

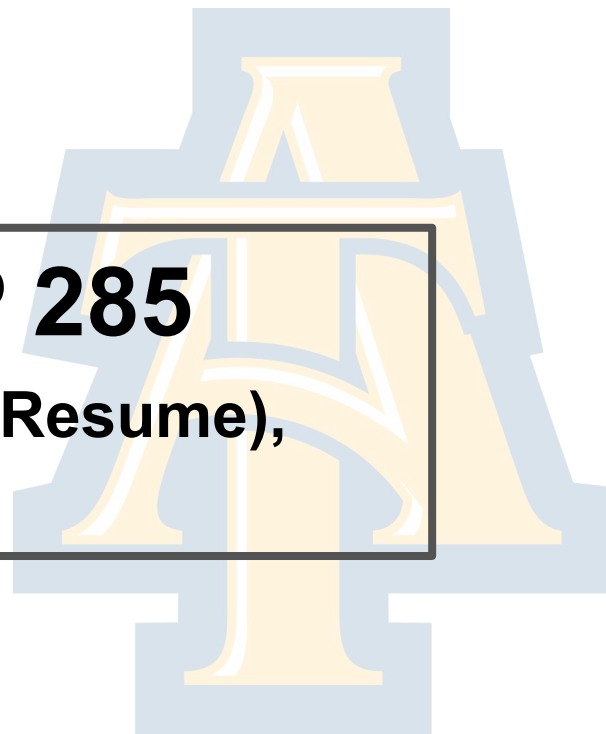
COMP - 285

Advanced Analysis of Algorithms

# **Welcome to COMP 285**

**Lecture 1: CS Job Hunting (Resume),  
Pseudocode and Recursion**

**Chris Lucas (cflucas@ncat.edu)**



# HW0 is out!

Due Thursday @ 11:59PM !!!!

## Homework Assignments

### Homework 0: Logistics + Getting to Know You

Release: [Aug 18, 3:30 PM](#) - Due: [Aug 25, 11:59 PM](#)

- PDF Version: [\[Link\]](#)
- Repl.it: [\[Starter code\]](#)

# Big Questions!

## 08/23/22 - Session

- How to get started with career prep?
- How to write a compelling technical resume?
- How to multiply integers?
- How to conquer? Do we divide?
- How fast is fast enough?



# Big Questions!

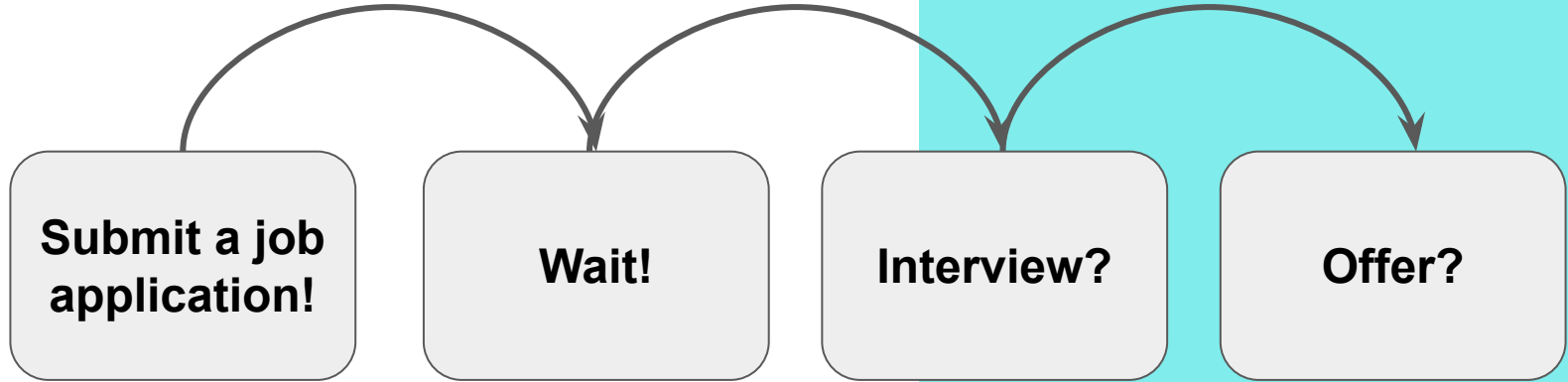
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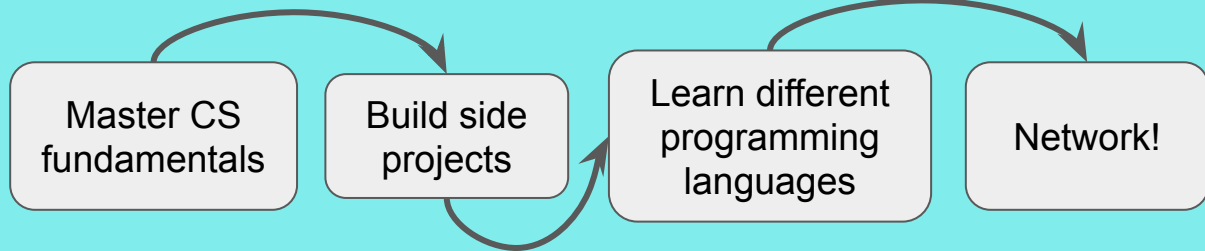
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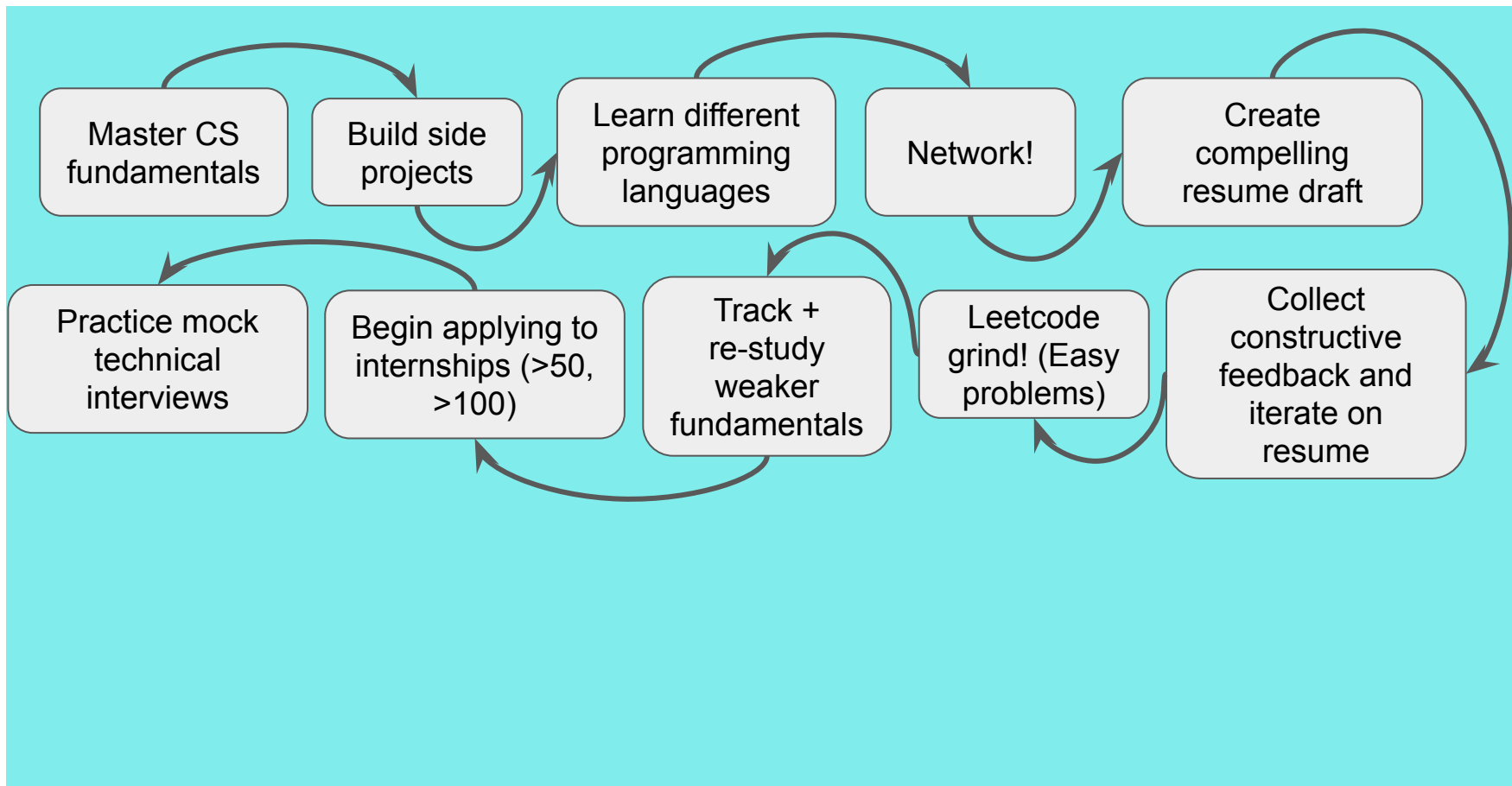




# Recruitment Process?

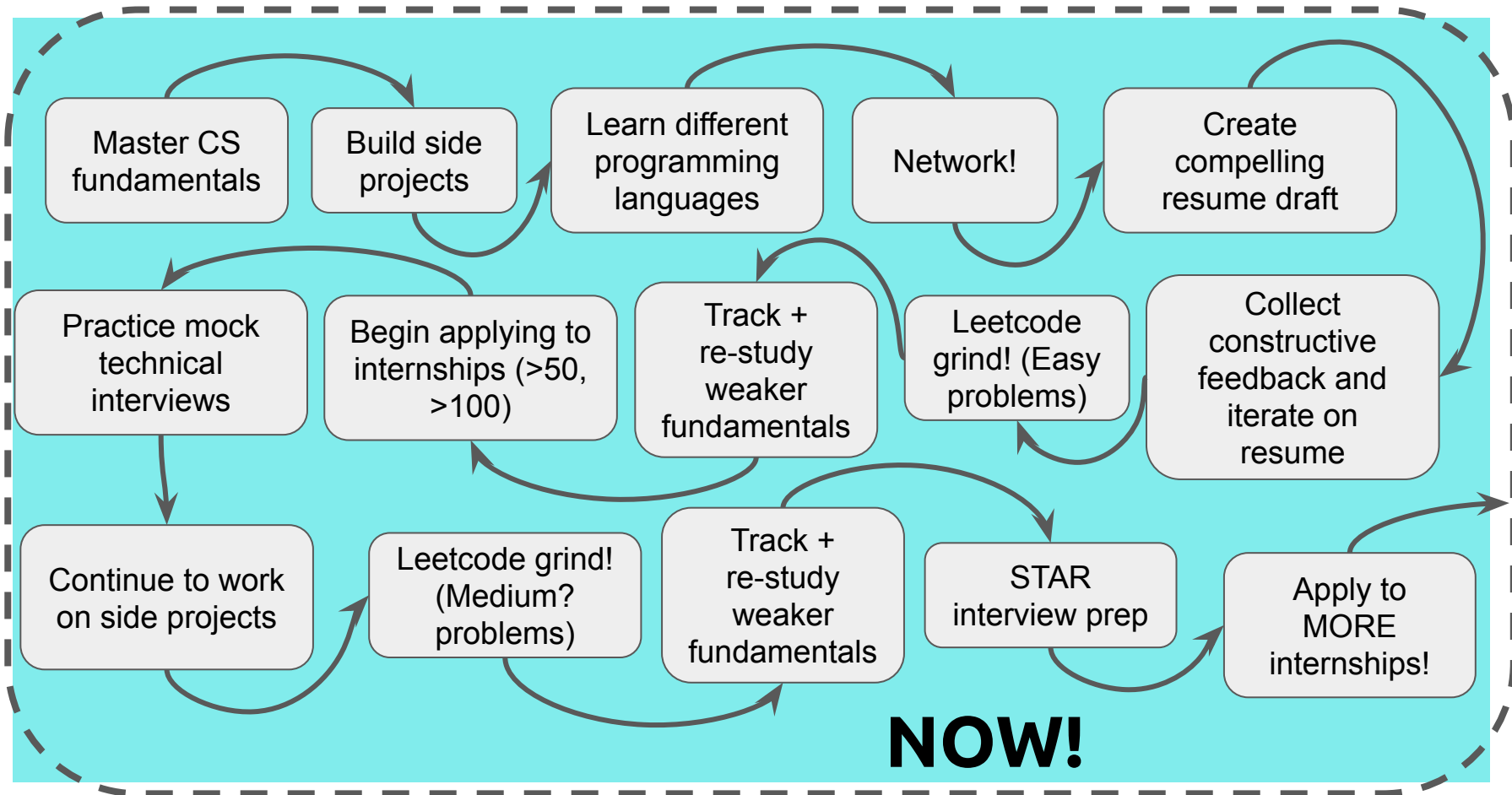


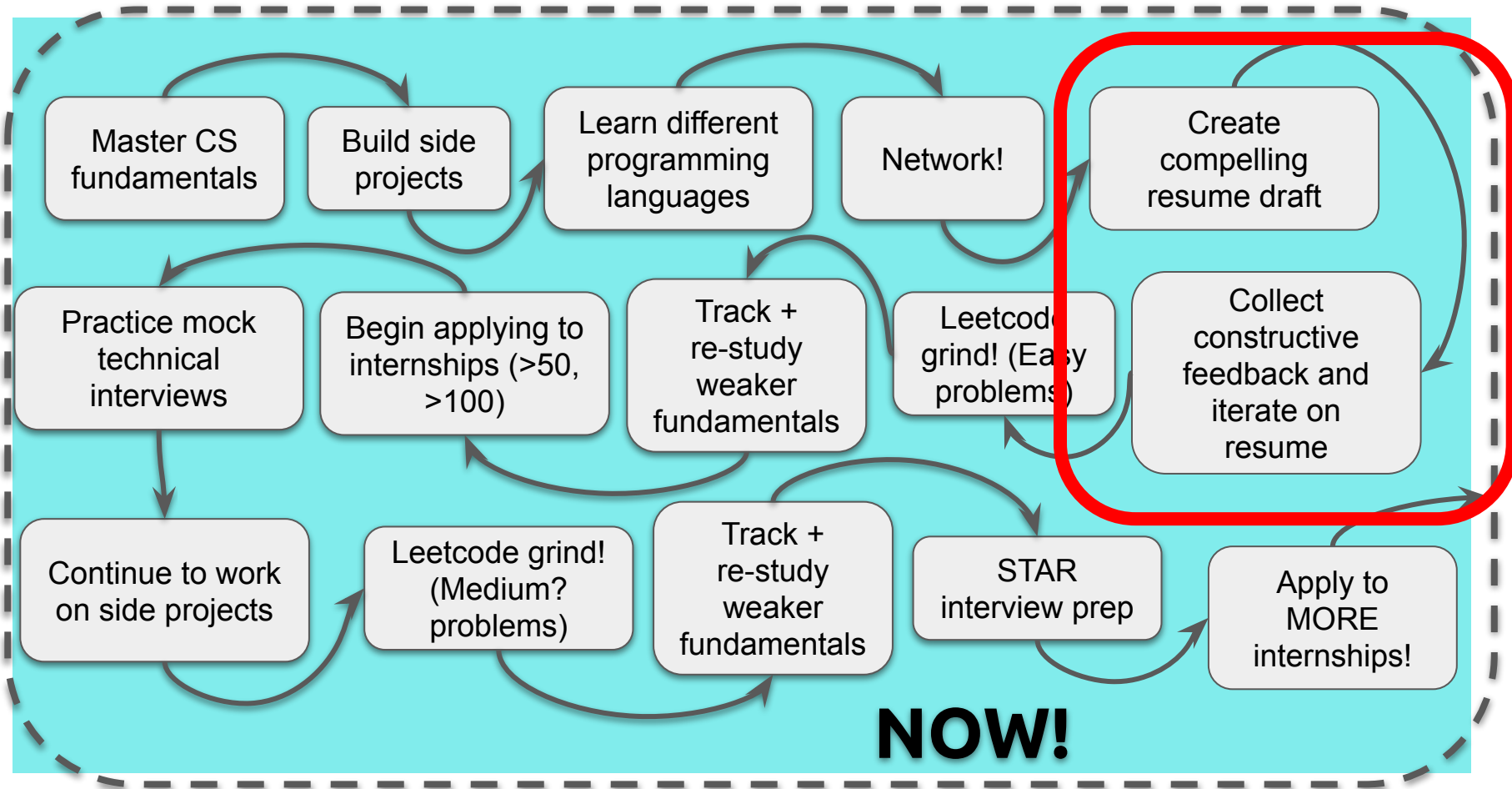












# Big Questions!

## 08/23/22 - Session

- How to get started with career prep?
- How to write a compelling technical resume?
- How to multiply integers?
- How to conquer? Do we divide?
- How fast is fast enough?



# **Resumes!!!**



**EVERYONE CAN WRITE A POLISHED AND  
COMPELLING RESUME!**



# **EVERYONE CAN WRITE A POLISHED AND COMPELLING RESUME!**

**(it will just take some time and effort)**

# **What makes a strong, technical resume?**



**What makes a ~~strong, technical~~ resume?**

# What makes a ~~strong, technical~~ resume?

- 1 page !
- Personal information (name, phone # and/or email)
- No pictures, selfies
- 10-12pt font, Times New Roman, Arial, etc.
- Standardized sections: Education, Experience, Other, Software Projects, Skills & Interests
- **CONCISE! SKIMMABLE!**

**RESUME TIPS**

**RESUME LANGUAGE SHOULD BE:**

- Specific rather than general
- Active rather than passive
- Written to express not impress
- Articulate rather than "flowery"
- Fact-based (quantify and qualify)
- Written for people who scan quickly

**DONT:**

- Use personal pronouns (such as I)
- Abbreviate
- Use a narrative style
- Use slang or colloquialisms
- Include a picture
- Include age or gender
- List references
- Start each line with a date

**TOP 6 RESUME MISTAKES:**

1. Spelling and grammar errors
2. Missing email and phone information
3. Using passive language instead of "action" words
4. Not well organized, concise, or easy to skim
5. Not demonstrating results
6. Too long

**DO:**

- Be consistent in format and content
- Make it easy to read and follow, balancing white space
- Use consistent spacing, underlining, italics, bold, and capitalization for emphasis
- List headings (such as Experience) in order of importance
- Within headings, list information in reverse chronological order (most recent first)
- Avoid information gaps such as a missing summer
- Be sure that your formatting will translate properly if converted to a .pdf

**PLAN TO WORK INTERNATIONALLY?**

Resume guidelines can vary from country to country. See our international resources at [ocs.fas.harvard.edu/online-tools](https://ocs.fas.harvard.edu/online-tools)

RESUMES AND COVER LETTERS  
Resume Template

Home Street Address • City, State Z

**HARVARD UNIVERSITY**  
Degree, Concentration: GPA [Note: Optional]  
Thesis [Note: Optional]  
Relevant Coursework: [Note: Optional. Awards and Honors [Note: If Applicable]]

**STUDY ABROAD** [Note: If Applicable]  
Study abroad coursework in \_\_\_\_\_.

**NAME OF HIGH SCHOOL**  
[Note: May include GPA, SAT/ACT scores, or

**ORGANIZATION**  
Position Title

- Beginning with your most recent paragraph form.
- Begin each line with an action verb.
- Quantify where possible.
- Do not use personal pronouns; e

**ORGANIZATION**  
Position Title

- With your next-most recent paragraph form.
- Begin each line with an active skills, knowledge, abilities, Quantify where possible.
- Do not use personal pronouns

**ORGANIZATION**

- This section can be form
  - If this section is more r
- Experience section.

Technical: List computer so  
Language: List foreign lang  
Laboratory: List scientific  
Interests: List activities yc

NICHOLAS D. ROBERTS

932 Hollings Road • Eden, New York 14054 • (716) 992-0909 • [mroberts@buffalo.edu](mailto:mroberts@buffalo.edu)

## OBJECTIVE

A position in corporate finance using proven problem-solving, analytical and interpersonal skills.

## EDUCATION

UNIVERSITY AT BUFFALO  
Master of Business Administration, expected May 2015  
Concentrations: Finance and Information Systems & E-Business  
GPA: 3.8/4.0

CANISIUS COLLEGE  
Bachelor of Science in Business Administration, September 2010  
Concentration: Finance  
GPA: 3.3/4.0

## EXPERIENCE

- Helped to reduce company's \$1 million dollar account receivable to \$400,000 in 18 months without a significant reduction in sales volume
- Negotiated a rate decrease with check guarantee vendor resulting in a \$50,000 savings
- Trained wholesale sales representatives in the check guarantee process which results in a 98% approval rate for bad check submissions for coverage
- Reduced internal check float time from three days to one day
- Evaluated credit for new accounts which helped reduce bad debt and days' sales outstanding
- Strengthened customer relationship manager loyalty management and its sales representatives
- Created database reports with the help of our MIS professionals to provide essential information for operational analysis

**PRAXAIR, INC.**, Tonawanda, New York  
**Corporate Audit**, 09/2010 – 08/2011

- Conducted year-end compliance audits of production facilities throughout the United States
- Created an audit profile for the company's Medigas division
- Recognized relatively high telephone expenses for an expatriate officer and developed a solution to minimize this expense with the help of the telecommunications department
- Recognized areas for improvement and discussed alternative solutions with local management after participating in a month long accounting and operational audit of plant facilities in China

- Analyzed float operations of newly acquired bank for Assistant Vice President of Technology and Banking Operations
- Recommended how to minimize cost of combined float operations

## COMPUTER SKILLS

Proficient in Microsoft Office (Word, PowerPoint, Excel and Access), Microsoft Front Page,  
Basic HTML, Dynamic HTML, Lotus Notes, Lotus Smart Suite  
Familiar with Adobe Pagemaker, Visual Basic, Visual C++, JavaScript, Java

#### ACTIVITIES/ AFFILIATION

**Vice President** of the Graduate Management Association (GMA)  
Webmaster for the National MBA Consortium and GMA web sites  
**Volunteer Practice Interviewer** for the School of Management Career Resource Center  
Member of Winning Team in the IBM Career Advantage Competition

you design a strong resume, OCS offers formatted templates. On the OCS website, templates" and click on OCS Guides and Templates. Choose bulleted or paragraph your information, and then bring your draft to drop-ins for editing and feedback.

**RESUMES AND COVER LETTERS**

**Resume Template II (paragraph style)**

Firstname Lastname  
Address • City, State Zip • your email address

**ne Template II (paragraph format)**

Firstname Lastname  
 Address • City, State Zip • youremail@college.harvard.edu •

Education

Optional  
 Site: OCS

Education

Awards and honors can also be listed here.]

mic honors an employer may want to know]

**Experience**

City, Country  
Month Year - Month Year

### Experience

*City, State (or Remote Location) – Month Year*

experience, skills, and resulting outcomes in bullet or paragraph form, where possible. Do not use personal pronouns; each line should be written as a complete sentence. Do not use personal pronouns; articles can make your descriptions flow more smoothly.]

### Ship & Activities

Month Year – Month Year City, State  
for, consider moving this above your Experience section. If this  
section, or you can omit descriptions for activities. If this  
consider-

Month Year - Month Year  
Consider moving this above your Experience section.]

cable  
ion

Technical: List computer so  
Language: List foreign lang  
Laboratory: List scientific  
Interests: List activities y

**ORGANIZATION**

**Role**

- This section can be form
- If this section is more r

Experience section.

Technical: List computer so  
Language: List foreign lang  
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Interests: List activities y

**EXPERIENCE**

**ADVANTAGE COMPANY**, Williamsville, New York  
**Operations Manager/Analyst**, 01/2011 – 05/2013

- Helped to reduce company's \$1 million dollar account receivable to \$400,000 in 18 months without a significant reduction in sales volume
- Negotiated a rate decrease with check guarantee vendor resulting in a \$5,000 savings
- Trained wholesale sales representatives in the check guarantee process which results in a 98% approval rate for bad checks submitted for coverage
- Reduced internal check float time from three days to one day
- Evaluated credit for new accounts which helped reduce bad debt and days' sales outstanding
- Acted as relationship manager between the company and its sales representatives
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- Recognized areas for improvement and discussed alternative solutions with local management after participating in a month long accounting and operational audit of plant facilities in China

**M&T BANK**, Buffalo, New York  
**Finance Intern**, Summer 2010

- Analyzed float operations of newly acquired bank for Assistant Vice President of Technology and Banking Operations
- Recommended how to minimize cost of combined float operations

<b>COMPUTER SKILLS</b>	<p>Proficient in Microsoft Office (Word, PowerPoint, Excel and Access), Microsoft Front Page, Basic HTML, Dynamic HTML, Lotus Notes, Lotus Smart Suite</p> <p>Familiar with Adobe PageMaker, Visual Basic, Visual C++, JavaScript, Java</p>
<b>ACTIVITIES/ AFFILIATION</b>	<p><b>Vice President</b> of the Graduate Management Association (GMA)</p> <p>Webmaster for the National MBA Consortium and GMA web sites</p> <p><b>Volunteer Practice Interviewer</b> for the School of Management Career Resource Center</p> <p>Member of Winning Team in the IBM Career AdvantEdge Competition</p>

able] ton

Month Year – Month Year City, State  
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e: Optional] Month Year – Month Year City, State

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## **CASHIER, CHICK-FIL-A, GREENSBORO, NC | 06/17 - 09/17**

- I would help customers by taking their orders then would ensure they received their correct order.

## **CENTRE-STORE STOCKER, FOOD LION, GREENSBORO, NC | 06/18 - 09/18**

- I would find and retrieve stock then place it on allocated shelves in an efficient way.

## **“RATE EM” IOS APP, NCAT HACKATHON, GREENSBORO, NC | 10/19**

- We worked on an app to rate professors and cafeteria food on-campus using “Rate Me” tokens.

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Why does it matter?

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What does this  
“token” mean?

Using  
pronouns

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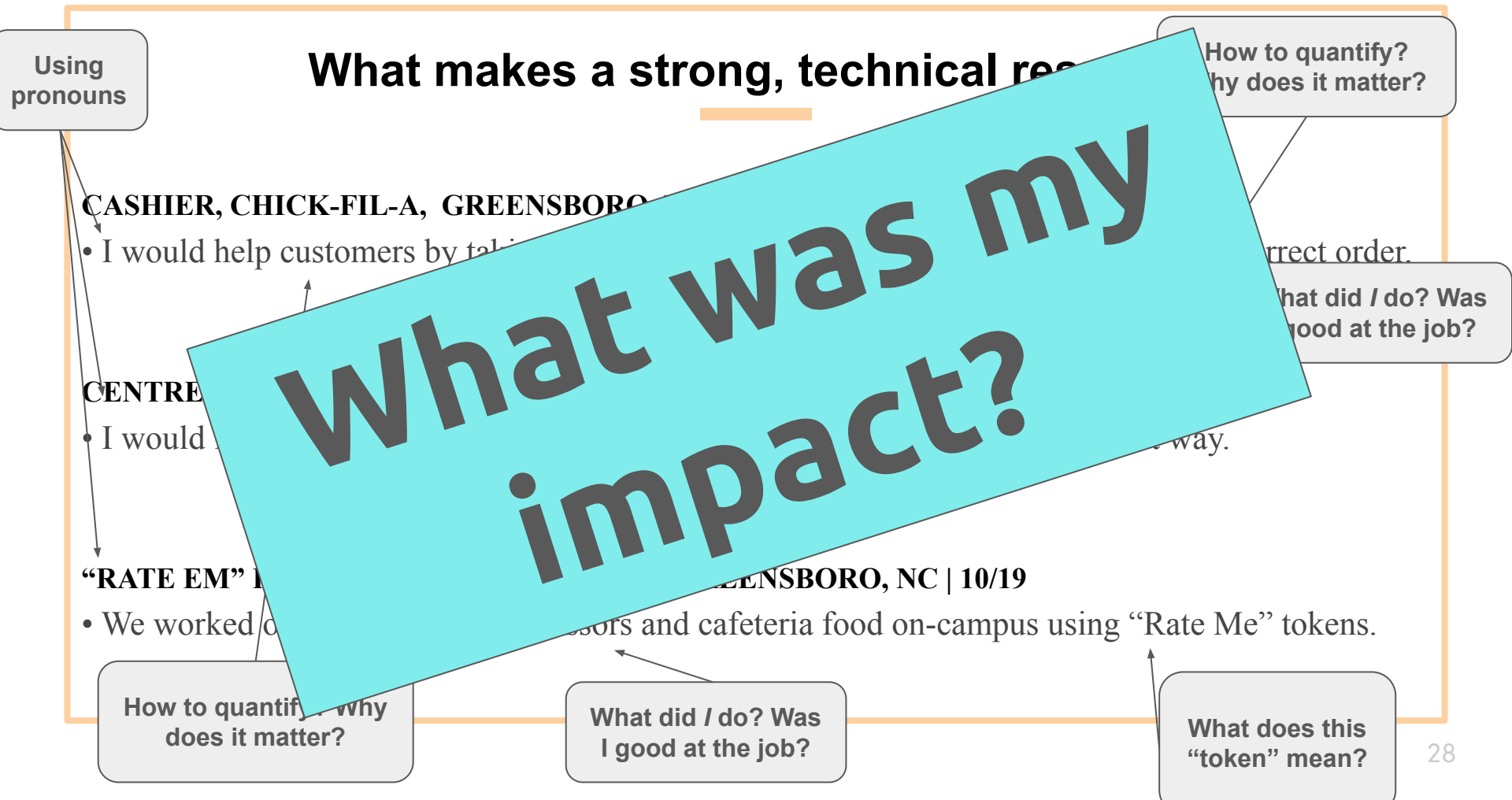
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What did I do? Was  
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How to quantify? Why  
does it matter?

What did I do? Was  
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What does this  
“token” mean?



**ACTION  
VERB**



**WHAT  
*YOU* DID**



**RESULTS,  
WHY IT'S  
IMPORTANT**

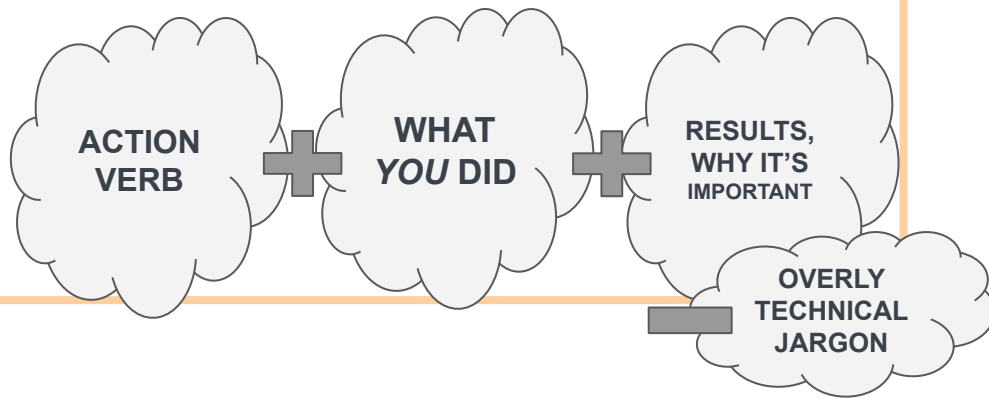


**OVERLY  
TECHNICAL  
JARGON**

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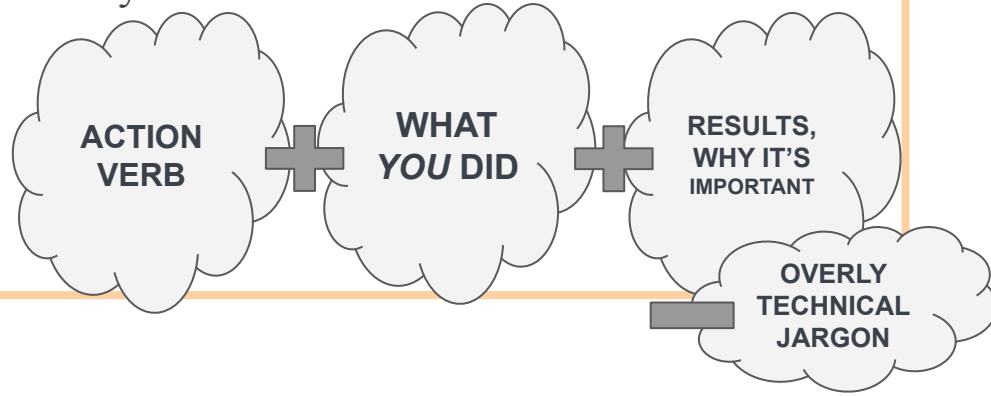
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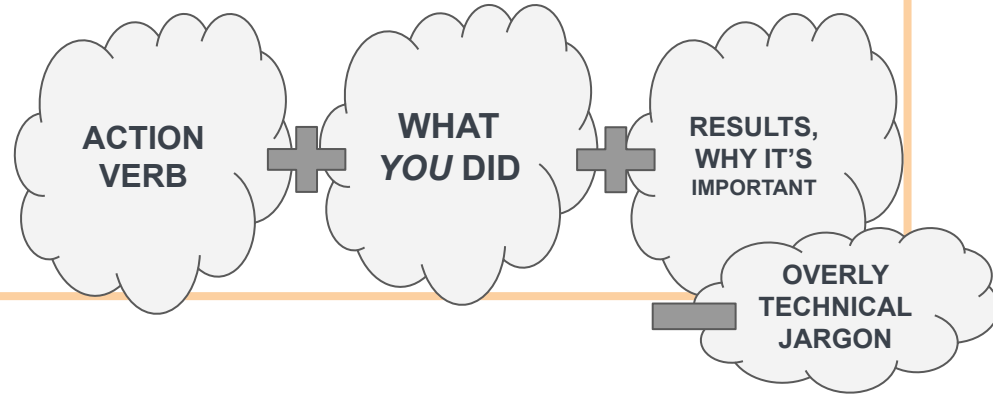
- I would help customers by taking their orders then would ensure they received their correct order.
- Utilized F2F order management system to successfully input over 50 orders/hr then mentored two new hires to achieve same level of productivity



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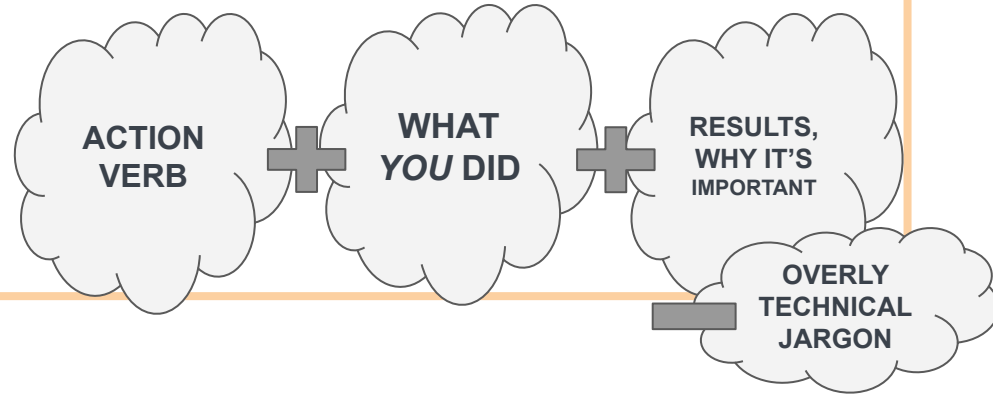




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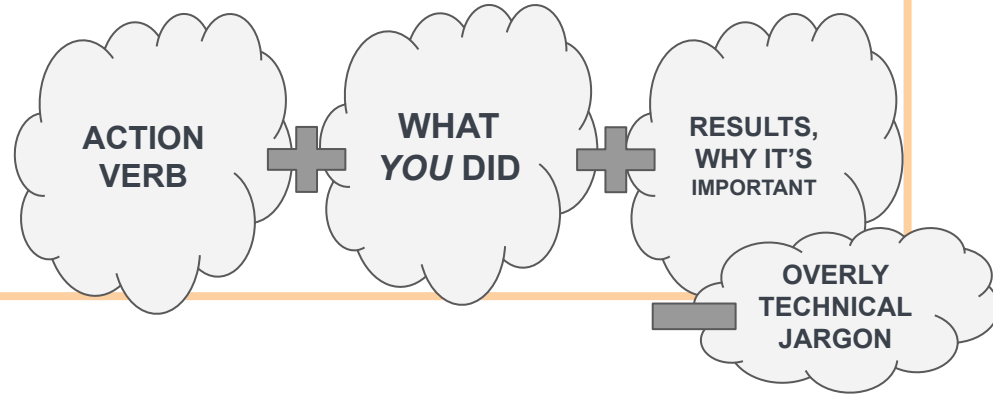
- I would find and retrieve stock then place it on allocated shelves in an efficient way.
- Managed stock of 300+ items and was recognized by senior management for ability to debug inconsistencies in the inventory counts logged in tracking software versus actual supply



# What makes a strong, technical resume?

**“RATE EM” IOS APP, NCAT HACKATHON, GREENSBORO, NC | 10/19**

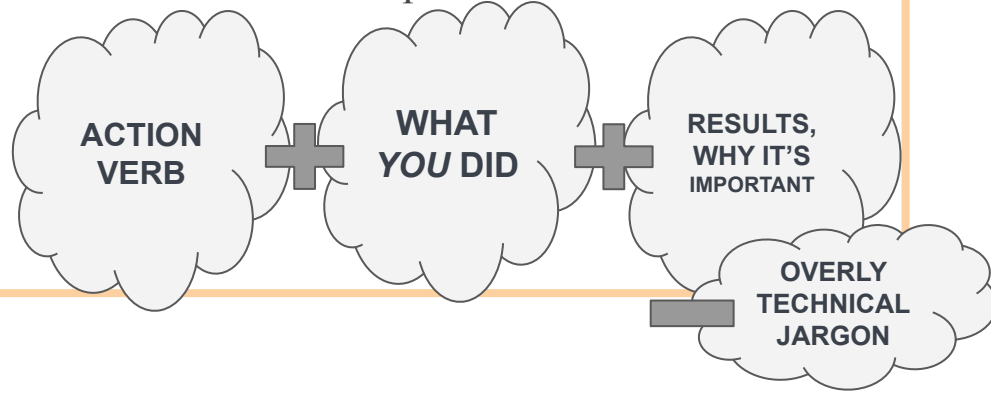
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- I worked on an app to rate professors and cafeteria food on-campus using “Rate Me” tokens.
- Developed iOS app to allow students to rate +250 professors and +7 on-campus cafeterias, requiring data from multiple university APIs; managed team of 4 and won third place award from Citadel sponsor



## How to “fluff”?

---

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- Consider side projects! (Github, Kaggle, Leetcode)

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---

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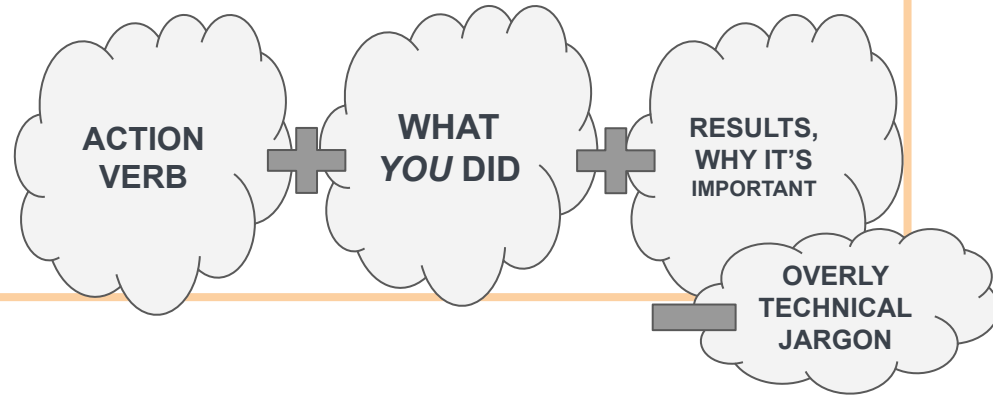
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- Consider your part time work experience!



## How to “fluff”?

- Consider side projects! (Github, Kaggle, Leetcode)
- Consider your extracurriculars here at NCAT! (leadership positions, impact that you’ve had, etc.)
- Consider your course projects and assignments! (Turn into side project!)
- Consider your part time work experience!
- Take time to breathe and reflect! Everyone starts somewhere and you have more experiences than you think!

# EVERYONE CAN WRITE A POLISHED AND COMPELLING RESUME!



# HW 1!!

**ACTION  
VERB**



**WHAT  
YOU DID**



**RESULTS,  
WHY IT'S  
IMPORTANT**

**OVERLY  
TECHNICAL  
JARGON**

# Big Questions!

## 08/23/22 - Session

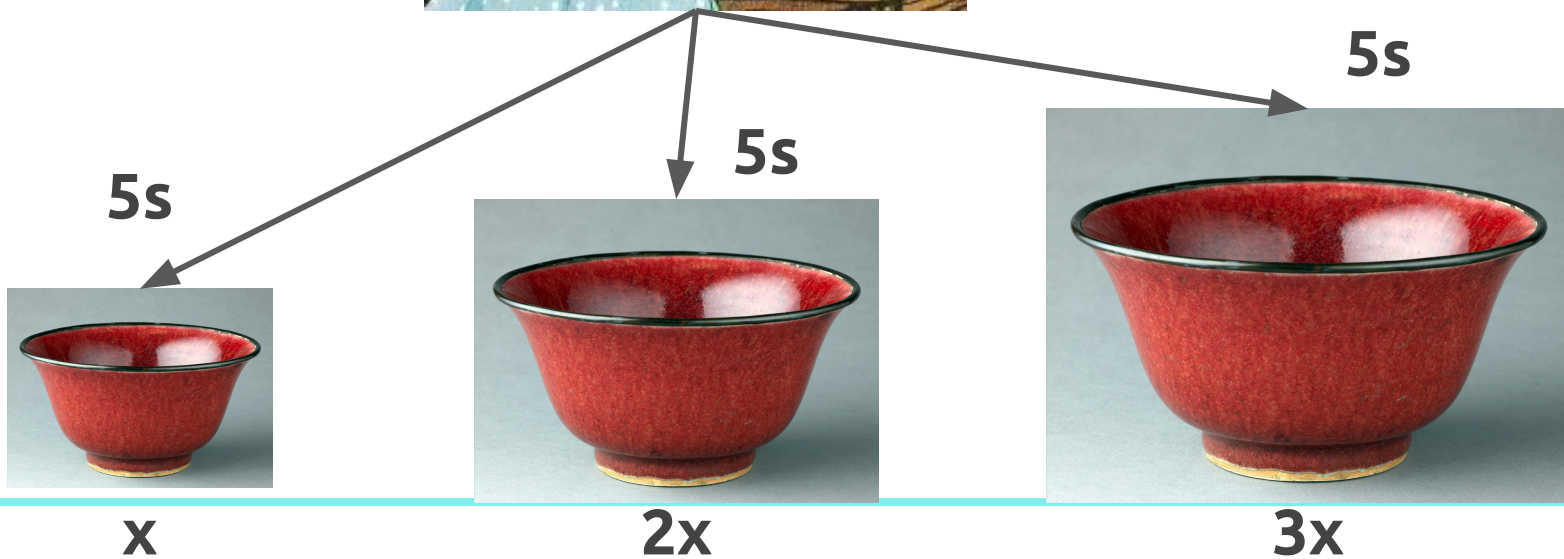
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- How to conquer? Do we divide?
- How fast is fast enough?



**Recall where we  
ended last lecture...**



**Constant**



**Linear**



**5s**



**x**

**10s**



**2x**

**15s**



**3x**



**Quadratic**

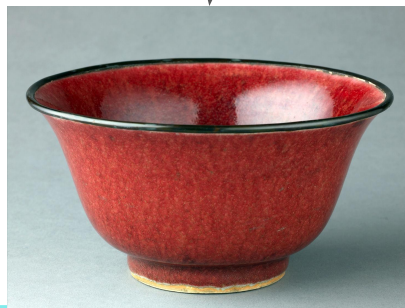


**5s**



**x**

**20s**



**2x**

**45s**



**3x**

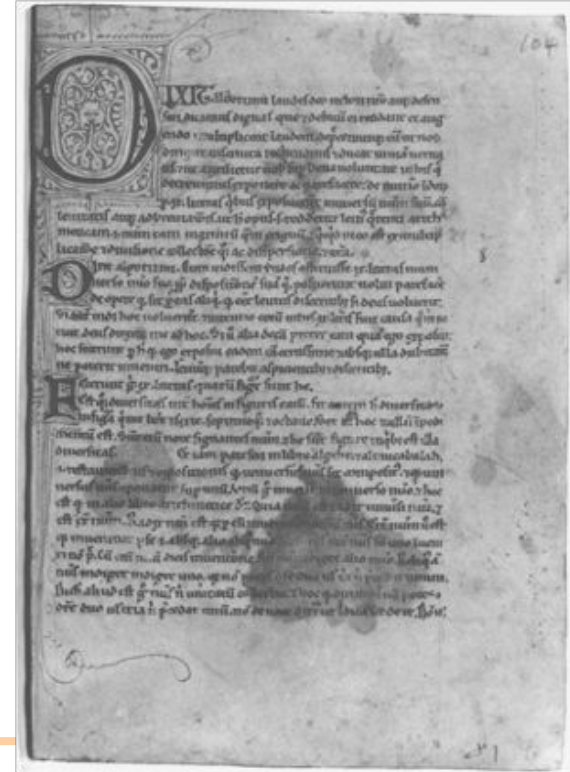
## What's an algorithm anyhow?

- Al-Khwarizmi was a 9th-century scholar, born in present-day Uzbekistan, who studied and worked in Baghdad during the Abbassid Caliphate.
- Among many other contributions in mathematics, astronomy, and geography, **he wrote a book about how to multiply with Arabic numerals.**
- His ideas came to Europe in the 12th century.



# What's an algorithm anyhow?

- Originally, “Algorisme” [old French] referred to just the Arabic number system, but eventually it came to mean “Algorithm” as we know today.



**This was kind of a big deal!**

$$\text{XLIV} \times \text{XCVII} = ?$$

## Integer multiplication!

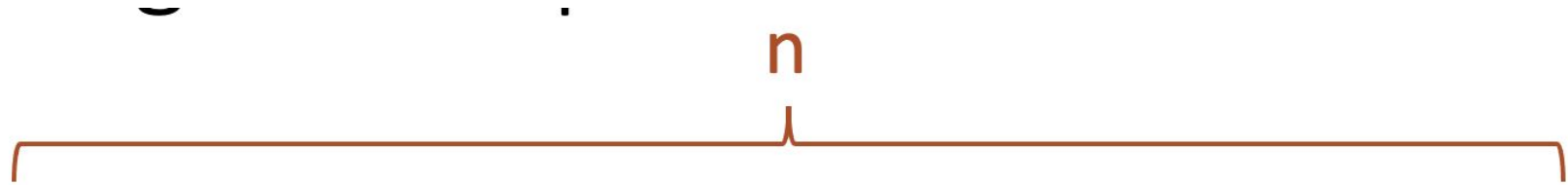
$$\begin{array}{r} 44 \\ \times 97 \\ \hline \end{array}$$

## Integer multiplication!

1234567895931413  
x 4563823520395533

---

How fast is this anyway?


$$\begin{array}{r} 1233925720752752384623764283568364918374523856298 \\ \times 4562323582342395285623467235019130750135350013753 \\ \hline \end{array}$$

How fast is this anyway?

$$\begin{array}{r} 1233925720752752384623764283568364918374523856298 \\ \times 4562323582342395285623467235019130750135350013753 \\ \hline \end{array}$$

(How many one-digit operations?)



**How fast is this anyway?**

---

About  $n^2$  one-digit operations

(How many one-digit operations?)

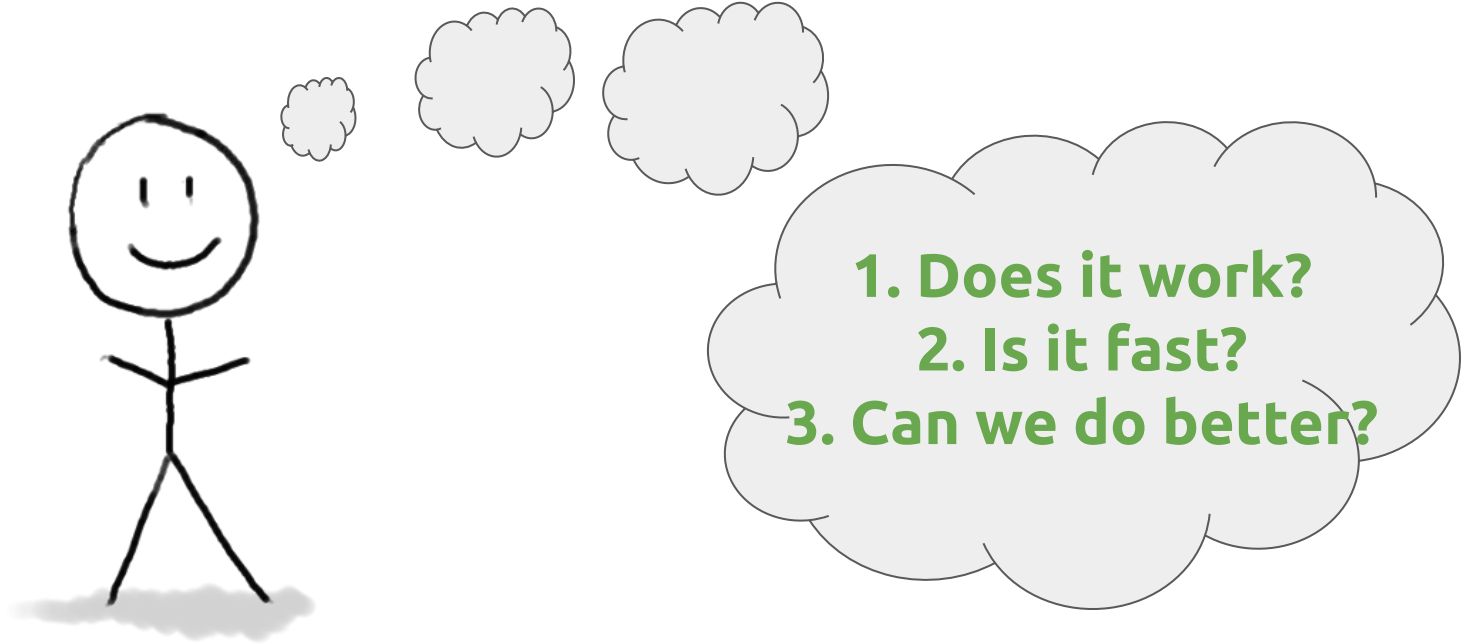
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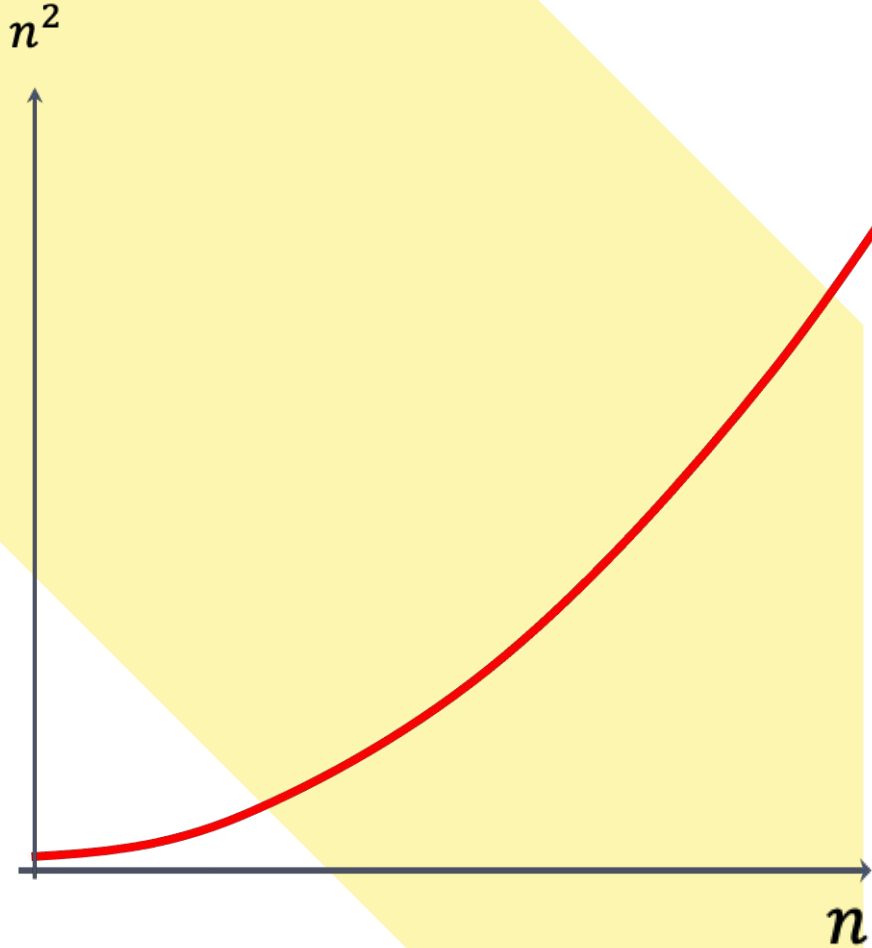
About  $n^2$  one-digit operations

*Multiply each one of the  $n$ -digits in the first number with each one of the  $n$ -digits in the second number ( $n * n$ )*

(How many one-digit operations?)

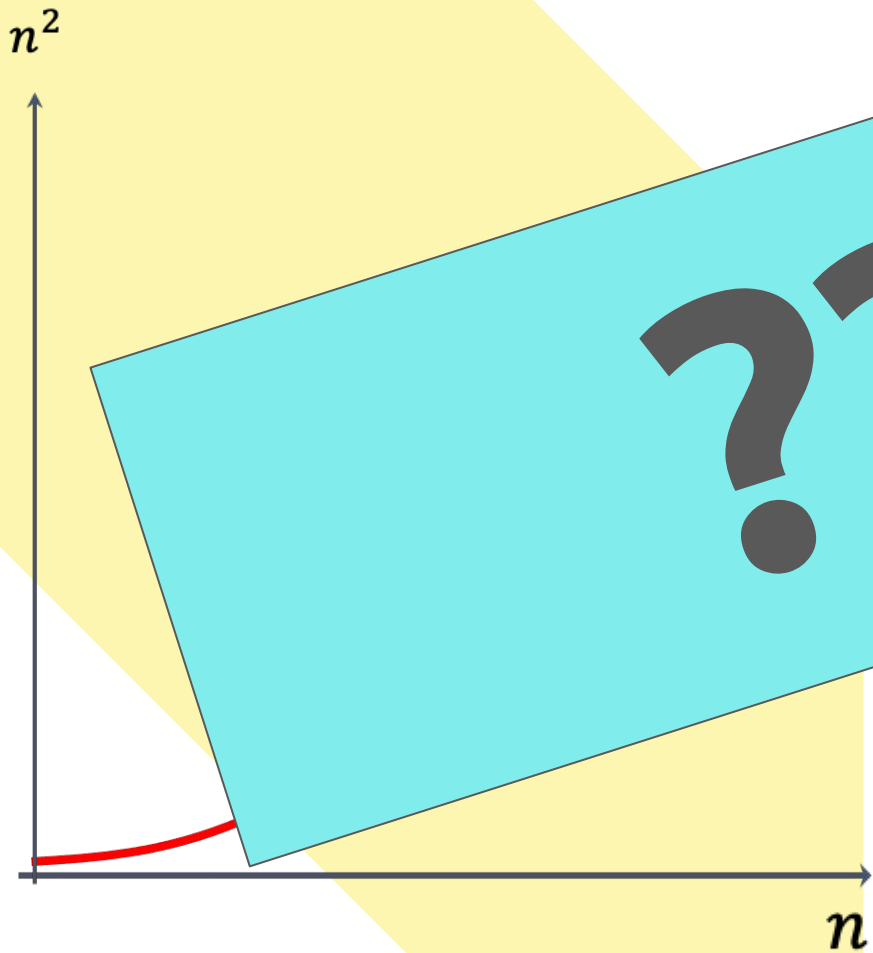
# Our Guiding Questions...





## Question?

Can we multiply  $n$ -digit integers in fewer than  $n^2$  operations?



Can we multiply  $n$ -digit  
integers in fewer than  
 $n^2$  operations?

# Big Questions!

## 08/23/22 - Session

- How to get started with career prep?
- How to write a compelling technical resume?
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**Can we do better?**  
**Let's dig into our algorithmic toolkit!**



## **A technique to know! - Divide & Conquer**

---



# A technique to know! - Divide & Conquer

Break problem up into smaller (easier) sub-problems



Big Problem!

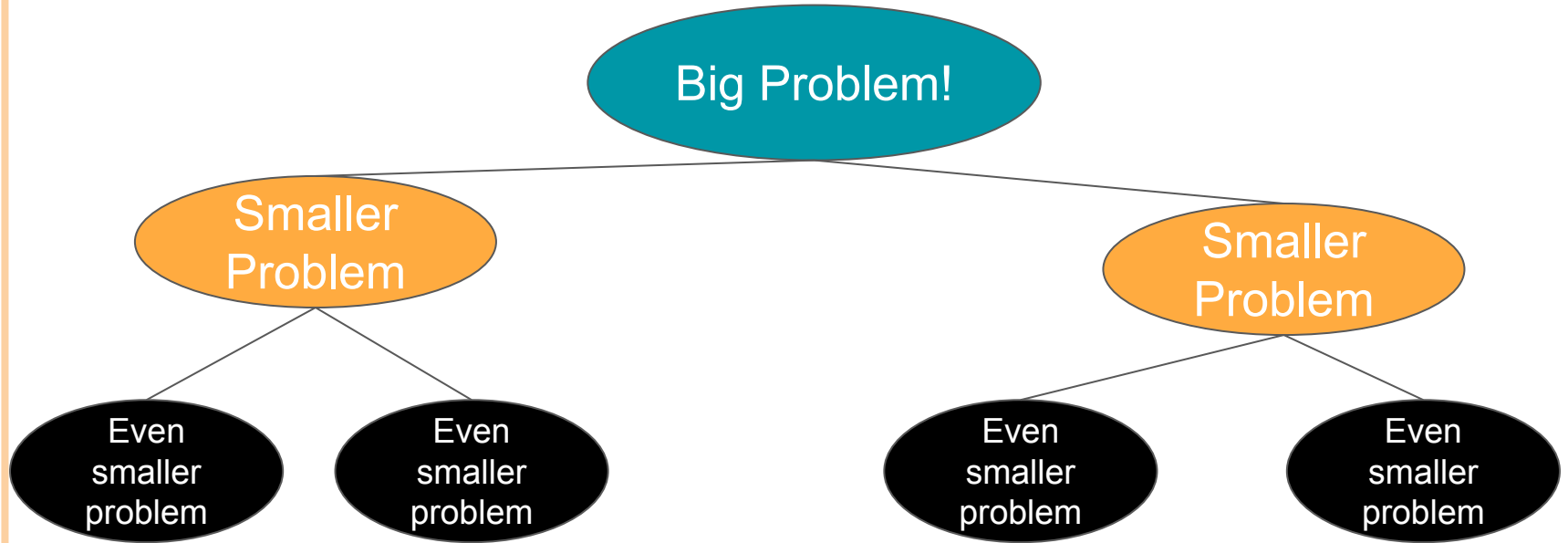
# A technique to know! - Divide & Conquer

Break problem up into smaller (easier) sub-problems



# A technique to know! - Divide & Conquer

Break problem up into smaller (easier) sub-problems



Can we do this for multiplication of integers?

$$12 * 34$$

Can we do this for multiplication of integers?

$$12 * 34$$

Can we do this for multiplication of integers?

$$12 * 34$$

$$12 = 1 * 10 + 2$$

$$34 = 3 * 10 + 4$$

Can we do this for multiplication of integers?

$$12 * 34$$

$$12 = 1 * 10 + 2$$

$$34 = 3 * 10 + 4$$

$$12 * 34 = (1 * 10 + 2)(3 * 10 + 4)$$

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$$34 = 3 * 10 + 4$$

$$12 * 34 = (1 * 10 + 2)(3 * 10 + 4)$$

$$= (1 * 10)(3 * 10) + 2 * (3 * 10) + 4 * (1 * 10) + 2 * 4$$



Can we do this for multiplication of integers?

$$12 * 34$$

$$12 = 1 * 10 + 2$$

$$34 = 3 * 10 + 4$$

$$12 * 34 = (1 * 10 + 2)(3 * 10 + 4)$$

$$= (1 * 10)(3 * 10) + 2 * (3 * 10) + 4 * (1 * 10) + 2 * 4$$

$$= (1 * 3) * 100 + (2 * 3 + 4 * 1) * 10 + 2 * 4$$

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One 2-digit problem -> Four 1-digit problems

Can we do this for multiplication integers?

$$12 * 34$$

STOP!

$$12 = 1 * 10 + 2$$

$$34 = 3 * 10 + 4$$

$$12 * 34 = (1 * 10 + 2)(3 * 10 + 4)$$

$$= (1 * 10)(3 * 10) + 2 * (3 * 10) + 4 * (1 * 10) + 2 * 4$$

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One 2-digit problem -> Four 1-digit problems

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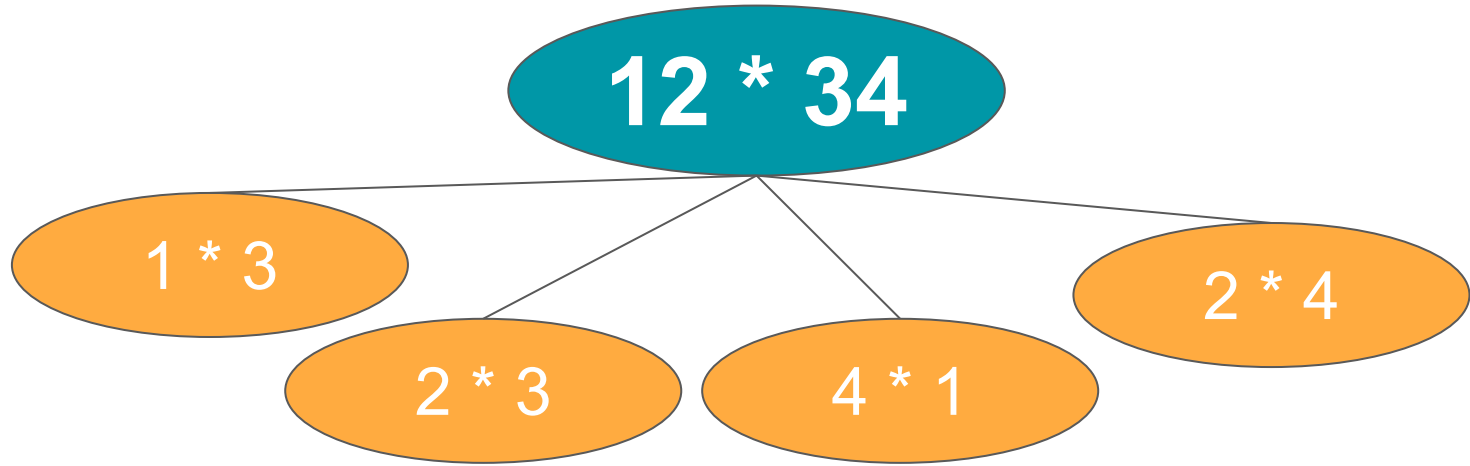
$$= (1 * 10)(3 * 10) + 2 * (3 * 10) + 4 * (1 * 10) + 2 * 4$$

$$= (1 * 3) * 100 + (2 * 3 + 4 * 1) * 10 + 2 * 4$$



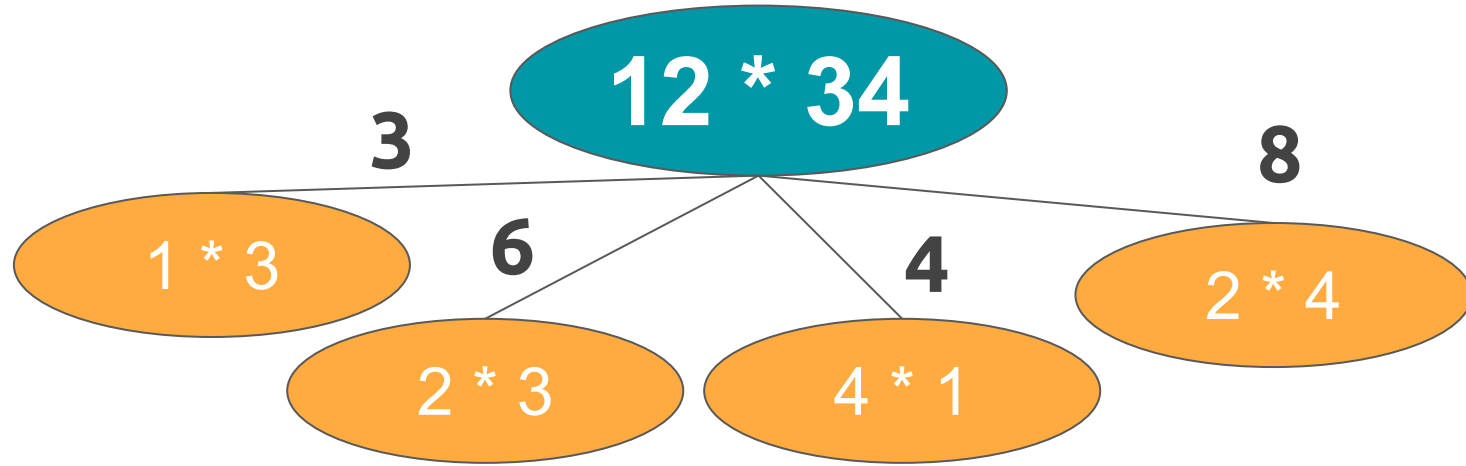
One 2-digit problem -> Four 1-digit problems

Can we do this for multiplication of integers?



$$= (1 * 3) * 100 + (2 * 3 + 4 * 1) * 10 + 2 * 4$$

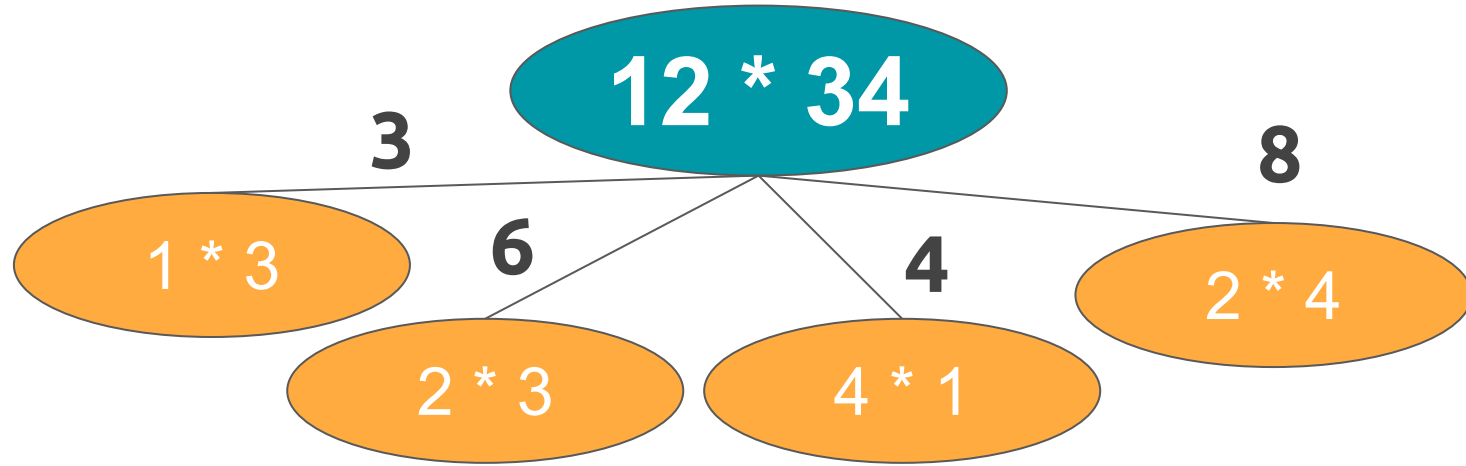
Can we do this for multiplication of integers?



$$= (1 * 3) * 100 + (2 * 3 + 4 * 1) * 10 + 2 * 4$$



Can we do this for multiplication of integers?



$$\begin{aligned} &= (1 * 3) * 100 + (2 * 3 + 4 * 1) * 10 + 2 * 4 \\ &= 3 * 100 + (6 + 4) * 10 + 8 \\ &= 408 ! \end{aligned}$$

**Can we do this for multiplication of integers? (pt. 2)**

---

$$1234 * 5678$$

Can we do this for multiplication of integers? (pt. 2)

$$1234 * 5678$$

$$1234 = 12 * 100 + 34$$

$$5678 = 56 * 100 + 78$$

$$1234 * 5678 \Rightarrow ???$$

Can we do this for multiplication of integers? (pt. 2)

$$1234 * 5678$$

$$1234 = 12 * 100 + 34$$

$$5678 = 56 * 100 + 78$$

$$1234 * 5678 \Rightarrow$$

$$= (12 * 100 + 34)(56 * 100 + 78)$$

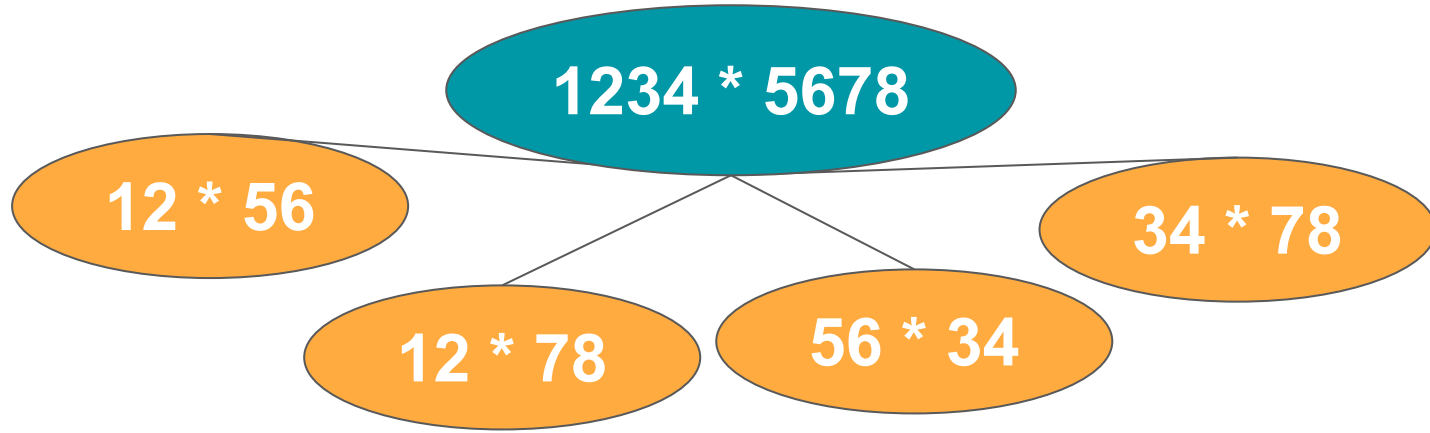
$$= (12 * 100)(56 * 100) + (12 * 100 * 78) + (56 * 100 * 34) + 34 * 78$$

$$= (12 * 56) * 10000 + (12 * 78 + 56 * 34) * 100 + 34 * 78$$

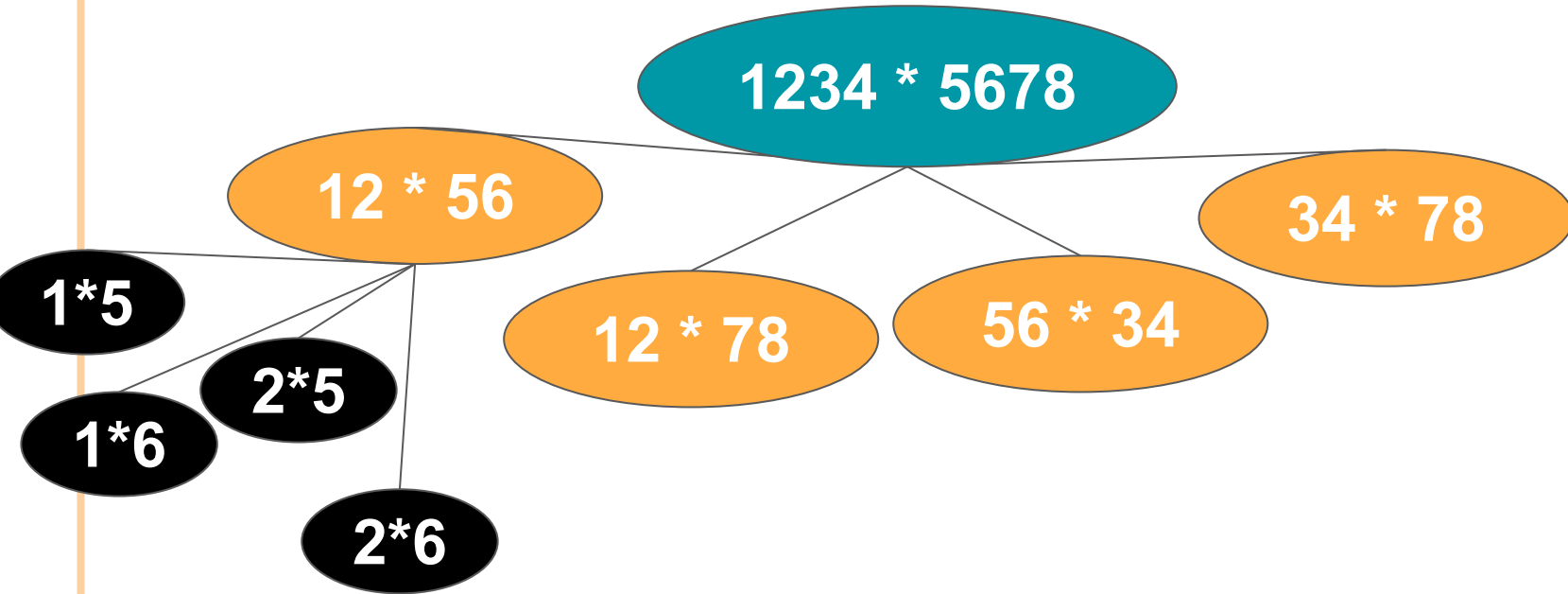
**Can we do this for multiplication of integers? (pt. 2)**

$$1234 * 5678$$

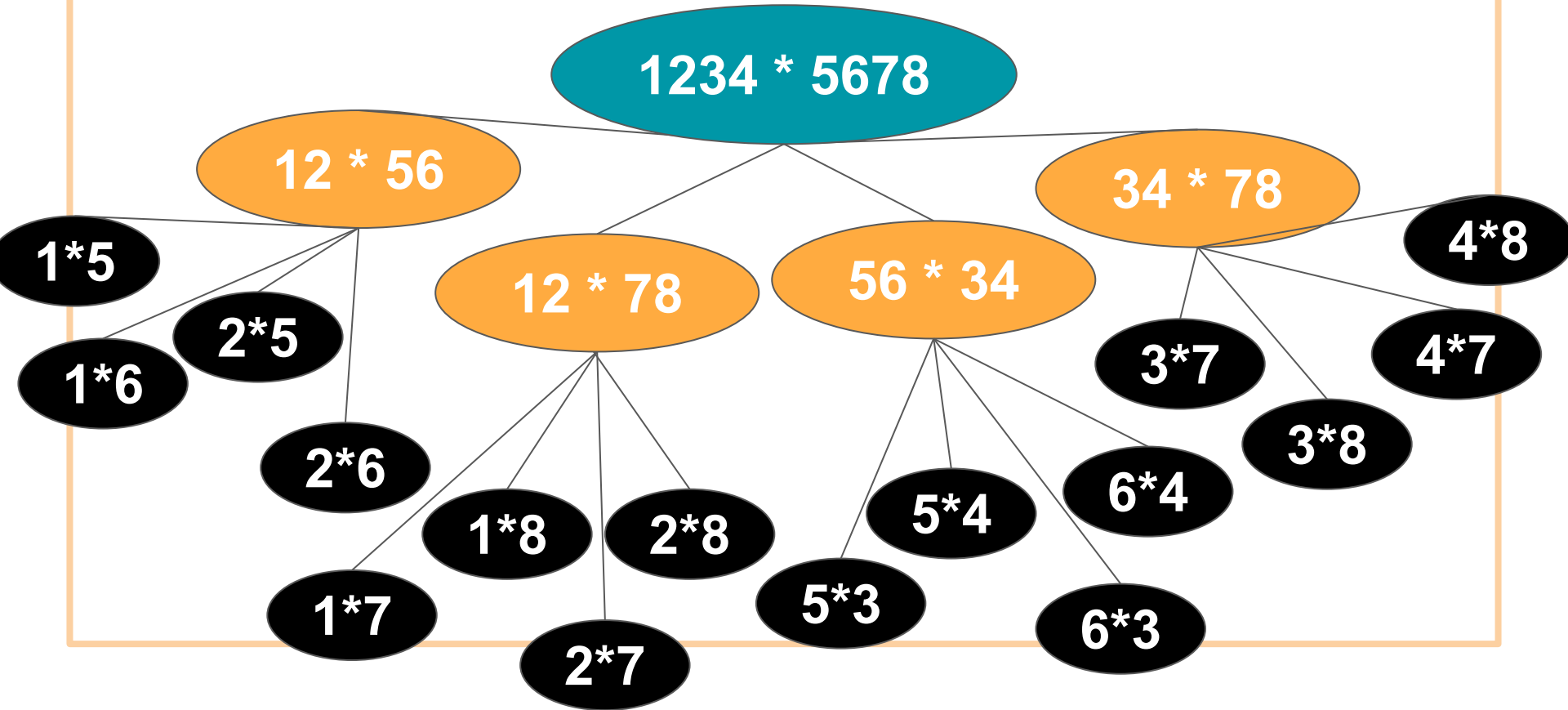
Can we do this for multiplication of integers? (pt. 2)



Can we do this for multiplication of integers? (pt. 2)



Can we do this for multiplication of integers? (pt. 2)





## And in general!

Break up an n-digit integer x:

$$[x_1, x_2, \dots, x_n] = [x_1, x_2, \dots, x_{n/2}] * 10^{n/2} + [x_{n/2+1}, x_{n/2+2}, \dots, x_n]$$

## And in general!

Break up an n-digit integer x:

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$$\begin{aligned} x \times y &= (a \times 10^{n/2} + b)(c \times 10^{n/2} + d) \\ &= (a \times c)10^n + (a \times d + c \times b)10^{n/2} + (b \times d) \end{aligned}$$

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Break up an n-digit integer x:

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$$\begin{aligned} x \times y &= (a \times 10^{n/2} + b)(c \times 10^{n/2} + d) \\ &= \underbrace{(a \times c)}_1 10^n + \underbrace{(a \times d + c \times b)}_2 10^{n/2} + \underbrace{(b \times d)}_4 \end{aligned}$$

One n-digit problem -> Four (n/2)-digit problems

**So what is our algorithm in pseudocode?**

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**Multiply**( $x, y$ ):  $x, y$  are  $n$ -digit numbers

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**Multiply**( $x, y$ ):  $x, y$  are  $n$ -digit numbers

**return** answer

## So what is our algorithm in pseudocode?


$x, y$  are  $n$ -digit numbers

**Multiply**( $x, y$ ):

**If**  $n = 1$ :

**return**  $x * y$

Base case: we have 1-digit multiplication,  
cannot break into subproblems



**return** answer

## So what is our algorithm in pseudocode?

**Multiply**( $x, y$ ): x, y are n-digit numbers

**If**  $n = 1$ : ← Base case: we have 1-digit multiplication, cannot break into subproblems

**return**  $x * y$

    Compute  $a, b, c, d$  from  $x, y$  ← a, b, c, d are n/2-digit numbers

**return** answer



## So what is our algorithm in pseudocode?

**Multiply**( $x, y$ ): x, y are n-digit numbers

**If**  $n = 1$ : ← Base case: we have 1-digit multiplication, cannot break into subproblems

**return**  $x * y$

    Compute  $a, b, c, d$  from  $x, y$  ← a, b, c, d are n/2-digit numbers

    Compute  $ac, ad, bc, bd$  from ???

**return** answer

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**Multiply**( $x, y$ ): x, y are n-digit numbers

**If**  $n = 1$ : ← Base case: we have 1-digit multiplication, cannot break into subproblems

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$ac = \text{Multiply}(a, c)$

$ad = \text{Multiply}(a, d)$  ← Recursive cases

$bc = \text{Multiply}(b, c)$

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**return** answer

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    Calculate  $xy$  using results

$\text{answer} = ac \cdot 10^n + (ad + bc) \cdot 10^{n/2} + bd$

**return** answer

**Let's code  
it!!!**



# So what is our algorithm in pseudocode?

$x, y$  are  $n$ -digit numbers

**Multiply**( $x, y$ ):

If  $n = 1$ :

**return**  $x * y$

Compute  $a, b, c, d$  from  $x, y$

Compute  $ac, ad, bc, bd$  from

$ac = \mathbf{Multiply}(a, c)$

$ad = \mathbf{Multiply}(a, d)$

$bc = \mathbf{Multiply}(b, c)$

$bd = \mathbf{Multiply}(b, d)$

Calculate  $xy$  using results

$\text{answer} = ac \cdot 10^n + (ad + bc) \cdot 10^{n/2} + bd$

**return** answer

we have 1-digit multiplication,  
break into subproblems

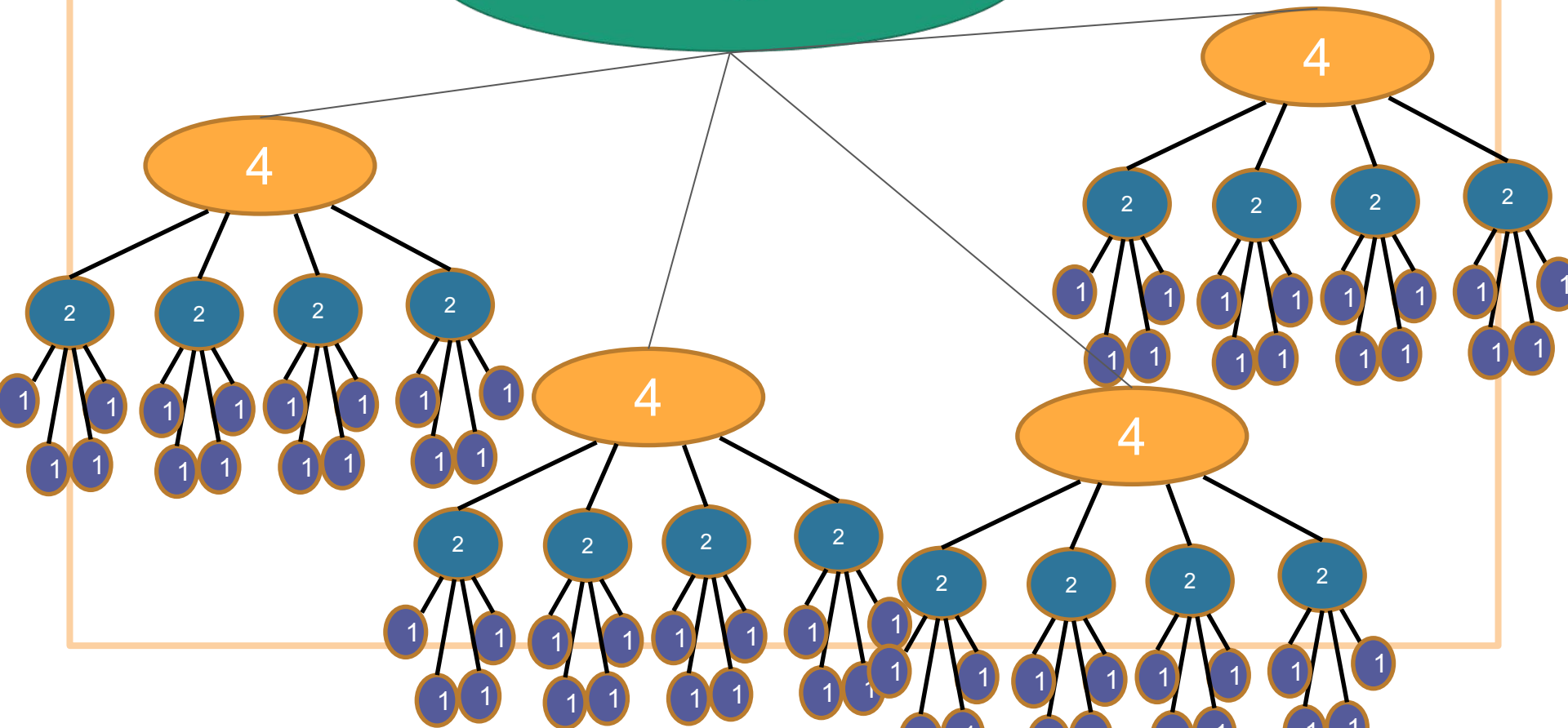
1. Does it work?
2. Is it fast?
3. Can we do better?

## Is it fast?

- We saw that multiplying 2 digit numbers took 4 multiplications.
- We saw that multiplying 4 digit numbers takes 16 multiplications.
- What about 8 digit numbers? What about 16 digit numbers?
- **How many operations as a function of  $n$ ?**

8 digits

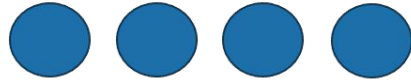
64 one-digit multiplies!



# There are ??? 1-digit multiplications

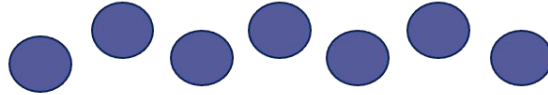


1 problem  
of size  $n$



4 problems  
of size  $n/2$

...



$4^t$  problems  
of size  $n/2^t$

...

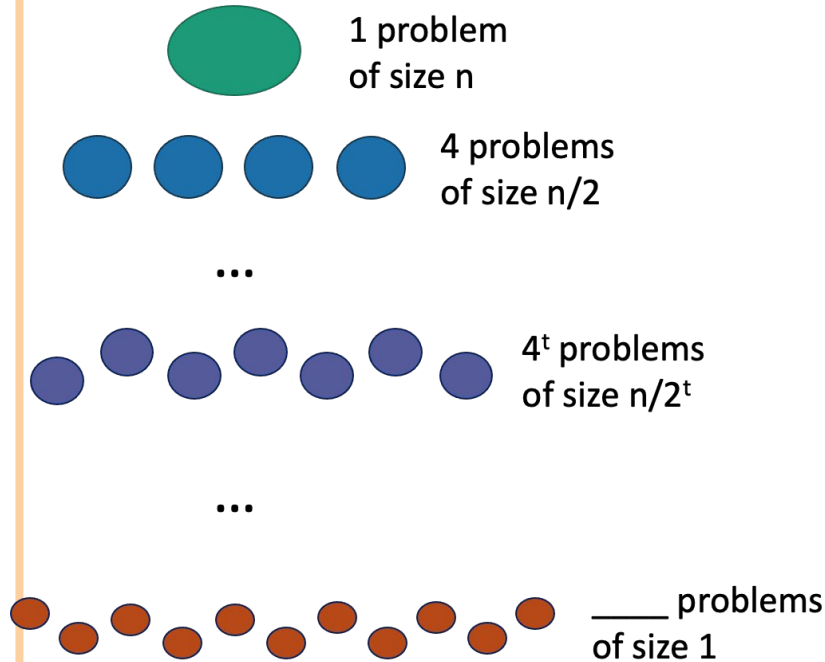


\_\_\_\_\_ problems  
of size 1

Note: this is just a  
cartoon – I'm not  
going to draw all  $4^t$   
circles!

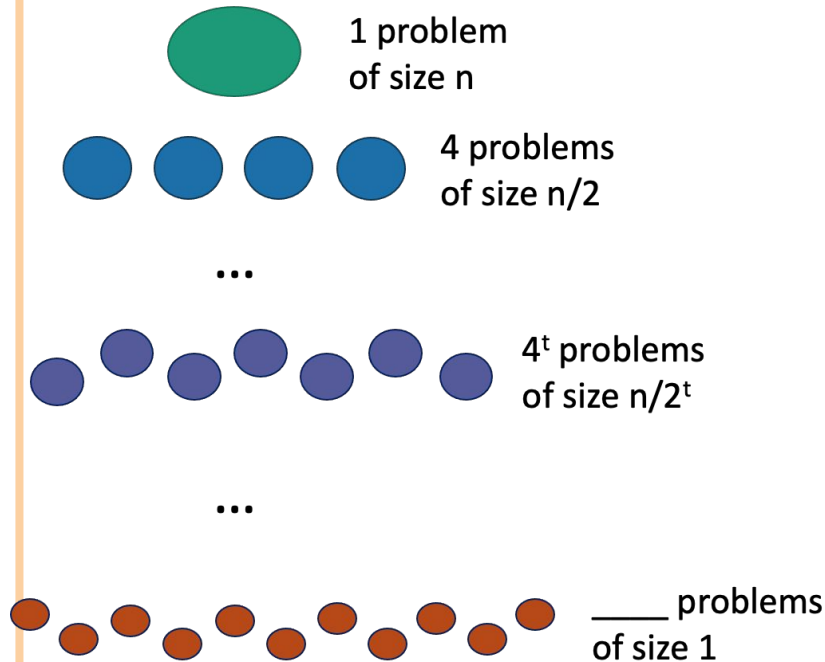


## How many problems on the last level?



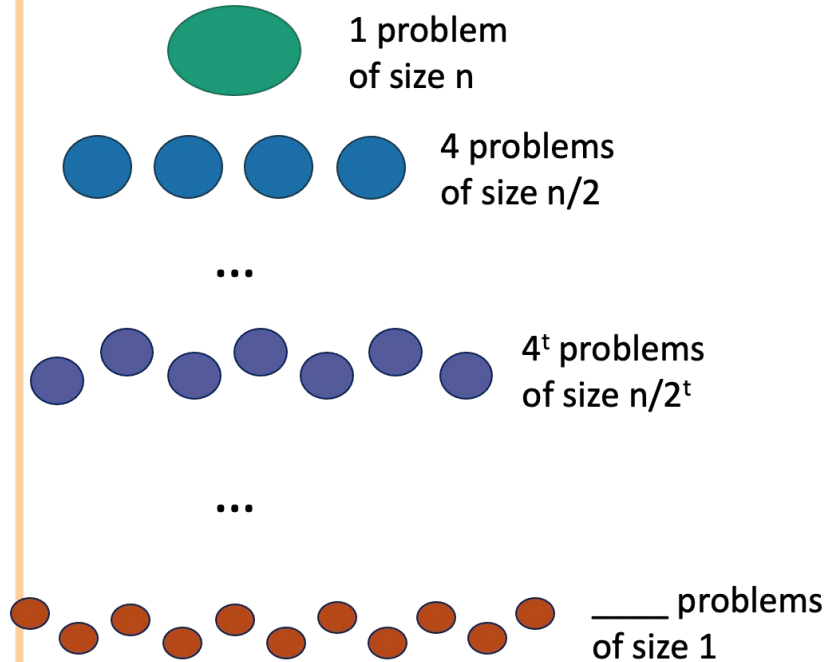
- For each "**level**", we multiply the number of problems by **4**
- So for the **t<sup>th</sup>** level (where the first level is **t=0**), we will have **4<sup>t</sup>** problems
- The problems on the **last** level are of size (1)

## So what's the index of the last level?



- We start with **size  $n$**
- Then go down to **size  $n/2$**
- Then go down to  **$(n/2)/2 = n/4$**
- Then  **$(n/4)/2 = n/8$**
- And so on...
- On the last level, we must have  **$n/2^t = 1$**

## So what's the index of the last level?

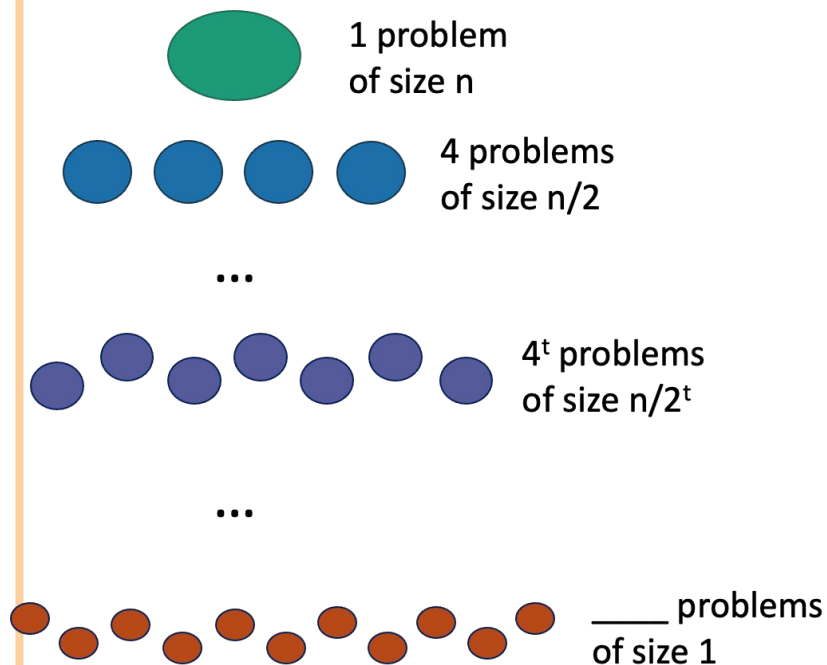


$$\frac{n}{2^t} = 1$$

$$\implies n = 2^t$$

$$\implies t = \log_2 n$$

## So how many problems on the last level?



$$\begin{aligned} - \quad 4^t &= 4^{\log_2 n} \\ &= (2^2)^{\log_2 n} \\ &= 2^{2 \log_2 n} \\ &= (2^{\log_2 n})^2 \\ &= n^2 \end{aligned}$$

**Darn, that's sad :(**



# Big Questions!

## 08/23/22 - Session

- How to get started with career prep?
- How to write a compelling technical resume?
- How to multiply integers?
- How to conquer? Do we divide?
- How fast is fast enough?



**But wait!!!**

## Let's recall our algorithm!

Break up an n-digit integer:

$$[x_1 x_2 \cdots x_n] = [x_1 x_2 \cdots x_{n/2}] \times 10^{n/2} + [x_{n/2+1} x_{n/2+2} \cdots x_n]$$

$$x \times y = (a \times 10^{n/2} + b)(c \times 10^{n/2} + d)$$

$$= \underbrace{(a \times c)}_1 10^n + \underbrace{(a \times d + c \times b)}_2 10^{n/2} + \underbrace{(b \times d)}_4$$

1

2

3

4



## What if we did less work?

Break up an n-digit integer:

$$[x_1 x_2 \cdots x_n] = [x_1 x_2 \cdots x_{n/2}] \times 10^{n/2} + [x_{n/2+1} x_{n/2+2} \cdots x_n]$$

$$x \times y = (a \times 10^{n/2} + b)(c \times 10^{n/2} + d)$$

$$= \underbrace{(a \times c)}_1 10^n + \underbrace{(a \times d + c \times b)}_2 10^{n/2} + \underbrace{(b \times d)}_4$$

1

2

3

4

## What if we recursed 3 times instead of 4?

Break up an n-digit integer:

$$[x_1 x_2 \cdots x_n] = [x_1 x_2 \cdots x_{n/2}] \times 10^{n/2} + [x_{n/2+1} x_{n/2+2} \cdots x_n]$$

$$x \times y = (a \times 10^{n/2} + b)(c \times 10^{n/2} + d)$$

$$= \underbrace{(a \times c)}_1 10^n + \underbrace{(a \times d + c \times b)}_2 10^{n/2} + \underbrace{(b \times d)}_4$$

1

2

3

4

## This is what Karatsuba figured out!

- It feels like we need four multiplications

- $ac$
- $bd$
- $bc$
- $ad$

$$= \underbrace{(a \times c)}_1 10^n + \underbrace{(a \times d + c \times b)}_2 10^{n/2} + \underbrace{(b \times d)}_4$$

## This is what Karatsuba figured out!

- It feels like we need four multiplications

- ac
- bd
- bc
- ad

$$= \underbrace{(a \times c)}_{\text{1}} 10^n + \underbrace{(a \times d + c \times b)}_{\text{2}} 10^{n/2} + \underbrace{(b \times d)}_{\text{4}}$$

- Karatsuba figured out that's not true!! You only need **three**!
  - ac
  - bd
  - $(a+b)(c+d)$

## How does this work?

---

- **These are the “values” we need**

- ac
- bd
- bc
- ad

- **Karatsuba says**
  - ac (just do it!)

## How does this work?

---

- **These are the “values” we need**

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- ac (just do it!)
- bd (just do it!)
-

## How does this work?

---

- These are the “values” we need

- ac
- bd
- **bc**
- **ad**

- **Karatsuba says**

- ac (just do it!)
- bd (just do it!)
- we want **(ad + bc)**,  
could we compute it  
another way?

$$(a+b)(c+d) = ac + bd + bc + ad$$

## How does this work?

---

- These are the “values” we need

- ac
- bd
- **bc**
- **ad**

- **Karatsuba says**

- ac (just do it!)
- bd (just do it!)
- Do  $(a+b)(c+d)$  instead! Then subtract ac and bd!

$$(a+b)(c+d) = ac + bd + bc + ad$$



## So what is our algorithm in pseudocode?

**Multiply**( $x, y$ ): x, y are n-digit numbers

**If**  $n = 1$ : ← Base case: we have 1-digit multiplication, cannot break into subproblems

**return**  $x * y$

    Compute  $a, b, c, d$  from  $x, y$  ← a, b, c, d are n/2-digit numbers

    Compute  $ac, ad, bc, bd$  from recursion

$ac = \text{Multiply}(a, c)$

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**return** answer

## So what is our algorithm in pseudocode?

**Karatsuba**( $x, y$ ): x, y are n-digit numbers

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**return**  $x * y$

    Compute  $a, b, c, d$  from  $x, y$  ← a, b, c, d are n/2-digit numbers

    Compute  $ac, ad, bc, bd$  from recursion

$ac = \text{Karatsuba}(a, c)$

$bd = \text{Karatsuba}(b, d)$  ← Recursive cases

$z = \text{Karatsuba}(a+b, c+d)$

    Calculate  $xy$  using results

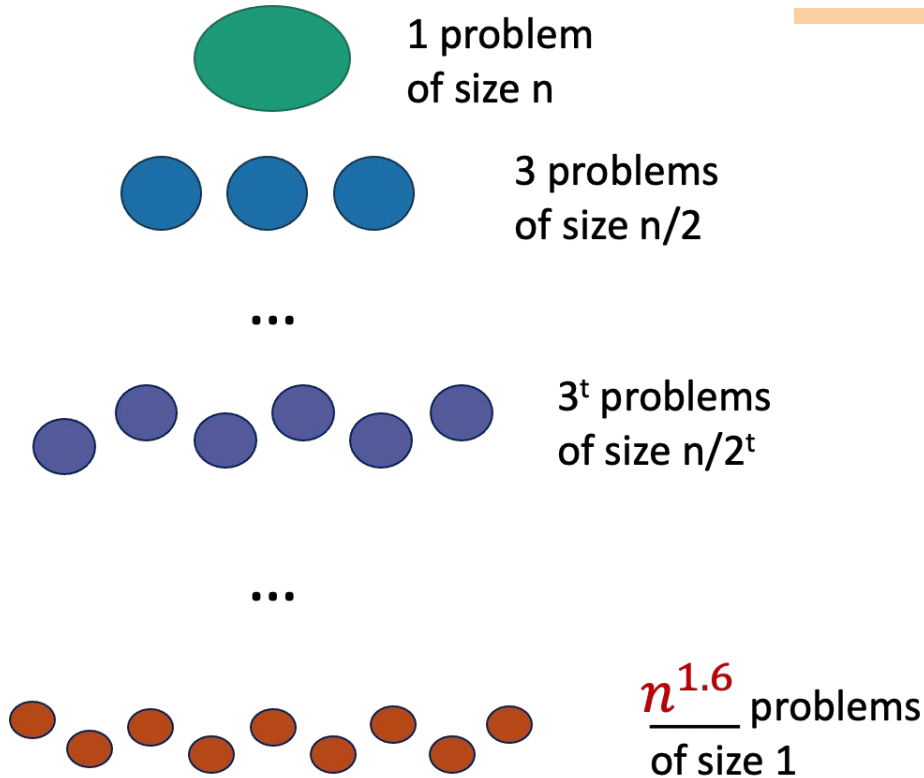
$\text{answer} = ac \cdot 10^n + (z - ac - bd) \cdot 10^{n/2} + bd$

**return** answer

**Let's code  
it!!!**

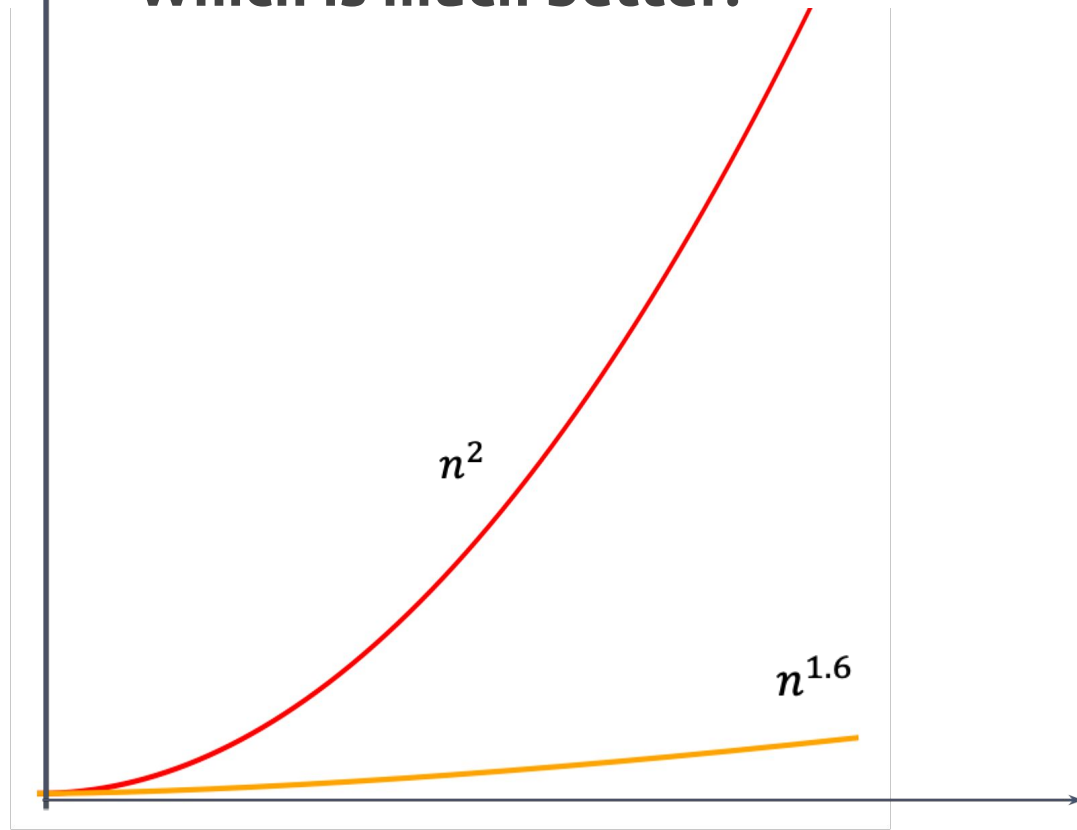


# What's the running time?



$$\begin{aligned} 3^t &= 3^{\log_2 n} \\ &= (2^{\log_2 3})^{\log_2 n} \\ &= (2^{\log_2 n})^{\log_2 3} \\ &= n^{\log_2 3} \\ &\approx n^{1.6} \end{aligned}$$

Which is much better!



## Can we do even better?

---

- **Toom-Cook** (1963): instead of breaking into three  $n/2$  sized problems, break into five  $n/3$ -sized problems.
  - Runs in  $O(n^{1.465})$
- **Schönhage-Strassen** (1971)
  - Runs in  $O(n \log(n) \log \log(n))$
- **Furer** (2007)
  - Runs in  $n \log(n) * 2^{O(\log^*(n))}$
- **Harvey and van der Hoeven** (2019)
  - Runs in time  $O(n \log(n))$

## Can you?

- **Describe**
  - The components of a compelling, technical resume
  - The Karatsuba Integer Multiplication optimization
- **Practice**
  - Applying action verb + what *you* did + results/significance formula to your resume
  - Designing an efficient algorithm for integer multiplication

**How was the pace today?**



## Wrap-Up

- **Everyone** can write a polished and compelling resume.
  - Action verb + what *you* did + results
- **Divide and conquer** is a tool we use to decompose large problems into smaller, easier-to-solve subproblems.
- **Karatsuba optimization:**  $n^{1.6}$  is better than  $n^2$  operations; we reduced the number of nodes we needed to execute.

## Announcements

- **HW 0 is out!**
  - Due Thursday 08/25 @ 11:59PM
- **Google Tech Exchange**
  - Deadline Monday 09/12

## **Next time!**

- (More) formal big-O introduction!
- Space/time complexity practice
- Space/time complexity with recursion.

COMP - 285

Advanced Analysis of Algorithms

# **Welcome to COMP 285**

**Lecture 1: CS Job Hunting (Resume),  
Pseudocode and Recursion**

**Chris Lucas (cflucas@ncat.edu)**

