

MONASH INFORMATION TECHNOLOGY

FIT2004 Algorithms and Data Structures

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Referencing materials by Rafael Dowsley, Nathan Companez, Aamir Cheema, Arun Konagurthu and Lloyd Allison





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Ready?

Agenda

- Grade School Integer Multiplication
- Quick Integer Multiplication
 - Karatsuba algorithm (1960, 1962)
 - Schönhage–Strassen algorithm (1971)
 - Popular for matrix multiplication
 - ... and many more including a 2019 one in UNSW



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- Grade School Integer Multiplication
- Quick Integer Multiplication
 - Karatsuba algorithm (1960, 1962)
 - Schönhage–Strassen algorithm (1971)
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 - ... and many more including a 2019 one in UNSW
- Divide and Conquer
 - Simple recap on MergeSort
 - Simple recap on QuickSort





Let us begin!

An algorithm we all know



Recall how you multiply from grade school



- Recall how you multiply from grade school
 - It is an algorithm
 - It is something that you do use till today, right?



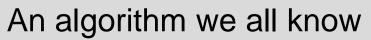
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- Consider the following 2 inputs
 - x = 123
 - y = 345
 - Multiple x with y, what is the answer?



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 - It is an algorithm
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 - What is your algorithm?
 - 1. Loop through y from right to left.
 - 2. For each integer of y, multiply with each integer in x from right to left.
 - 3. If overflow exist, add to the left value
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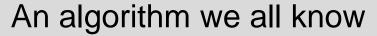
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 - It is an algorithm
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 - What is your algorithm?
 - 1. Loop through y from right to left.
 - 2. For each integer of y, multiply with each integer in x from right to left.
 - 3. If overflow exist, add to the left value
 - 4. ... You can write it in a better way, and code it
- Consider the following 2 inputs
 - x = 123
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- Consider the following 2 inputs
 - x = 123
 - y = 345
 - Multiple x with y, what is the answer?
- Have your teacher ever...

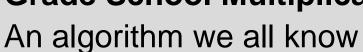
×		1 3	2 4	3 5
3	46	6 9 9	1 2	5
4	2	4	3	5





- Consider the following 2 inputs
 - x = 123
 - y = 345
 - Multiple x with y, what is the answer?
- Have your teacher ever...
 - Explain why it work?

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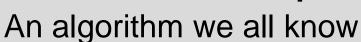




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 - Explain why it work? For every possible number combinations?





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- Have your teacher ever...
 - Explain why it work? For every possible number combinations?
 - How efficient it is?

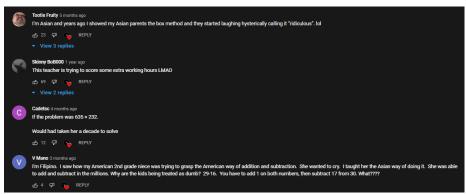


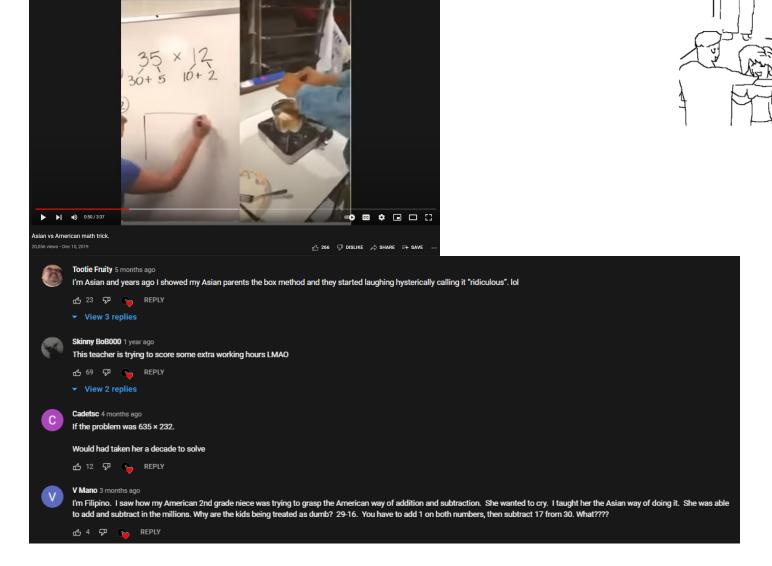
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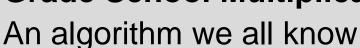
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- Have your teacher ever...
 - Explain why it work? For every possible number combinations?
 - How efficient it is? Probably not... that is why....









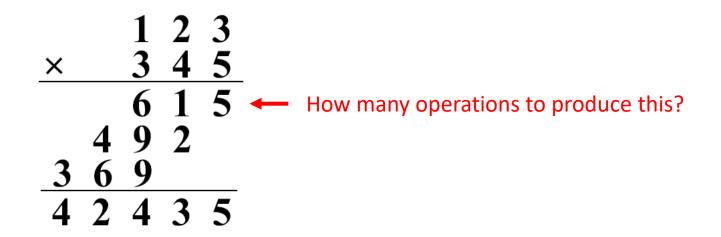


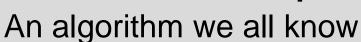
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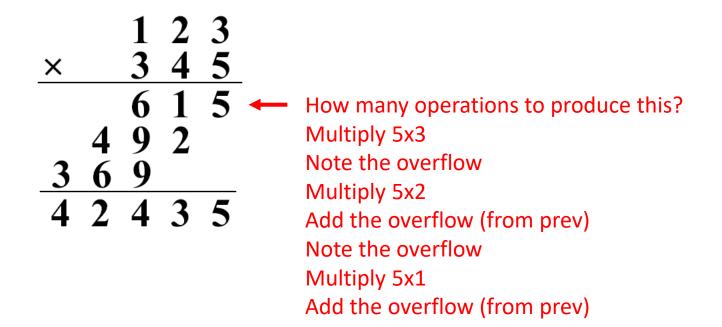
- Have your teacher ever...
 - Explain why it work? For every possible number combinations?
 - How efficient it is?
 - This is not efficient...
 - As the numbers become bigger you need more steps!



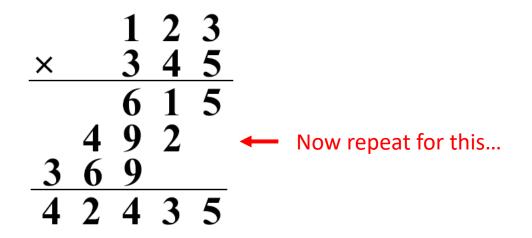


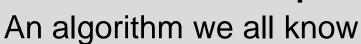




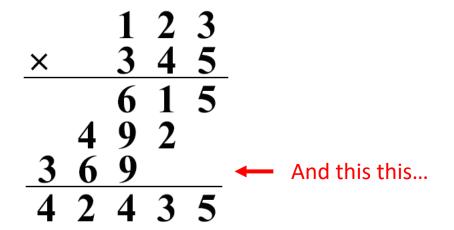


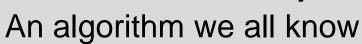




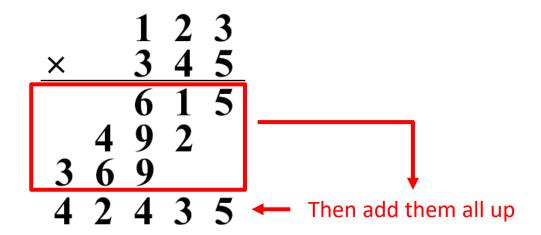














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It is a lot of operations!
... and it become worse as the number becomes bigger!



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Each digit in *x*, increases actions per row Each digit in *y*, increases a row!



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It is a lot of operations!
... and it become worse as the number becomes bigger!

Each digit in *x*, increases actions per row Each digit in *y*, increases a row!

And in the end, you need to add them all up!!!



An algorithm we all know

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And don't forget, you need to store all of these somewhere... What if they are really big? You are wasting memory....



An algorithm we all know

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This entire thing?

- 9 multiplications
- 3 noting of overflow
- 3 addition for overflow
- The final addition process that deals with a lot of integers and overflow

An algorithm we all know



That is why students are taught the box method...
 which provides the foundation for Karatsuba!



Questions?

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- A method to multiply 2 integers
- Able to do so quickly, even as the integers scales to be bigger integers



- A method to multiply 2 integers
- Able to do so quickly, even as the integers scales to be bigger integers
- By breaking large numbers into smaller ones
 - x = 1234
 - y = 6789
 - x * y = ?



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- x = 1234 = 12 * 10^2 + 34 * 10^0
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Simple Quick Integer Multiplication

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— Can you see it?



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So why do this matter?



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- So why do this matter?
 - Quicker to multiply small integers
 - Quicker to multiple simple numbers
 - Example: 123*100 = 12300



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- So why do this matter? If you count the operations???
 - Quicker to multiply small integers
 - Quicker to multiple simple numbers
 - Example: 123*100 = 12300



Simple Quick Integer Multiplication

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- And we can do even better!
 - Add small numbers, then only multiply!

Simple Quick Integer Multiplication

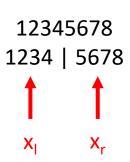


- With that, we can generalize:
 - Given integer x with n-digits
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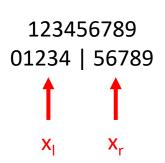
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 - Given integer x with n-digits
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 - x can be broken down into
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 - y can be broken down the same

put 0 at the front to make all even digit number into odd digit number

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Simple Quick Integer Multiplication

With that, we can generalize:

- Given integer x with n-digits
- Given integer y with n-digits
- x can be broken down into
 - The most significant half x₁
 - The less significant half x_r
- y can be broken down the same
- Therefore $x * y = x_1 * y_1 * 10^n + (x_1 * y_r + x_r * y_1) * 10^{n/2} + x_r * y_r$

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Simple Quick Integer Multiplication

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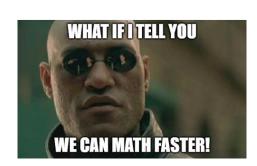
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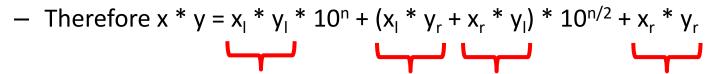
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 - Add small numbers, then only multiply!
 - What if I tell you we can do even better?





Simple Quick Integer Multiplication

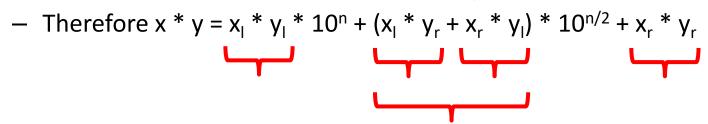
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Simple Quick Integer Multiplication

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- Therefore
$$x * y = x_1 * y_1 * 10^n + (x_1 * y_r + x_r * y_1) * 10^{n/2} + x_r * y_r$$

Gauss introduce a trick for us



Simple Quick Integer Multiplication

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Why are we doing this?



Simple Quick Integer Multiplication

Recall we stopped at the following

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$$x * y = \frac{x_1 * y_1}{x_1 * y_1} * 10^n + (x_1 * y_1 + x_1 * y_1) * 10^{n/2} + x_1 * y_1$$

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 - Then we rearrange the above...

$$= (x_1 + x_r) * (y_1 + y_r) - x_1 * y_1 - x_r * y_r$$
Sub this back upper

Sub this back upper red underlined part to have a quicker computation

- Why are we doing this?
 - 1 multiplication instead of 2 multiplication
 - Note that it is slower to multiply than it is to add/ subtract in general



Questions?

In summary



- Given 2 large numbers
- Divide and conquer the large number into 2 halves
 - Smaller numbers are faster to operate on
 - Only need 3 multiplications, on smaller numbers
- Then combine the result

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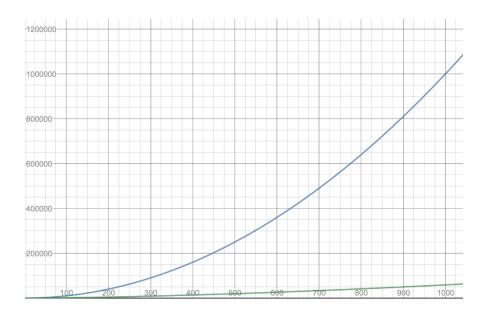
We can follow Karatsuba again for the 3 multiplications!

Then combine the result

In summary



To multiply 2 large numbers of n-digits,
 Karatsuba can do so in O(N^1.59), which is much more scalable than O(N^2)





Questions?



- Take a problem
- Divide the problem into smaller subproblems
- Conquer the smaller subproblems, getting the solution
- Combine the smaller solutions to obtain the bigger solution



- Take a problem
- Divide the problem into smaller subproblems
- Conquer the smaller subproblems, getting the solution
- Combine the smaller solutions to obtain the bigger solution
- And you done that with:
 - Karatsuba earlier
 - MergeSort and QuickSort from earlier your prerequisite(s)



- Take a problem
- Divide the problem into smaller subproblems
 - Karatsuba: Split a number into most-significant digits (MSD) and least-significant digits (LSD)
 - MergeSort and QuickSort: Split a list into left-partition and rightpartition
- Conquer the smaller subproblems, getting the solution
- Combine the smaller solutions to obtain the bigger solution



- Take a problem
- Divide the problem into smaller subproblems
- Conquer the smaller subproblems, getting the solution
 - Karatsuba: Multiply the smaller digits.
 - MergeSort and QuickSort: Sort the partitions
- Combine the smaller solutions to obtain the bigger solution



- Take a problem
- Divide the problem into smaller subproblems
- Conquer the smaller subproblems, getting the solution
- Combine the smaller solutions to obtain the bigger solution
 - Karatsuba: Add and subtract the values together.
 - MergeSort and QuickSort: Combine the partitions in sorted order.



- Take a problem
- Divide the problem into smaller subproblems
- Conquer the smaller subproblems, getting the solution
- Combine the smaller solutions to obtain the bigger solution
- You would notice that many of them are done in recursively as well; we will explore how to analyze recursive complexity in a later lecture.



Questions?

Other DnC Algorithms?



- Finding closest pair of points in a plane in O(n log n).
- Counting inversions in O(n log n), see you Studio question.
- Improving matrix multiplication (Strassen's algorithm).
- Fast Fourier Transform: this algorithm published by James Cooley and John Tukey in 1965 is one of the most influential algorithms, with a wide range of applications in engineering, music, science, mathematics, etc.
 - In fact, it can be traced back to unpublished work by Gauss.



Questions?



Thank You