

Engineering



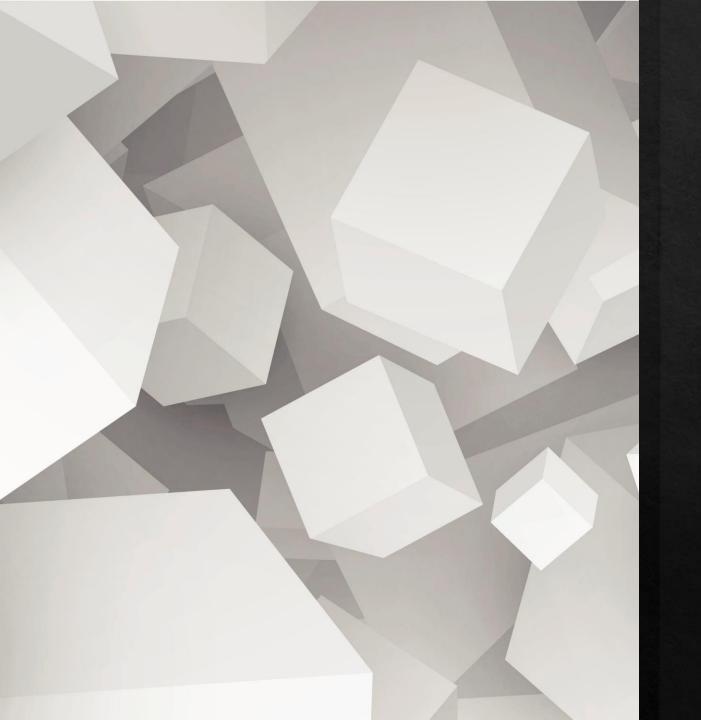


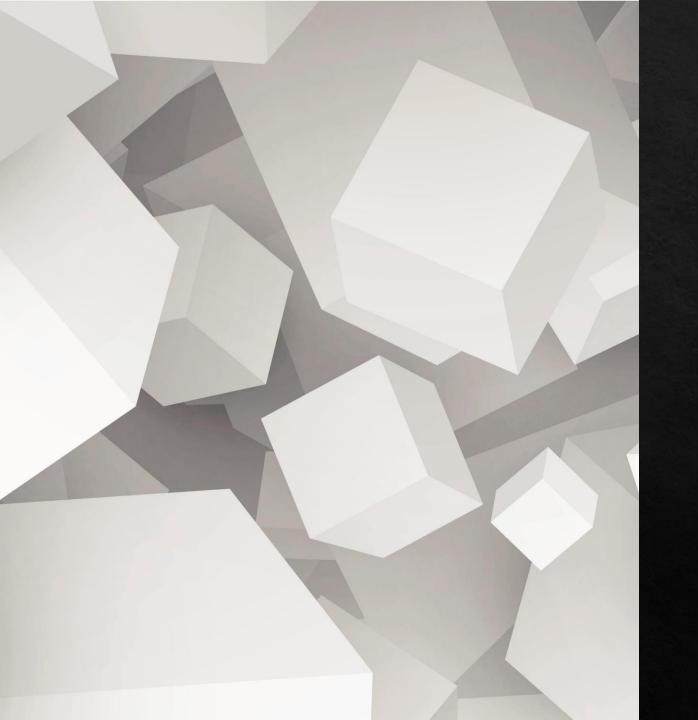
#### C++ and Linear Algebra

**Guy Davidson** 

# #include < C++>

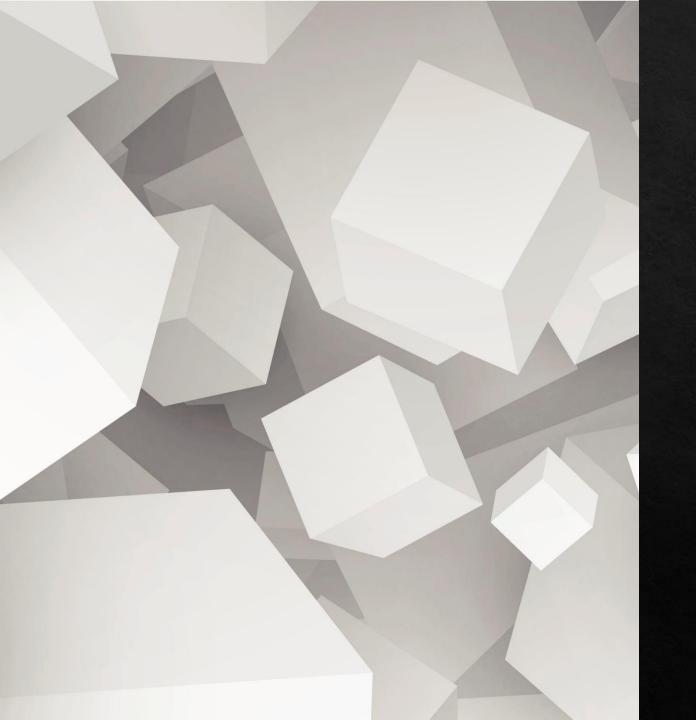
includecpp.org





What is linear algebra?

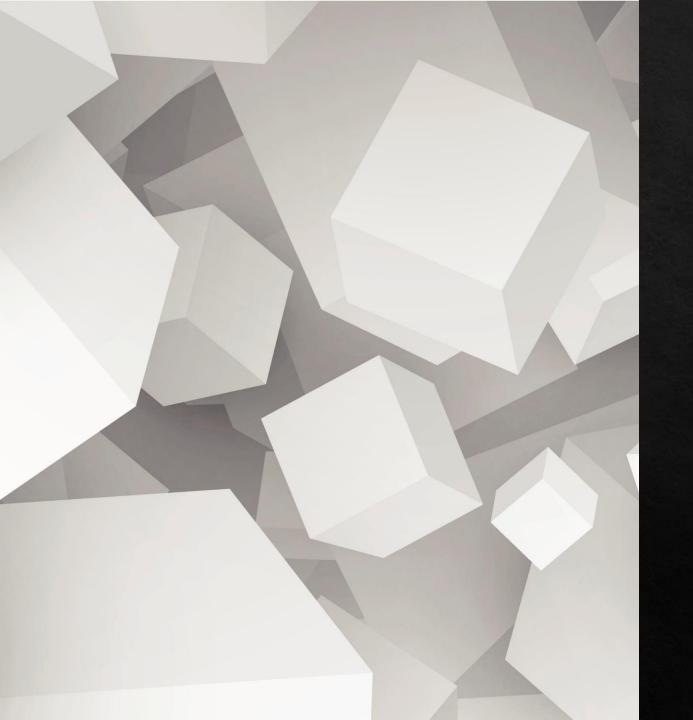
What is a linear algebra library?



What is linear algebra?

What is a linear algebra library?

Customising the library

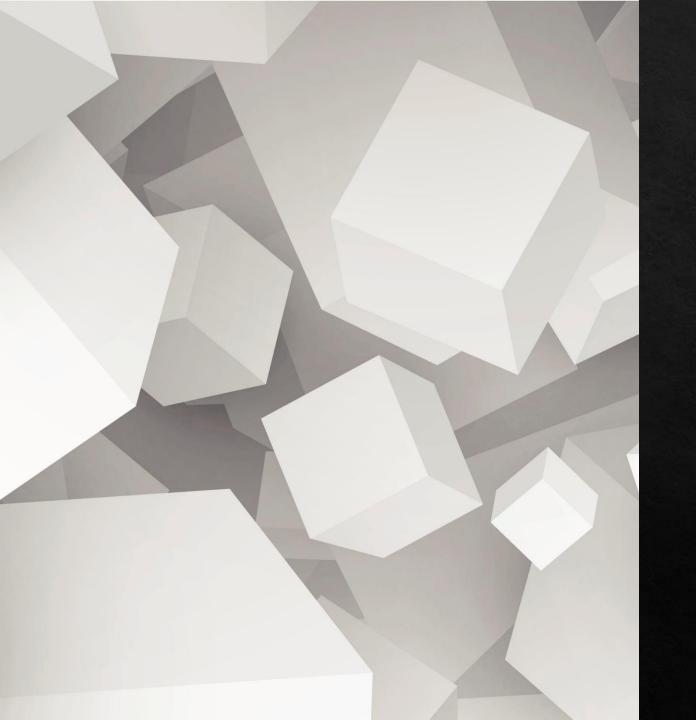


What is linear algebra?

What is a linear algebra library?

Customising the library

Applications in colour



What is linear algebra?

What is a linear algebra library?

Customising the library

Applications in colour

Applications in geometry

♦ "The branch of mathematics concerning linear equations and linear functions, and their representation through matrices and vector spaces"

\* "The branch of mathematics concerning linear equations and linear functions, and their representation through matrices and vector spaces"

$$\Rightarrow a_1 x_1 + a_2 x_2 + ... + a_n x_n = b$$

♦ "The branch of mathematics concerning linear equations and linear functions, and their representation through matrices and vector spaces"

$$\Rightarrow a_1 x_1 + a_2 x_2 + ... + a_n x_n = b$$

♦ Geometry

♦ "The branch of mathematics concerning linear equations and linear functions, and their representation through matrices and vector spaces"

$$\Rightarrow a_1 x_1 + a_2 x_2 + ... + a_n x_n = b$$

- ♦ Geometry
- ♦ Colour

- ♦ "The branch of mathematics concerning linear equations and linear functions, and their representation through matrices and vector spaces"
- $a_1x_1 + a_2x_2 + ... + a_nx_n = b$
- ♦ Geometry
- ♦ Colour
- Solving simultaneous equations

♦ Matrix

#### ♦ Matrix

♦ Matrix-scalar multiplication

♦ Matrix-scalar multiplication

♦ Matrix addition

#### ♦ Matrix addition

♦ Matrix-matrix multiplication

♦ Matrix-matrix multiplication

♦ Matrix-matrix multiplication

♦ Square matrix

#### ♦ Square matrix

♦ Identity matrix

♦ Identity matrix

```
◆ I = [1 0 ... 0]
        [0 1 ... 0]
        [... ... ]
        [0 0 ... 1]
```

♦ Identity matrix

$$A * I = I * A = A$$

 $\Rightarrow$  Determinant of A = |A|

- $\Rightarrow$  Determinant of A = |A|
- $\Rightarrow$  Inverse of  $A = A^{-1}$
- $A * A^{-1} = A^{-1} * A = I$

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- ♦ operator+()
- ♦ operator-()
- ♦ operator\*()

♦ Vector

- ♦ Vector
- ♦ Single row or single column

- ♦ Vector
- ♦ Single row or single column
- Inner product

- ♦ Vector
- ♦ Single row or single column
- ♦ Inner product

$$*$$
 [a b] \* [x] = (a \* x) + (b \* y)
[y]

- ♦ Vector
- ♦ Single row or single column
- Outer product

- ♦ Vector
- ♦ Single row or single column
- Outer product

$$(a) * [x y] = [a * x a * y]$$

$$[b] * [b * x b * y]$$

- ♦ Vector
- ♦ Single row or single column
- ♦ Abstraction problem

- ♦ Vector
- ♦ Single row or single column
- ♦ Abstraction problem
- ♦ Naming problem

$$\Leftrightarrow$$
 ax + by = e  
cx + dy = f

```
    ax + by = e
    cx + dy = f

    [a b] * [x] = [e]
    [c d] [y] [f]

    M * [x] = [e]
    [y] [f]
```

```
    ax + by = e
    cx + dy = f

    (a b) * [x] = [e]
    [c d] [y] [f]

    M * [x] = [e]
        [y] [f]

    (x] = M<sup>-1</sup> * [e]
    [y] [f]
```

$$\Rightarrow$$
 2x + 3y = 8  
x - 2y = -3

♦ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
♦  $M = [2 3]$ 

[1 -2]

$$\Rightarrow$$
 2x + 3y = 8  
x - 2y = -3

$$M = [2 \ 3]$$
 $[1 \ -2]$ 

$$\Diamond$$
 M<sup>-1</sup> = |M|<sup>-1</sup> \* adjugate(M)

♦ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
♦  $M = [2 \ 3]$   
 $[1 \ -2]$   
♦  $M^{-1} = |M|^{-1} * adjugate(M)$   
•  $|M| = (2 * -2) - (1 * 3)$   
 $= -7$ 

♦ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
♦  $M = [2 \ 3]$   
 $[1 \ -2]$   
♦  $M^{-1} = |M|^{-1} * adjugate(M)$   
•  $|M| = (2 * -2) - (1 * 3)$   
 $= -7$   
• adjugate(M) =  $[-2 \ -3]$   
 $[-1 \ 2]$ 

♦ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
♦  $M = [2 \ 3]$   
 $[1 \ -2]$   
♦  $M^{-1} = -7^{-1} * [-2 \ -3]$   
 $[-1 \ 2]$ 

♦ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
♦  $M = \begin{bmatrix} 2 & 3 \end{bmatrix}$   
 $\begin{bmatrix} 1 & -2 \end{bmatrix}$   
•  $M^{-1} = -7^{-1} * \begin{bmatrix} -2 & -3 \end{bmatrix}$   
 $\begin{bmatrix} -1 & 2 \end{bmatrix}$   
•  $\begin{bmatrix} x \end{bmatrix} = -7^{-1} * \begin{bmatrix} -2 & -3 \end{bmatrix} * \begin{bmatrix} 8 \end{bmatrix}$   
 $\begin{bmatrix} y \end{bmatrix}$ 

⇒ 
$$2x + 3y = 8$$
  
 $x - 2y = -3$   
⇒  $M = \begin{bmatrix} 2 & 3 \end{bmatrix}$   
 $\begin{bmatrix} 1 & -2 \end{bmatrix}$   
⇒  $M^{-1} = -7^{-1} * \begin{bmatrix} -2 & -3 \end{bmatrix}$   
 $\begin{bmatrix} -1 & 2 \end{bmatrix}$   
⇒  $\begin{bmatrix} x \end{bmatrix} = \begin{bmatrix} -7^{-1} * \begin{bmatrix} -2 & -3 \end{bmatrix} * \begin{bmatrix} 8 \end{bmatrix}$   
 $\begin{bmatrix} y \end{bmatrix}$   $\begin{bmatrix} -1 & 2 \end{bmatrix}$   $\begin{bmatrix} -3 \end{bmatrix}$   
⇒  $\begin{bmatrix} x \end{bmatrix} = \begin{bmatrix} ((-2 * 8) + (-3 * -3)) / -7 \end{bmatrix} = \begin{bmatrix} 1 \end{bmatrix}$   
 $\begin{bmatrix} y \end{bmatrix}$   $\begin{bmatrix} ((-1 * 8) + (2 * -3)) / -7 \end{bmatrix} = \begin{bmatrix} 2 \end{bmatrix}$ 

♦ 68000, fixed point

- ♦ 68000, fixed point
- ♦ 80286, fixed point, C/C++

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- ♦ AVX, (Sandy bridge)
- ♦ N4860, P1385

Optimisations available through specialisation

- Optimisations available through specialisation
- ♦ Matrix size

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- ♦ Matrix size
- ♦ Float

- Optimisations available through specialisation
- ♦ Matrix size
- ♦ Float
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- ♦ Matrix size
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- ♦ SIMD instruction set
- ♦ Cache line size
- ♦ Dense

♦ Matrix

- ♦ Matrix
- ♦ Vector

- ♦ Matrix
- ♦ Vector
- ♦ Infix operator overloads

- ♦ Matrix
- ♦ Vector
- ♦ Infix operator overloads
- ♦ M+M, V-V, a\*M, V/a...

- ♦ Matrix
- ♦ Vector
- ♦ Infix operator overloads
- ♦ M+M, V-V, a\*M, V/a...
- ♦ V\*V, V\*M, M\*V, M\*M

♦ operator >>

- operator >>
- ♦ operator []

- operator >>
- ♦ operator []
- $\Rightarrow$  m(i,j)

- operator >>
- ♦ operator []
- $\Rightarrow$  m(i,j)
- $\Rightarrow$  m[i,j]

- operator >>
- ♦ operator []
- $\Rightarrow$  m(i,j)
- $\phi$  m[i,j]
- ♦ m[i][j]

♦ operator \*

♦ operator \*

♦ 6 x 9

- ♦ operator \*
- ♦ 6 x 9
- ♦ operator x

- ♦ operator \*
- ♦ 6 x 9
- ♦ operator x
- ♦ operator x

- ♦ operator \*
- ♦ 6 x 9
- ♦ operator x
- ♦ operator x
- ♦ 6 x 9

♦ v \* w

Hadamard product

```
(3, 2) * (4, 2) = (12, 4)
(4, 2) = [12, 2]
[4, 2] = [2, 2]
[8, 4]
```

♦ BLAS (Basic Linear Algebra Subprograms)

- ♦ BLAS (Basic Linear Algebra Subprograms)
- ♦ BLAS++

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- BLAS (Basic Linear Algebra Subprograms)
- ♦ BLAS++

♦ Boost.uBLAS

```
vector 1 norm (sum)
add vectors
  axpy
            copy vector
  copy
            dot product
  dot
            dot product, unconjugated
  dotu
            max element
  iamax
            vector 2 norm
  nrm2
            apply Givens plane rotation
  rot
            generate Givens plane rotation
  rotg
            apply modified Givens plane rotation
  rotm
            generate modified Givens plane rotation
  rotmg
  scal
            scale vector
            swap vectors
  swap
```

general matrix-vector multiply asum gemv general matrix rank 1 update ger axpy hermitian matrix-vector multiply hemv copy hermitian rank 1 update dot her hermitian rank 2 update dotu her2 symmetric matrix-vector multiply iamax symv symmetric rank 1 update nrm2 syr symmetric rank 2 update syr2 rot triangular matrix-vector multiply rotg trmv triangular matrix-vector solve rotm trsv rotmg scal swap

general matrix multiply: C = AB + C gemm asum gemv hermitian matrix multiply hemm ger axpy hermitian rank k update hemy herk copy hermitian rank 2k update dot her her2k symmetric matrix multiply dotu her2 symm symmetric rank k update syrk iamax symv symmetric rank 2k update nrm2 syr2k syr triangular matrix multiply syr2 rot trmm triangular solve matrix rotg trsm trmv rotm trsv rotmg scal swap

<b>�</b>	asum	gemv	gemm	general matrix multiply: C = AB + C
	axpy	ger	hemm	hermitian matrix multiply
	copy	hemv	herk	hermitian rank k update
	dot	her	her2k	hermitian rank 2k update
	dotu	her2	symm	symmetric matrix multiply
	iamax	symv	syrk	symmetric rank k update
	nrm2	syr	syr2k	symmetric rank 2k update
	rot	syr2	trmm	triangular matrix multiply
	rotg	trmv	trsm	triangular solve matrix
	rotm	trsv		
	rotmg			
	scal			

swap

P1673R2: A free function linear algebra interface based on the BLAS

♦ Eigen

- Eigen
- Matrix and vector templates

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- Matrix and vector templates
- Dynamic or static dimensions

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- Matrix and vector templates
- Dynamic or static dimensions
- ♦ Span

- Eigen
- Matrix and vector templates
- Dynamic or static dimensions
- Span
- ♦ Member function API

```
♦ #include <iostream>
  #include <Eigen/Dense>
  using namespace Eigen;
  using namespace std;
  int main() {
    MatrixXd m = MatrixXd::Random(3,3);
    m = (m + MatrixXd::Constant(3,3,1.2)) * 50;
    cout << "m =" << endl << m << endl;
    VectorXd v(3);
    v << 1, 2, 3;
    cout << "m * v =" << endl << m * v << endl;
```

Dlib

- Dlib
- ♦ Expression templates

Blaze

```
♦ #include <iostream>
  #include <blaze/Math.h>
  using blaze::StaticVector;
  using blaze::DynamicVector
  int main() {
     StaticVector<int,3UL> a{ 4, -2, 5 }
     DynamicVector<int> b( 3UL );
     b[0] = 2;
     b[1] = 5;
     b[2] = -3;
     DynamicVector<int> c = a + b;
     std::cout << "c =\n" << c << "\n";
```

- ♦ https://wg21.link/P1385
- Syntax proposal
- ♦ Reserve some identifiers
- ♦ Boost.QVM

♦ Element type

- ♦ Element type
- ♦ Element arrangement

- ♦ Element type
- ♦ Element arrangement
- ♦ std::math::matrix<float, 3, 3> m1;

- ♦ Element type
- ♦ Element arrangement

```
♦ std::math::matrix<float, 3, 3> m1;
```

♦ std::math::matrix<float> m2;

Designing storage engines

- Designing storage engines
- ◆ automatic\_storage<T, R, C>

- Designing storage engines
- ◆ automatic\_storage<T, R, C>
- ♦ dynamic\_storage<T, A>

- Designing storage engines
- ♦ automatic storage<T, R, C>
- ♦ dynamic storage<T, A>
- std::math::matrix<automatic\_storage<float, 3, 3>> m1;

- Designing storage engines
- ♦ automatic storage<T, R, C>
- ♦ dynamic storage<T, A>
- ♦ std::math::matrix<automatic\_storage<float, 3, 3>> m1;
- \$ std::math::matrix<dynamic\_storage<float, std::allocator>> m2;

```
Designing storage engines

automatic_storage<T, R, C>

dynamic_storage<T, A>

std::math::matrix<automatic_storage<float, 3, 3>> m1;

std::math::matrix<dynamic_storage<float, std::allocator>> m2;

using geometry = automatic_storage<float, 3, 3>;
std::math::matrix<geometry> m1;
```

♦ mdspan : P0009

- ♦ mdspan : P0009
- Multidimensional arrays are a foundational data structure for science and engineering codes, as demonstrated by their extensive use in Fortran for five decades.
   A multidimensional array is a view to a memory extent through a layout mapping from a multi-index space (domain) to that extent (range).

- ♦ mdspan : P0009
- \* Traditional layout mappings have been specified as part of the language. For example, Fortran specifies column major layout and C specifies row major layout. Such a language-imposed specification requires significant code refactoring to change an array's layout and requires significant code complexity to implement non-traditional layouts such as tiling in modern linear algebra or structured grid application domains.

- ♦ mdspan : P0009
- A multidimensional array view abstraction with polymorphic layout is required to enable changing array layout without extensive code refactoring and maintenance of functionally redundant code. Layout polymorphism is a critical capability; however, it is not the only beneficial form of polymorphism.

- ♦ mdspan : P0009
- template <ptrdiff\_t... Extents> class extents;

- ♦ mdspan : P0009
- template <ptrdiff\_t... Extents> class extents;
- dynamic\_extent

♦ matrix\_storage\_engine<T, extents<R, C>, A>;

- ♦ matrix\_storage\_engine<T, extents<R, C>, A>;
- matrix<matrix\_storage\_engine<float, extents<3, 3>, void>>;

```
    matrix_storage_engine<T, extents<R, C>, A>;

    matrix<matrix_storage_engine<float, extents<3, 3>, void>>;

    matrix<matrix_storage_engine<float, dynamic_extents, std::allocator<T>>>;
```

```
    matrix_storage_engine<T, extents<R, C>, A>;

    matrix_storage_engine<float, extents<3, 3>, void>>;

    matrix<matrix_storage_engine<float, dynamic_extents, std::allocator<T>>>;

    matrix_storage_engine<T, extents<R, C>, A, L>;
```

```
    #include <iostream>

int main()
{
    std::cout << 1 + 2.5;
}
</pre>
```

```
    #include <iostream>

int main()
{
    std::cout << 1 + 2.5;
}

    3.5

    double operator+(int, double)?</pre>
```

```
    #include <iostream>

    int main()
    {
        std::cout << 1 + 2.5;
    }

        3.5

        double operator+(int, double)?

        double operator+(double, double)</pre>
```

```
    #include <iostream>
    #include <complex>

int main()
{
    std::cout << std::complex<double>(3., 3.);
}
```

```
    #include <iostream>
    #include <complex>

int main()
{
    std::cout << std::complex<double>(3., 3.);
}

    (3,3)
```

```
    #include <iostream>
    #include <complex>

int main()
{
    std::cout << std::complex<int>(3., 3.);
}
```

```
    #include <iostream>
    #include <complex>

int main()
{
    std::cout << std::complex<int>(3., 3.);
}

    (3,3)
```

```
    #include <iostream>
    #include <complex>

int main()
{
    std::cout << std::complex<int>(3.7, 3.2);
}
```

```
    #include <iostream>
    #include <complex>

int main()
{
      std::cout << std::complex<int>(3.7, 3.2);
}

      (3,3)
```

binary '+': 'std::complex<float>' does not define this operator or a
 conversion to a type acceptable to the predefined operator

```
    matrix_storage_engine<double, extents<3, 3>, void, row_major>;

    matrix_storage_engine<float, extents<3, 3>, void, row_major>;

    => matrix_storage_engine<double, extents<3, 3>, void, row_major>;
```

```
    matrix_storage_engine<double, extents<3, 3>, void, row_major>;

    matrix_storage_engine<float, extents<3, 3>, void, row_major>;

    => matrix_storage_engine<double, extents<3, 3>, void, row_major>;
```

```
    matrix_storage_engine<double, extents<3, 3>, void, row_major>;

    matrix_storage_engine<float, extents<3, 3>, void, row_major>;

    => matrix_storage_engine<double, extents<3, 3>, void, row_major>;
```

```
struct matrix_operation_traits {
   template <typename OTR, class T1, class T2> addition_element_traits;
   template <typename OTR, class T1, class T2> addition_engine_traits;
   template <typename OTR, class T1, class T2> addition_arithmetic_traits;
   template <typename OTR, class T1, class T2> subtraction_element_traits;
   ...
   template <typename OTR, class T1, class T2> multiplication_element_traits;
   ...
   template <typename OTR, class T1, class T2> addition_element_traits;
};
```

```
$ template<class T, ptrdiff_t R, ptrdiff_t C, class COT = void>
using fixed_size_matrix =
   basic_matrix<matrix_storage_engine<T, extents<R, C>,
        void, matrix_layout::row_major>, COT>;

$ template<class COT = void>
using matrix_33f =
   basic_matrix<matrix_storage_engine<float, extents<3, 3>,
        void, matrix layout::row major>, COT>;
```

♦ Multiplication

- Multiplication
- $\diamond$  O(n<sup>3</sup>)

- Multiplication
- $\diamond$  O(n<sup>3</sup>)
- $\diamond$  Strassen's algorithm  $O(n^{2.807})$

- Multiplication
- $\diamond$  O(n<sup>3</sup>)
- $\diamond$  Strassen's algorithm  $O(n^{2.807})$
- $\bullet$  Best result  $O(n^{2.3728639})$

```
struct custom operation traits {
    template <typename OTR, class T1, class T2>
    using addition element traits =
      std::matrix operation traits::addition element traits<OTR, T1, T2>;
    template <typename OTR, class T1, class T2>
    using addition engine traits =
      std::matrix operation traits::addition engine traits<OTR, T1, T2>;
    template <typename OTR, class T1, class T2>
    using addition arithmetic traits =
      custom addition arithmetic traits<OTR, T1, T2>;
```

♦ basic\_matrix<</pre>

- ♦ basic\_matrix<</pre>
- matrix\_storage\_engine<</pre>





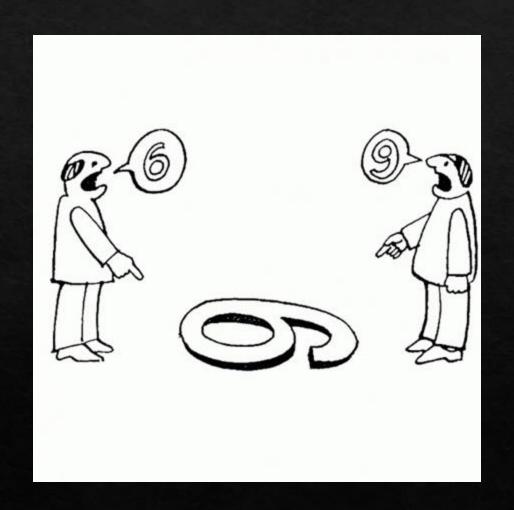


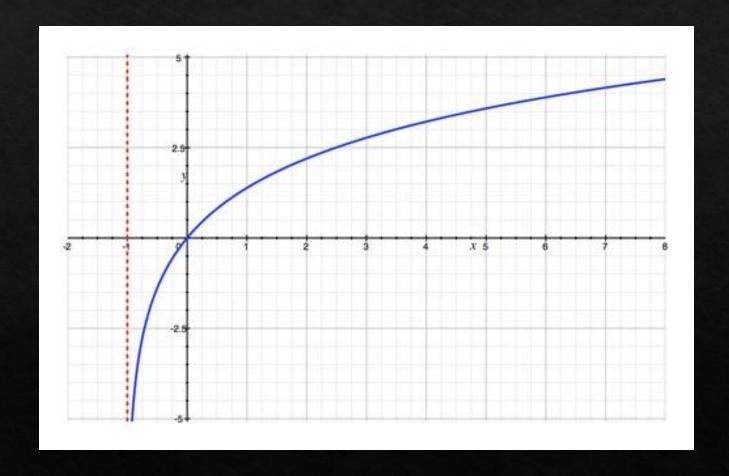


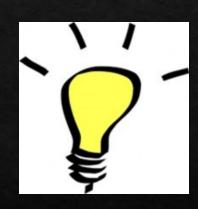
```
    template <T> using complex_scalar_storage =
        matrix_storage_engine<std::complex<T>, extents<1, 1>, void>;
    template <T> using complex_scalar =
        basic_matrix<complex_scalar_storage<T>>;
    complex_scalar<float> c1{2.2f, 3.3f};
    complex_scalar<double> c2{4.4, 5.5};
    auto c3 = c1 + c2;
```



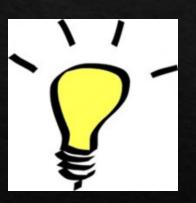


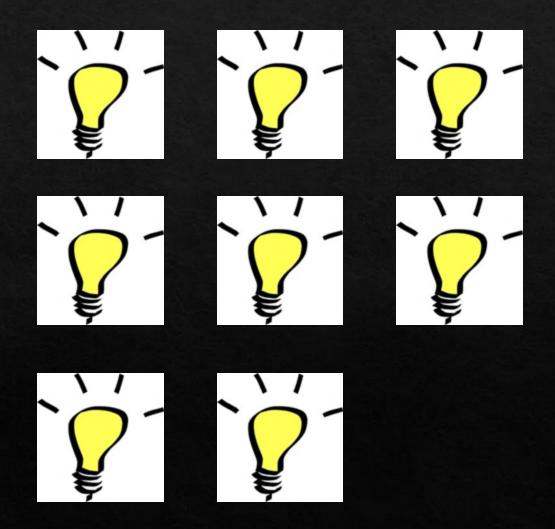


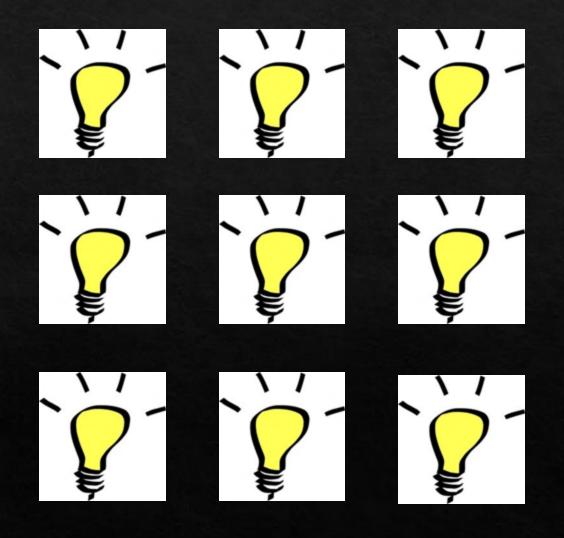


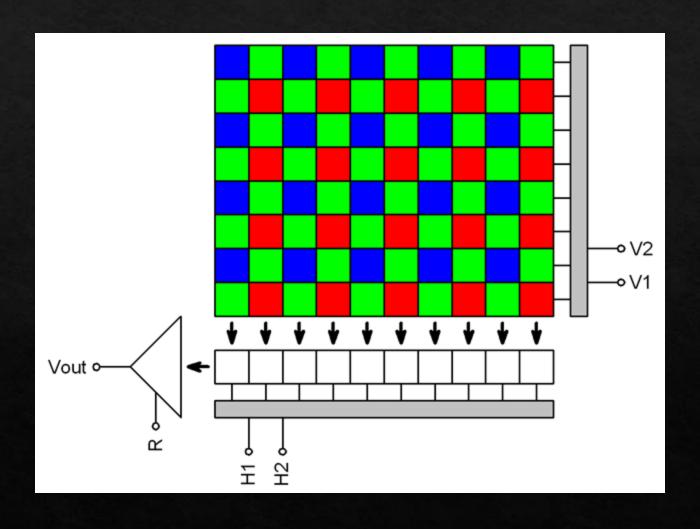






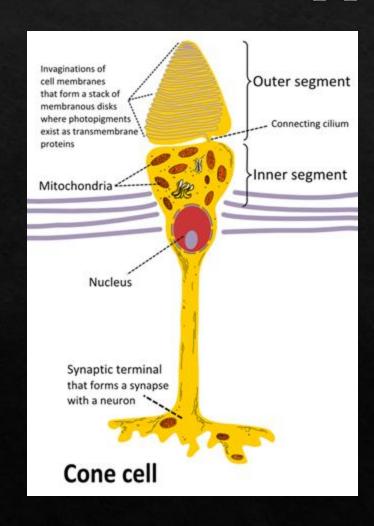


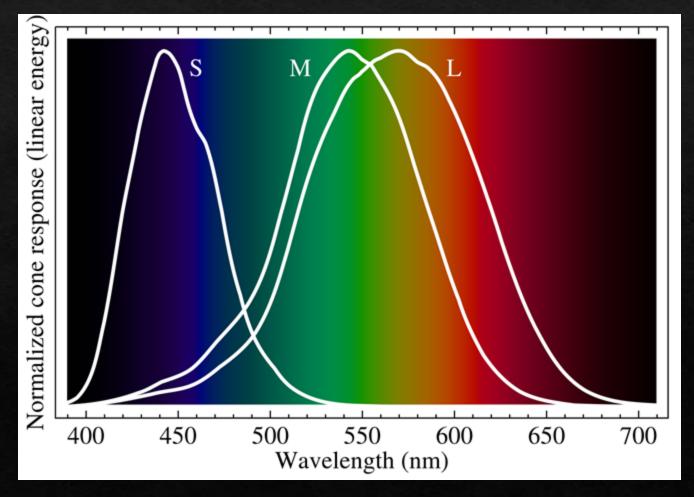




 $2.0\sqrt{X}$   $2.0\sqrt{X}$   $2.0\sqrt{X}$   $2.0\sqrt{X}$   $2.0\sqrt{X}$ 

$$2.2\sqrt{X}$$
  $2.2\sqrt{X}$   $2.2\sqrt{X}$   $2.2\sqrt{X}$   $2.2\sqrt{X}$   $2.2\sqrt{X}$   $2.2\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$   $1.8\sqrt{X}$ 





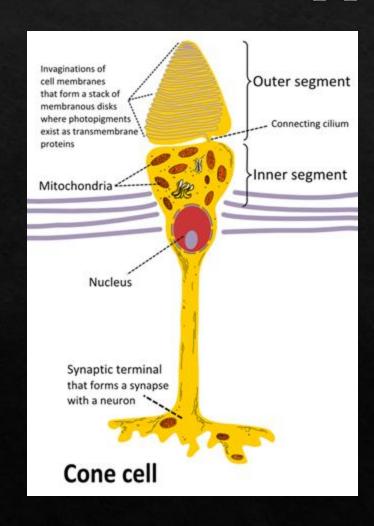
♦ Take a standard human

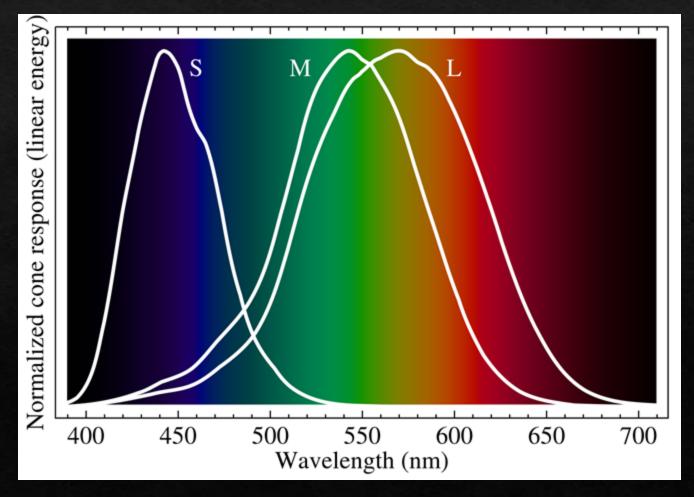
- ♦ Take a standard human
- ♦ Put them in a standard environment

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- Measure how they perceive electromagnetic waves, via matching the colours of lights

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- ♦ Put them in a standard environment
- ♦ Measure how they perceive electromagnetic waves, via matching the colours of lights
- ♦ Build a function that maps wavelengths to perception, giving 3 values (X, Y, Z)

- ♦ Take a standard human
- ♦ Put them in a standard environment
- Measure how they perceive electromagnetic waves, via matching the colours of lights
- ♦ Build a function that maps wavelengths to perception, giving 3 values (X, Y, Z)
- ♦ Add some mathematical constraints (values > 0, Y = relative luminance [0, 100])





Humans separate colour from brightness

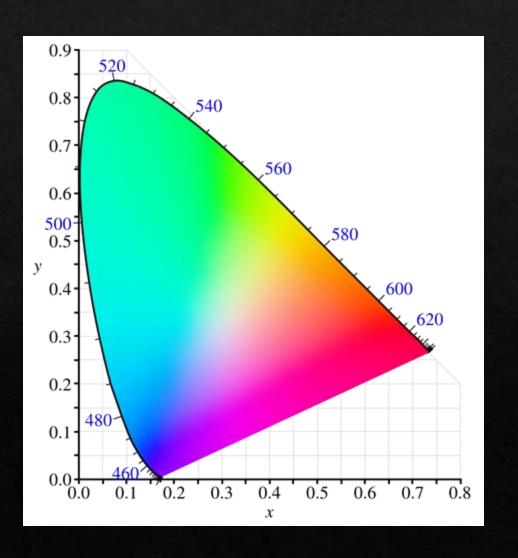
- Humans separate colour from brightness
- ♦ Normalise:

$$x = X / (X + Y + Z)$$
  
 $y = Y / (X + Y + Z)$   
 $z = Z / (X + Y + Z) = (1 - x - y)$ 

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$$x = X / (X + Y + Z)$$
  
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xyY colour spacex and y are colourY is relative luminance



♦ Small change in a value has the same effect in perceived colour

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- ♦ XYZ values are not perceptually uniform

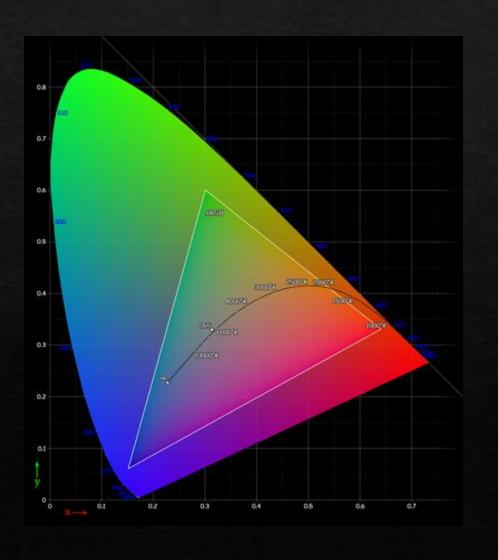
- ♦ Small change in a value has the same effect in perceived colour
- ♦ XYZ values are not perceptually uniform
- ♦ Inefficient, like storing sound volume in raw values rather than in dB. 100dB=1^100

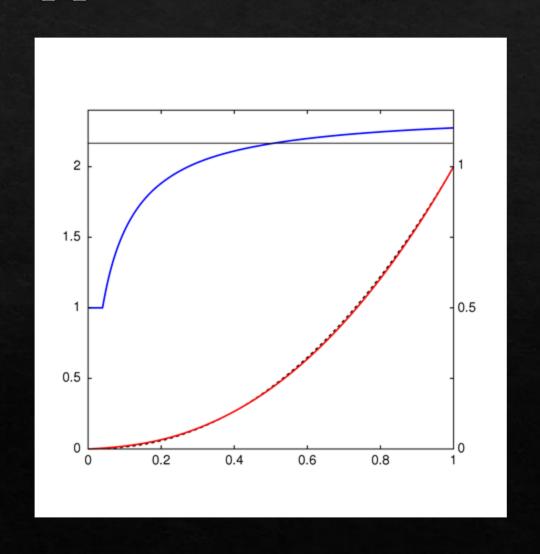
♦ 1996: Microsoft + HP

- ♦ 1996: Microsoft + HP
- ♦ IEC 61966-2-1:1999

- ♦ 1996: Microsoft + HP
- ♦ IEC 61966-2-1:1999
- ♦ Default colour space where NO COLOUR SPACE INFORMATION is provided

Chromaticity	Red	Green	Blue	White point
X	0.6400	0.3000	0.1500	0.3127
У	0.3300	0.6000	0.0600	0.3290
Y	0.2126	0.7152	0.0722	1.0000





$$\begin{bmatrix} R_{\rm linear} \\ G_{\rm linear} \\ B_{\rm linear} \end{bmatrix} = \begin{bmatrix} +3.24096994 & -1.53738318 & -0.49861076 \\ -0.96924364 & +1.8759675 & +0.04155506 \\ +0.05563008 & -0.20397696 & +1.05697151 \end{bmatrix} \begin{bmatrix} X_{D65} \\ Y_{D65} \\ Z_{D65} \end{bmatrix}$$

$$\gamma(u) = \left\{ egin{array}{ll} 12.92u & = rac{323u}{25} & u \leq 0.0031308 \ 1.055u^{1/2.4} - 0.055 & = rac{5}{1200} & ext{otherwise} \end{array} 
ight.$$

$$\gamma^{-1}(u) = \begin{cases} \frac{u}{12.92} &= \frac{25u}{323} & u \le 0.04045\\ \left(\frac{u+0.055}{1.055}\right)^{2.4} &= \left(\frac{200u+11}{211}\right)^{\frac{12}{5}} & \text{otherwise} \end{cases}$$

$$\begin{bmatrix} X_{D65} \\ Y_{D65} \\ Z_{D65} \end{bmatrix} = \begin{bmatrix} 0.41239080 & 0.35758434 & 0.18048079 \\ 0.21263901 & 0.71516868 & 0.07219232 \\ 0.01933082 & 0.11919478 & 0.95053215 \end{bmatrix} \begin{bmatrix} R_{\rm linear} \\ G_{\rm linear} \\ B_{\rm linear} \end{bmatrix}$$

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 $\Leftrightarrow$  (x + y) / 2

```
♦ (x + y) / 2
```

♦ 
$$(\sqrt{x} + \sqrt{y}) / 2 < \sqrt{((x + y) / 2)}$$

♦ (x + y) / 2♦  $(\sqrt{x} + \sqrt{y}) / 2 < \sqrt{((x + y) / 2)}$ ♦ x = 9, y = 16

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```
♦ (x + y) / 2

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♦ x = 9, y = 16

♦ (\sqrt{9} + \sqrt{16}) / 2 = 3.5

♦ \sqrt{((9 + 16) / 2)} = 3.535
```

```
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♦ template <class T>

constexpr std::midpoint(T a, T b) noexcept;
```

```
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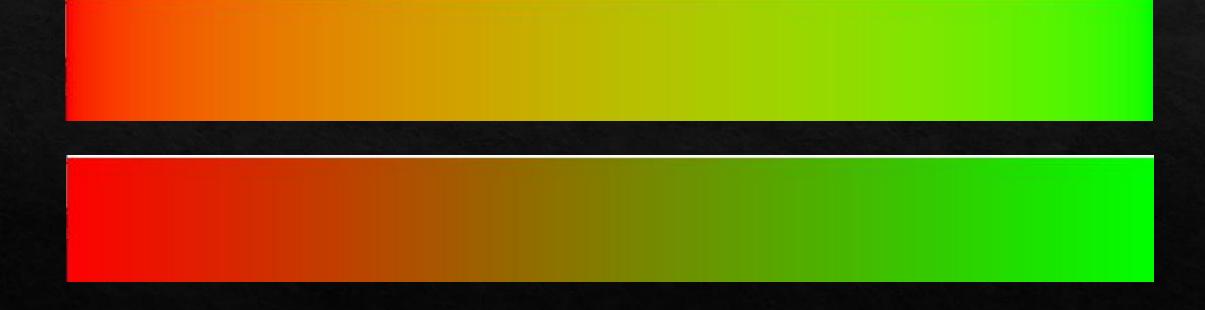
♦ x = 9, y = 16

♦ (\sqrt{9} + \sqrt{16}) / 2 = 3.5

♦ \sqrt{((9 + 16) / 2)} = 3.535

♦ template <class T> constexpr std::midpoint(T a, T b) noexcept;

♦ constexpr float std::lerp(float a, float b, float t) noexcept
```



♦ libSDL

- ♦ libSDL
- ♦ SFML

- ♦ libSDL
- ♦ SFML
- ♦ Dear ImGui

- ♦ libSDL
- ♦ SFML
- ♦ Dear ImGui
- ♦ Flash

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- Unity
- ♦ Godot
- ♦ OGRE

♦ CRYENGINE

- ♦ CRYENGINE
- ♦ MatLab

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- ♦ OpenCV

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- ♦ CRYENGINE
- ♦ MatLab
- ♦ OpenCV
- ♦ SVG and CSS
- Qt
- ♦ Unreal Engine

```
guy@DESKTOP-69NQDUU:/$ ls
bin boot dev etc home init lib lib64 media mnt opt proc root run sbin snap
srv sys @@@ usr var
guy@DESKTOP-69NQDUU:/$ _
```



♦ "The branch of mathematics concerned with questions of shape, size, relative position of figures and the properties of space."



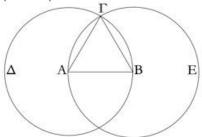
♦ "The branch of mathematics concerned with questions of shape, size, relative position of figures and the properties of space."





α.

Επί τῆς δοθείσης εὐθείας πεπερασμένης τρίγωνον Ισόπλευρον συστήσασθαι.



Έστω ή δοθεῖσα εὐθεῖα πεπερασμένη ή ΑΒ.

 $\Delta$ εῖ δὴ ἐπὶ τῆς AB εὐθείας τρίγωνον Ισόπλευρον συστήσασθαι.

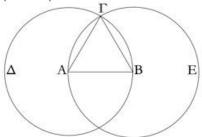
Κέντρω μὲν τῷ Α διαστήματι δὲ τῷ ΑΒ χύχλος γεγράφθω ὁ ΒΓΔ, καὶ πάλιν κέντρω μὲν τῷ Β διαστήματι δὲ τῷ ΒΑ χύχλος γεγράφθω ὁ ΑΓΕ, καὶ ἀπὸ τοῦ Γ σημείου, καθ' δ τέμνουσιν ἀλλήλους οἱ χύχλοι, ἐπί τὰ Α, Β σημεῖα ἐπεζεύχθωσαν εὐθεῖαι αἱ ΓΑ, ΓΒ.

Καὶ ἐπεὶ τὸ A σημεῖον χέντρον ἐστὶ τοῦ  $\Gamma\Delta B$  χύχλου, ἴση ἐστὶν ἡ  $A\Gamma$  τῆ AB πάλιν, ἐπεὶ τὸ B σημεῖον χέντρον ἐστὶ τοῦ  $\Gamma AE$  χύχλου, ἴση ἐστὶν ἡ  $B\Gamma$  τῆ BA. ἐδείχθη δὲ καὶ ἡ  $\Gamma A$  τῆ AB ἴση· ἐκατέρα ἄρα τῶν  $\Gamma A$ ,  $\Gamma B$  τῆ AB ἐστιν ἴση. τὰ δὲ τῷ αὐτῷ ἴσα καὶ ἀλλήλοις ἐστὶν ἴσα· καὶ ἡ  $\Gamma A$  ἄρα τῆ  $\Gamma B$  ὲστιν ἴση· αὶ τρεῖς ἄρα αὶ  $\Gamma A$ , AB,  $B\Gamma$  ἴσαι ἀλλήλαις εἰσίν.

Τσόπλευρον ἄρα ἐστὶ τὸ ΑΒΓ τρίγωνον. καὶ συνέσταται ἐπὶ τῆς δοθείσης εὐθείας πεπερασμένης τῆς ΑΒ. ὅπερ ἔδει ποιῆσαι.

α'.

Έπὶ τῆς δοθείσης εὐθείας πεπερασμένης τρίγωνον ἰσόπλευρον συστήσασθαι.



Έστω ή δοθεῖσα εὐθεῖα πεπερασμένη ή ΑΒ.

Δεῖ δὴ ἐπὶ τῆς AB εὐθείας τρίγωνον Ισόπλευρον συστήσασθαι.

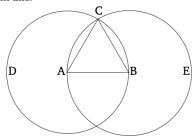
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#### Proposition 1

To construct an equilateral triangle on a given finite straight-line.



Let AB be the given finite straight-line.

So it is required to construct an equilateral triangle on the straight-line AB.

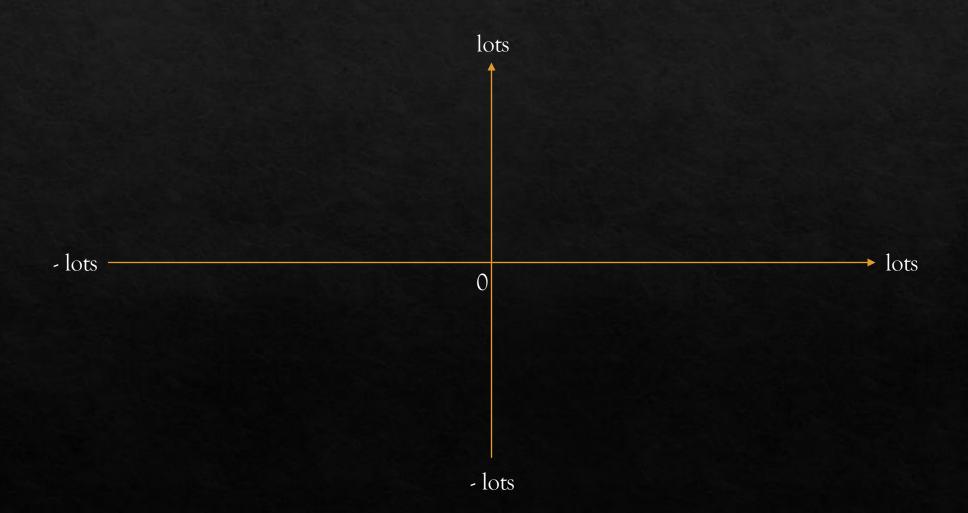
Let the circle BCD with center A and radius AB have been drawn [Post. 3], and again let the circle ACE with center B and radius BA have been drawn [Post. 3]. And let the straight-lines CA and CB have been joined from the point C, where the circles cut one another,  $^{\dagger}$  to the points A and B (respectively) [Post. 1].

And since the point A is the center of the circle CDB, AC is equal to AB [Def. 1.15]. Again, since the point B is the center of the circle CAE, BC is equal to BA [Def. 1.15]. But CA was also shown (to be) equal to AB. Thus, CA and CB are each equal to AB. But things equal to the same thing are also equal to one another [C.N. 1]. Thus, CA is also equal to CB. Thus, the three (straight-lines) CA, AB, and BC are equal to one another.

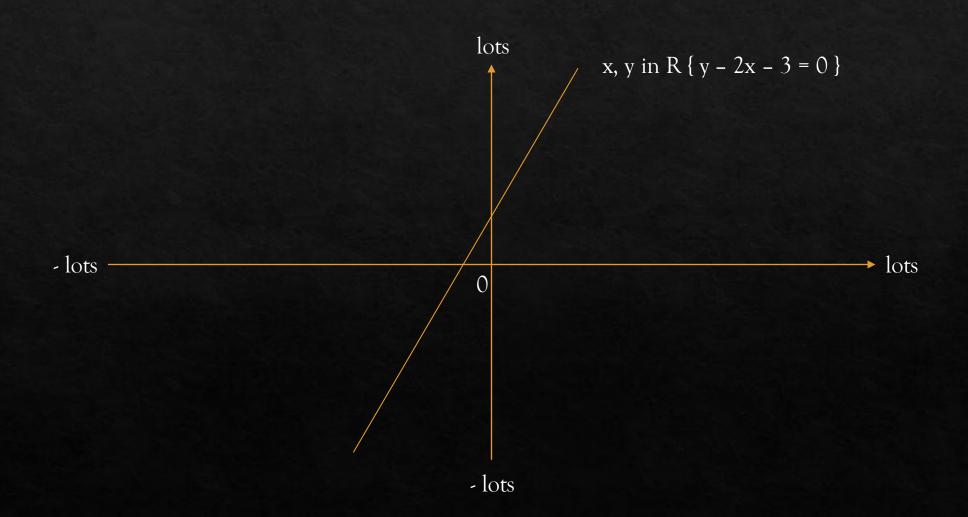
Thus, the triangle ABC is equilateral, and has been constructed on the given finite straight-line AB. (Which is) the very thing it was required to do.

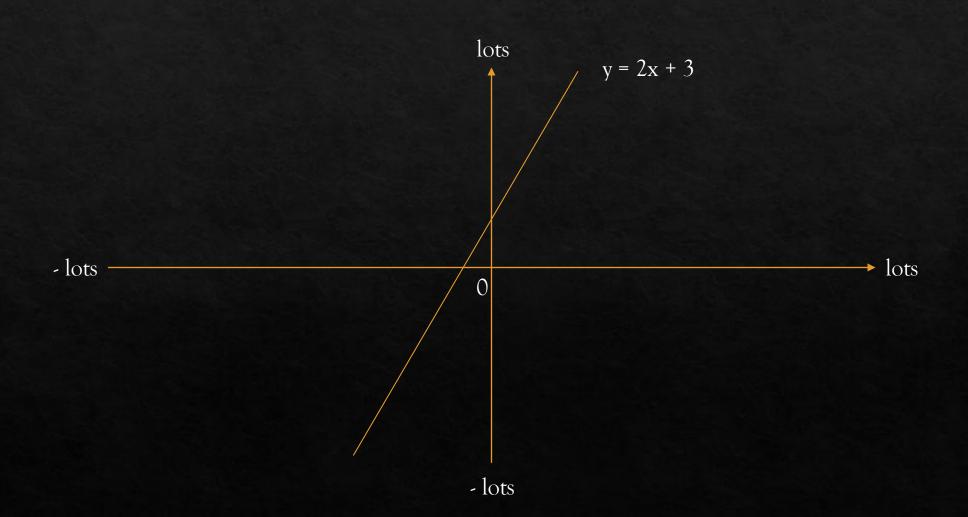
- René Descartes
- ♦ b. 31st March 1596
- ♦ d. 11th February 1650











$$\Rightarrow a_1 x_1 + a_2 x_2 + ... + a_n x_n = b$$

$$\Rightarrow a_1x_1 + a_2x_2 + ... + a_nx_n = b$$

$$\Rightarrow a_1 x_1 + a_2 x_2 = b$$

$$\Rightarrow a_1 x_1 + a_2 x_2 + ... + a_n x_n = b$$

$$\Rightarrow a_1 x_1 + a_2 x_2 = b$$

$$\Rightarrow$$
 ax + by = c

$$\Rightarrow a_1x_1 + a_2x_2 + ... + a_nx_n = b$$

$$\Rightarrow a_1 x_1 + a_2 x_2 = b$$

$$\Rightarrow$$
 ax + by = c

$$\Rightarrow$$
 by = -ax + c

$$\Rightarrow a_1x_1 + a_2x_2 + ... + a_nx_n = b$$

$$\Rightarrow a_1 x_1 + a_2 x_2 = b$$

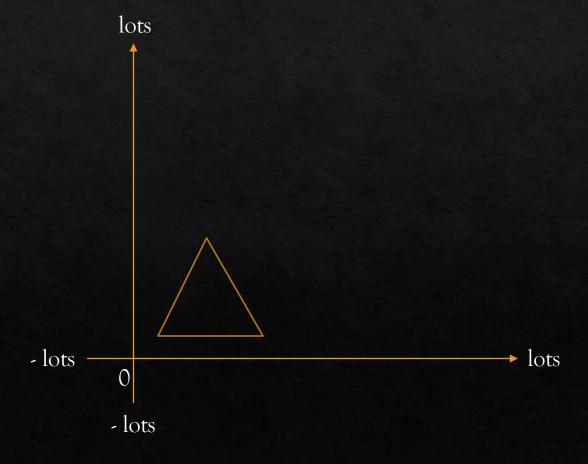
$$\Rightarrow$$
 ax + by = c

$$\Rightarrow$$
 by = -ax + c

$$\Rightarrow$$
 y = mx + c

- **♦** (x, y)
- ♦ Translate

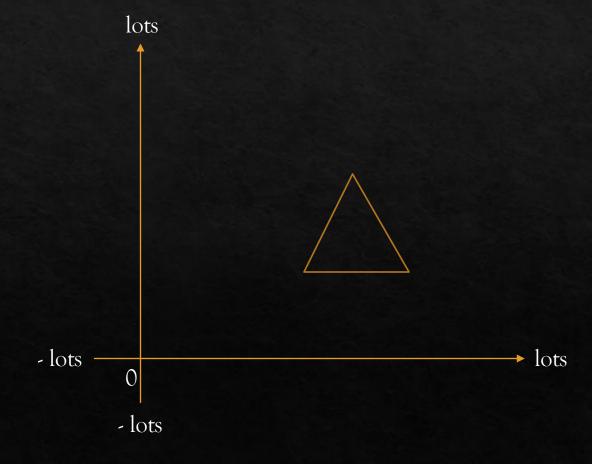
$$(x, y) + (a, b) = (x + a, y + b)$$



**♦** (x, y)

♦ Translate

$$(x, y) + (a, b) = (x + a, y + b)$$

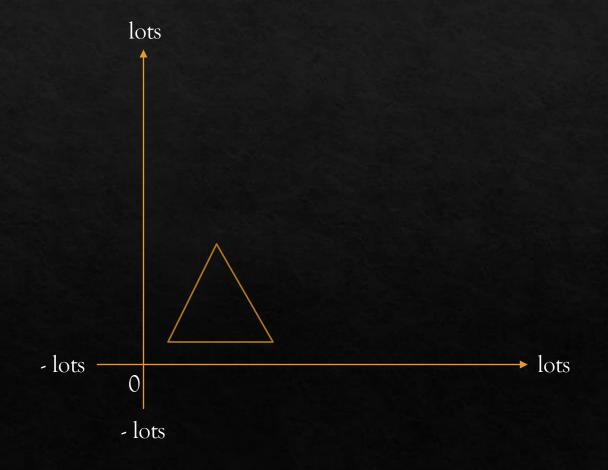


♦ Scale

$$(x, y) * 2 = (2x, 2y)$$

$$(x, y) * (2 0) = (2x, 2y)$$

$$(0 2)$$

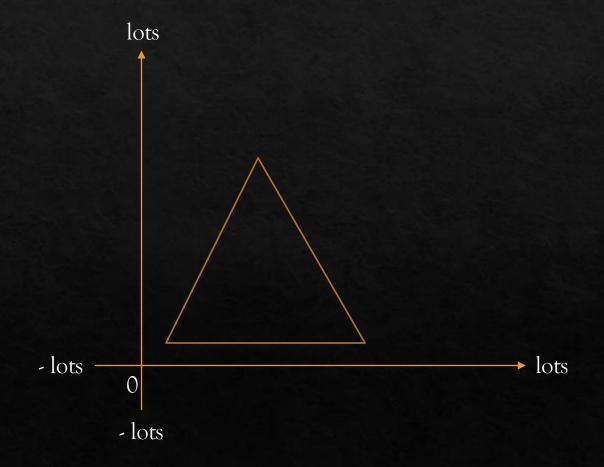


♦ Scale

$$(x, y) * 2 = (2x, 2y)$$

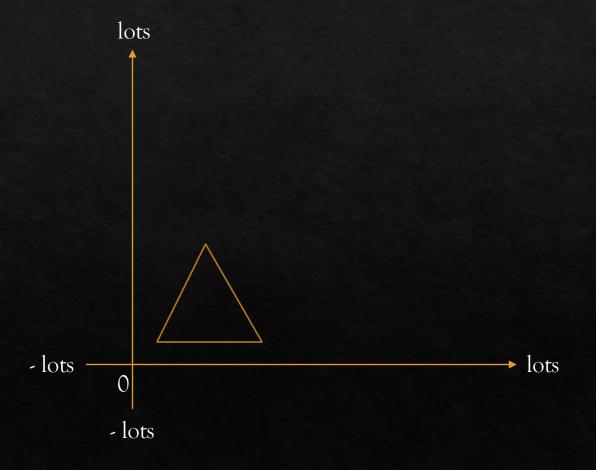
$$(x, y) * (2 0) = (2x, 2y)$$

$$(0 2)$$



$$(x, y) * (1 2) = (x, 2x + y)$$

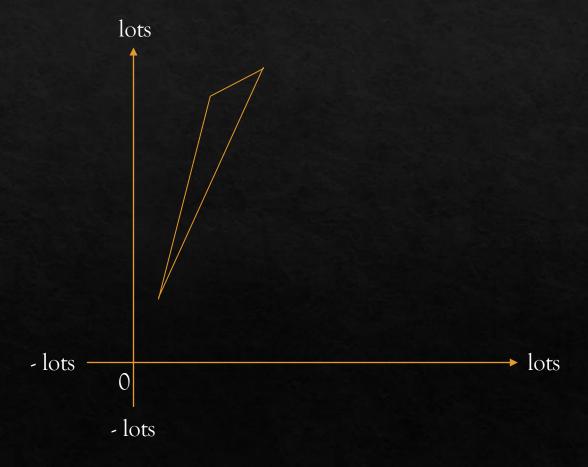
$$(0 1)$$



♦ Shear

$$(x, y) * (1 2) = (x, 2x + y)$$

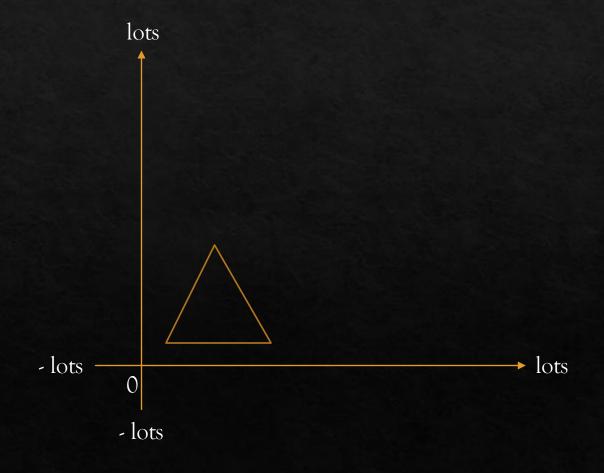
$$(0 1)$$



♦ Reflect

$$(x, y) * (1 0) = (x, -y)$$

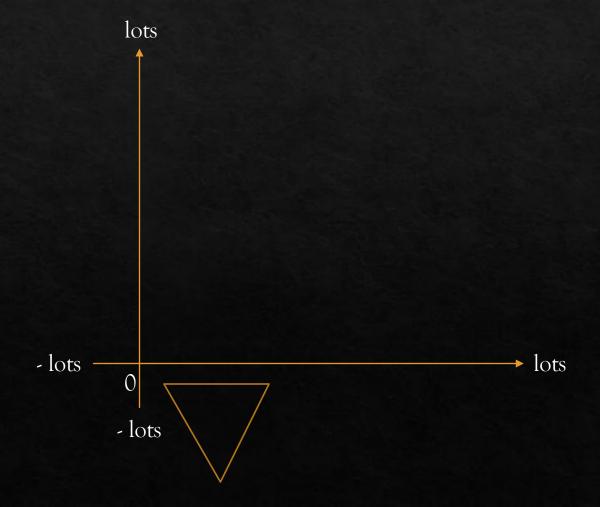
$$(0 - 1)$$



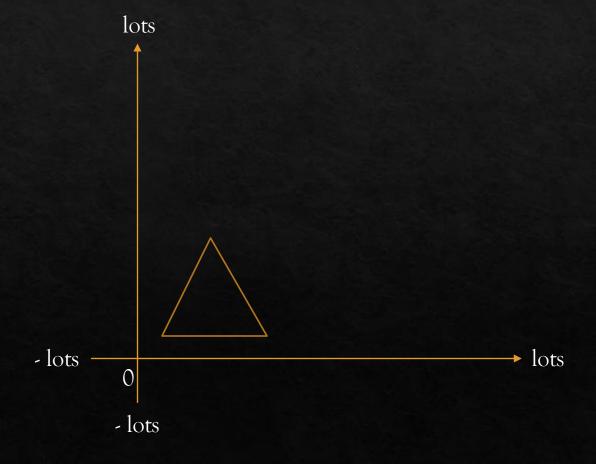
♦ Reflect

$$(x, y) * (1 0) = (x, -y)$$

$$(0 - 1)$$



```
    ♦ (x, y)
    ♦ Rotate
    ♦ (x, y) * (cos a -sin a)
        (sin a cos a)
        = (x * cos a + y * sin a,
        -x * sin a + y * cos a)
```



```
\Leftrightarrow (x, y)
♦ Rotate
(x, y) * (\cos a - \sin a)
            (sin a cos a)
   = (x * \cos a + y * \sin a,
            -x * sin a + y * cos a)
                                             - lots
                                                                                                  lots
```

♦ Boost.Geometry

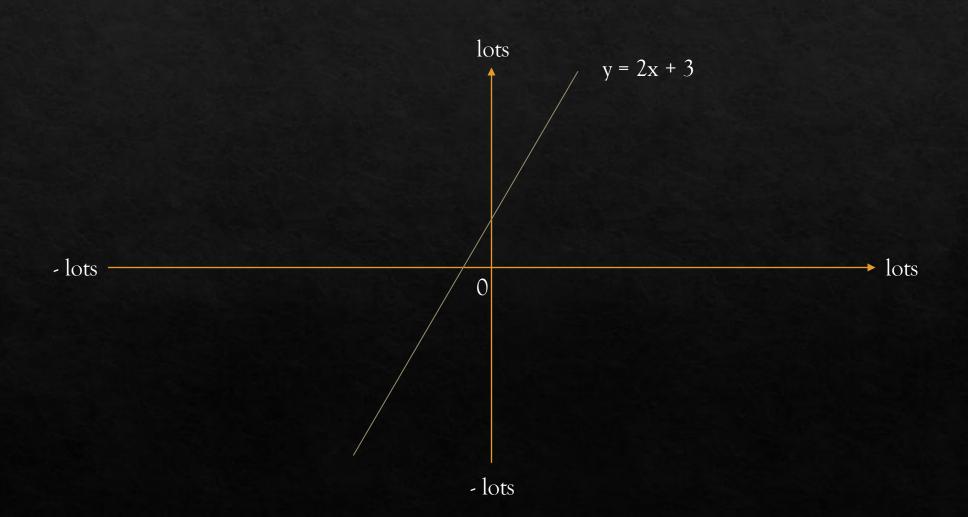
- ♦ Boost.Geometry
- Barend Gehrels

- ♦ Boost.Geometry
- Barend Gehrels
- ♦ Geometry classes

- ♦ Boost.Geometry
- Barend Gehrels
- Geometry classes
- ♦ Dimension agnostic

- ♦ Boost.Geometry
- Barend Gehrels
- Geometry classes
- ♦ Dimension agnostic
- ♦ Distance

- ♦ Boost.Geometry
- ♦ Barend Gehrels
- Geometry classes
- ♦ Dimension agnostic
- ♦ Distance
- ♦ Coordinate-system agnostic



```
$ struct line
{
    float gradient;
    float y_intercept;
};
```

```
$ struct line
{
    float gradient;
    float y_intercept;
};

struct line_segment
{
    point p1;
    point p2;
};
```

♦ Q

Q

**♦** 3244.7482

```
$ struct line
{
    std::vector<point> points;
};
```

```
$ struct line
{
    float gradient;
    float y_intercept;
};
```

```
$ struct line
{
    float gradient;
    float y_intercept;
    point p1;
    point p2;
};
```

```
$ struct line
{
    float gradient;
    float y_intercept;
    point p_begin;
    point p_end;
};
```

```
$ struct bezier
{
    point p_begin;
    point p_control;
    point p_end;
};
```

♦ 
$$y = x - 1$$
 $y = 2x - 4$ 

♦  $0 = x - 3$ 
 $x = 3$ 

♦ 
$$y = x^2$$
  
 $y = x + 3.9$   
♦  $0 = x^2 - x - 3.9$   
 $x = 0.5 \pm \sqrt{(16.6)/2}$ 

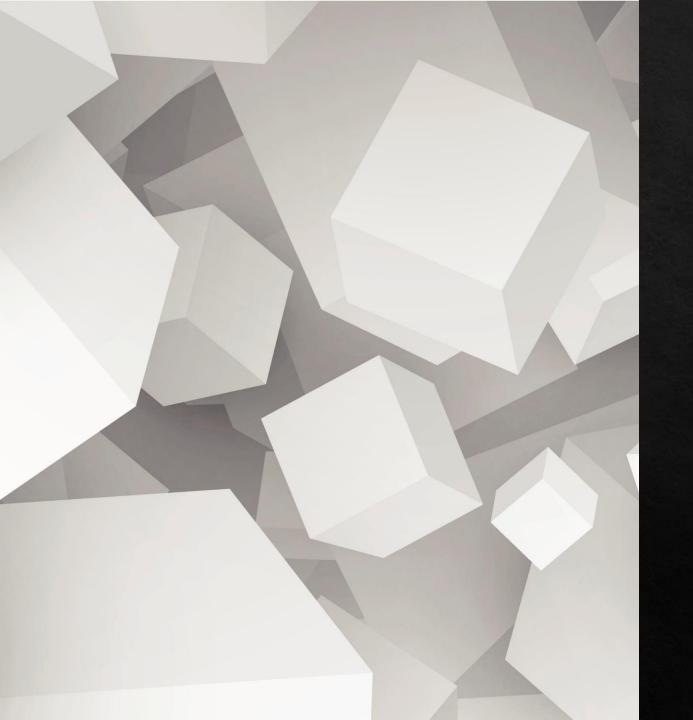
$$y = x - 2.3$$
  
 $y = x/3$ 

$$\Rightarrow$$
 y = x - 2.3  
y = x/3  
 $\Rightarrow$  0 = 2x/3 - 2.3  
x = 3.45

♦ bool intersects(line a, line b);

- ♦ bool intersects(line a, line b);
- FLT\_MIN vs FLT\_EPSILON

```
> bool intersects(line a, line b);
> FLT_MIN vs FLT_EPSILON
> bool intersects(line a, line b, float epsilon);
```



#### What to expect

What is linear algebra?

What is a linear algebra library?

Customising the library

Applications in colour

Applications in geometry

https://wg21.link/p1385



Engineering





## C++ and Linear Algebra

**Guy Davidson**