## THINKING LIKE A COMPUTER SCIENTIST

## Dr Kirill Sidorov

sidorovk@cardiff.ac.uk

School of Computer Science and Informatics

Cardiff University

## Definition

A square root of a number x is a number y such that

$$y^2 = x$$

In other words, it is a number y such that the result of multiplying y by itself is x:

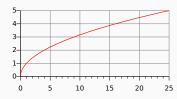
$$y \cdot y = x$$

## **CASE STUDY: SQUARE ROOTS**

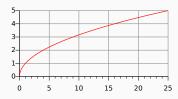
You probably know many facts about square roots:

• The following notation is used to denote that y is the square root of x:  $y = \sqrt{x}$ 

- The following notation is used to denote that y is the square root of x:  $y = \sqrt{x}$
- The plot of the square root looks like this:

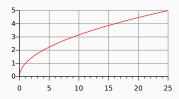


- The following notation is used to denote that y is the square root of x:  $y = \sqrt{x}$
- The plot of the square root looks like this:



• Some algebraic properties include:  $\sqrt{xy} = \sqrt{x}\sqrt{y}$ ,  $\sqrt{x} = x^{1/2}$ ,  $\sqrt{x^2} = |x|$  and so on...

- The following notation is used to denote that y is the square root of x:  $y = \sqrt{x}$
- The plot of the square root looks like this:



- Some algebraic properties include:  $\sqrt{xy} = \sqrt{x}\sqrt{y}$ ,  $\sqrt{x} = x^{1/2}$ ,  $\sqrt{x^2} = |x|$  and so on...
- Square roots are mentioned in ancient Babylonian clay tablets from 1800 BC.

#### TWO WAYS OF THINKING

However, all this knowledge does not help to actually find square roots!

What we need is some kind of recipe, procedure, method, algorithm for finding square roots.

However, all this knowledge does not help to actually find square roots!

What we need is some kind of recipe, procedure, method, algorithm for finding square roots.

There are two types of knowledge, two ways of thinking:

# "What is" knowledge

- · Statements of facts. What is true about things.
- · We call it declarative knowledge.

# However, all this knowledge does not help to actually find square roots!

What we need is some kind of recipe, procedure, method, algorithm for finding square roots.

There are two types of knowledge, two ways of thinking:

## "What is" knowledge

- · Statements of facts. What is true about things.
- · We call it declarative knowledge.

# "How to" knowledge

- How to do things.
- · Recipes, procedures, instructions, methods, algorithms.
- · We call it algorithmic knowledge.

Here is one possible recipe we could use for finding the square root of *x*:

· Make some guess as to what the square root might be.

- · Make some guess as to what the square root might be.
  - · Let's call it q, for "guess".
  - It need not be a good guess. Using q = 1 or q = x will work.

- · Make some guess as to what the square root might be.
  - Let's call it *g*, for "guess".
  - It need not be a good guess. Using q = 1 or q = x will work.
- · Check if this guess is good enough:

- Make some guess as to what the square root might be.
  - Let's call it q, for "guess".
  - It need not be a good guess. Using g = 1 or g = x will work.
- · Check if this guess is good enough:
  - We can do so by squaring *g* and comparing the result to *x*.
  - "Good enough" can mean, for example, that we are not too far off from x, that is:  $|g \cdot g x| < A$  for some chosen accuracy threshold A.

- · Make some guess as to what the square root might be.
  - Let's call it *g*, for "guess".
  - It need not be a good guess. Using q = 1 or q = x will work.
- · Check if this guess is good enough:
  - We can do so by squaring g and comparing the result to x.
  - "Good enough" can mean, for example, that we are not too far off from x, that is:  $|g \cdot g x| < A$  for some chosen accuracy threshold A.
- Try to *improve* the guess, obtaining a better guess  $g_{\text{new}}$  whose square is even closer to x.

- · Make some guess as to what the square root might be.
  - · Let's call it q, for "guess".
  - It need not be a good guess. Using q = 1 or q = x will work.
- · Check if this guess is good enough:
  - We can do so by squaring g and comparing the result to x.
  - "Good enough" can mean, for example, that we are not too far off from x, that is:  $|g \cdot g x| < A$  for some chosen accuracy threshold A.
- Try to *improve* the guess, obtaining a better guess  $g_{\text{new}}$  whose square is even closer to x.
- Continue repeateadly improving the guess until the guess becomes good enough.

Here is one possible recipe we could use for finding the square root of *x*:

- · Make some guess as to what the square root might be.
  - Let's call it *g*, for "guess".
  - It need not be a good guess. Using q = 1 or q = x will work.
- · Check if this guess is good enough:
  - We can do so by squaring g and comparing the result to x.
  - "Good enough" can mean, for example, that we are not too far off from x, that is:  $|g \cdot g x| < A$  for some chosen accuracy threshold A.
- Try to *improve* the guess, obtaining a better guess  $g_{\text{new}}$  whose square is even closer to x.
- Continue repeateadly improving the guess until the guess becomes good enough.

## Do you think this will work?

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$X = g^2 + 2g\epsilon + \epsilon^2$$

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$X = g^2 + 2g\epsilon + \epsilon^2 = g^2 + \epsilon(2g + \epsilon)$$

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$x = g^2 + 2g\epsilon + \epsilon^2 = g^2 + \epsilon(2g + \epsilon)$$

therefore

$$\epsilon = \frac{x - g^2}{2g + \epsilon}$$

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$x = g^2 + 2g\epsilon + \epsilon^2 = g^2 + \epsilon(2g + \epsilon)$$

therefore

$$\epsilon = \frac{x - g^2}{2q + \epsilon}$$

Assuming  $\epsilon \ll g$  we can approximately express  $\epsilon$  without solving the quadratic equation:

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$x = g^2 + 2g\epsilon + \epsilon^2 = g^2 + \epsilon(2g + \epsilon)$$

therefore

$$\epsilon = \frac{x - g^2}{2g + \epsilon} = \dots$$

Assuming  $\epsilon \ll g$  we can approximately express  $\epsilon$  without solving the quadratic equation:

$$\dots = \frac{x - g^2}{2g + \epsilon}$$

Let g be our guess, and suppose we are off by some error  $\epsilon$ . In other words:

$$X = (g + \epsilon)^2$$

To improve the guess means to compensate for the error  $\epsilon$ , so let's express  $\epsilon$ :

$$x = g^2 + 2g\epsilon + \epsilon^2 = g^2 + \epsilon(2g + \epsilon)$$

therefore

$$\epsilon = \frac{x - g^2}{2g + \epsilon} = \dots$$

Assuming  $\epsilon \ll g$  we can approximately express  $\epsilon$  without solving the quadratic equation:

$$\ldots = \frac{x - g^2}{2g + \cancel{\epsilon}} \approx \frac{x - g^2}{2g}$$

Since we have established that the error

$$\epsilon pprox \frac{x - g^2}{2g}$$

we can replace our guess with an *improved* guess (by compensating for this error) as

$$g_{\text{new}} = g + \epsilon \approx g + \frac{x - g^2}{2g} = \frac{2g^2 + x - g^2}{2g} = \frac{g^2 + x}{2g} = \frac{g + \frac{\lambda}{g}}{2}$$

Since we have established that the error

$$\epsilon \approx \frac{x - g^2}{2g}$$

we can replace our guess with an *improved* guess (by compensating for this error) as

$$g_{\text{new}} = g + \epsilon \approx g + \frac{x - g^2}{2g} = \frac{2g^2 + x - g^2}{2g} = \frac{g^2 + x}{2g} = \frac{g + \frac{x}{g}}{2}$$

$$g_{\text{new}} = \frac{g + \frac{x}{g}}{2}$$

Another way of thinking about our improved guess

$$g_{\text{new}} = \frac{g + \frac{x}{g}}{2}$$

is to think of it as the average between g and x/g.

Another way of thinking about our improved guess

$$g_{\text{new}} = \frac{g + \frac{x}{g}}{2}$$

is to think of it as the average between g and x/g. Indeed, suppose g is an overestimation, that is g > y.

Then x/g must be an underestimation:

$$\frac{1}{g} < \frac{1}{y} \implies \frac{x}{g} < \frac{x}{y} \implies \frac{x}{g} < \frac{y^2}{y} \implies \frac{x}{g} < y$$

(And vice versa.)

Another way of thinking about our improved guess

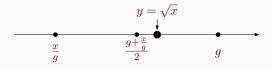
$$g_{\text{new}} = \frac{g + \frac{\chi}{g}}{2}$$

is to think of it as the average between g and x/g. Indeed, suppose g is an overestimation, that is g > y.

Then x/g must be an underestimation:

$$\frac{1}{q} < \frac{1}{y} \Longrightarrow \frac{x}{q} < \frac{x}{y} \Longrightarrow \frac{x}{q} < \frac{y^2}{y} \Longrightarrow \frac{x}{q} < y$$

(And vice versa.) Thus, for our new guess  $g_{\text{new}}$  we take the average between an overestimation and an underestimation.



## **PUTTING IT ALL TOGETHER**

So now we have the complete recipe for finding square roots:

```
procedure SQUAREROOT(x)

Choose desired accuracy, e.g. A \leftarrow 0.01

Make an initial guess g \leftarrow x

while the error |g^2 - x| > A repeat the following:

replace g with an improved guess: g \leftarrow \frac{g+x/g}{2}

Finally, g is the result, i.e. g \approx \sqrt{x}

end procedure
```

So now we have the complete recipe for finding square roots:

```
1 procedure SQUAREROOT(x)
```

- Choose desired accuracy, e.g.  $A \leftarrow 0.01$
- Make an initial guess  $g \leftarrow x$
- while the error  $|g^2 x| > A$  repeat the following:
- replace g with an improved guess:  $g \leftarrow \frac{g+x/g}{2}$ 
  - Finally, g is the result, i.e.  $g \approx \sqrt{x}$
- end procedure



This procedure is known as the "Babylonian method" or "Heron's method" and has been known since antiquity. Newton proposed a more powerful variant of this method which can solve more general equations, not only find square roots.

So now we have the complete recipe for finding square roots:

```
1 procedure SQUAREROOT(x)
```

- Choose desired accuracy, e.g.  $A \leftarrow 0.01$
- Make an initial guess  $g \leftarrow x$
- while the error  $|g^2 x| > A$  repeat the following:
- replace g with an improved guess:  $g \leftarrow \frac{g+x/g}{2}$ 
  - Finally, g is the result, i.e.  $g \approx \sqrt{x}$
- end procedure



This procedure is known as the "Babylonian method" or "Heron's method" and has been known since antiquity. Newton proposed a more powerful variant of this method which can solve more general equations, not only find square roots.

Let's try finding some square roots with this recipe!

## FINDING SQUARE ROOTS NUMERICALLY

## Problem

Find the square root of 20 with the error no greater than 0.001

## FINDING SQUARE ROOTS NUMERICALLY

## Problem

Find the square root of 20 with the error no greater than 0.001

# Solution

Current guess Error Good enough? Improved guess

#### Problem

Find the square root of 20 with the error no greater than 0.001

# Solution

Current guess	Error	Good enough?	Improved guess
20.0000			

\_\_\_\_\_

g = 20

# Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000		
	$ g \cdot g - x $		

# Problem

Find the square root of 20 with the error no greater than 0.001

### Solution

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	

Is  $|g \cdot g - x| < 0.001$ ?

#### Problem

Find the square root of 20 with the error no greater than 0.001

#### Solution

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000

 $g_{\text{new}} = \frac{g + x/g}{2}$ 

## Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000			

# Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500		

# Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	

# Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	6.2024

# Problem

Find the square root of 20 with the error no greater than 0.001

•	Current guess	Error	Good enough?	Improved guess
	20.0000	380.0000	No	10.5000
	10.5000	90.2500	No	6.2024
	6.2024	18.4695	No	4.7135

FINDING SQUARE ROOTS NUMERICALLY

## Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	6.2024
6.2024	18.4695	No	4.7135
4.7135	2.2168	No	4.4783

FINDING SQUARE ROOTS NUMERICALLY

Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	6.2024
6.2024	18.4695	No	4.7135
4.7135	2.2168	No	4.4783
4.4783	0.0553	No	4.4721

FINDING SQUARE ROOTS NUMERICALLY

Problem

Find the square root of 20 with the error no greater than 0.001

Error	Good enough?	Improved guess
380.0000	No	10.5000
90.2500	No	6.2024
18.4695	No	4.7135
2.2168	No	4.4783
0.0553	No	4.4721
0.0003	YES!	
	380.0000 90.2500 18.4695 2.2168 0.0553	380.0000 No 90.2500 No 18.4695 No 2.2168 No 0.0553 No

FINDING SQUARE ROOTS NUMERICALLY

#### Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	6.2024
6.2024	18.4695	No	4.7135
4.7135	2.2168	No	4.4783
4.4783	0.0553	No	4.4721
4.4721	0.0003	YES!	

FINDING SQUARE ROOTS NUMERICALLY

Problem

Find the square root of 20 with the error no greater than 0.001

Current guess	Error	Good enough?	Improved guess
20.0000	380.0000	No	10.5000
10.5000	90.2500	No	6.2024
6.2024	18.4695	No	4.7135
4.7135	2.2168	No	4.4783
4.4783	0.0553	No	4.4721
4.4721	0.0003	YES!	

Therefore 
$$\sqrt{20} \approx 4.4721$$

#### QUESTIONS ABOUT OUR RECIPE

A computer scientist will further study the problem to answer questions like

- · Does this method work correctly?
- Does it always work? For all numbers?
   If not, when does it not work?
- How fast does it work? How many repetitions do we need to make to reach the desired accuracy?
- · Are there faster methods to find square roots?
- · Will this method always stop?
- · How much of other resources (e.g. memory) are needed?
- Can this method be used to solve other problems apart from square roots?

More on this in CM1103, CM1208, CM2104, CM2207, CM2208, CM2307...

#### QUESTIONS AND EXERCISES

- What does the symbol **(\*)** mean in my lectures?
- What will happen if you use our recipe to find the square root of 20 with the initial guess q = 0?
- What will happen if you try computing the square root of a negative number?
- $\cdot$  Try computing the square root of 10 to two decimal places.
- A How would you modify our method to find *cube* roots?

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty.

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty. Alice reads chronicles, reports, letters *etc.* and learns various facts about the relationships within this royal family, *i.e.* 

person C is a child of person P

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty. Alice reads chronicles, reports, letters *etc.* and learns various facts about the relationships within this royal family, *i.e.* 

person C is a child of person P

#### For example:

Nicholas I is a son of Paul I

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty. Alice reads chronicles, reports, letters *etc.* and learns various facts about the relationships within this royal family, *i.e.* 

person C is a child of person P

#### For example:

- · Nicholas I is a son of Paul I
- · Alexander III is a son of Alexander II

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty. Alice reads chronicles, reports, letters *etc.* and learns various facts about the relationships within this royal family, *i.e.* 

person C is a child of person P

#### For example:

- · Nicholas Lis a son of Paul L
- · Alexander III is a son of Alexander II
- · Alexander I is a son of Paul I

Your friend Alice is starting her degree in history. For the first assignment she has to write a paper on the Romanov dynasty. Alice reads chronicles, reports, letters *etc.* and learns various facts about the relationships within this royal family, *i.e.* 

## person C is a child of person P

#### For example:

- · Nicholas Lis a son of Paul I
- · Alexander III is a son of Alexander II
- · Alexander I is a son of Paul I

And so on... Alice has written down all the known facts about who is a child of whom.

# Can you help Alice devise procedures to answer questions like:

- · Who are the parents of Alexander I?
- Is it true that Alexander II is a grandson of Paul I?
- How many children and grandchildren did
   Peter I "The Great" have?
- · Who was the last Russian emperor?
- In what way is Nicholas II related to Queen Victoria I?

# Can you help Alice devise procedures to answer questions like:

- · Who are the parents of Alexander I?
- Is it true that Alexander II is a grandson of Paul I?
- How many children and grandchildren did
   Peter I "The Great" have?
- · Who was the last Russian emperor?
- In what way is Nicholas II related to Oueen Victoria I?

