

# Lecture 7: Transformations Math

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# Review of Last Time

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- Transformations
- Hierarchies, Chains, Trees, DAGs, ...
- Scene-Graph APIs (SVG)

# Today

- Transformations as Functions
- Coordinate Systems as Matrices
- Linear Algebra Review
- Transformations as Linear Algebra
- Homogeneous Coordinates

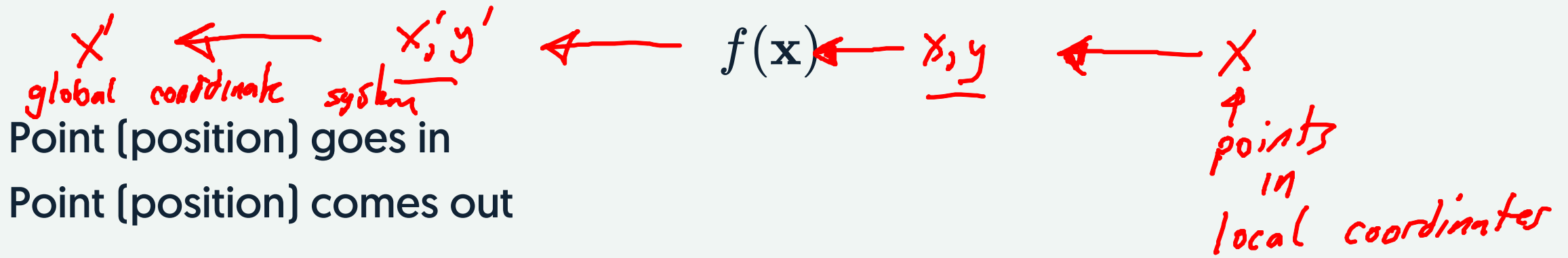
# After Today

- Transformation Math
- Curves
- 3D

# What does a transformation do to points?

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Transformations are functions that apply to points



Point (position) goes in

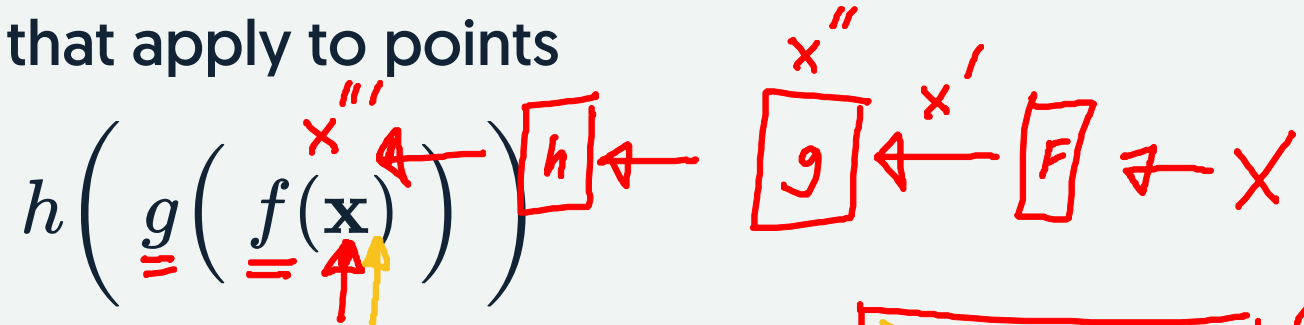
Point (position) comes out

Changes coordinate systems:

- going in (local, original coordinates)
- going out (less-local, new coordinates)

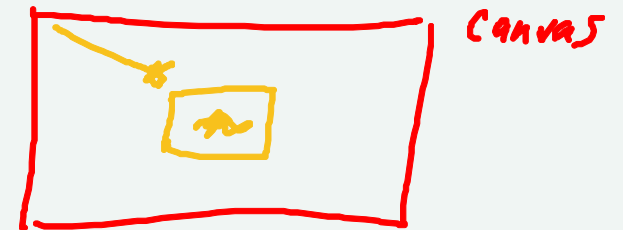
# What do transformations do to points?

Transformations are functions that apply to points



We can combine the functions (composition):

$$(h \circ g \circ f)(x)$$



This says what happens to points

What happens to coordinate systems?

# What is a Coordinate System?

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Three things:

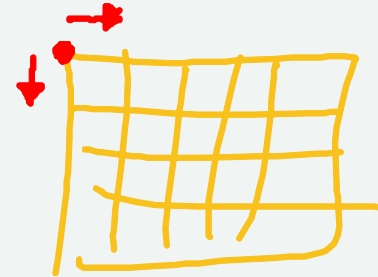
7,10

origin  


1. origin (where is 0,0)
2. x "step"
3. y "step"

A piece of "graph paper" that tells us how to interpret coordinates.

The axes do not have to be orthogonal.



# Linear combinations

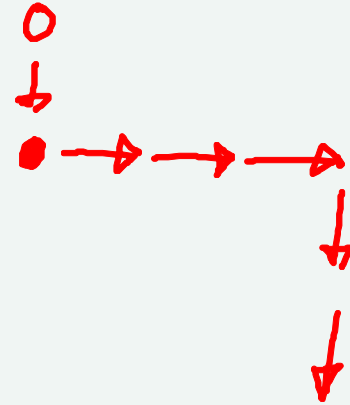
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Combine:

3, 2

- origin
- x steps
- y steps

Interpeted in the "current coordinate system"



# Can store these in a Matrix

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What is an x step

What is a y step

Where does the origin go (gets added no matter what)



# Math you need to know...

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Linear algebra in a few minutes  
(not really)

Just the parts we'll use

Quickly today... practice later

**Why?**

**Transformations are conveniently expressed as matrices**

# Vectors and Points (and Tuples)

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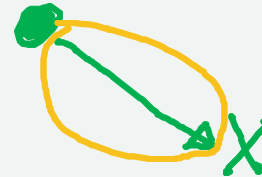
Both are "arrays"



A **Point** is a place

A **Vector** is a movement

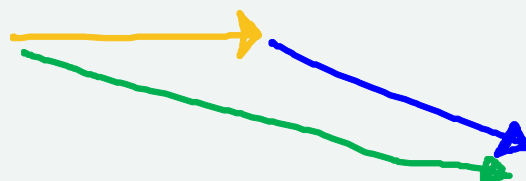
A **Tuple** is a list (of numbers)



A point is the interpretation of a vector in a coordinate system

# Vectors (and points)

- addition
- multiply by scalar
- linear combination
- norms / magnitude
- dot product  $\leftrightarrow$
- row vectors vs. column vectors

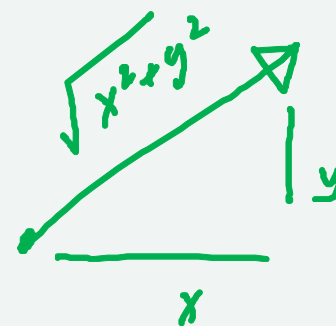


$$s_1 V_1 + s_2 V_2 + s_3 V_3$$



$$(x_1, y_1) \quad (x_2, y_2)$$

$$x_1 x_2 + y_1 y_2$$



# Row Vectors vs. Column Vectors

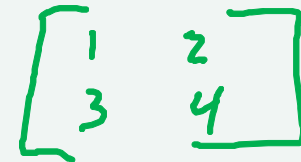
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$$[1 \quad 2 \quad 3 \quad 4]$$

$$\begin{bmatrix} 1 \\ 2 \\ 3 \\ 4 \end{bmatrix}$$

They are matrices of different shapes

They have the same content (4 numbers)

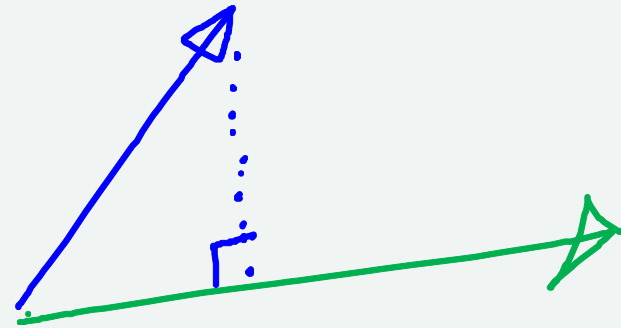

$$\left[ \begin{array}{c} 1 \\ 3 \end{array} \right] \quad \left[ \begin{array}{c} 2 \\ 4 \end{array} \right]$$

# more vector stuff

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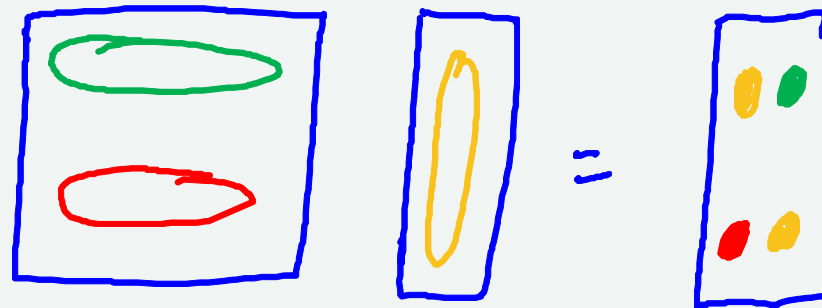
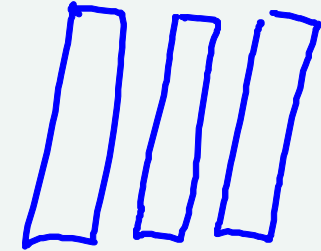
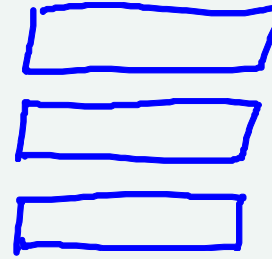
- vector spaces
- projection
- and some things for 3D (and higher)
  - cross product

$$s_1 V_1 + s_2 V_2 = V$$

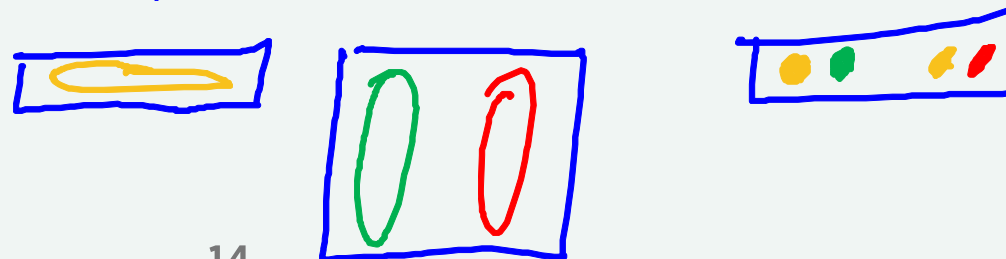
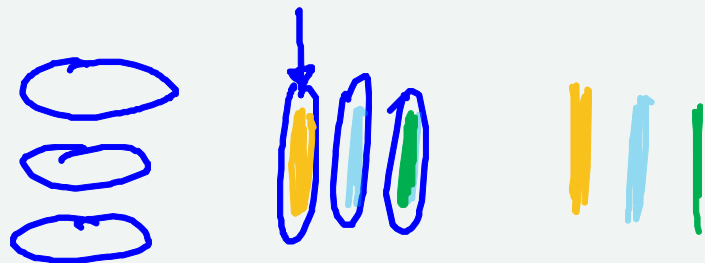


# Matrices

- matrix as a set of row vectors
- matrix as a set of column vectors
- matrix \* vector
  - right multiply
  - left multiply
- matrix \* matrix



$M \cdot v$



# Matrix Transpose

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Rows become columns (or columns become rows)

$$[1 \quad 2 \quad 3]^T \longrightarrow \begin{array}{|c|} \hline \\ \hline \end{array}$$

$$\begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix}^T \longrightarrow \begin{array}{|c|} \hline a \\ \hline b \\ \hline c \\ \hline \end{array}$$

# (right) Multiply Matrix by Vector

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$$\begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \circ \begin{bmatrix} x \\ y \\ z \end{bmatrix} = \begin{bmatrix} ax + by + cz \\ dx + ey + fz \end{bmatrix}$$



# (left) Multiply Matrix by Vector

---

$$\begin{bmatrix} x & y & z \end{bmatrix} \circ \begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \begin{bmatrix} xa + dy + gz & bx + ey + hz \end{bmatrix}$$

# Matrix multiply

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$$\begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \circ \begin{bmatrix} 1 & 2 & 3 \\ 4 & 5 & 6 \\ 7 & 8 & 9 \end{bmatrix}$$

# Matrix Properties

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- orthogonality ←
- orthonormality
- determinants
- inverses →
- full-rank vs. rank-deficient



vector orthogonal  
dot = 0

$$M \cdot M^{-1}$$

# What does this have to do with Transformations?

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1. Coordinate systems are matrices

- so changes in systems are matrices as well

2. The most important transformations are linear operations

- so focus on them

# Linear Transformations

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Linear combinations of the inputs

$$\begin{aligned} \underline{x'} &= a\underline{x} + b\underline{y} \\ \underline{y'} &= c\underline{x} + d\underline{y} \end{aligned}$$

*constant*  
↓

# Why do we care?

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- Most of what we did has this form
  - rotate, scale, skew - and combinations
- Good for analysis
- Easy to implement
- Guaranteed properties (more later)
- Allows us to use matrices

# Change in notation

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$$x' = ax + by$$

$$y' = cx + dy$$

rewrite as...

$$\begin{bmatrix} x' \\ y' \end{bmatrix} = \begin{bmatrix} a & b \\ c & d \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$



# Matrix Notation

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$$\underline{\mathbf{x}'} = \mathbf{A} \underline{\mathbf{x}}$$

Right multiply convention

Vectors  $\underline{\mathbf{x}} = [x, y]^T$  and  $\underline{\mathbf{x}'} = [x', y']^T$

$$\text{Matrix } \mathbf{A} = \begin{bmatrix} a & b \\ c & d \end{bmatrix}$$





# Warning: Right Multiply

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Many old books prefer left multiply

Some APIs are left multiply

Most (modern) descriptions prefer right multiply

# Transformation as a Linear Operator

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$$\mathbf{x}' = f(\mathbf{x})$$

$$\mathbf{x}' = \mathbf{F}\mathbf{x}$$

# Composition

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$$\mathbf{x}' = h(\underbrace{g(\underbrace{f(\mathbf{x}))}_{\text{yellow}}})_{\text{red}}$$

$$\mathbf{x}' = (h \circ g \circ f)(\mathbf{x})$$

# Composition is Matrix Multiply

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$$\mathbf{x}' = h(g(f(\mathbf{x})))$$

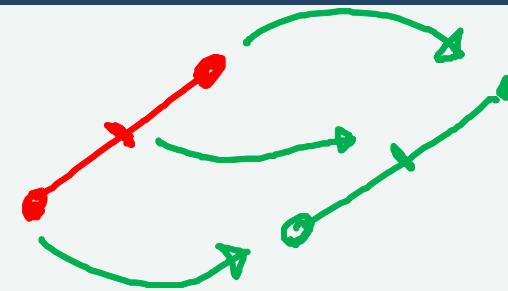
$$\mathbf{x}' = \mathbf{H} \mathbf{G} \mathbf{F} \mathbf{x}$$


$$\mathbf{x}' = (\mathbf{H} \mathbf{G} \mathbf{F}) \mathbf{x}$$

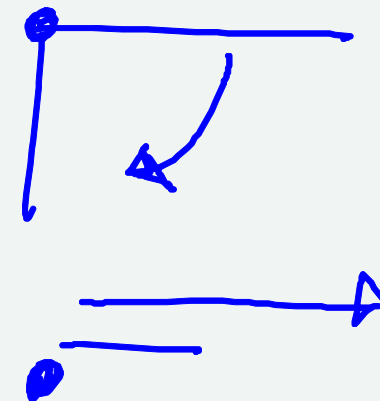
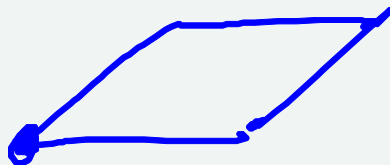
# Properties of Linear Transformations

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- Composition by Matrix Multiply
- Lines remain lines
- Ratios are preserved
- Set is closed under composition



- Zero is preserved



# What about Translation?

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Translation in 2D is not a linear operation in 2D

$$x \neq t_x \quad y \neq t_y$$

But, translation is important!

# Affine Transformations

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Linear transformation plus a translation

Change of center

$$x' = a x + b y + t_x$$

$$y' = c x + d y + t_y$$

or

$$\mathbf{x}' = \underbrace{\mathbf{A} \mathbf{x}} + \mathbf{t}$$

# Affine transformations

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How do we compose them?

$$\rightarrow f(\mathbf{x}) = \mathbf{F}\mathbf{x} + \mathbf{t}$$

$$\rightarrow g(\mathbf{x}) = \mathbf{G}\mathbf{x} + \mathbf{u}$$

$$g(f(\mathbf{x})) = g(\mathbf{F}\mathbf{x} + \mathbf{t}) = \mathbf{G}\mathbf{F}\mathbf{x} + \mathbf{G}\mathbf{t} + \mathbf{u}$$



# Encoding Transforms in Matrices

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Affine transforms (in nD) are not linear (in nD)

So work in higher dimensions...

Affine transforms (in nD) are linear (in n+1 D) in homogeneous coordinates

# 1D Example

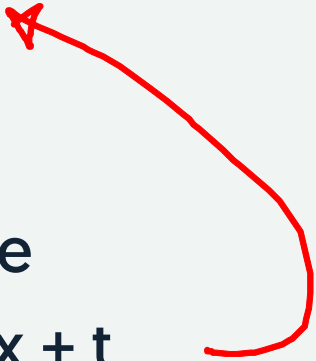
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1D Linear

$$f = \underline{s} x$$

1D Affine

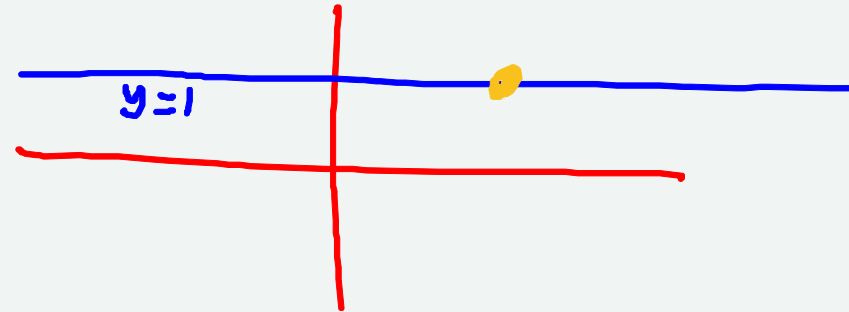
$$f(x) = \underbrace{s x + t}$$



# Place the 1D space in 2D

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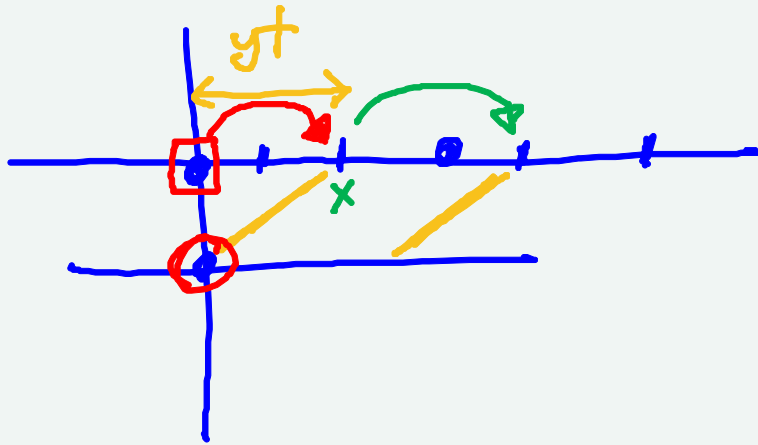
let the "1D space" be  $y=1$



Our 1D "points"  $x$  are now  $[x,1]$  in 2D

# Translation in 1D is Shear in 2D

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$$x' = x + t$$
$$\begin{bmatrix} x' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & t \\ 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ 1 \end{bmatrix} = \begin{bmatrix} x + t \\ 1 \end{bmatrix}$$

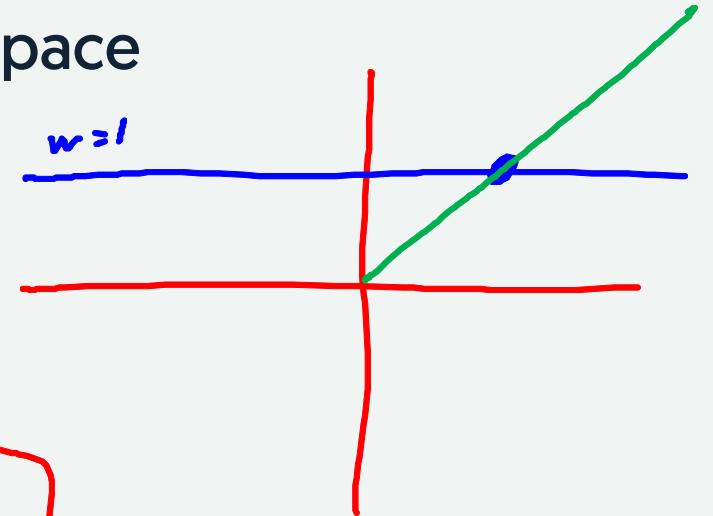
The diagram shows the matrix equation for a shear transformation. The matrix  $\begin{bmatrix} 1 & t \\ 0 & 1 \end{bmatrix}$  is underlined in green. The vector  $\begin{bmatrix} x \\ 1 \end{bmatrix}$  has the '1' circled in red, with a green arrow pointing to it from below. The resulting vector  $\begin{bmatrix} x + t \\ 1 \end{bmatrix}$  is drawn in red.

# Homogeneous Coordinates

Embed an  $n$  dimensional space in an  $n+1$  dimensional space

We call the extra dimension  $w$

$x$   
 $y$   
 $1$



Project back to the original space

Divide by  $w$

$$\begin{bmatrix} x \\ y \\ w \end{bmatrix}$$



$$\begin{bmatrix} x/w \\ y/w \\ 1 \end{bmatrix}$$



# What does this matrix do (1)

---

$$\begin{matrix} x \\ y \end{matrix} \begin{bmatrix} 1 & 0 & 1 \\ 0 & 1 & 1 \\ 0 & 0 & 1 \end{bmatrix} \begin{matrix} x \\ y \\ 1 \end{matrix} = \begin{matrix} x+1 \\ y+1 \\ 1 \end{matrix} \Rightarrow \begin{matrix} x+1 \\ y+1 \end{matrix}$$

The image shows a handwritten derivation of a linear transformation. On the left, a column vector  $\begin{pmatrix} x \\ y \end{pmatrix}$  is multiplied by a 3x3 matrix  $\begin{bmatrix} 1 & 0 & 1 \\ 0 & 1 & 1 \\ 0 & 0 & 1 \end{bmatrix}$ . The matrix is annotated with blue handwritten labels:  $+x$  above the top-right element (1) and  $+y$  to the left of the middle-right element (1). A blue oval encircles the rightmost column of the matrix. This matrix multiplication is equated to a column vector  $\begin{pmatrix} x+1 \\ y+1 \\ 1 \end{pmatrix}$ . A green arrow points from this vector to the final result, a column vector  $\begin{pmatrix} x+1 \\ y+1 \end{pmatrix}$ .

# What does this matrix do (2)

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x  
y

$$\begin{bmatrix} 2 & 0 & 0 \\ 0 & 2 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

Scale

$$\begin{matrix} x \\ y \\ 1 \end{matrix} = \begin{matrix} 2x \\ 2y \\ 1 \end{matrix} = \begin{matrix} 2x \\ 2y \end{matrix}$$

# What does this matrix do (3)

---

x  
y

$$\begin{bmatrix} 2 & 0 & 1 \\ 0 & 2 & 1 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

$$\begin{matrix} 2x+1 & 2x+1 \\ 2y+1 & = & 2y+1 \\ 1 & & \end{matrix}$$





**Is the bottom row always  $[0,0,1]$ ?**

---

**Is  $w$  always 1?**

# Is the bottom row always [0,0,1]?

---

If we limit ourselves to affine, we don't *need* anything else

$$\text{canvasMatrix} = \begin{bmatrix} a & c & e \\ b & d & f \\ 0 & 0 & 1 \end{bmatrix}$$

Note the order

# What does this matrix do? (4)

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x  
y

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 2 \end{bmatrix}$$

$$\begin{bmatrix} x \\ y \\ z \end{bmatrix} = \begin{bmatrix} x \\ y \\ 2z \end{bmatrix} = \begin{bmatrix} x/2 \\ y/2 \\ z \end{bmatrix}$$

↑  
Scale by 1/2

# What does this matrix do? (5)

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$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 1 & 1 \end{bmatrix} \begin{pmatrix} x \\ y \\ 1 \end{pmatrix} = \begin{pmatrix} x \\ y \\ y+1 \end{pmatrix} = \begin{pmatrix} \frac{x}{y+1} \\ \frac{y}{y+1} \end{pmatrix}$$

# Better in the book...

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The actual matrices for your favorite transformations

# Non-Affine Transformations

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## Projective Transformations

Useful in 2D (for computer vision)

Useful in 3D (just wait)

Focus on affine for now

# Matrices and Coordinate Systems

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Three Columns: where does the...

- (local) X axis go
- (local) y axis go
- (local) origin go



$$\begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \begin{matrix} x \\ y \\ 1 \end{matrix}$$

*(Note: In the original image, the columns are circled in red, green, and yellow respectively, and the origin row 'g h i' is crossed out with a blue line. Below the matrix, there are blue circles under 'g', 'h', and 'i'.)*

Matrices move from one coordinate system to another

Works in either direction

# Implementation in APIs

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- Base, window, device ... coordinates
  - Canvas Coordinates
- Current coordinate system *— Start w/ I*
  - Matrix (map to "Base")
- Transformation commands multiply transform (on the right)
- Save = copy the current matrix (push onto stack)
- Restore = return to previous matrix (pop off of stack)