$

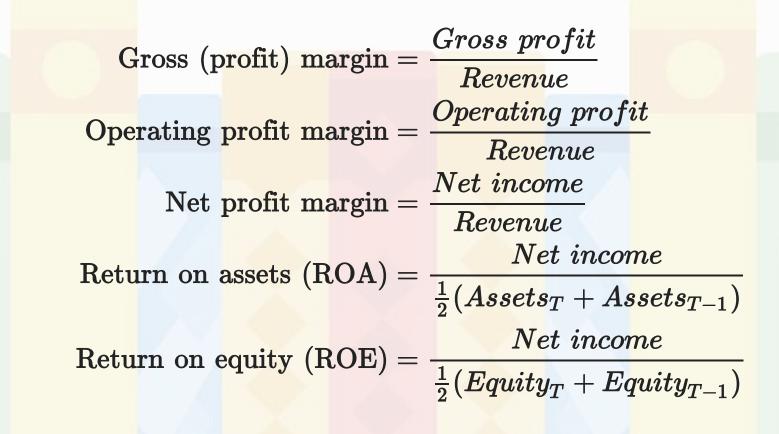
Equations



Balance sheet ratio equations

$$\begin{aligned} &\operatorname{Inventory \ turnover} = \frac{COGS}{\frac{1}{2}(Inventory_T + Inventory_{T-1})} \\ &A/\text{R \ turnover} = \frac{Revenue}{\frac{1}{2}(A/R_T + A/R_{T-1})} \\ &A/\text{P \ turnover} = \frac{COGS}{\frac{1}{2}(A/P_T + A/P_{T-1})} \\ &Cash \ conversion \ cyle = \frac{365}{Inv. \ turnover} + \frac{365}{A/R \ turnover} - \frac{365}{A/P \ turnover} \\ &Asset \ turnover = \frac{Net \ revenue}{\frac{1}{2}(Assets_T + Assets_{T-1})} \\ &Current \ ratio = \frac{Current \ assets}{Current \ liabilities} \\ &Quick \ ratio = \frac{Cash + Short \ term \ investments + A/R}{Current \ liabilities} \\ &Debt \ ratio = \frac{Total \ liabilities}{Total \ assets} \\ &Income \ from \ operations \\ &Interest \ expense \end{aligned}$$

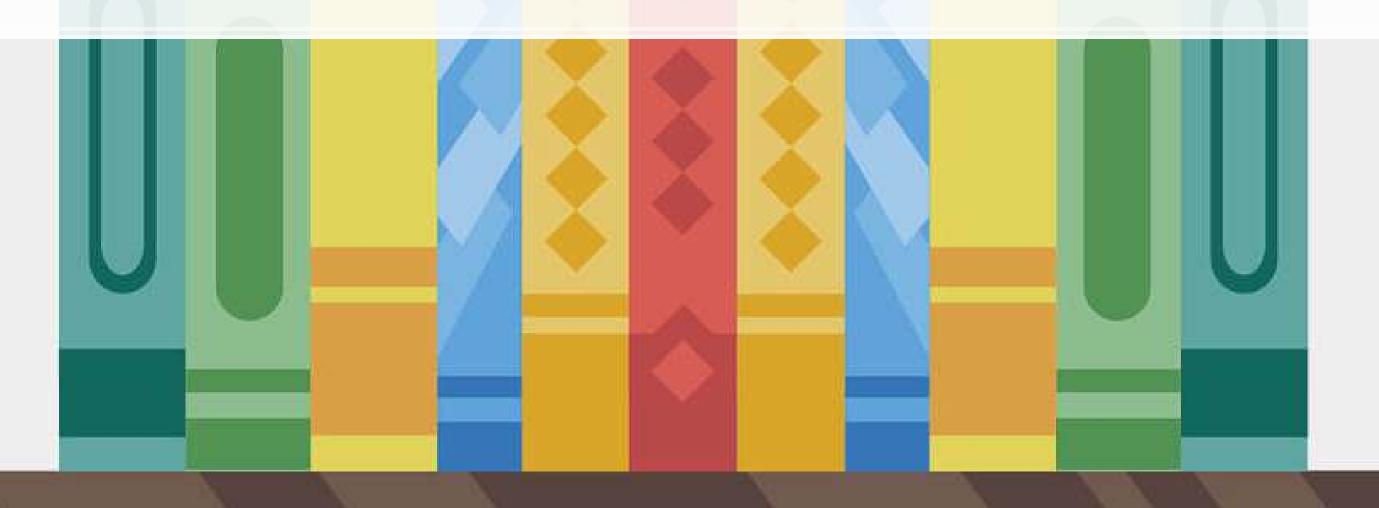
Income statement ratio equations



Equity ratio equations

Earnings per share (EPS) =
$$\frac{Net\ income - Dividends\ on\ pref.\ shares}{\frac{1}{2}(\#Shares_T + \#Shares_{T-1})}$$

$$Price/earnings\ ratio\ (P/E) = \frac{Stock\ price}{EPS}$$



Analytics

$$\varepsilon_{ex} = \frac{dQ_{ex}}{de} \cdot \frac{e}{Q_{ex}}; \ \varepsilon_{in} = \frac{dQ_{im}}{de} \cdot \frac{e}{Q_{im}}.$$

$$NE(e) = Q_{ex}(e) - eQ_{im}(e),$$

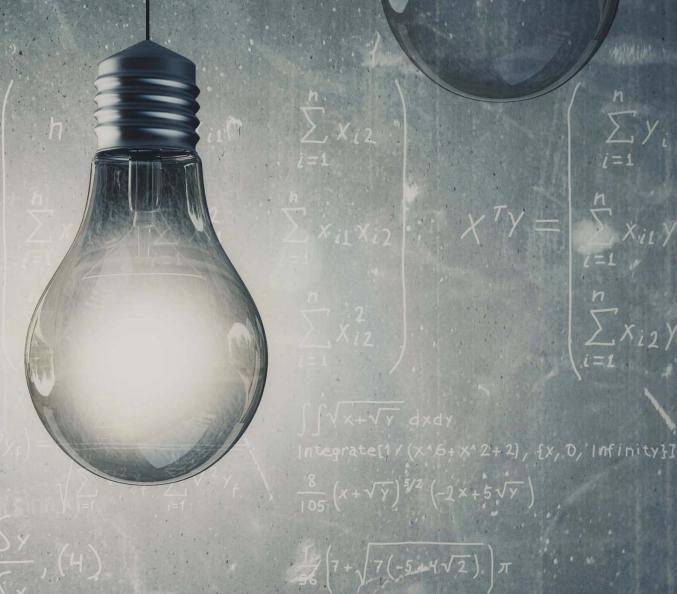
$$\Delta NE = \frac{c!Q_{ex}}{de} \Delta e - e \frac{dQ_{im}}{de} \Delta e - eQ_{im}.$$

$$= \frac{x^{2}(1-x)^{b-1}}{a} \int_{0}^{1} x^{a-1} (1-x)^{b-2} dx - \frac{b-1}{a} \int_{0}^{1} x^{a-1} (1-x)^{b-2} dx = \frac{b-1}{a} B(a, b-1) - \frac{b-1}{a} B(a, b),$$

$$= \frac{b-1}{a} B(a, b-1) - \frac{b-1}{a} B(a, b-1).$$

$$\chi_{l_{u}} = \frac{\sum_{P_{0}q_{1}}}{\sum q_{1}} + \frac{\sum_{P_{0}q_{0}}}{\sum q_{0}} \quad f(x) = \frac{a_{0}}{2} + \sum_{n=1}^{\infty} (a_{n} \cos nx + b_{n} \sin nx) \quad G^{2}(\varepsilon) = \widetilde{S}^{2}(\varepsilon) = \widetilde{S}^{2}(\varepsilon)$$

$$\frac{\sum_{k=2}^{n} (y_k - y_1) \cdot (y_{k-1} - y_2)}{\sum_{k=2}^{n} (y_k - y_1)^2 \cdot \sum_{k=2}^{n} (y_{k-1} - y_2)^2} = \frac{\sum_{k=2}^{n} (y_k - y_1)^2 \cdot \sum_{k=2}^{n} (y_{k-1} - y_2)^2}{\sum_{k=2}^{n} (y_1 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot \sum_{k=2}^{n} (y_2 - y_2)^2}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_k - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_1)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx} = \frac{\sum_{k=2}^{n} (y_2 - y_2)^2 \cdot dx}{\sum_{k=2}^{n} (y_2$$



Background

This is a quick preview of a module called "Forecasting and Forensic Analytics," part of the Analytics major in SOA

 You don't need to know this for this class, but the techniques covered here are becoming more and more important

Revenue prediction

Predicting ROA for tech companies using prior year data

```
summary(fit)
```

1000

4040

```
## Call:
  lm(formula = ROA ~ ROA_lag + Revenue_lag + Debt_lag + factor(gind),
      data = df tech)
## Residuals:
               1Q Median
  -4.4421 -0.0238 0.0107 0.0467 0.4378
## Coefficients:
                     Estimate Std. Error t value Pr(>|t|)
  (Intercept)
                     0.004095
                                0.031227
                                           0.131 0.89569
  ROA lag
                     0.469025
                                0.061576
                                          7.617 6.91e-14 ***
## Revenue lag
                     0.030639
                                0.015260
                                           2.008 0.04498
## Debt lag
                     0.121253
                                0.040732
                                          2.977 0.00299 **
## factor(gind) 451020 -0.092444
                                0.035630 -2.595 0.00964 **
## factor(gind)451030 -0.035024
                                0.033293 -1.052 0.29310
## factor(gind) 452010 -0.138055
                                0.034286 -4.027 6.16e-05 ***
## factor(gind) 452020 -0.077091
                                0.032478 -2.374 0.01784
## factor(gind) 452030 -0.090377
                                0.034553 -2.616 0.00906 **
## factor(gind) 453010 -0.014934
                                0.032090 -0.465 0.64178
```

0011000

R

0010

(2)(2)(2)(6)

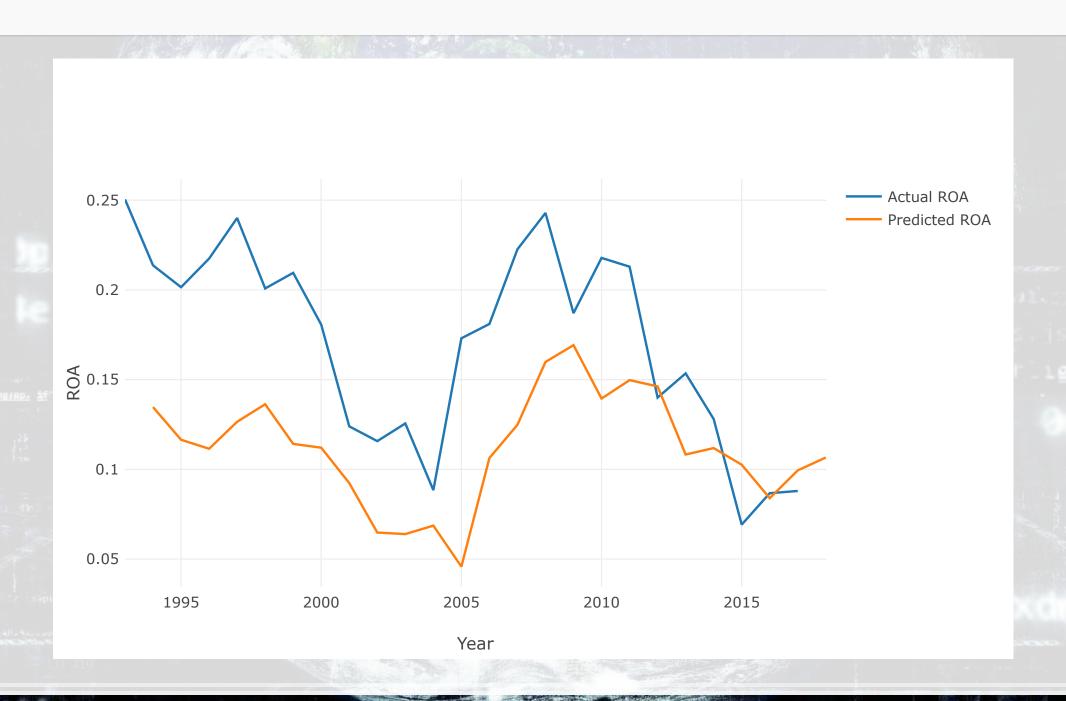
Code: Revenue prediction

```
library(readr)
library(dplyr)
df <-read.csv("/media/Data/Data/Compustat/Compustat 199301-201703.csv")</pre>
df <- data.frame(df)</pre>
df tech \leftarrow subset(df, gsector == 45 & at > 10000,
                   select=c("gvkey", "datadate", "at", "ni", "lt", "revt", "gind"))
df tech <- arrange(df tech, gvkey, datadate)</pre>
df tech$ROA <- df tech$ni / df tech$at</pre>
df tech$Revenue <- df tech$revt / df_tech$at
df tech$Debt <- df tech$lt / df tech$at</pre>
x <- c("ROA", "Revenue", "Debt") # Columns to lag
df tech <- df tech %>%
 group by(gvkey) %>%
 mutate at(.cols=x, .funs=funs(lag = dplyr::lag(., n=1, default=NA)))
is.na(df tech) <- sapply(df tech, is.infinite)</pre>
fit <- lm(ROA ~ ROA lag + Revenue lag + Debt lag + factor(gind), data=df tech)
save(fit, file = "Data/fit.rda")
summary(fit)
```

R

Revenue prediction for Microsoft

Predict out Microsoft's 2018 ROA



1000

4040

.0011000

(OCHE)

Code: Revenue prediction for Microsoft

```
R
df ms <- subset(df, gvkey==12141, select=c("gvkey", "datadate", "at", "ni", "lt",</pre>
                                             "revt", "gind"))
df ms2 <- data.frame(gvkey=12141, datadate=20170630, at=241086,ni=21204,
                      lt=168692, revt=89950, gind=451030)
df ms3 <- data.frame(gvkey=12141, datadate=20180630, at=NA, ni=NA,
                      lt=NA, revt=NA, gind=451030)
df ms <- rbind(df ms, df ms2, df ms3)</pre>
df ms$ROA <- df ms$ni / df ms$at</pre>
df ms$Revenue <- df ms$revt / df ms$at</pre>
df ms$Debt <- df ms$lt / df ms$at</pre>
x <- c("ROA", "Revenue", "Debt") # Columns to lag
df ms <- df ms %>%
 group by(gvkey) %>%
 mutate at(.cols=x, .funs=funs(lag = dplyr::lag(., n=1, default=NA)))
df ms$ROA predicted <- predict(fit, df ms)</pre>
df ms$year = floor(df ms$datadate/10000)
save(df ms, file="Data/df ms.rda")
```

Fraud detection

Using 3 components:

生的生意

- 1. Topic what companies say in annual reports
- 2. Style writing style used in annual reports
- 3. Financials financial ratios

Classification Performance of topic for AAERs and Irregularity Restatements

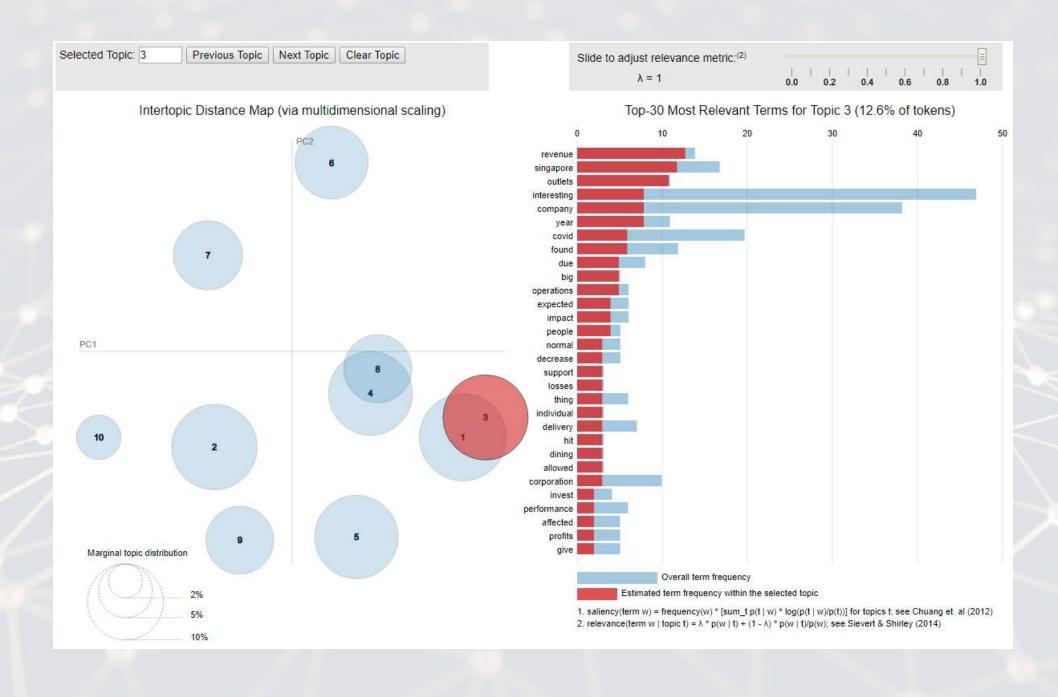
| Pane | A. | Classification | of | AAERS |
|------|----|----------------|----|-------|

| | Classification % | | | NDCG@k |
|---------------------------|------------------|-------|------------------|--------|
| | $50 \mathrm{th}$ | 90 th | $95 \mathrm{th}$ | 99 th |
| topic | 72.54 | 18.60 | 11.25 | 0.097 |
| F-score | 71.16 | 23.86 | 14.04 | 0.141 |
| Style | 60.21 | 11.95 | 6.50 | 0.085 |
| topic and F -score | 74.07 | 32.07 | 17.24 | 0.192 |
| topic and $Style$ | 74.47 | 19.40 | 11.27 | 0.123 |
| F-score and $Style$ | 73.98 | 23.73 | 14.66 | 0.168 |
| topic, F-score, and Style | 75.09 | 31.50 | 21.44 | 0.176 |

 Brown, Crowley, & Elliott (2020, Journal of Accounting Research)



Text classification of what you found interesting on HW2





Wrap up

- For next week
 - 1. Homework 5
 - Cash flows and financial ratios
 - Turn in by next week
 - 2. Next week:
 - Groups will present in order
 - Group numbers were randomly assigned initially!
 - Group project presentations
 - Email me slides by 10am of that class day
 - 3. Extra practice available
 - Financial ratios eLearn quiz

Packages used for these slides

- dplyr
- kableExtra
- knitr
- Ida
- LDAvis
- plotly
- revealjs
- servr
- tm