

Lecture 7: Transformations Math

Review of Last Time

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

APIs **hide** the math

APIs **expose** mis-understanding

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?

Transformations are functions that apply to points

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

Point (position x) goes in

Point (position x') comes out

Changes coordinate systems:

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

What do transformations do to points?

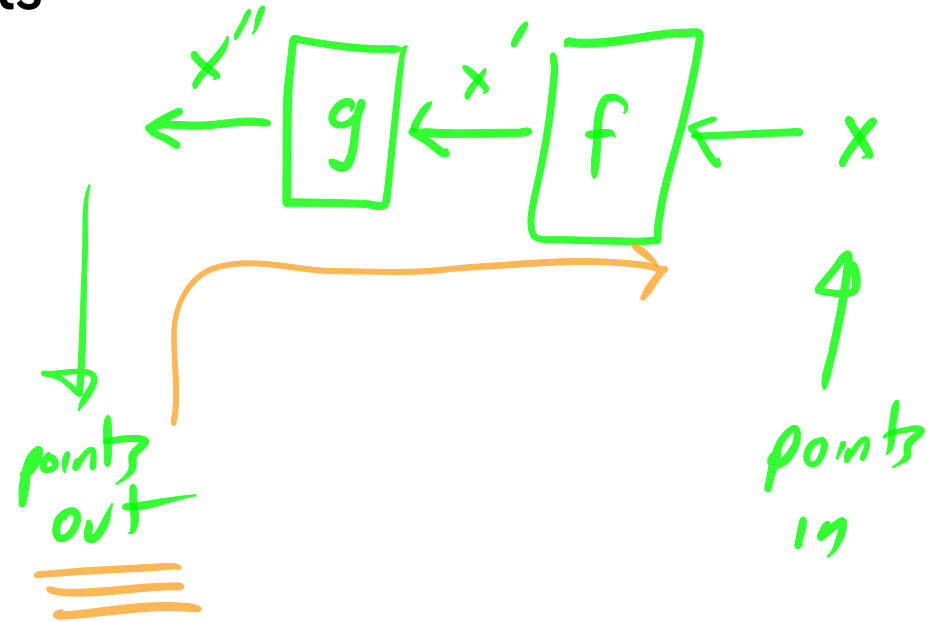
Transformations are functions that apply to points

$$h\left(g\left(f(\mathbf{x})\right)\right)$$

gliba

We can combine the functions (composition):

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



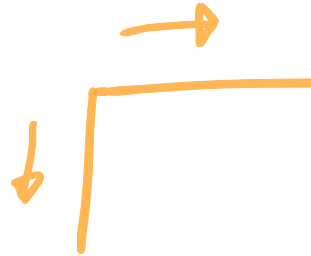
This says what happens to points

What happens to coordinate systems?

What is a Coordinate System?

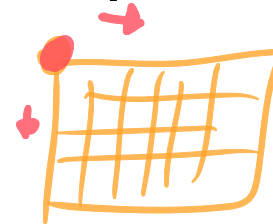
Three things:

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



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

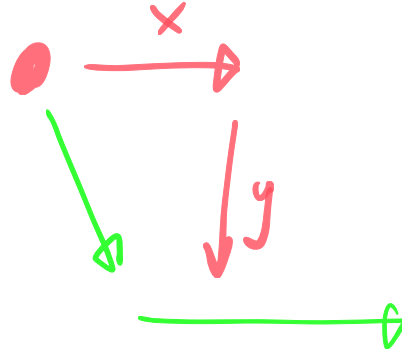
The axes do not have to be orthogonal.



Linear combinations

Combine:

- origin
- x steps
- y steps



Interpreted in the "current coordinate system"

Can store these in a Matrix

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...

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)

Both are "arrays"

$[1 \ 2 \ 3]$
└──┬──┘
3 Tuple

A Point is a place

A Vector is a movement

A Tuple is a fixed-sized list

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

A tuple/array is the data structure we use to store them

Vectors Operations You Should Know

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

$$[a, b] + [c, d]$$

$$s [a, b]$$

$$s \underline{x} + t \underline{y}$$

$$[a, b] \bullet [c, d]$$

$$ac + bd$$

Note: only some of these make sense for points

Row Vectors vs. Column Vectors

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

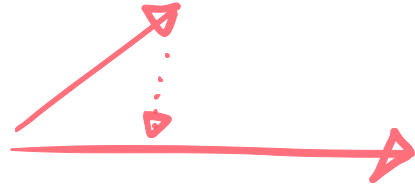
$$\begin{bmatrix} 1 \\ 2 \\ 3 \\ 4 \end{bmatrix}$$

They are **matrices** of different shapes

They have the same content (4 numbers)

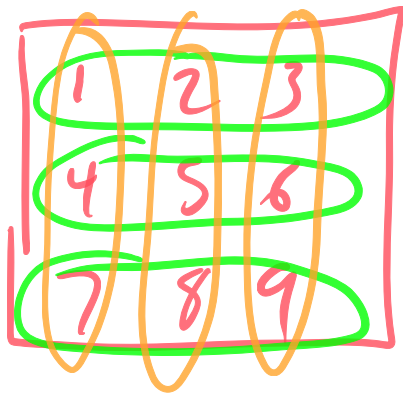
more vector stuff

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



Matrices

- matrix as a 2D array of numbers
- matrix as a set of row vectors
- matrix as a set of column vectors
- matrix * vector



Matrix Transpose

Rows become columns (or columns become rows)

$$\begin{bmatrix} 1 & 2 & 3 \end{bmatrix}^T = \begin{bmatrix} 1 \\ 2 \\ 3 \end{bmatrix}$$

$$\begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix}^T = \begin{bmatrix} a & d & g \\ b & e & h \\ c & f & i \end{bmatrix}$$

(right) Multiply Matrix by Vector

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

(left) Multiply Matrix by Vector

$$\begin{bmatrix} x & y & z \end{bmatrix} \circ \begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \left[\begin{array}{l} \text{row} \\ a x + d y + g z \end{array} \right]$$

The image shows a handwritten diagram illustrating the dot product of a row vector and a column vector. The row vector $[x \ y \ z]$ is circled in orange. The column vector $\begin{bmatrix} a \\ d \\ g \end{bmatrix}$ has its elements a , d , and g circled in green. The resulting scalar value is shown as $a x + d y + g z$ inside large square brackets. Above the term $a x$ are two wavy lines, one green and one orange. Below the expression are two upward-pointing arrows, one under $a x$ and one under $d y + g z$, indicating the contribution of each part to the sum.

Matrix multiply

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

A

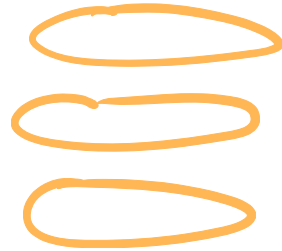
B

$$AB \neq BA$$

$$(A B) C = A (B C)$$

Matrix Properties

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



$$\text{Identity} = I$$



What does this have to do with Transformations?

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

Linear combinations of the inputs

$$\begin{aligned} x' &= \underline{ax} + \underline{by} \\ y' &= \underline{cx} + \underline{dy} \end{aligned}$$

Why do we care?

- 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

Scalar Notation

$$\begin{aligned}x' &= ax + by \\y' &= cx + dy\end{aligned}$$

rewrite as...

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

Matrix Notation

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

Right multiply convention

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

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

Warning: Right Multiply

Many old books prefer left multiply

Some APIs are left multiply

Most (modern) descriptions prefer right multiply

Transformation as a Linear Operator

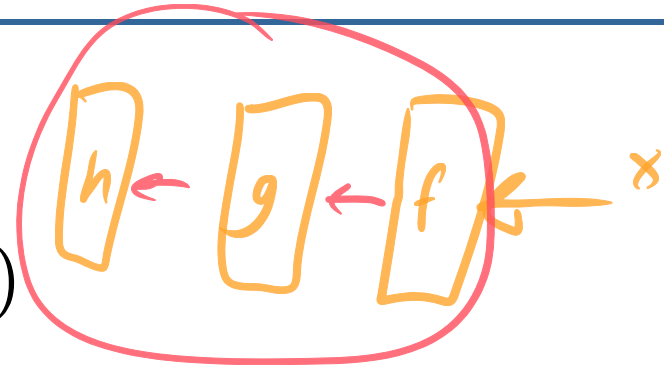
$$\mathbf{x}' = \underline{f}(\mathbf{x})$$

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

Composition

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


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



Composition is Matrix Multiply

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

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

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


Properties of Linear Transformations

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

- Zero is preserved

Fx
 \uparrow
 0



What about Translation?

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

But, translation is important!

Affine Transformations

Linear transformation plus a translation

Change of center

$$x' = a x + b y + \underline{t_x}$$

$$y' = c x + d y + \underline{t_y}$$

or

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

Affine transformations

How do we compose them?

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

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

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

↑ ↑

Encoding Transforms in Matrices

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

↑
2D

2D

So work in higher dimensions...



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

2D

3D

3D

4D



1D Example

1D Linear

$$f = s x$$

1D Affine

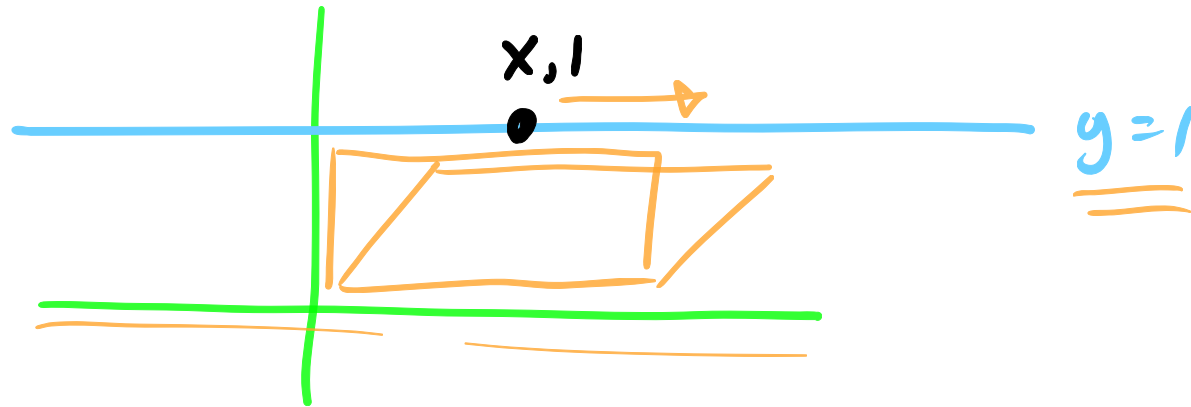
$$f(x) = s x + t$$



Place the 1D space in 2D

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

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



Translation in 1D is Shear in 2D

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

Homogeneous Coordinates

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

We call the extra dimension w

Project back to the original space

Divide by w

What does this matrix do (1)

x'
 y'
 w'

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

$$\begin{bmatrix} x & +1 \\ y & +1 \\ 1 \end{bmatrix} \rightarrow \begin{matrix} x' \\ z' \\ w' \\ z' \end{matrix}$$

What does this matrix do (2)

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

linear *trans*

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

What does this matrix do (3)

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

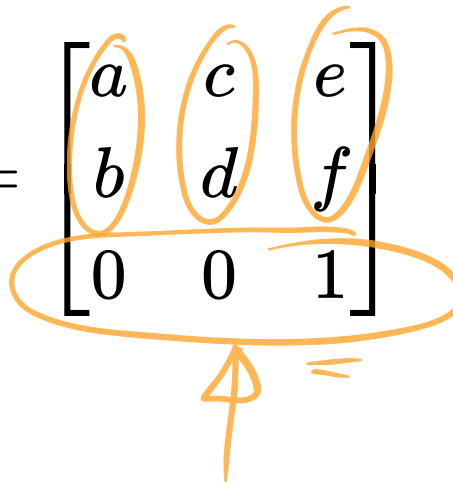
$$\begin{matrix} 2x + 1 \\ 2y + 1 \\ 1 \end{matrix}$$

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)

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

$$\begin{matrix} x \\ y \\ z \end{matrix} \Rightarrow \begin{matrix} x \\ 2y \\ 2z \end{matrix}$$

What does this matrix do? (5)

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

$$\begin{matrix} x \\ y \\ y+1 \end{matrix} \Rightarrow \begin{matrix} \frac{x}{y+1} \\ y \\ y+1 \end{matrix}$$

Better in the book...

The actual matrices for your favorite transformations

Non-Affine Transformations

Projective Transformations

Useful in 2D (for computer vision)

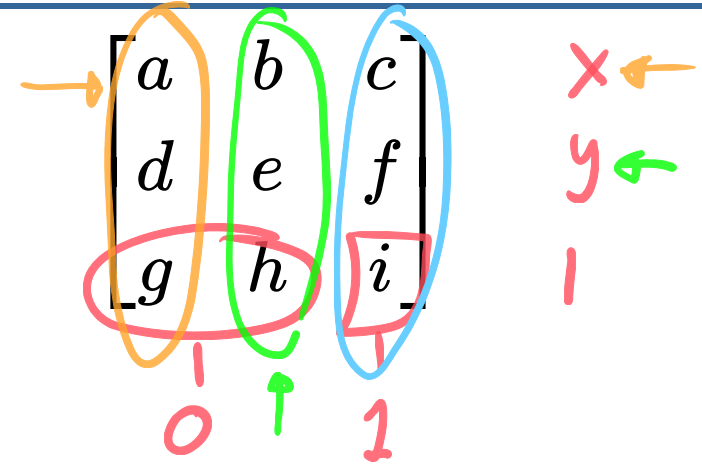
Useful in 3D (just wait)

Focus on affine for now

Matrices and Coordinate Systems

Three Columns: where does the...

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



Matrices move from one coordinate system to another

Works in either direction



Implementation in APIs

- Base, window, device ... coordinates
 - Canvas Coordinates
- Current coordinate system
 - 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)

Using a Matrix (without seeing it)

Canvas Coordinates

Transform

Object Coordinates



current

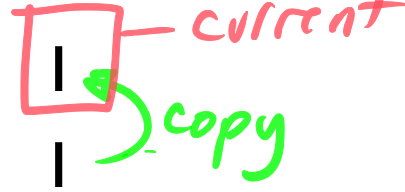
```
context.moveTo(x, y);  
(etc)
```


Using a Matrix (without seeing it)

Canvas Coordinates



Transform

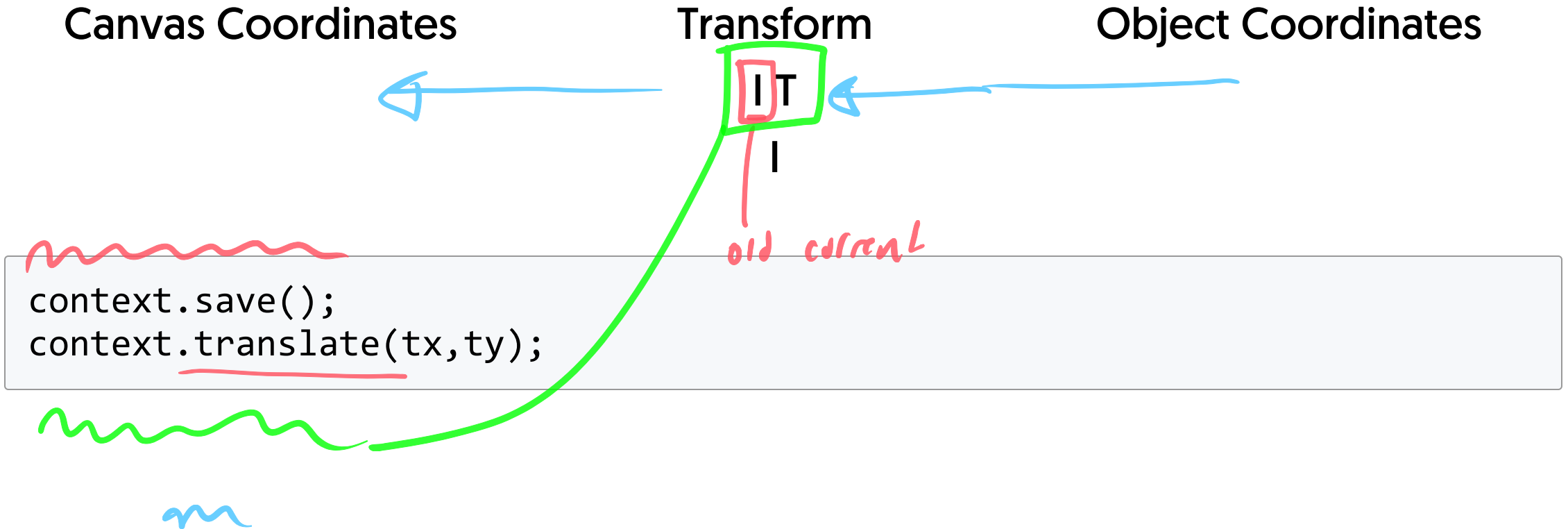


Object Coordinates



```
context.save();
```

Using a Matrix (without seeing it)

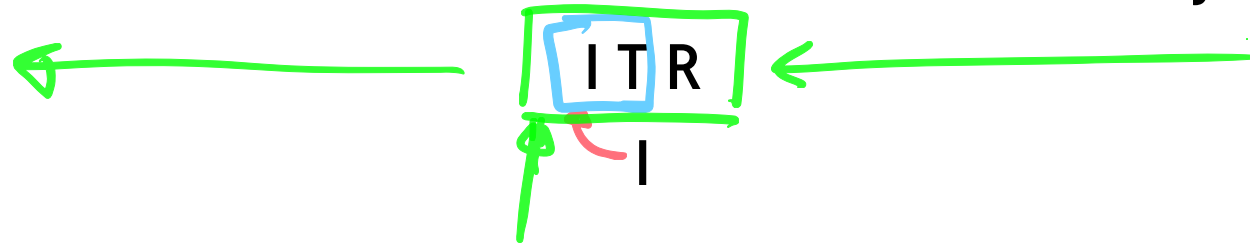


Using a Matrix (without seeing it)

Canvas Coordinates

Transform

Object Coordinates



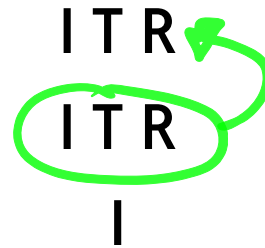
```
context.save();  
context.translate(tx, ty);  
context.rotate(a); ←  
context.moveTo(x, y);  
                    
```

Using a Matrix (without seeing it)

Canvas Coordinates

Transform

Object Coordinates



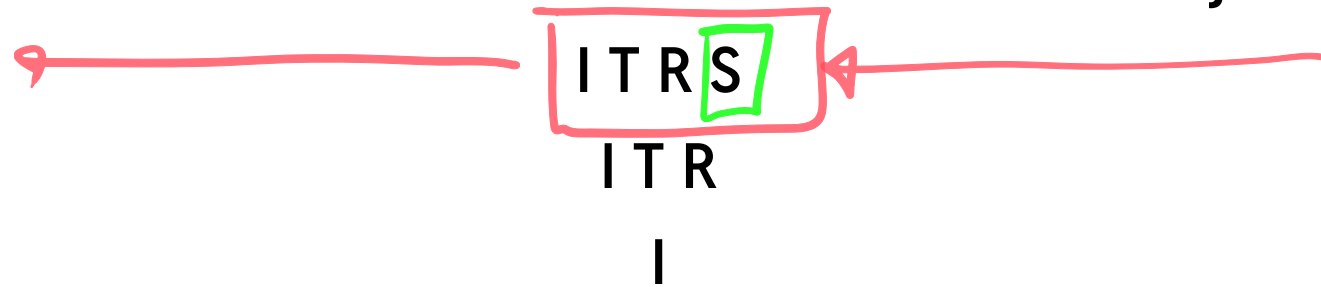
```
context.save();  
context.translate(tx, ty);  
context.rotate(a);  
context.save();
```

Using a Matrix (without seeing it)

Canvas Coordinates

Transform

Object Coordinates



```
context.save();  
context.translate(tx,ty);  
context.rotate(a);  
context.save();  
context.scale(s,s);  
context.moveTo(x,y); DRAW...
```

Using a Matrix (without seeing it)

Canvas Coordinates

~~ITR~~
Transform

Object Coordinates

I T R

I

```
context.save();  
context.translate(tx,ty);  
context.rotate(a);  
context.save();  
context.scale(s,s);  
context.moveTo(x,y); DRAW...  
context.restore(); ←
```

Using a Matrix (without seeing it)

Canvas Coordinates

Transform

Object Coordinates

$$\begin{matrix} | \\ \left(\left(\begin{matrix} I & T_x \end{matrix} \right) T_y \right) \leftarrow pt \end{matrix}$$

```
context.save();
context.translate(tx, ty);
context.rotate(a);
context.save();
context.scale(s, s);
context.moveTo(x, y); DRAW...
context.restore();
context.restore();
```

- ① save
- ② translate (tx, 0)
- ③ translate (0, ty)
- ④ draw
- restore

Summary

- Math Review (hopefully a review)
- Linear Transformations
- Affine Transformations
- Homogeneous Coordinates
- Where the matrices hide