

introduction to

# kinect

NUI, artificial intelligence  
applications and programming



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# WHO I AM...

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Lots of words...

**Ambient Intelligence**

**Smart device**

**Augmented reality**

**Pervasive Computing**

**Human-centered computing**

**Ubiquitous computing**

**Internet of Things**

**Physical Computing**

# ... One concept

No more desktop-centered computation, but **distributed computation**("ubiquitous")

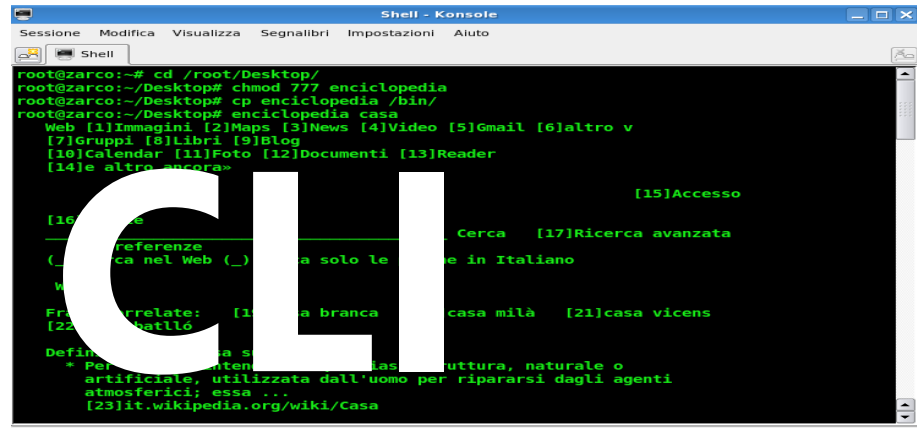
Objects become more "intelligent" and "smart"

New information's model

New possibility of interaction with information

Machines fit the human environment instead of forcing humans to enter theirs

# Interface Evolution



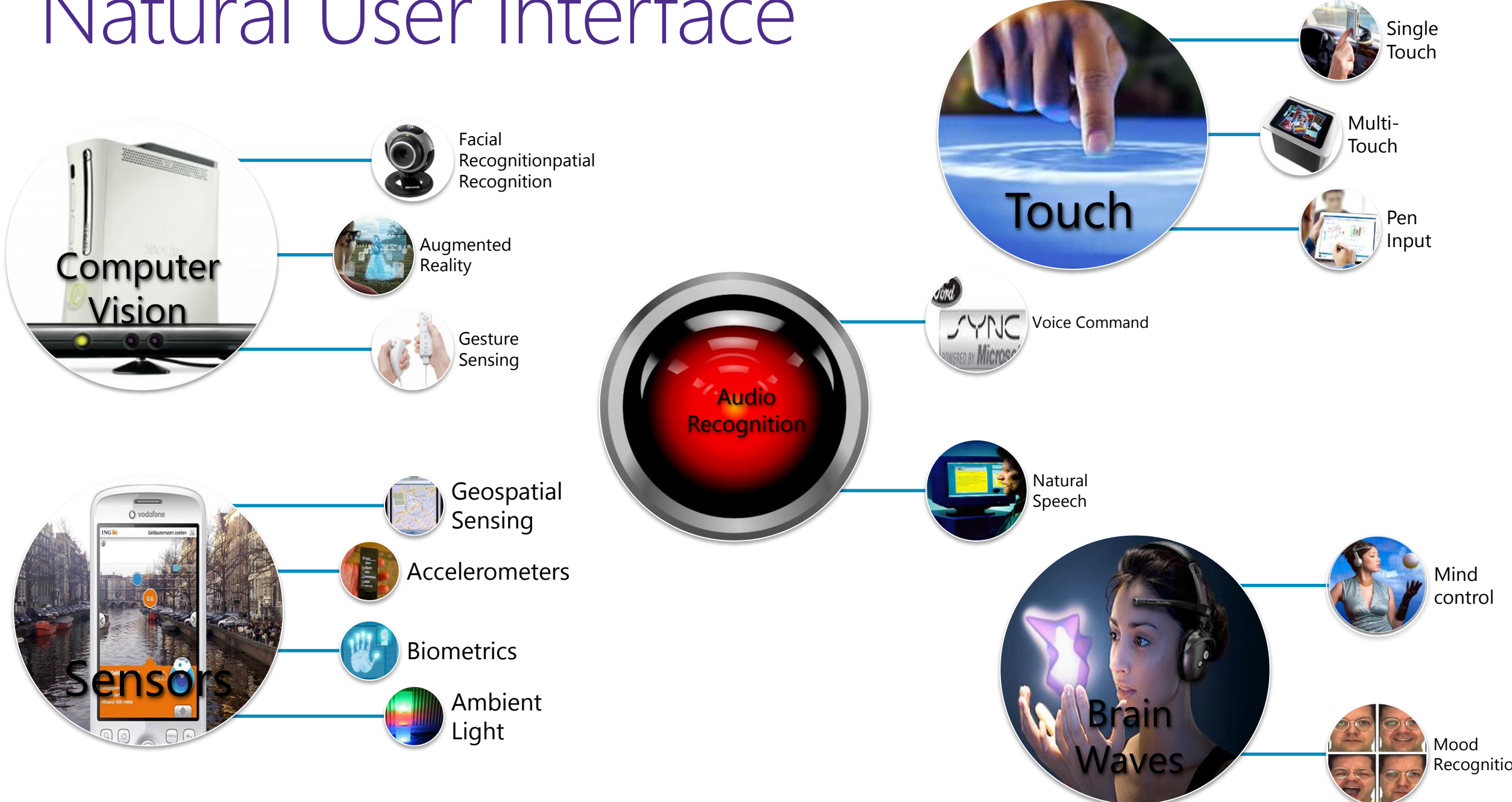
Command Line  
Interface



Graphical User  
Interface



# Natural User Interface



# Kinect

It is a motion sensing input device by Microsoft for the Xbox 360 console (codename Project Natal).

It enables users to control and interact with the Xbox without the need to touch a game controller, through a natural user interface using gestures and spoken commands.

Launched in November 2010, sold 8 million units in 60 days





# Kinect's magic

Immersive user experience



=



*"Any sufficiently advanced technology is indistinguishable from magic"*  
(Arthur C. Clarke)

# Power Comes from the Sum

Any single technology on its own  
can create good experiences

**The sum:**  
**This is where the magic is**

Tons of opportunities ahead



# Application fields

Videogames

Natural User Interface

Augmented Reality

Medicina e Riabilitazione

Speech & Sign Language recognition

Learning support (also for impaired people)

Real-time conference & collaboration

3D scan & artwork

...

Video and examples available at:

<http://www.microsoft.com/en-us/kinectforwindows/discover/gallery.aspx>

# Videos

<http://www.xbox.com/en-US/Kinect/Kinect-Effect> (rehabilitation)

<http://www.youtube.com/watch?v=id7OZAbFaVI&feature=related> (Medical use)

<http://www.kinecthacks.com/kinect-interactive-hopscotch/> (game for children)

<http://www.youtube.com/watch?v=9xMSGmjOZlg&feature=related> (Holographic projection)

<http://www.youtube.com/watch?v=1dnMsmajogA&feature=related> (Kinect Glasses-less 3D)

<http://www.youtube.com/watch?v=s0Fn6PyfJ0I&feature=related> (Kinect Virtual Fashion, the Future of Shopping at Home)

<http://www.youtube.com/watch?v=4V11V9Pegpc&feature=related> (Kinect Projection mapping with box2D physics)

# Videos (2)

<http://www.youtube.com/watch?v=oALluVb0NJ4> (Multidevice computing)

<http://www.youtube.com/watch?v=-yxRTn3fj1g&feature=related> (Kinect Touch wall )

<http://www.youtube.com/watch?v=KBHgRcMPaYI&feature=related> (Kinect window Bank of Moscow)

<http://kinecthacks.net/motion-control-banking-is-so-easy-even-your-pet-can-do-it/> (Kinect Banking App Video)

<http://www.youtube.com/watch?v=FMClO0KNjrs> (Art)

<http://www.youtube.com/watch?v=g6N9Qid8Tqs&feature=related> (Interactive LED Floor)

<http://www.youtube.com/watch?v=c6jZjpvlio4> (Kinect in Education)

[http://www.youtube.com/watch?v=\\_qvMHAvu-yc&feature=related](http://www.youtube.com/watch?v=_qvMHAvu-yc&feature=related) (explore universe)

introduction to

# kinect

Hardware and sensors



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## Hardware:

Depth resolution:

640x480 px

RGB resolution:

1600x1200 px

FrameRate:

60 FPS

## Software

Depth

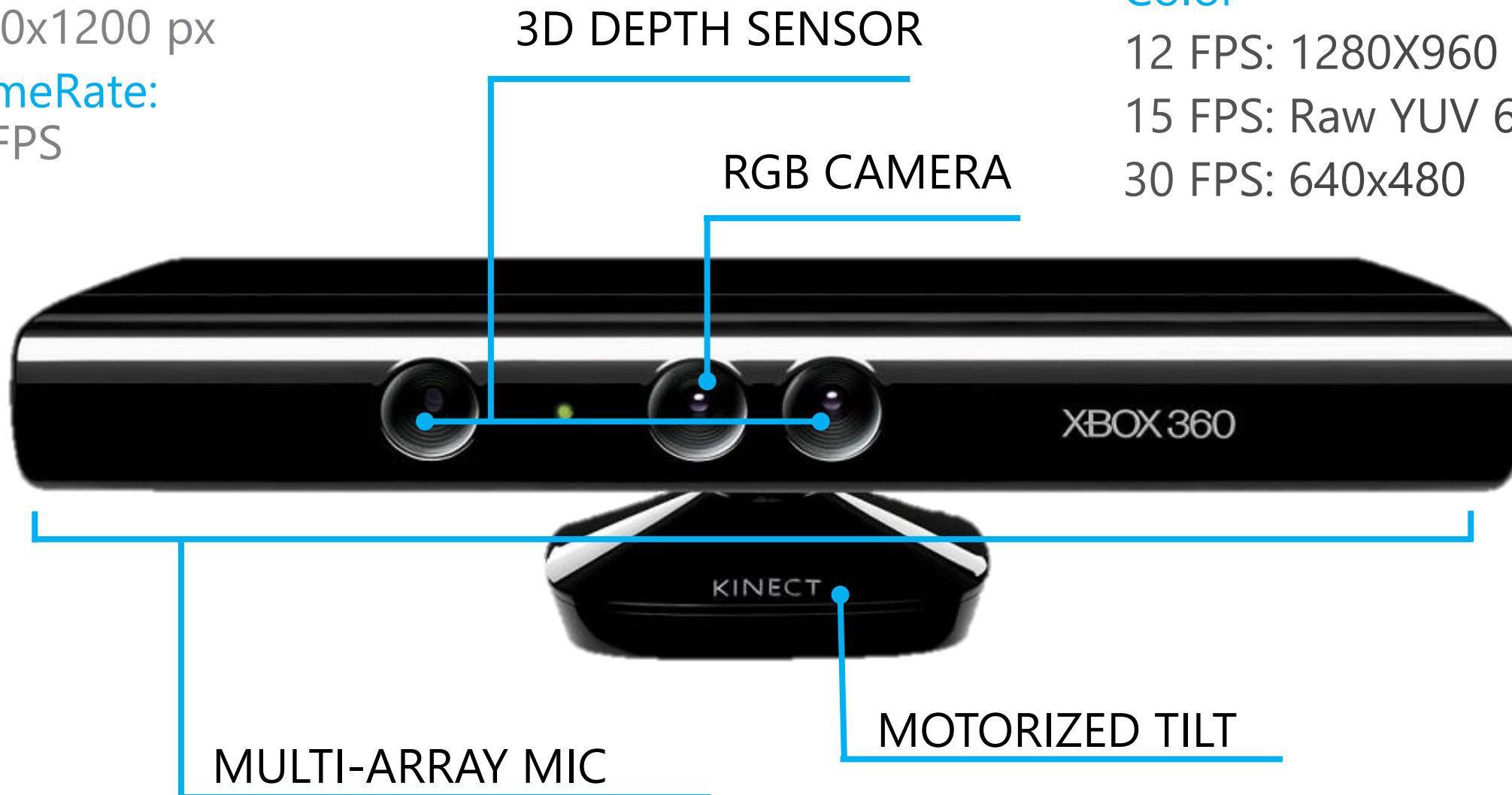
30 FPS: 80x60, 320x240, 640x480

Color

12 FPS: 1280X960 RGB

15 FPS: Raw YUV 640x480

30 FPS: 640x480



# Kinect Sensors



<http://www.ifixit.com/Teardown/Microsoft-Kinect-Teardown/4066/1>



# Kinect Sensors

Color Sensor

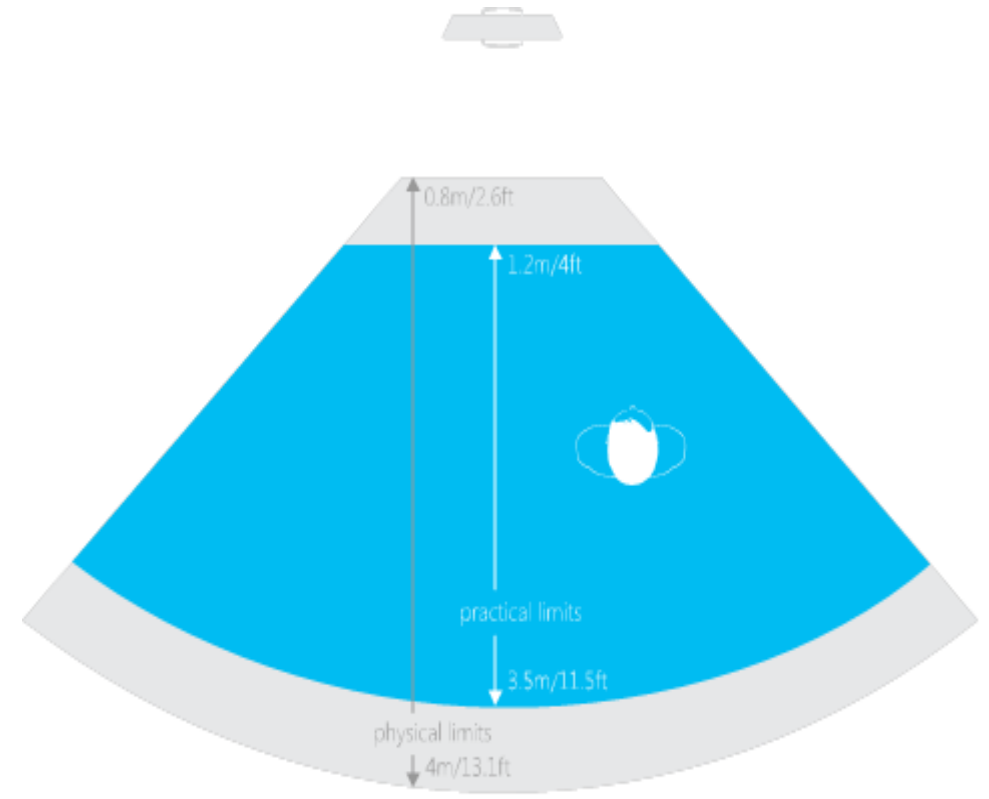
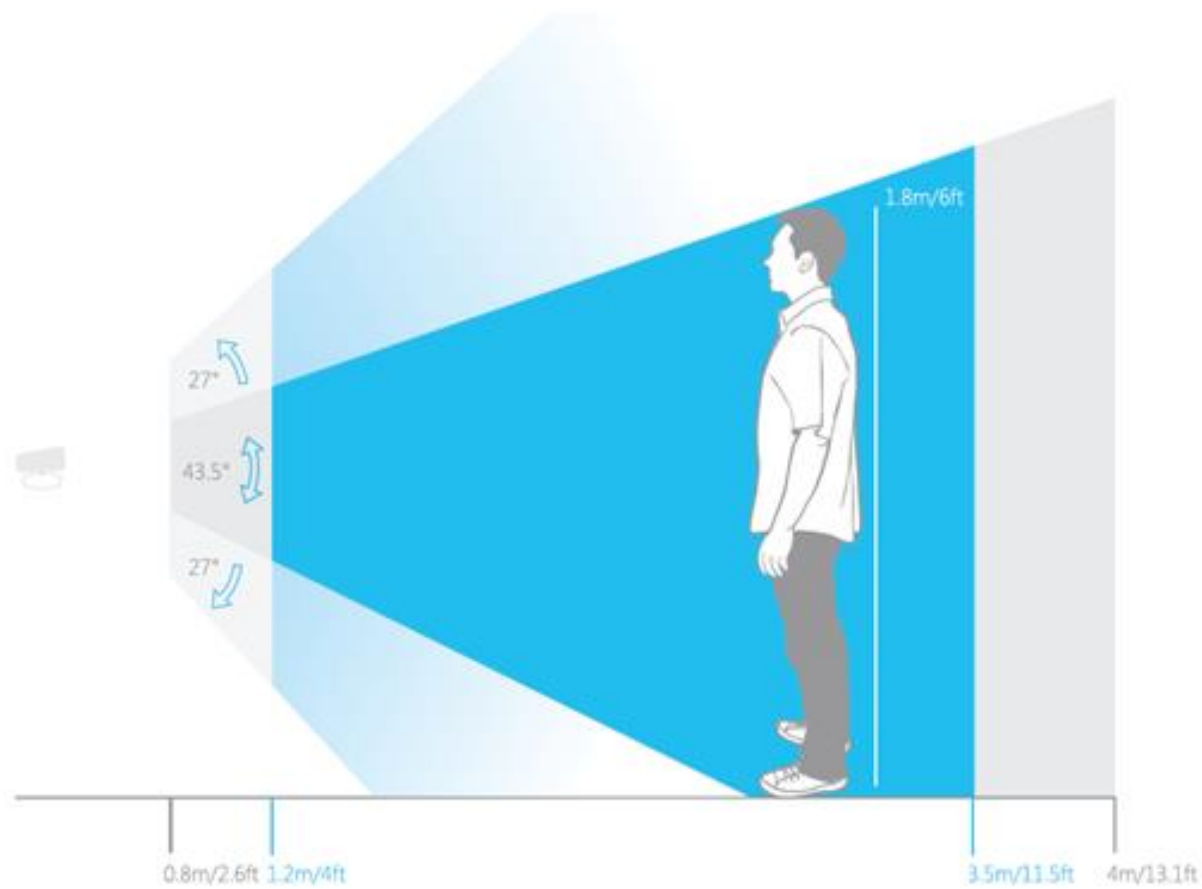
IR Depth Sensor

IR Emitter



# Field of View

43° vertical by 57° horizontal field of view

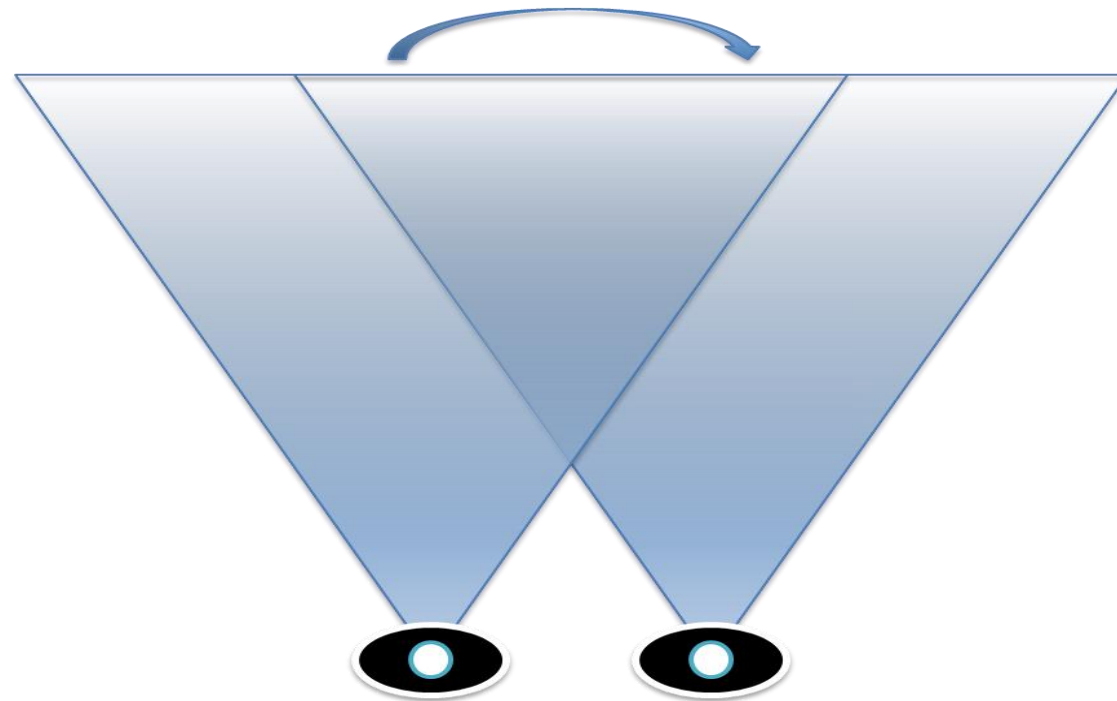


# How does it work?

introduction to kinect

# Depth Sensing

Object pattern similarity  
determines disparity

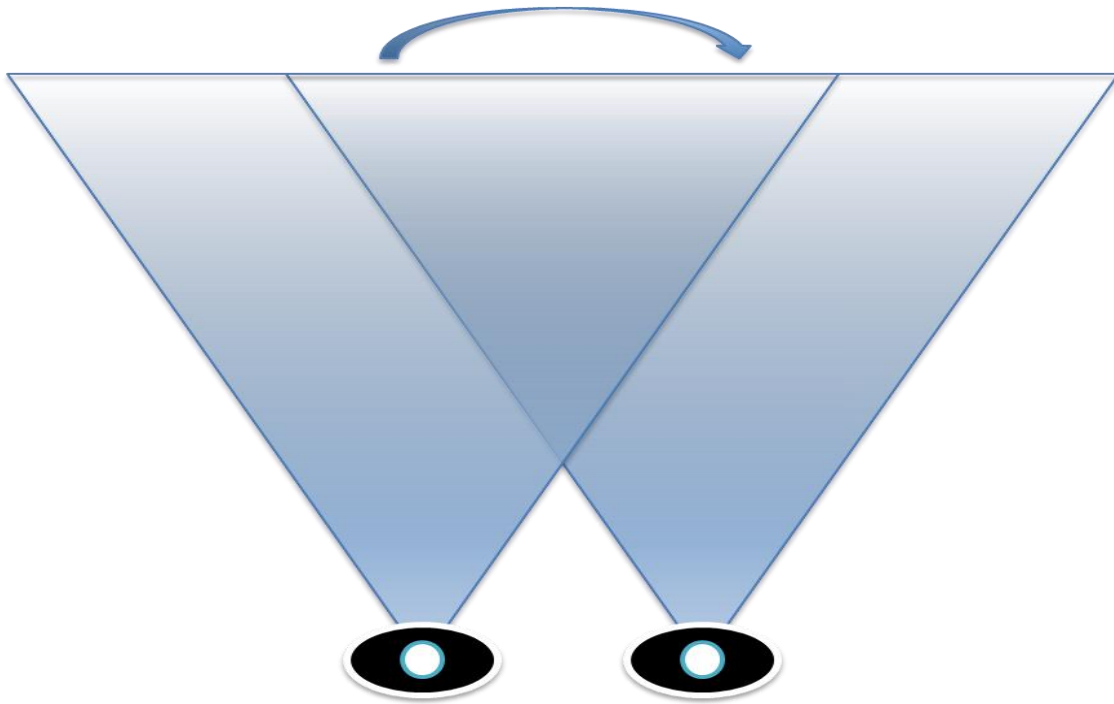


what does it  
see?

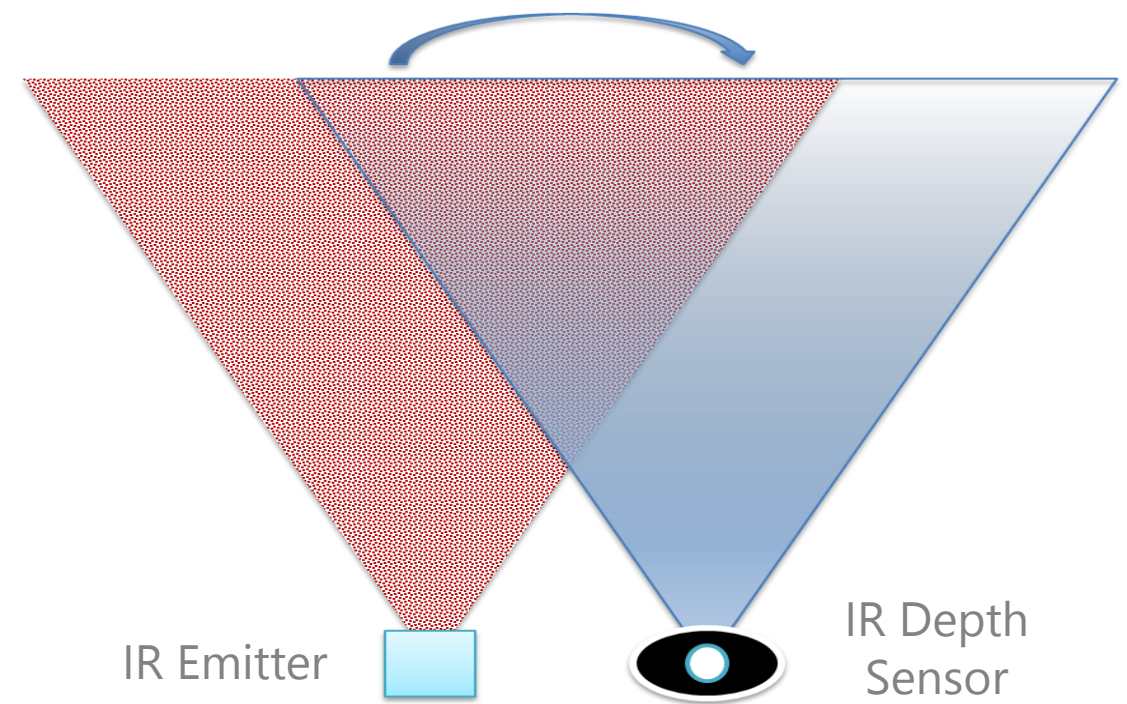


# Depth Sensing

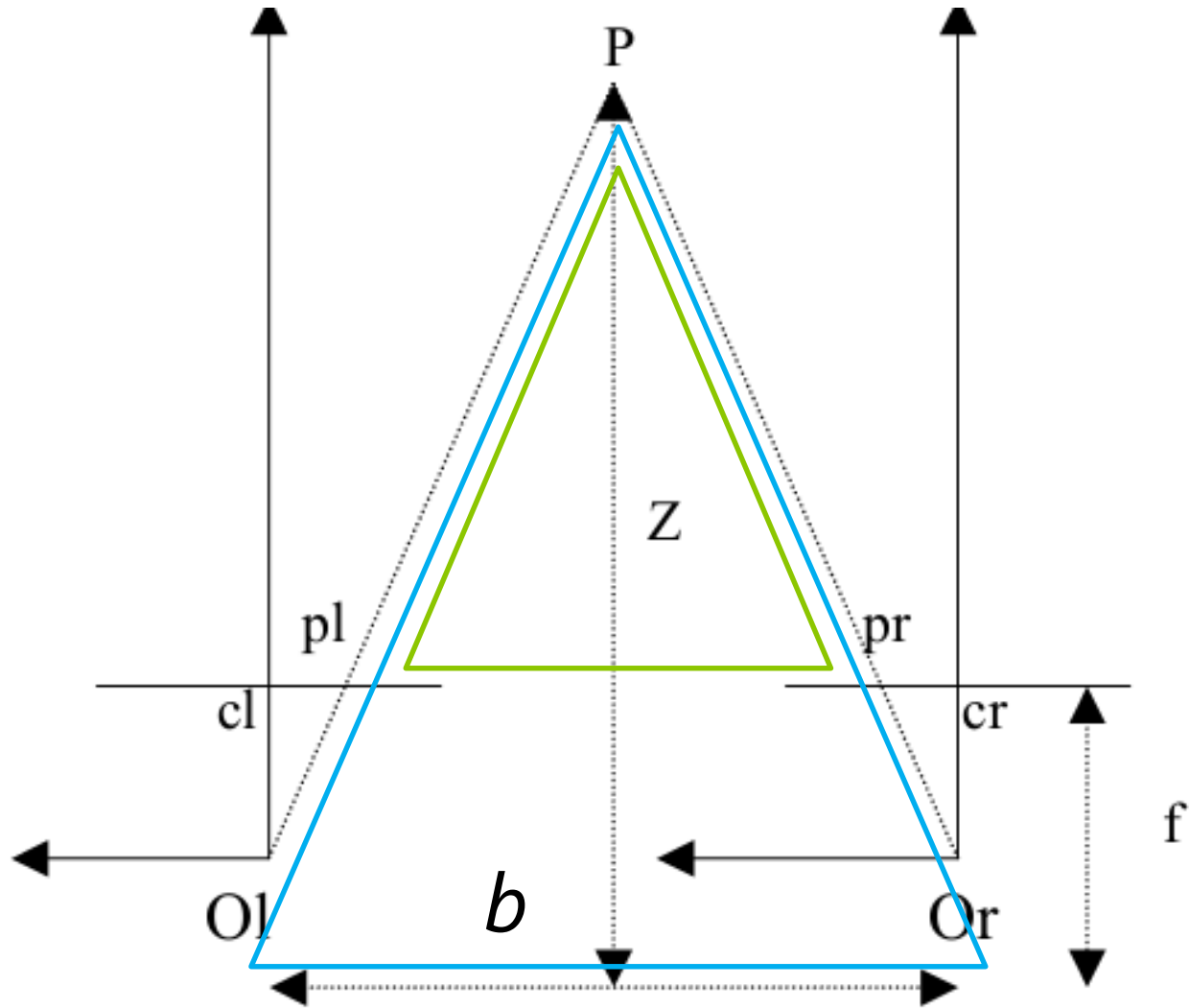
Object pattern similarity  
determines disparity



IR pattern similarity  
determines disparity



# Mathematical Model



$$\frac{b + x_l - x_r}{Z - f} = \frac{b}{Z}$$

$$d = x_l - x_r$$

$$Z = \frac{b * f}{d}$$

# Mathematical Model(2)

Reference plane distance

$$\frac{D}{b} = \frac{Z_o - Z_k}{Z_o}$$

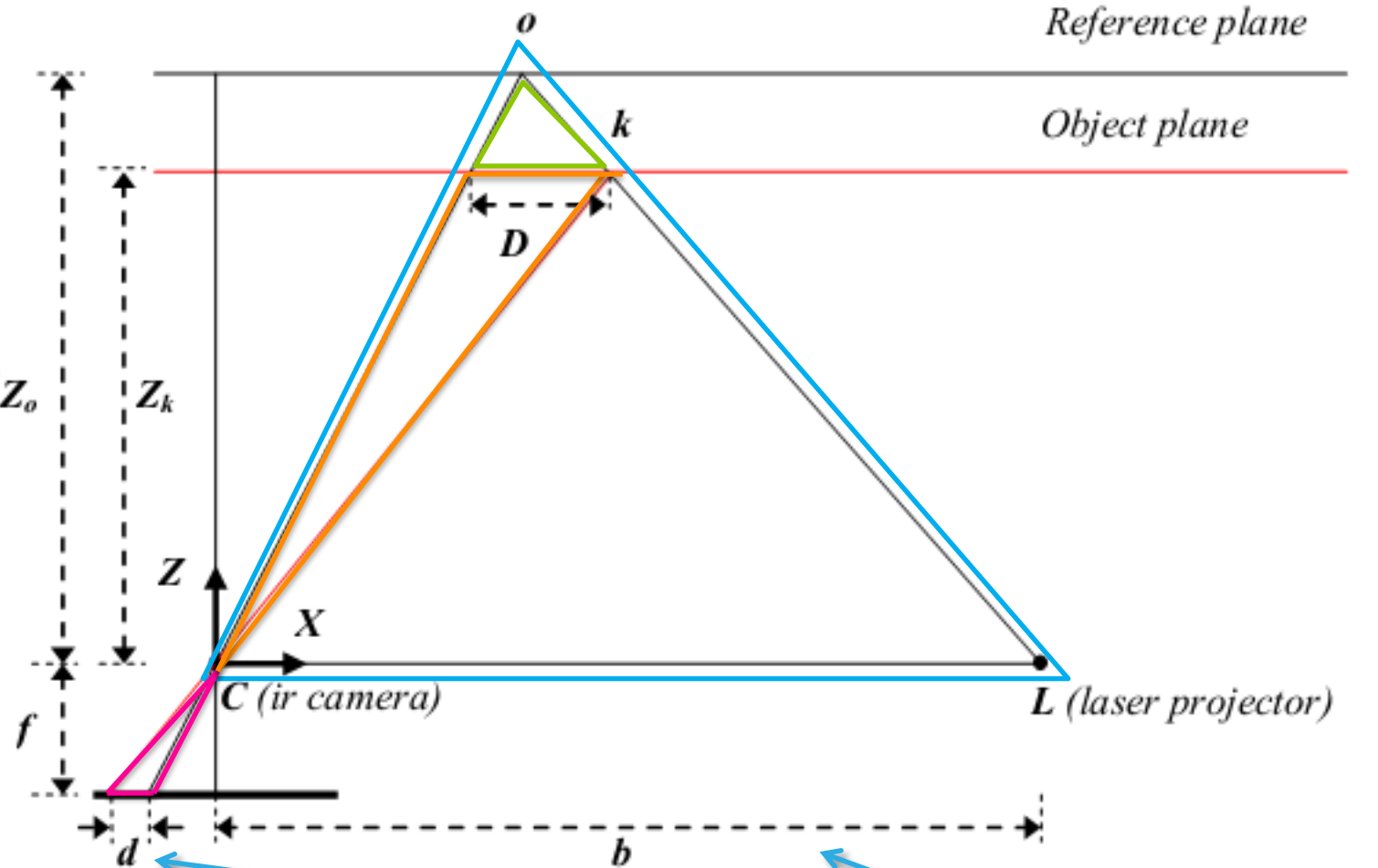


$$= Z_k = \frac{Z_o}{1 + \frac{Z_o}{fb}d}$$

$$\frac{d}{f} = \frac{D}{Z_k}$$

$$X_k = -\frac{Z_k}{f}(x_k - x_o + \delta x)$$

$$Y_k = -\frac{Z_k}{f}(y_k - y_o + \delta y)$$



Disparity

Image Plane



# Precision

spatial x/y  
resolution

3mm @ 2m distance

depth z  
resolution

1cm @ 2m distance

10 cm @ 4m distance

operation  
range

0.8m ~ 4m | 0.5m ~ 3m

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Microsoft Kinect SDK 1.8



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# Kinect SDKs

**Nov '10:** Linux community release FreeKinect, the first driver that allows the use of the RGB and depth

**Dec '10:** PrimeSense release OpenNI, their open source SDK with motion tracking middleware called NITE

**Jun '11:** Microsoft release non-commercial Kinect beta SDK for Windows

**Feb '12:** Microsoft released first stable commercial Kinect SDK for Windows and specific device (Kinect for Windows)



# Microsoft SDK vs OpenNI

## Microsoft SDK

### Cons

no gesture recognition system

no support for others devices

only supports Win7/8 (x86 & x64)

SDK does not have events for when new user enters frame, leaves frame etc...

### Pros

support for audio

support for motor/tilt

full body tracking:

does not need a calibration pose

includes head, hands, feet, clavicles

seems to deal better with occluded joints

supports multiple sensors

single installer

dedicated Runtime for client

SDK has events for when a new Video or new Depth frame is available

# Microsoft SDK vs OpenNI

## PrimeSense OpenNI/NITE

### Cons

no support for audio

no support for motor/tilt (although you can simultaneously use the CL-NUI motor drivers)

lacks rotations for the head, hands, feet, clavicles

needs a calibration pose to start tracking (although it can be saved/loaded to/from disk for reuse)

occluded joints are not estimated

supports multiple sensors although setup and enumeration is a bit quirky

three separate installers and a NITE license string (although the process can be automated with my auto driver installer)

SDK does not have events for when new Video or new Depth frames is available

### Pros

includes a framework for hand tracking

includes a framework for hand gesture recognition

can automatically align the depth image stream to the color image

also calculates rotations for the joints

support for hands only mode

also supports the Primesense and the ASUS WAPI Xtion sensors

supports Windows (including Vista&XP), Linux and Mac OSX

support for record/playback to/from disk

SDK has events for when new User enters frame, leaves frame etc

# GET STARTED

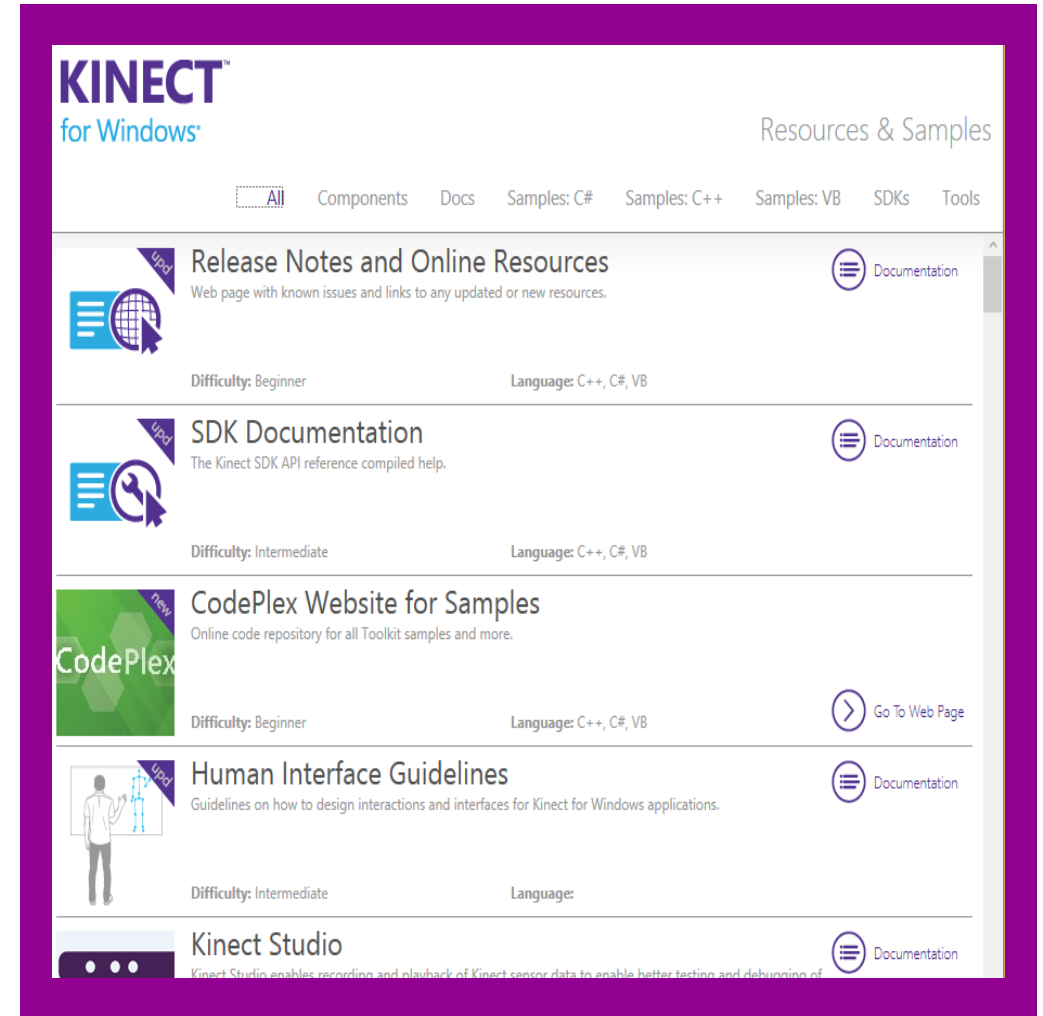
<http://kinectforwindows.org>

Order Kinect Hardware  
Download Kinect SDK  
Kinect Toolkit Browser  
Install Kinect Studio  
Coding4Fun Toolkit

C#, C++ or VB languages supported

SDK 1.0 released on February 2013

minor updates every 2 months  
major updates every 4 months



# demo

Kinect Samples



# Potential and applications

## Depth sensor

Background removal  
Object recognition

## Skeletal tracking

Multi-user  
Easy Gesture Recognition

## Microphone array

Sound source detection  
Speech recognition



# KINECT API BASICS

## Manage Kinect state

Connected

Enable Color, Depth, Skeleton

Start Kinect

## Get Data

Events – AllFramesReady, ColorFrameReady, SkeletonFrameReady, DepthFrameReady,...

Polling – OpenNextFrame

# The Kinect Stack

## App

Joint Filtering

Gesture Detection

Character  
Retargeting

Speech Commands

Skeletal Tracking

UI Control

Identity

Speech Recognition

Drivers

Depth Processing

Color Processing

Echo Cancellation

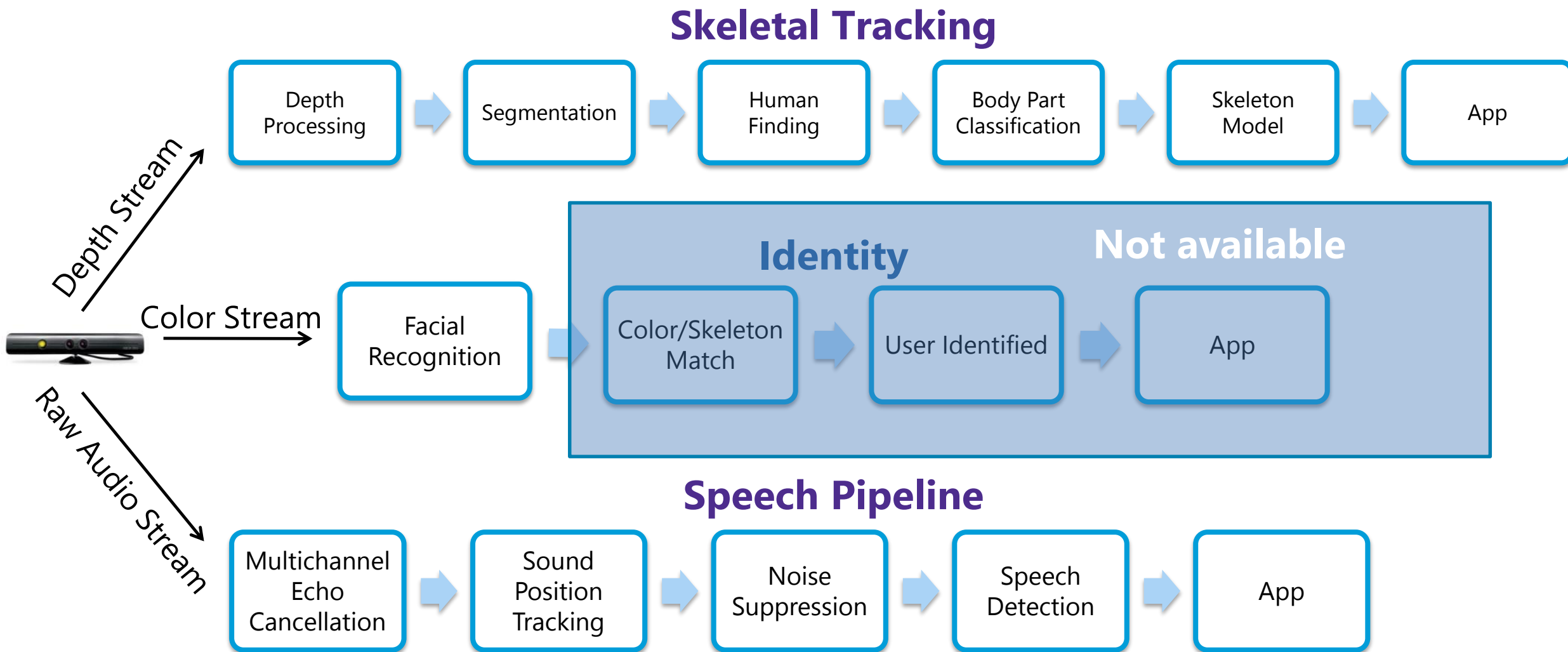
Tilt Sensor

Depth Sensor

Color Sensor

Microphones

# System Data Flow



# code

Detecting a Kinect Sensor



```
private KinectSensor _Kinect;
public MainWindow() {
    InitializeComponent();
    this.Loaded += (s, e) => { DiscoverKinectSensor(); };
}

private void DiscoverKinectSensor() {
    KinectSensor.KinectSensors.StatusChanged +=
        KinectSensors_StatusChanged;
    this.Kinect = KinectSensor.KinectSensors.FirstOrDefault(x =>
        x.Status == KinectStatus.Connected);
}
```

```
private void KinectSensors_StatusChanged(object sender, StatusChangedEventArgs e) {
    switch(e.Status) {
        case KinectStatus.Connected:
            if(this.Kinect == null) {
                this.Kinect = e.Sensor;
            }
            break;

        case KinectStatus.Disconnected:
            if(this.Kinect == e.Sensor) {
                this.Kinect = null;
                this.Kinect = KinectSensor.KinectSensors
                    .FirstOrDefault(x => x.Status ==
KinectStatus.Connected);

                if(this.Kinect == null){
                    //Notify the user that the sensor is disconnected
                }
            }
            break;
        //Handle all other statuses according to needs
    }
}
```

```
public KinectSensor Kinect
{
    get { return this._Kinect; }
    set {
        if(this._Kinect != value) {
            if(this._Kinect != null) {
                //Uninitialize
                this._Kinect = null;
            }

            if(value != null && value.Status == KinectStatus.Connected)
            {
                this._Kinect = value;
                //Initialize
            }
        }
    }
}
```

# KinectStatus VALUES

<b>KinectStatus</b>	<b>What it means</b>
Undefined	The status of the attached device cannot be determined.
Connected	The device is attached and is capable of producing data from its streams.
DeviceNotGenuine	The attached device is not an authentic Kinect sensor.
Disconnected	The USB connection with the device has been broken.
Error	Communication with the device produces errors.
Error Initializing	The device is attached to the computer, and is going through the process of connecting.
InsufficientBandwidth	Kinect cannot initialize, because the USB connector does not have the necessary bandwidth required to operate the device.
NotPowered	Kinect is not fully powered. The power provided by a USB connection is not sufficient to power the Kinect hardware. An additional power adapter is required.
NotReady	Kinect is attached, but is yet to enter the Connected state.



# code

Move the camera



# Tilt

```
private void setAngle(object sender, RoutedEventArgs e){  
    if (Kinect != null) {  
        Kinect.ElevationAngle = (Int32)slider1.Value;    }    }
```

```
<Slider Height="33" HorizontalAlignment="Left" Margin="0,278,0,0"  
Name="slider1" VerticalAlignment="Top" Width="308" SmallChange="1"  
IsSnapToTickEnabled="True" />
```

```
<Button Content="OK" Height="29" HorizontalAlignment="Left"  
Margin="396,278,0,0" Name="button1" VerticalAlignment="Top"  
Width="102" Click="setAngle" />
```

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Camera Fundamentals



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# Cameras Events


**ColorImageFrameReadyEventArgs** 

Sealed Class

→ EventArgs

Methods

- OpenColorImageFrame() : ColorImageFrame


**DepthImageFrameReadyEventArgs** 

Sealed Class

→ EventArgs

Methods

- OpenDepthImageFrame() : DepthImageFrame


**SkeletonFrameReadyEventArgs** 

Sealed Class

→ EventArgs

Methods

- OpenSkeletonFrame() : SkeletonFrame


**AllFramesReadyEventArgs** 


Sealed Class

→ EventArgs

Methods

- OpenColorImageFrame() : ColorImageFrame
- OpenDepthImageFrame() : DepthImageFrame
- OpenSkeletonFrame() : SkeletonFrame

 IDisposable

**KinectSensor** 

Sealed Class

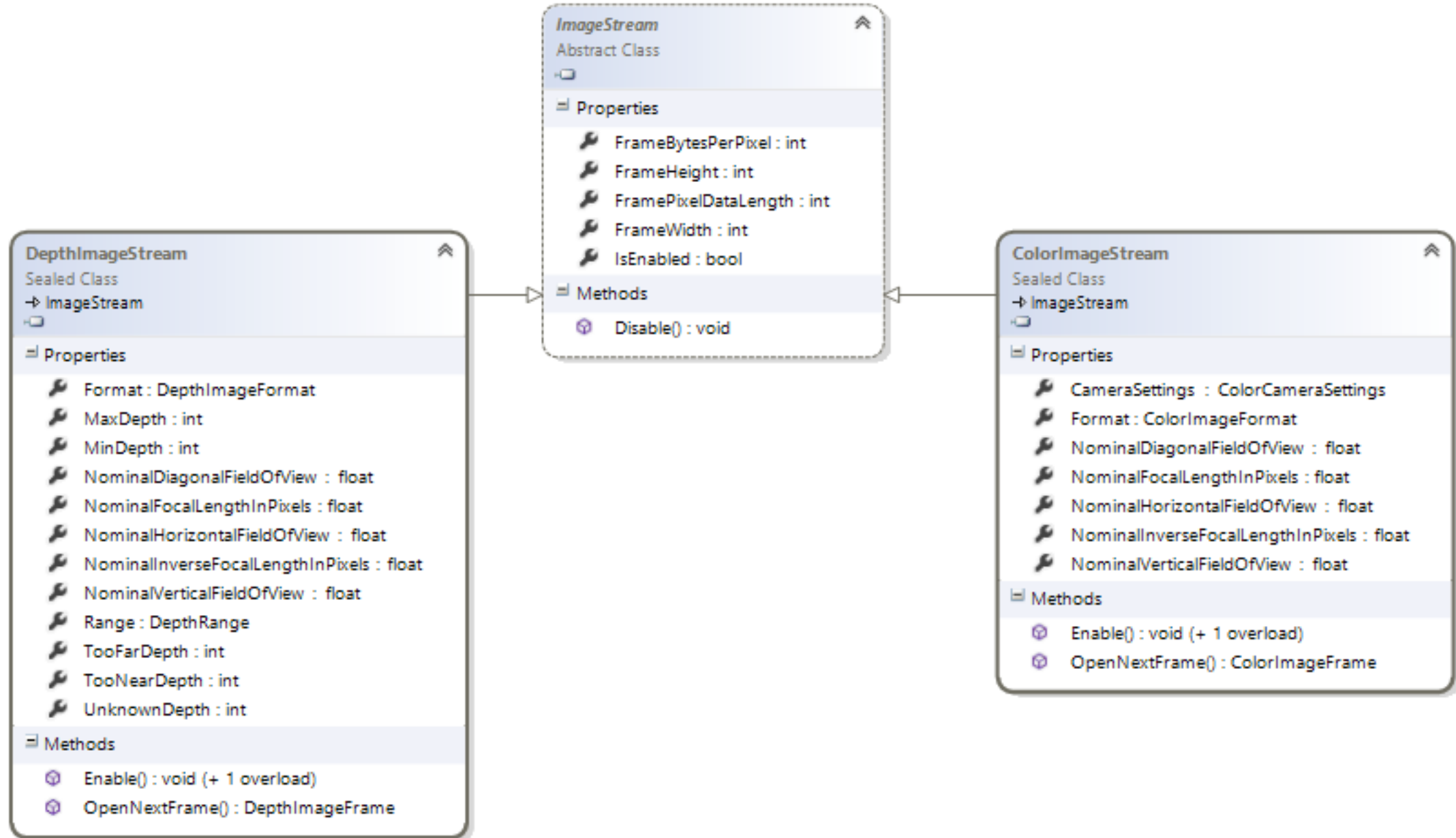
Properties

Methods

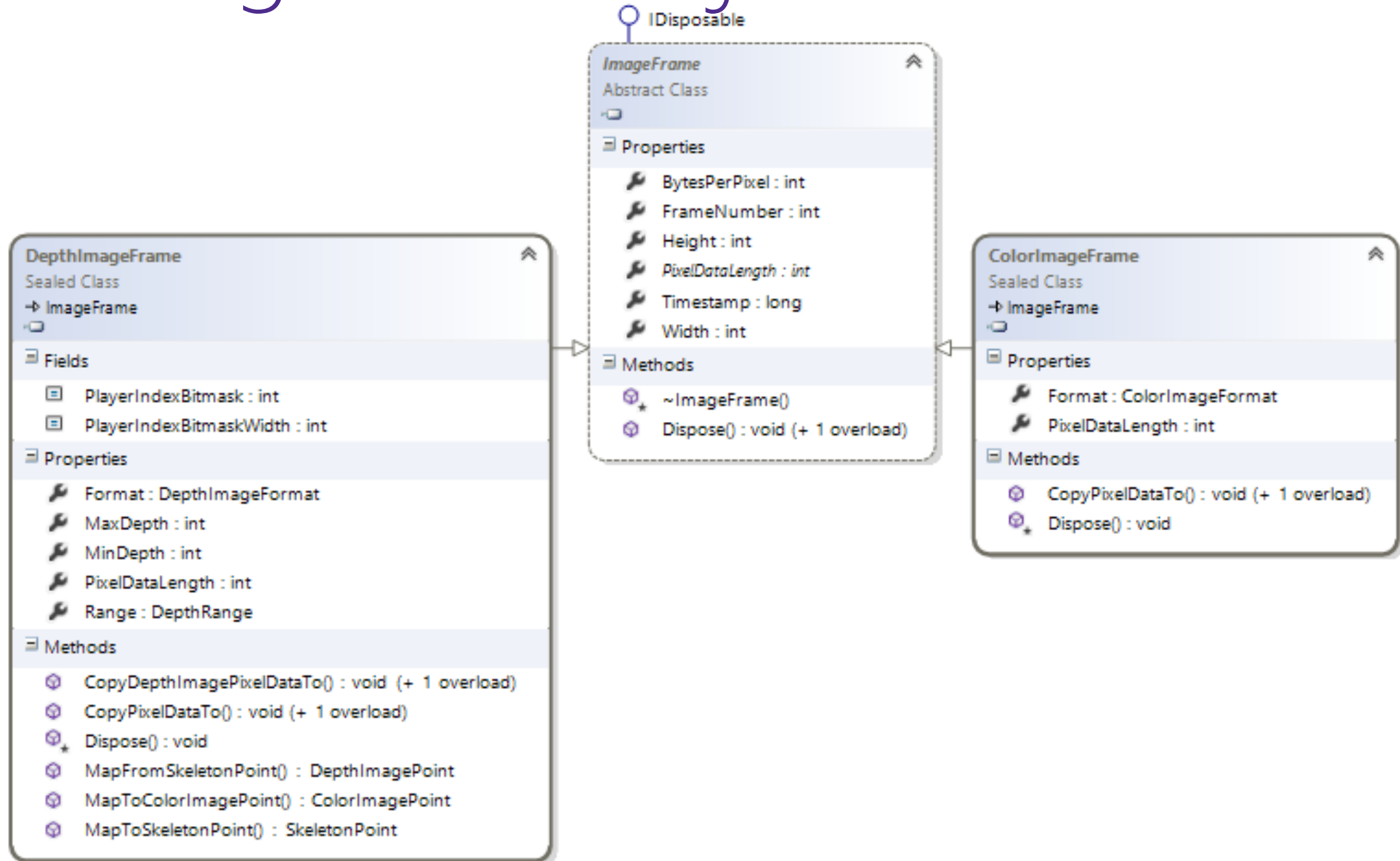
Events

- ⚡ AllFramesReady : EventHandler<AllFramesReadyEventArgs>
- ⚡ ColorFrameReady : EventHandler<ColorImageFrameReadyEventArgs>
- ⚡ DepthFrameReady : EventHandler<DepthImageFrameReadyEventArgs>
- ⚡ SkeletonFrameReady : EventHandler<SkeletonFrameReadyEventArgs>

# The ImageStream object model



# The ImageFrame object model



# ColorImageFormat

Member name	Description
<b>InfraredResolution640x480Fps30</b>	16 bits, using the top 10 bits from a <b>PixelFormat.Gray16</b> format (with the 6 least significant bits always set to 0) whose resolution is 640 x 480 and frame rate is 30 frames per second. <i>Introduced in 1.6.</i>
<b>RawBayerResolution1280x960Fps12</b>	Bayer data (8 bits per pixel, layout in alternating pixels of red, green and blue) whose resolution is 1280 x 960 and frame rate is 12 frames per second. <i>Introduced in 1.6.</i>
<b>RawBayerResolution640x480Fps30</b>	Bayer data (8 bits per pixel, layout in alternating pixels of red, green and blue) whose resolution is 640 x 480 and frame rate is 30 frames per second. <i>Introduced in 1.6.</i>
<b>RawYuvResolution640x480Fps15</b>	Raw YUV data whose resolution is 640 x 480 and frame rate is 15 frames per second.
<b>RgbResolution1280x960Fps12</b>	RGB data whose resolution is 1280 x 960 and frame rate is 12 frames per second.
<b>RgbResolution640x480Fps30</b>	RGB data whose resolution is 640 x 480 and frame rate is 30 frames per second.
<b>YuvResolution640x480Fps15</b>	YUV data whose resolution is 640 x 480 and frame rate is 15 frames per second.
<b>Undefined</b>	The format is not defined.

```
colorStream.Enable(ColorImageFormat.RgbResolution640x480Fps30);
```

# DepthImageFormat

Member name	Description
<b>Resolution320x240Fps30</b>	The resolution is 320 x 240; the frame rate is 30 frames per second.
<b>Resolution640x480Fps30</b>	The resolution is 640 x 480; the frame rate is 30 frames per second.
<b>Resolution80x60Fps30</b>	The resolution is 80 x 60; the frame rate is 30 frames per second.
<b>Undefined</b>	The format is not defined.

```
depthStream.Enable(DepthImageFormat.Resolution640x480Fps30);
```



# BYTES PER PIXEL

The stream Format determines the pixel format and therefore the meaning of the bytes.

ColorImageFormat.RgbResolution640x480Fps30 → pixel format is Bgra32 → 32 bits (4 bytes) per pixel.

The 1<sup>st</sup> byte is the blue channel value, the 2<sup>nd</sup> is green, and the 3<sup>th</sup> is red. The fourth byte determines the alpha or opacity of the pixel (unused)

$640 \times 480 = \text{height} * \text{width} * \text{BytesPerPixel} = 640 * 480 * 4 = 122880 \text{ bytes}$

**Stride** is the number of bytes for a row of pixels

$\text{Stride} = \text{width} * \text{BytesPerPixel}$

# Depth data

Returns the distance and player for every pixel

Ex:  $320 \times 240 = 76,800$  pixels

## Distance

Distance in mm from Kinect ex:  
2,000mm

## Player

1-6 players

# Depth Range

Near  
Mode

Default  
Mode

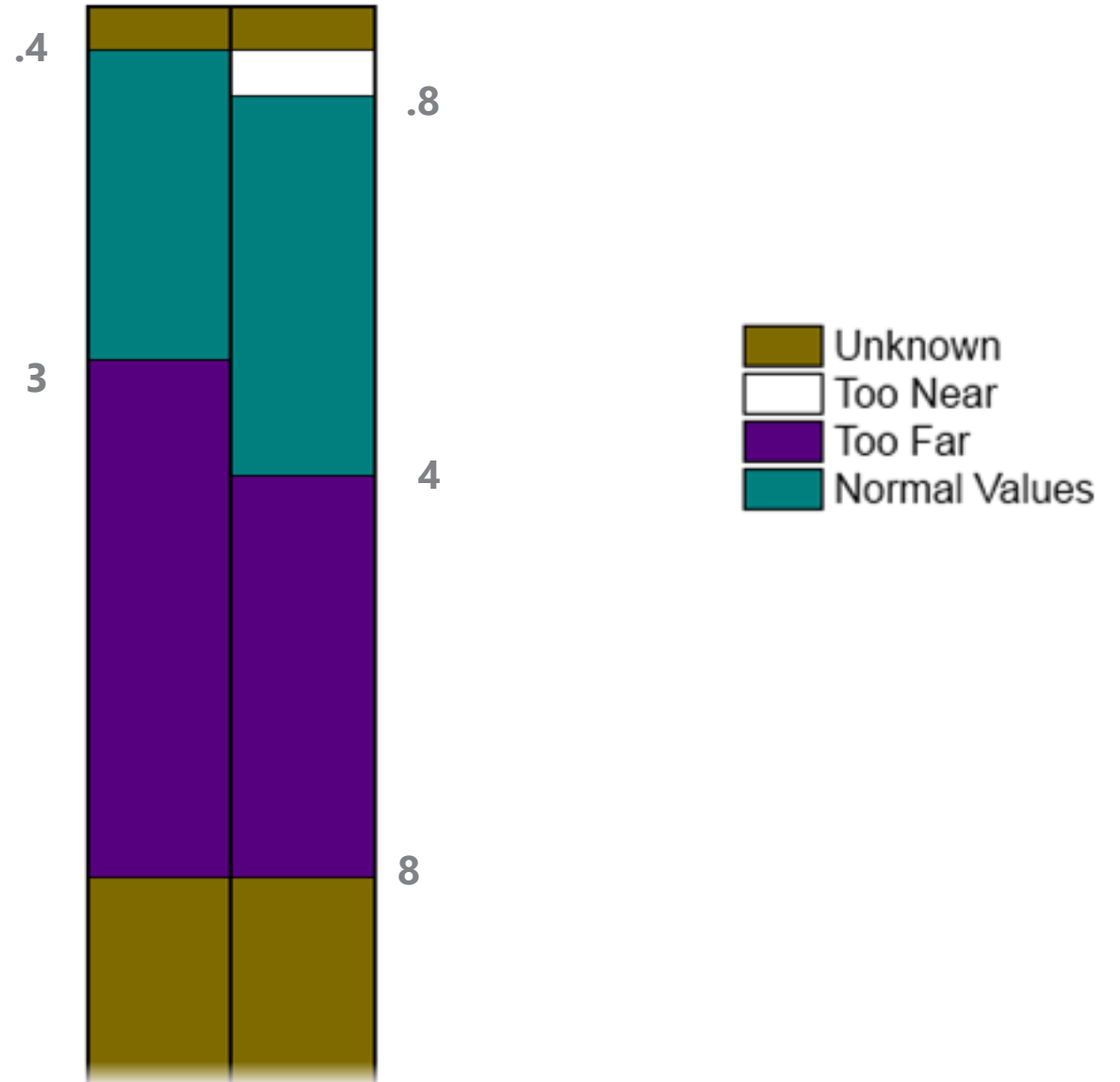
**DepthImageStream**  
Sealed Class  
→ ImageStream

Properties

- Format : DepthImageFormat
- MaxDepth : int
- MinDepth : int
- NominalDiagonalFieldOfView : float
- NominalFocalLengthInPixels : float
- NominalHorizontalFieldOfView : float
- NominalInverseFocalLengthInPixels : float
- NominalVerticalFieldOfView : float
- Range : DepthRange**
- TooFarDepth : int**
- TooNearDepth : int**
- UnknownDepth : int**

Methods

- Enable() : void (+ 1 overload)
- OpenNextFrame() : DepthImageFrame



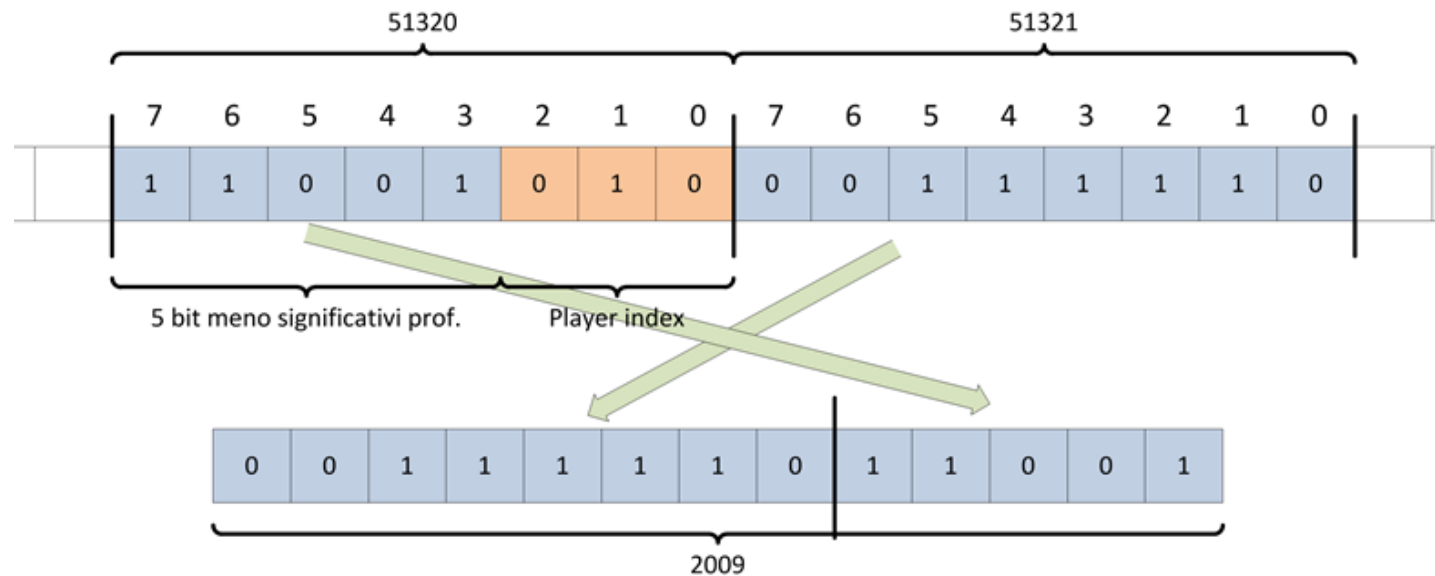
# Depth data

Distance Formula

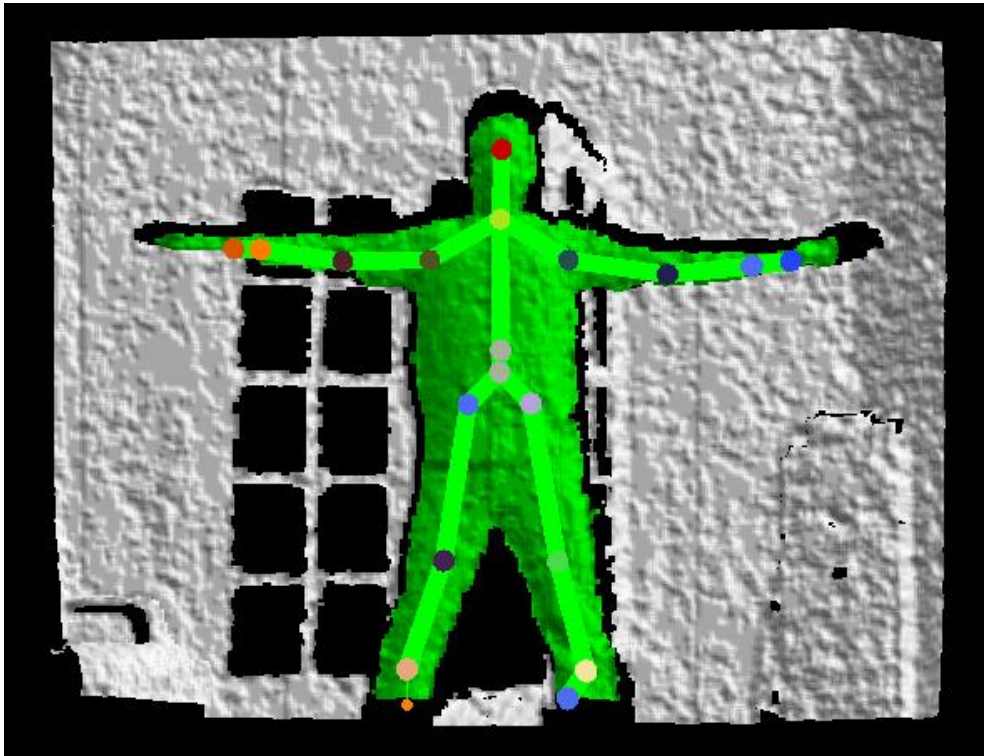
```
int depth = depthPoint >> DepthImageFrame.PlayerIndexBitmaskWidth;
```

Player Formula

```
int player = depthPoint & DepthImageFrame.PlayerIndexBitmask;
```



# Depth and Segmentation map



# code

Processing & Displaying a  
Color Data



```
private WriteableBitmap _ColorImageBitmap;
private Int32Rect _ColorImageBitmapRect;
private int _ColorImageStride;

private void InitializeKinect(KinectSensor sensor) {

    if (sensor != null){
        ColorImageStream colorStream = sensor.ColorStream;
        colorStream.Enable();

        this._ColorImageBitmap = new WriteableBitmap(colorStream.FrameWidth,
                                                    colorStream.FrameHeight, 96, 96,
                                                    PixelFormats.Bgr32, null);
        this._ColorImageBitmapRect = new Int32Rect(0, 0, colorStream.FrameWidth,
                                                    colorStream.FrameHeight);
        this._ColorImageStride = colorStream.FrameWidth * colorStream.FrameBytesPerPixel;
        ColorImageElement.Source = this._ColorImageBitmap;

        sensor.ColorFrameReady += Kinect_ColorFrameReady;
        sensor.Start();
    }
}
```

```
private void Kinect_ColorFrameReady(object sender, ColorImageFrameReadyEventArgs e)
{
    using (ColorImageFrame frame = e.OpenColorImageFrame())
    {
        if (frame != null)
        {
            byte[] pixelData = new byte[frame.PixelDataLength];
            frame.CopyPixelDataTo(pixelData);

            this._ColorImageBitmap.WritePixels(this._ColorImageBitmapRect,
                                                pixelData,
                                                this._ColorImageStride, 0);
        }
    }
}
```



# code

Taking a Picture



```
private void TakePictureButton_Click(object sender, RoutedEventArgs e) {
    string fileName = "snapshot.jpg";

    if (File.Exists(fileName)) {
        File.Delete(fileName);
    }

    using (FileStream savedSnapshot = new FileStream(fileName, FileMode.CreateNew)) {
        BitmapSource image = (BitmapSource)VideoStreamElement.Source;

        JpegBitmapEncoder jpgEncoder = new JpegBitmapEncoder();
        jpgEncoder.QualityLevel = 70;
        jpgEncoder.Frames.Add(BitmapFrame.Create(image));
        jpgEncoder.Save(savedSnapshot);

        savedSnapshot.Flush();
        savedSnapshot.Close();
        savedSnapshot.Dispose();
    }
}
```

# code

Processing & Displaying a  
DepthData



```
Kinect.DepthStream.Enable(DepthImageFormat.Resolution320x240Fps30);
```

```
Kinect.DepthFrameReady += Kinect_DepthFrameReady;
```

```
void Kinect_DepthFrameReady(object sender, DepthImageFrameReadyEventArgs e) {
```

```
    using (DepthImageFrame frame = e.OpenDepthImageFrame()) {
```

```
        if (frame != null) {
```

```
            short[] pixelData = new short[frame.PixelDataLength];
```

```
            frame.CopyPixelDataTo(pixelData);
```

```
            int stride = frame.Width * frame.BytesPerPixel;
```

```
            ImageDepth.Source = BitmapSource.Create(frame.Width,  
            frame.Height, 96, 96,
```

```
PixelFormat.Gray16, null, pixelData, stride);
```

```
        } } }
```

```
}
```

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Skeletal Tracking Fundamentals



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# Skeletal Tracking History

First experiments started over 4 years ago:

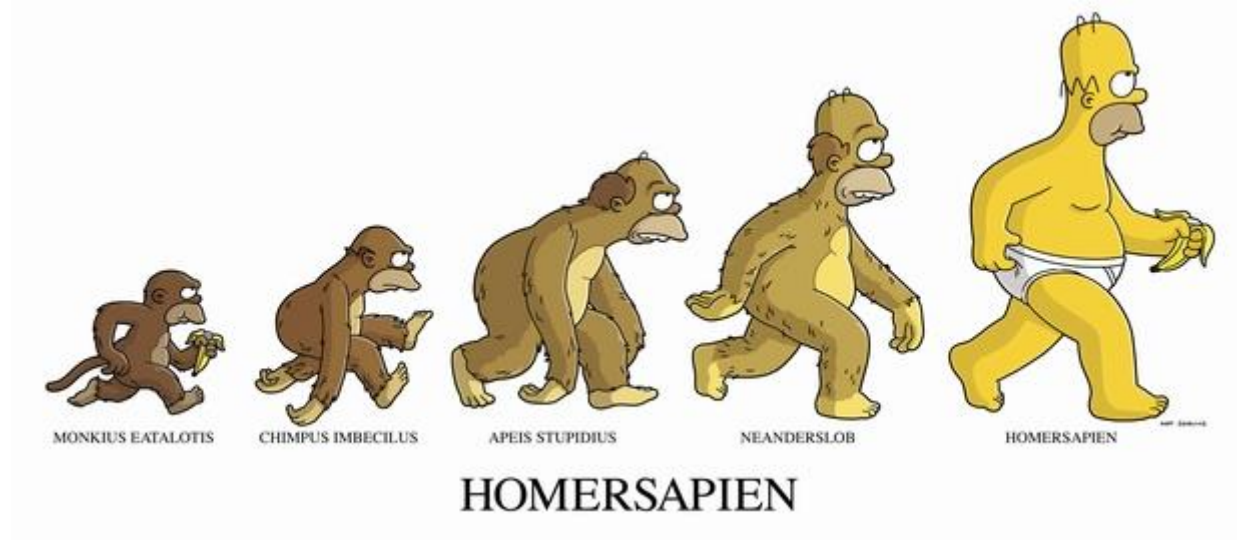
Started with tracking just hands

Then head and hands

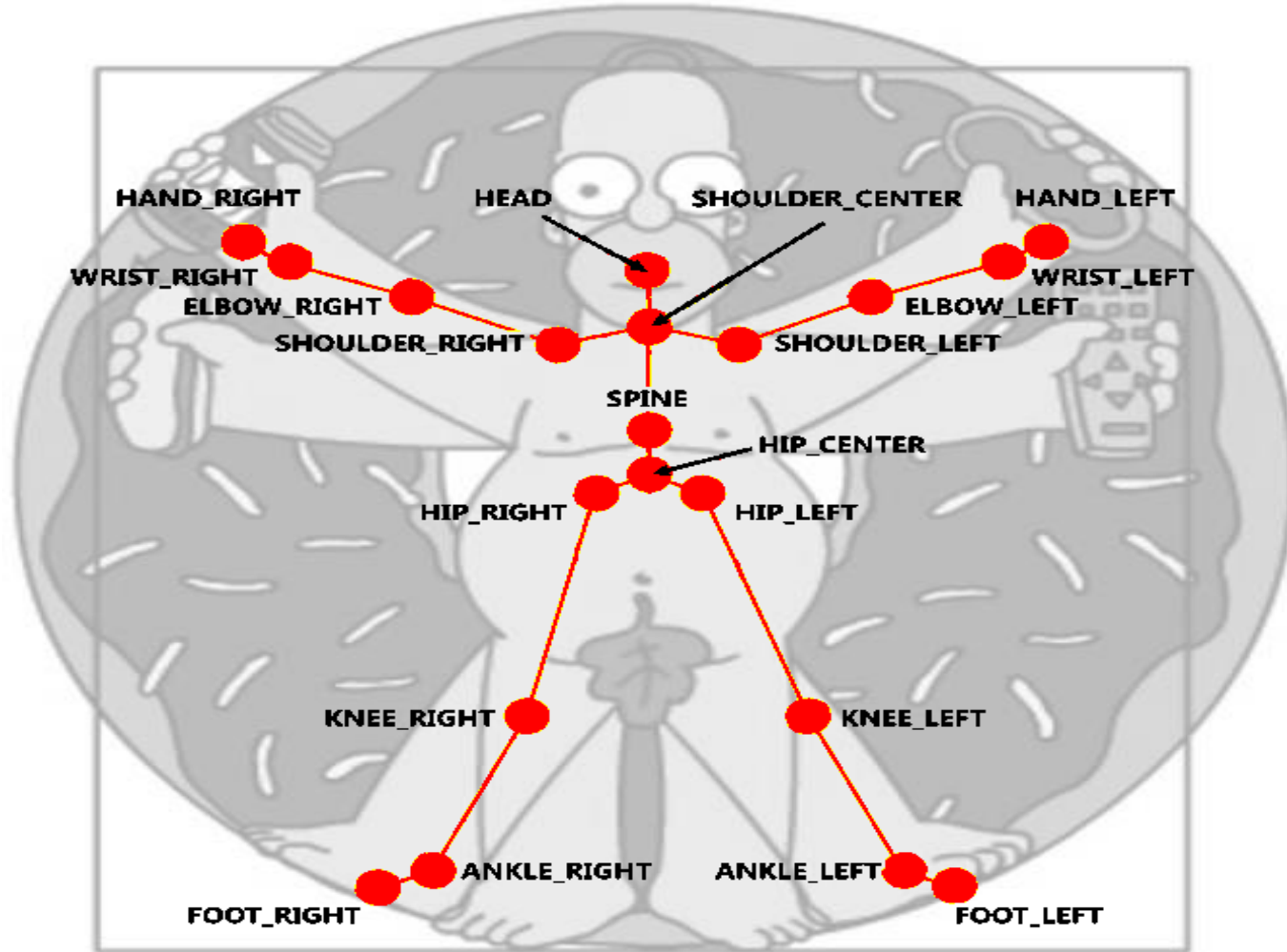
Then added shoulders and elbows

Then built "heavy duty" pipeline

To today's pipeline that tracks 20 joints and runs fast

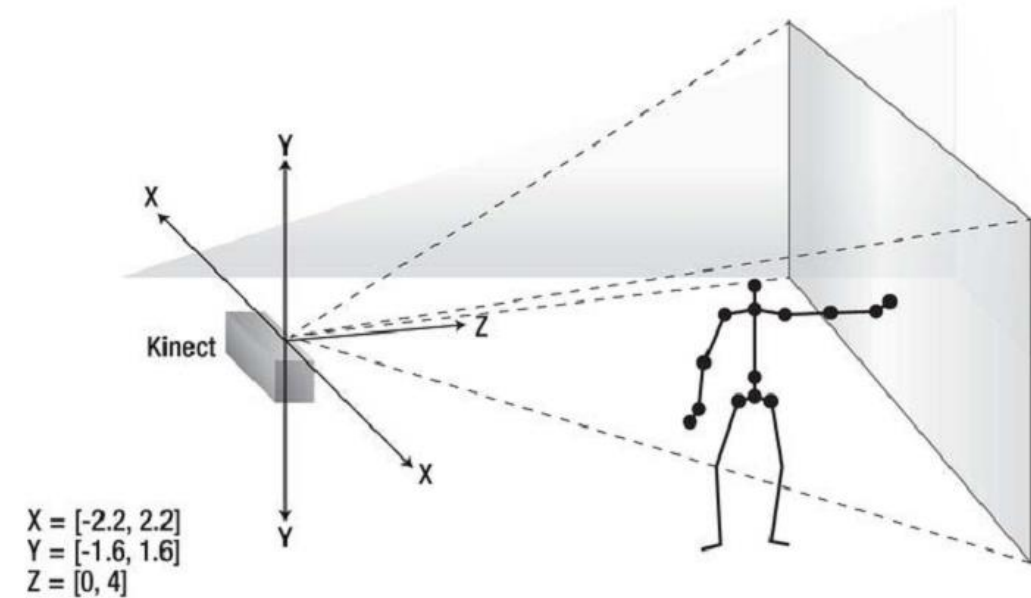


# Skeleton Data



Maximum two players tracked at once

Six player proposals per Kinect



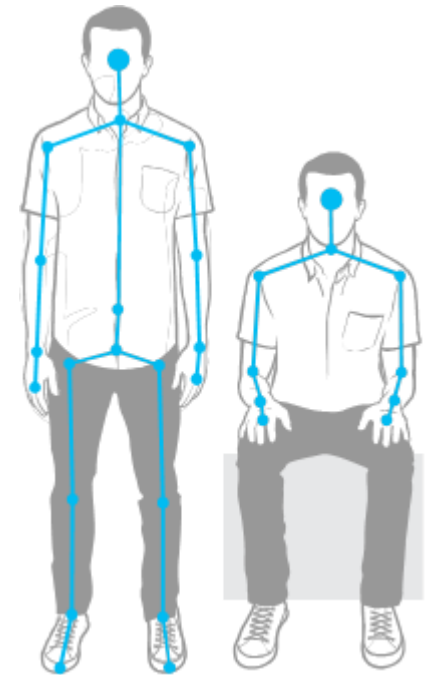
# Tracking Modes

## Default Mode

- 20 skeleton joints
- Optimized to recognize and track people who are standing and fully visible to the sensor
- Detects the user based on the distance of the subject from the background

## Seated Mode

- 10 skeleton joints (upper-body joints)
- designed to track people who are seated or whose lower body is not entirely visible to the sensor
- uses movement to detect the user and distinguish him or her from the background
- uses more resources than the default pipeline
- provides the best way to recognize a skeleton when the Kinect depth sensor is in near range.



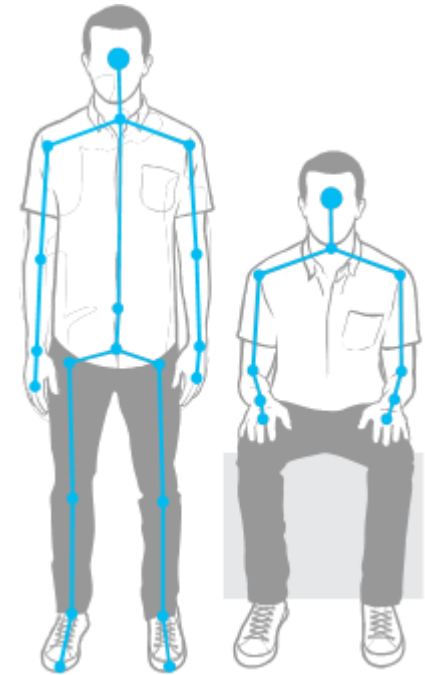


# Tracking Modes Details

Only one tracking mode can be used at a time.

Different Kinect sensors can use different modes, if they are using different processes.

Toggling between default and seated mode resets skeletal tracking briefly. When the users are relocked, each tracked user will be assigned a new tracking ID.



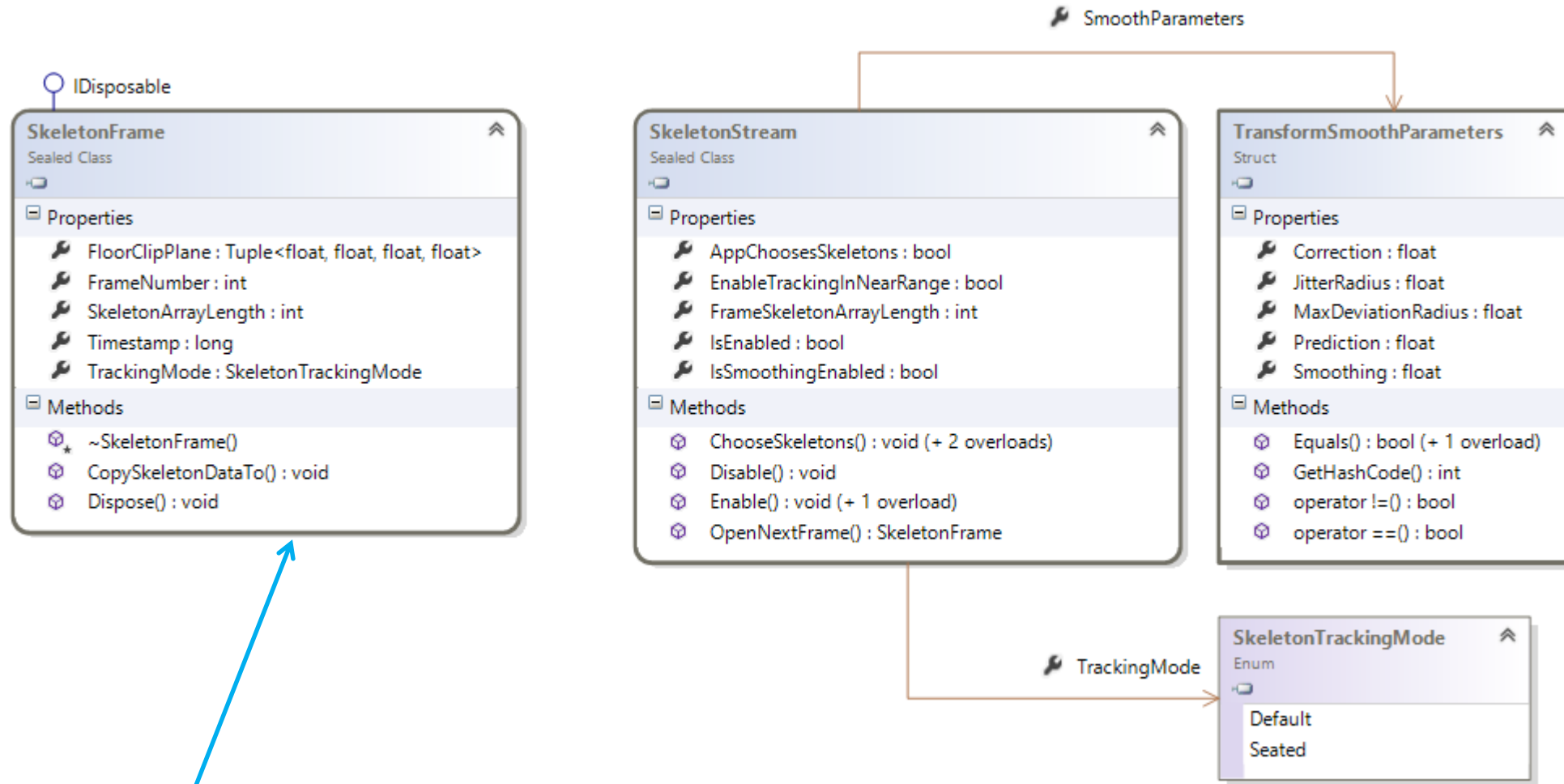
# Tracking in Near Mode

With SDK 1.5, an application can receive full joint information also in near mode

```
// enable returning skeletons while depth is in Near Range
this.kinect.SkeletonStream.EnableTrackingInNearRange = true;

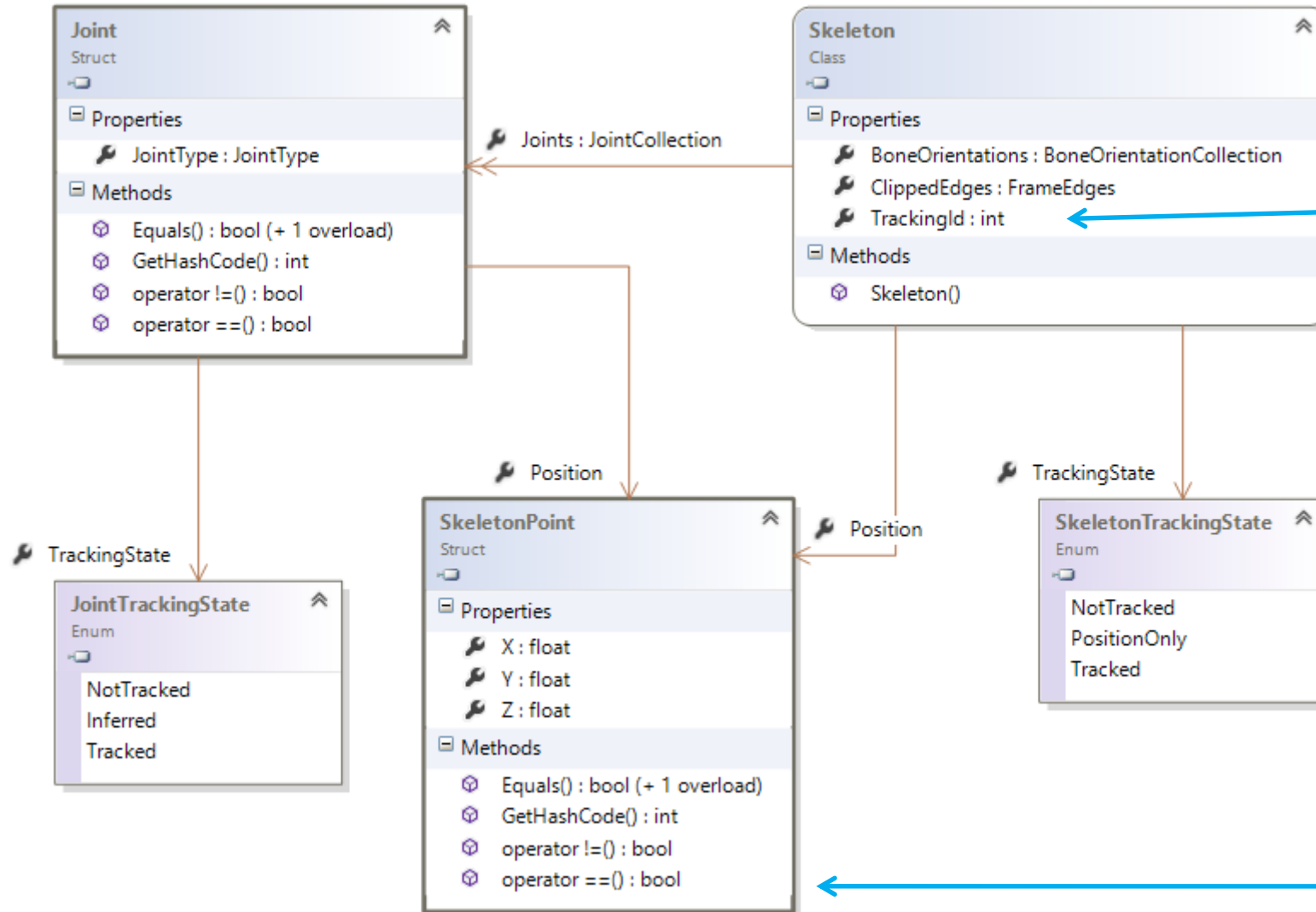
private void EnableNearModeSkeletalTracking() {
    if (this.kinect != null && this.kinect.DepthStream != null && this.kinect.SkeletonStream !=
null) {
        this.kinect.DepthStream.Range = DepthRange.Near; // Depth in near range enabled
        this.kinect.SkeletonStream.EnableTrackingInNearRange = true; // enable returning skeletons
        while depth is in Near Range
        this.kinect.SkeletonStream.TrackingMode = SkeletonTrackingMode.Seated; // Use seated tracking
    } }
```

# The SkeletonStream object model



AllFramesReady and SkeletonFrameReady Events return a SkeletonFrame which contain skeleton data

# The Skeleton object model



Each skeleton has a unique identifier - TrackingID

Each joint has a Position, which is of type SkeletonPoint that reports the X, Y, and Z of the joint.

# SkeletonTrakingState

SkeletonTrakingState	What it means
NotTracked	Skeleton object does not represent a tracked user. The Position field of the Skeleton and every Joint in the joints collection is a zero point
PositionOnly	The skeleton is detected, but is not actively being tracked. The Position field has a non-zero point, but the position of each Joint in the joints collection is a zero point.
Tracked	The skeleton is actively being tracked. The Position field and all Joint objects in the joints collection have non-zero points.

# JointsTrakingState

<b>JointsTrakingState</b>	<b>What it means</b>
Inferred	Occluded, clipped, or low confidence joints. The skeleton engine cannot see the joint in the depth frame pixels, but has made a calculated determination of the position of the joint.
NotTracked	The position of the joint is indeterminable. The Position value is a zero point.
Tracked	The joint is detected and actively followed.

Use TransformSmoothParameters to smooth joint data to reduce jitter

# code

Skeleton V1



```
private KinectSensor _KinectDevice;
private readonly Brush[] _SkeletonBrushes = { Brushes.Black, Brushes.Crimson, Brushes.Indigo,
                                             Brushes.DodgerBlue, Brushes.Purple, Brushes.Pink };

private Skeleton[] _FrameSkeletons;
#endregion Member Variables
```

```
private void InitializeKinect()    {

    this._KinectDevice.SkeletonStream.Enable();
    this._FrameSkeletons = new
Skeleton[this._KinectDevice.SkeletonStream.FrameSkeletonArrayLength];
    this.KinectDevice.SkeletonFrameReady += KinectDevice_SkeletonFrameReady;

    this._KinectDevice.Start();
}
```

```
private void UninitializeKinect()
{
    this._KinectDevice.Stop();
    this._KinectDevice.SkeletonFrameReady -= KinectDevice_SkeletonFrameReady;
    this._KinectDevice.SkeletonStream.Disable();

    this._FrameSkeletons = null;
}
```



```
private void KinectDevice_SkeletonFrameReady(object sender, SkeletonFrameReadyEventArgs e) {
    using (SkeletonFrame frame = e.OpenSkeletonFrame()) {
        if (frame != null) {
            Skeleton skeleton; Brush userBrush;
            LayoutRoot.Children.Clear();
            frame.CopySkeletonDataTo(this._FrameSkeletons);

            for (int i = 0; i < this._FrameSkeletons.Length; i++) {
                skeleton = this._FrameSkeletons[i];

                if (skeleton.TrackingState != SkeletonTrackingState.NotTracked) {
                    Point p = GetJointPoint(skeleton.Position);
                    Ellipse ell = new Ellipse();
                    ell.Height = ell.Width = 30;
                    userBrush = this._SkeletonBrushes[i % this._SkeletonBrushes.Length];
                    ell.Fill = userBrush;

                    LayoutRoot.Children.Add(ell);
                    Canvas.SetTop(ell, p.Y - ell.Height / 2);
                    Canvas.SetLeft(ell, p.X - ell.Width / 2);
                }
            }
        }
    }
}
```

Copy SkeletonsData in local variable

Actually, Length is 6

Scale Position

```
private Point GetJointPoint(SkeletonPoint skPoint)
```

```
{
```

```
    // Change System 3D ->2 D
```

```
    DepthImagePoint point = this.KinectDevice.MapSkeletonPointToDepth(skPoint,  
                                                                    this.KinectDevice.DepthStream.Format);
```

```
    // Scale point to actual dimension of container
```


```
    point.X = point.X * (int)this.LayoutRoot.ActualWidth /  
              this.KinectDevice.DepthStream.FrameWidth;
```

```
    point.Y = point.Y * (int)this.LayoutRoot.ActualHeight /  
              this.KinectDevice.DepthStream.FrameHeight;
```

```
    return new Point(point.X, point.Y);
```

```
}
```

Mapping different  
Coordinate systems



# Smoothing

## TransformSmoothParameters

## What it means

Correction

A float ranging from 0 to 1.0. The lower the number, the more correction is applied.

JitterRadius

Sets the radius of correction. If a joint position “jitters” outside of the set radius, it is corrected to be at the radius. Float value measured in meters.

MaxDeviationRadius

Used this setting in conjunction with the JitterRadius setting to determine the outer bounds of the jitter radius. Any point that falls outside of this radius is not considered a jitter, but a valid new position. Float value measured in meters.

Prediction

Sets the number of frames predicted.

Smoothing

Determines the amount of smoothing applied while processing skeletal frames. It is a float type with a range of 0 to 1.0. The higher the value, the more smoothing applied. A zero value does not alter the skeleton data.

# code

Skeleton V2



```
private void InitializeKinect()    {

    var parameters = new TransformSmoothParameters
    {
        Smoothing = 0.3f,
        Correction = 0.0f,
        Prediction = 0.0f,
        JitterRadius = 1.0f,
        MaxDeviationRadius = 0.5f
    };
    _KinectDevice.SkeletonStream.Enable(parameters);

    this._KinectDevice.SkeletonStream.Enable();
    this._FrameSkeletons = new
Skeleton[this._KinectDevice.SkeletonStream.FrameSkeletonArrayLength];
    this.KinectDevice.SkeletonFrameReady += KinectDevice_SkeletonFrameReady;

    this._KinectDevice.Start();
}
```

```

private void KinectDevice_SkeletonFrameReady(object sender, SkeletonFrameReadyEventArgs e)    {
    using (SkeletonFrame frame = e.OpenSkeletonFrame()) {
        if (frame != null) {
            Skeleton skeleton;
            Brush userBrush;
            LayoutRoot.Children.Clear();
            frame.CopySkeletonDataTo(this._FrameSkeletons);

            for (int i = 0; i < this._FrameSkeletons.Length; i++) {
                skeleton = this._FrameSkeletons[i];
                if (skeleton.TrackingState != SkeletonTrackingState.NotTracked) {
                    Point p = GetJointPoint(skeleton.Position);
                    Ellipse ell = new Ellipse();
                    ell.Height = ell.Width = 30;
                    userBrush = this._SkeletonBrushes[i % this._SkeletonBrushes.Length];
                    ell.Fill = userBrush;

                    LayoutRoot.Children.Add(ell);
                    Canvas.SetTop(ell, p.Y - ell.Height / 2);
                    Canvas.SetLeft(ell, p.X - ell.Width / 2);
                    if (skeleton.TrackingState == SkeletonTrackingState.Tracked) {
                        DrawSkeleton(skeleton, userBrush);
                    }
                }
            }
        }
    }
}

```

```
private void DrawSkeleton(Skeleton skeleton, Brush userBrush)    {
//Draws the skeleton's head and torso
    joints = new[] { JointType.Head, JointType.ShoulderCenter, JointType.ShoulderLeft, JointType.Spine,
        JointType.ShoulderRight, JointType.ShoulderCenter, JointType.HipCenter, JointType.HipLeft,
        JointType.Spine, JointType.HipRight, JointType.HipCenter };
    LayoutRoot.Children.Add(CreateFigure(skeleton, userBrush, joints));

//Draws the skeleton's left leg
    joints = new[] { JointType.HipLeft, JointType.KneeLeft, JointType.AnkleLeft, JointType.FootLeft };
    LayoutRoot.Children.Add(CreateFigure(skeleton, userBrush, joints));

//Draws the skeleton's right leg
    joints = new[] { JointType.HipRight, JointType.KneeRight, JointType.AnkleRight, JointType.FootRight };
    LayoutRoot.Children.Add(CreateFigure(skeleton, userBrush, joints));

//Draws the skeleton's left arm
    joints = new[] { JointType.ShoulderLeft, JointType.ElbowLeft, JointType.WristLeft, JointType.HandLeft };
    LayoutRoot.Children.Add(CreateFigure(skeleton, userBrush, joints));

//Draws the skeleton's right arm
    joints = new[] { JointType.ShoulderRight, JointType.ElbowRight, JointType.WristRight, JointType.HandRight };
    LayoutRoot.Children.Add(CreateFigure(skeleton, userBrush, joints));

}
```

```
private Polyline CreateFigure(Skeleton skeleton, Brush brush, JointType[] joints)
{
    Polyline figure = new Polyline();
    figure.StrokeThickness = 4;
    figure.Stroke = brush;

    for (int i = 0; i < joints.Length; i++)
    {
        figure.Points.Add(GetJointPoint(skeleton.Joints[joints[i]].Position));
    }

    return figure;
}
```



# code

Skeleton V3



```
private void InitializeKinect()
{
    var parameters = new TransformSmoothParameters{
        Smoothing = 0.3f,
        Correction = 0.0f,
        Prediction = 0.0f,
        JitterRadius = 1.0f,
        MaxDeviationRadius = 0.5f };
    _KinectDevice.SkeletonStream.Enable(parameters);

    this._KinectDevice.SkeletonStream.Enable();
    this._FrameSkeletons = new Skeleton[this._KinectDevice.SkeletonStream.FrameSkeletonArrayLength];
    this.KinectDevice.SkeletonFrameReady += KinectDevice_SkeletonFrameReady;

    this._KinectDevice.ColorStream.Enable(ColorImageFormat.RgbResolution640x480Fps30);
    this._KinectDevice.ColorFrameReady += new
    EventHandler<ColorImageFrameReadyEventArgs>(_KinectDevice_ColorFrameReady);

    this._ColorImageBitmap = new WriteableBitmap(_KinectDevice.ColorStream.FrameWidth,
        _KinectDevice.ColorStream.FrameHeight, 96, 96,
        PixelFormats.Bgr32, null);
    this._ColorImageBitmapRect = new Int32Rect(0, 0, _KinectDevice.ColorStream.FrameWidth,
        _KinectDevice.ColorStream.FrameHeight);
    this._ColorImageStride = _KinectDevice.ColorStream.FrameWidth *
    _KinectDevice.ColorStream.FrameBytesPerPixel;
    ColorImage.Source = this._ColorImageBitmap;

    this._KinectDevice.Start();
}
```

Video Stream  
initialization



```
private Point GetJointPoint(SkeletonPoint skPoint)
```

```
{
```

```
    // Change System 3D ->2D
```

```
    this.KinectDevice.DepthStream.Format);
```

Mapping on Color  
Coordinate system



```
    ColorImagePoint point = this.KinectDevice.MapSkeletonPointToColor(skPoint,  
        this.KinectDevice.ColorStream.Format);
```

```
    // Scale point to actual dimension of container
```

```
    point.X = point.X * (int)this.LayoutRoot.ActualWidth /  
        this.KinectDevice.DepthStream.FrameWidth;
```

```
    point.Y = point.Y * (int)this.LayoutRoot.ActualHeight /  
        this.KinectDevice.DepthStream.FrameHeight;
```

```
    return new Point(point.X, point.Y);
```

```
}
```

# Choosing Skeletons

Using the **AppChoosesSkeletons** property and **ChooseSkeletons** method is possible select which skeletons to track:

---

<b>AppChoosesSkeletons</b>	<b>What it means</b>
False(default)	The skeleton engine chooses the <b>first two skeletons</b> available for tracking (selection process is <b>unpredictable</b> )
True	To manually select which skeletons to track call the <b>ChooseSkeletons</b> method passing in the <b>TrackingIDs</b> of the skeletons you want to track.

---

The **ChooseSkeletons** method accepts one, two, or no **TrackingIDs**. The skeleton engine stops tracking all skeletons when the ChooseSkeletons method is passed no parameters.

# Choosing Skeletons(2)

Call `ChooseSkeletons` when `AppChoosesSkeletons==false` throws an `InvalidOperationException`.

If `AppChoosesSkeletons` is set to `true` before the `SkeletonStream` is enabled, no skeletons are actively tracked until call `ChooseSkeletons`.

Skeletons automatically selected for tracking before setting `AppChoosesSkeletons` is set to `true` continue to be actively tracked until the skeleton leaves the scene or is manually replaced. If the automatically selected skeleton leaves the scene, it is not automatically replaced.

Any skeletons manually chosen for tracking continue to be tracked after `AppChoosesSkeletons` is set to `false` until the skeleton leaves the scene.

# Gesture Interaction

How to design a gesture?



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# Gesture

What is a gesture?

An action intended to communicate feelings or intentions

What is “Gesture Detection” or “Gesture Recognition”?

Computer’s ability to understand human gestures as input

First used in 1963 with pen-based input device

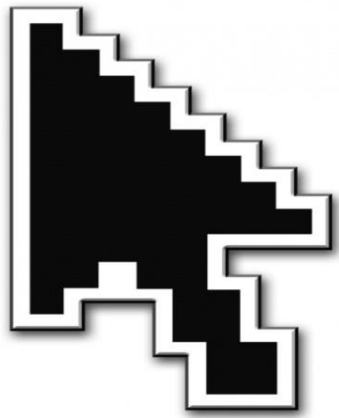
What is it used for?

Mouse movements, Handwriting recognition, Sign language, recognition, Touch screen input, Kinect

# Interaction metaphors

Depends on the task

Important aspect in design of UI



**Cursors (hands tracking):**  
Target an object



**Avatars (body tracking):**  
Interaction with virtual space



# The shadow/mirror effect



## Shadow Effect

I see the back of my avatar  
Problems with Z movements



## Mirror Effect

I see the front of my avatar  
Problem with mapping left/right movements

How to design a  
gesture?

# User Interaction

Game mindset  $\neq$  UI mindset



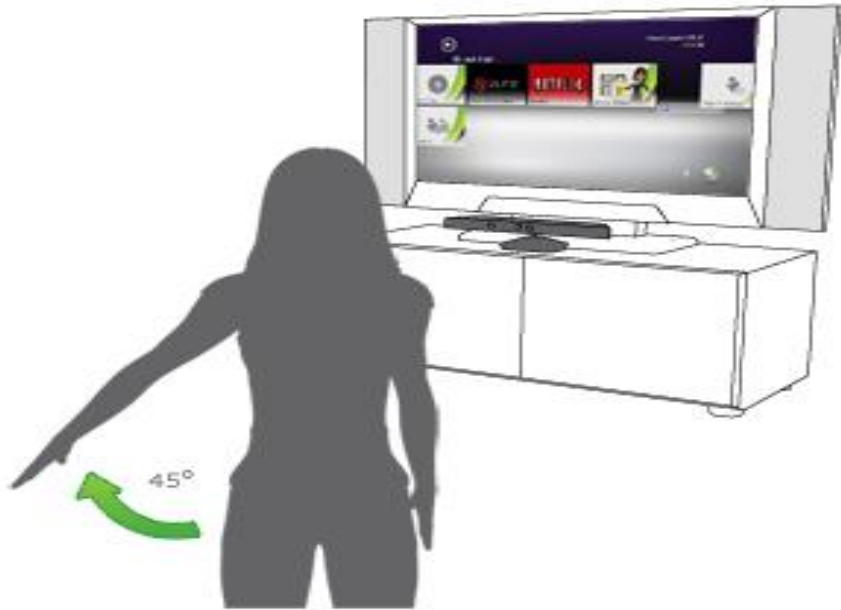
Challenging = fun



Challenging = easy and effective

# Gesture semantically fits user task

Abstract



Meaningful



# User action fits UI reaction



System's UI feedback relates to the user's physical movement

# User action fits UI reaction



System's UI feedback relates to the user's physical movement

# Gestures family-up



Each gesture feels related and cohesive with entire gesture set

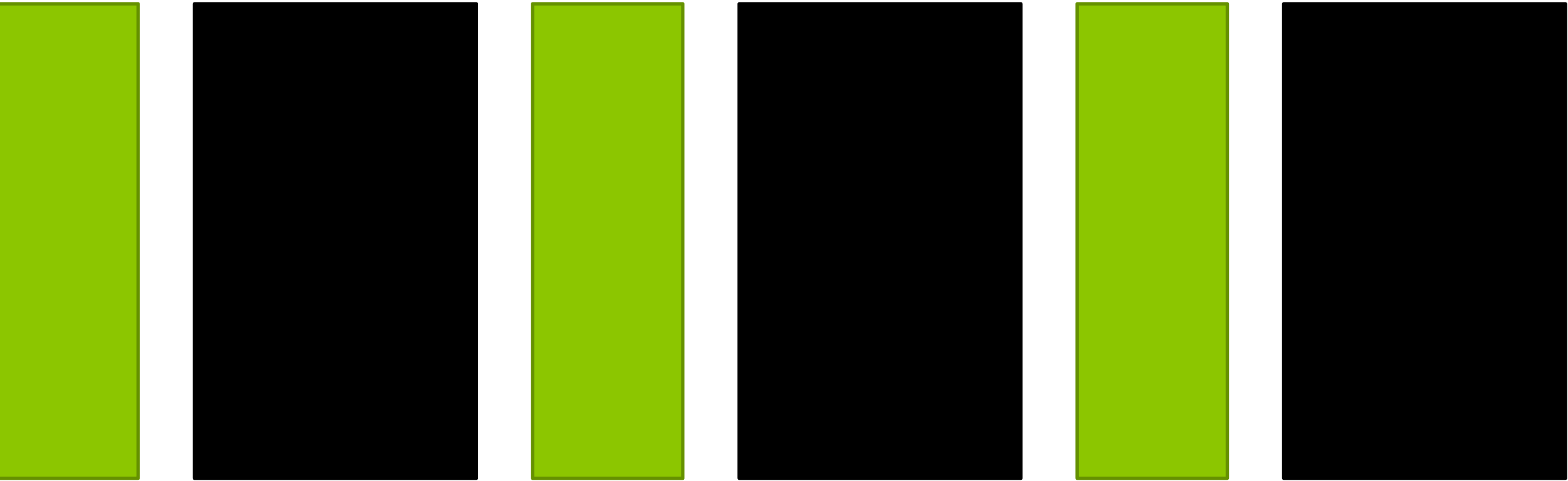
# Handed gestures



Different gesture depending on hand: only left hand can do gesture A

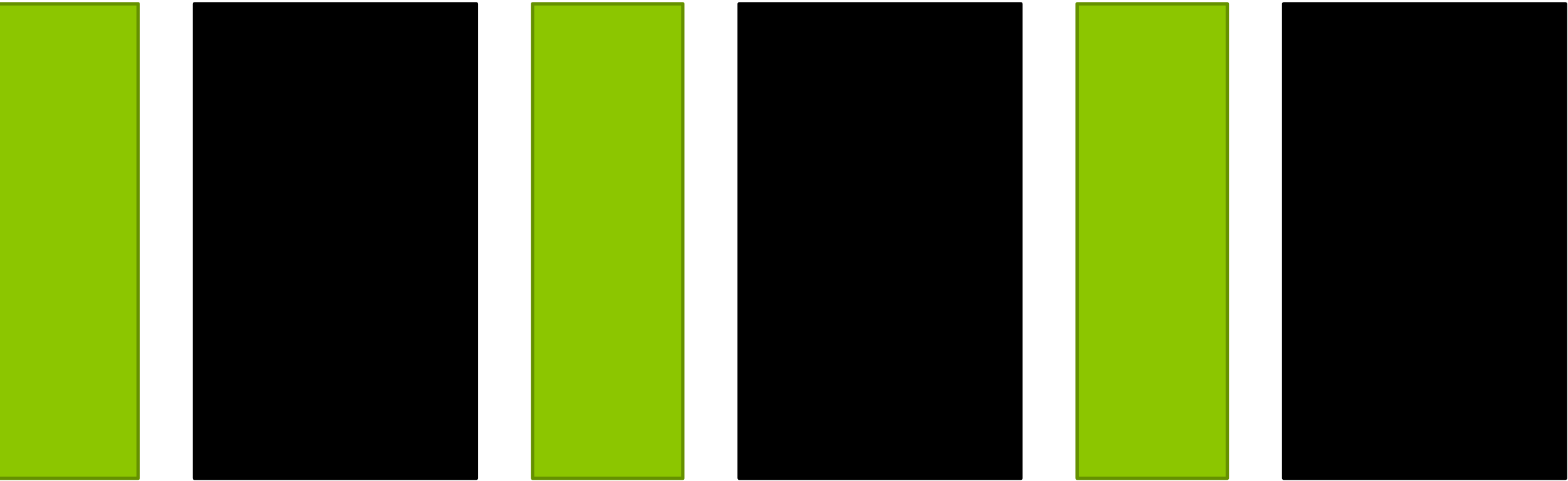


# Repeating Gesture?



Will users want/need to perform the proposed gesture repeatedly?

# Repeating Gesture?



Will users want/need to perform the proposed gesture repeatedly?

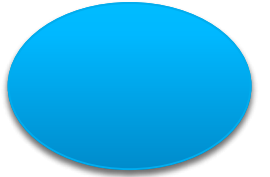
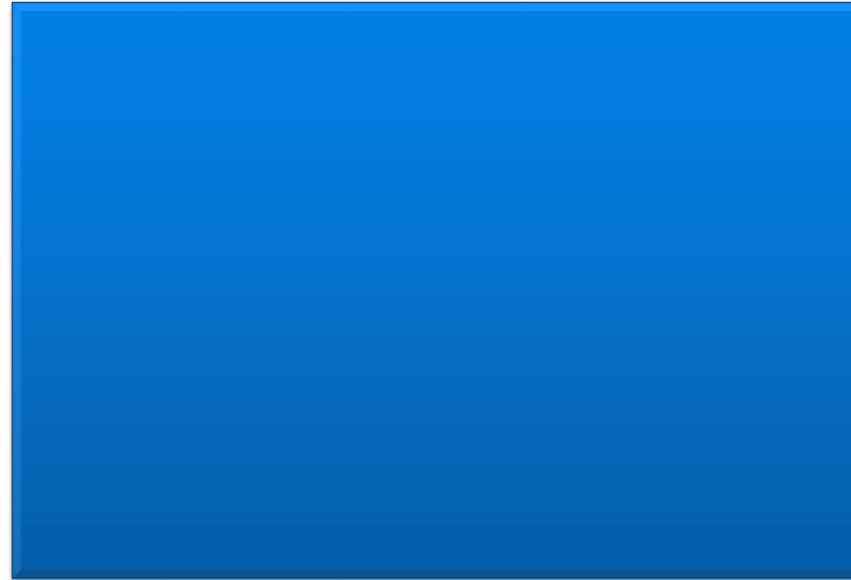
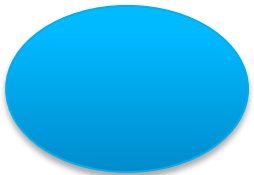
# Number of Hands



One-handed gestures are preferred

# Symmetrical two-handed gesture

Two hand gesture should be symmetrical



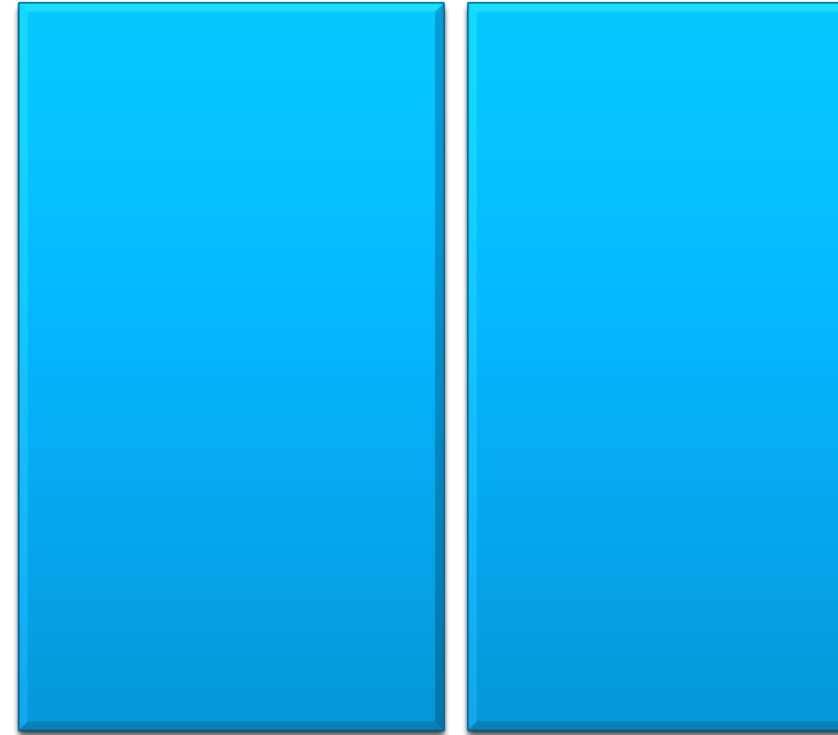
# Gesture payoff



Interactions requiring more work and effort should have a higher payoff

# Fatigue kills gesture

Fatigue is the start of downward that kills gesture



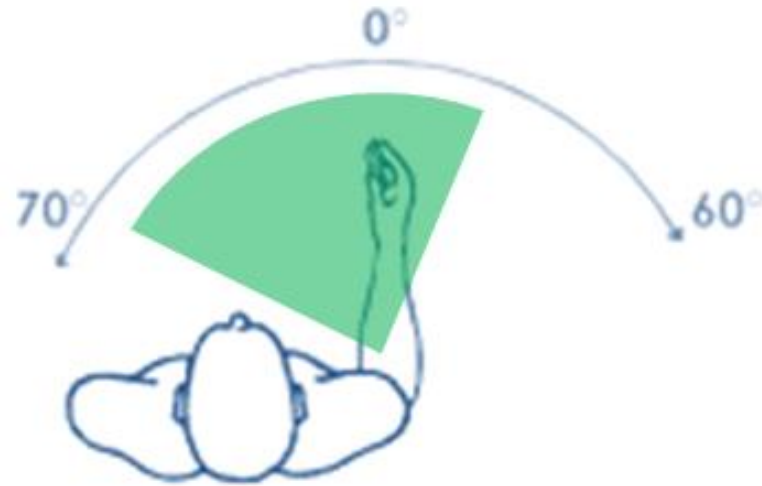
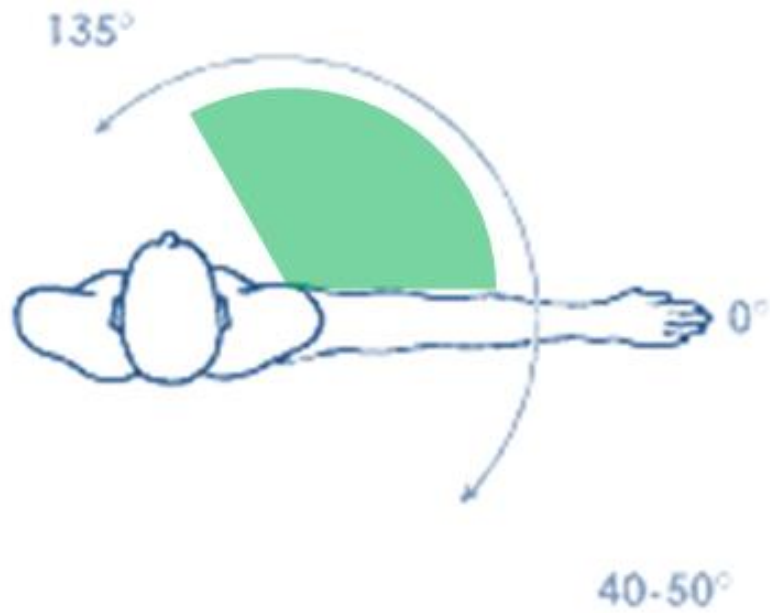
Fatigue increase messiness → poor performance →  
frustration → bad UX

# Gorilla Arm problem

Try to raise  
your arm for  
10 minutes...



# Comfortable positions





# User Posture

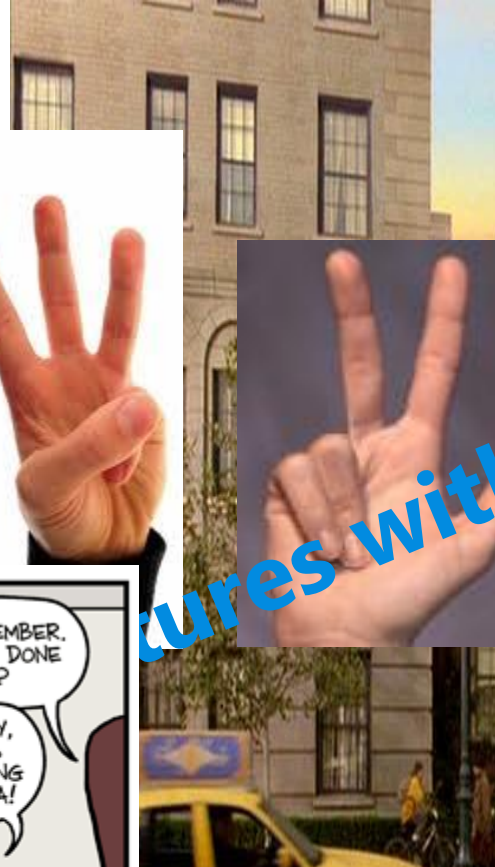
User posture may affect design of a gesture



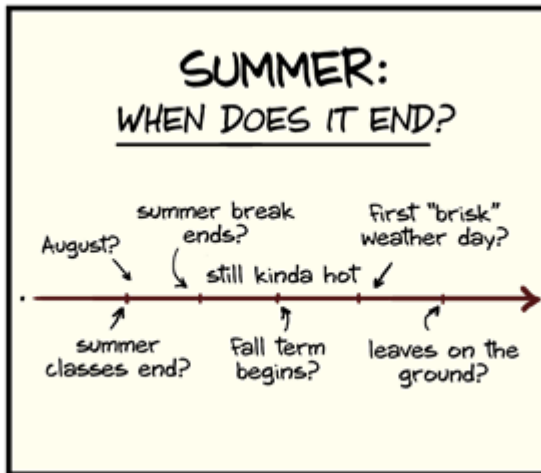
# The challenges

Environment

Input variability



ures with



WWW.PHDCOMICS.COM



# Gesture Recognition

Artificial Intelligence for Kinect



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@MatteoValoriani

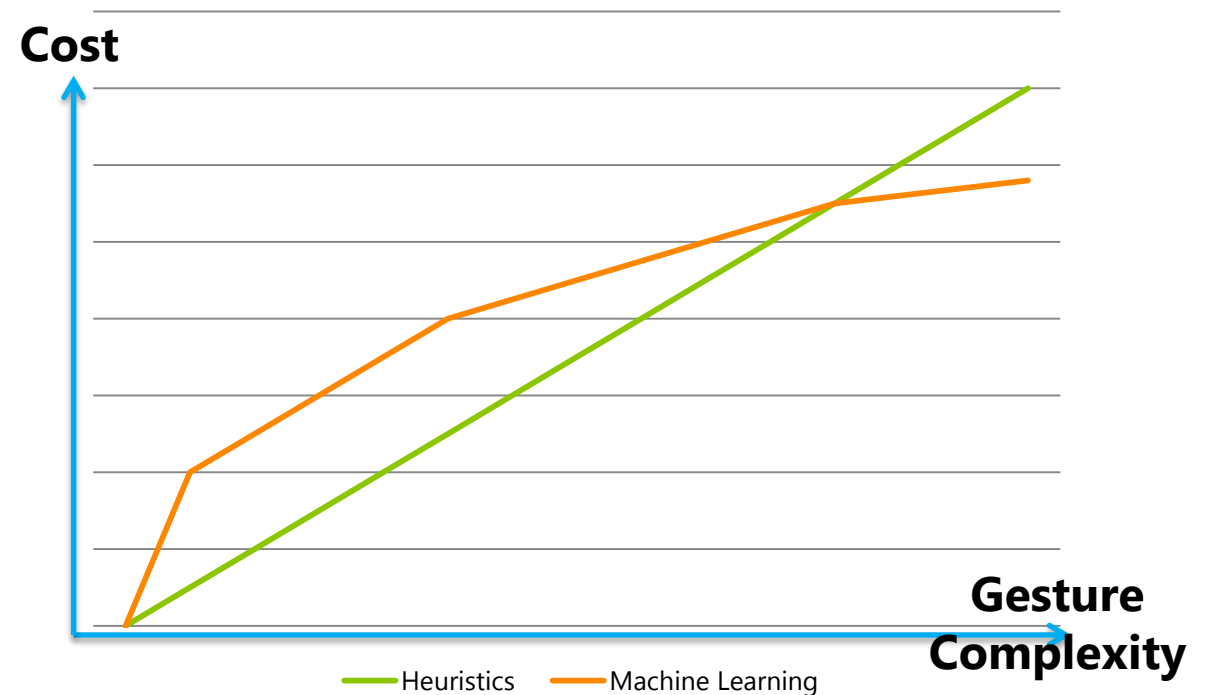
# Heuristics

Experience-based techniques for problem solving, learning, and discovery

Cost effective

Helps reconstruct missing information

Helps compute outcome of a gesture



# Define What Constitutes a Gesture

Some players have more energy (or enthusiasm) than others

Some players will “optimize” their gestures

Most players will not perform the gesture precisely as intended

# Define Key Stages of a Gesture

## Determine

When the gesture begins

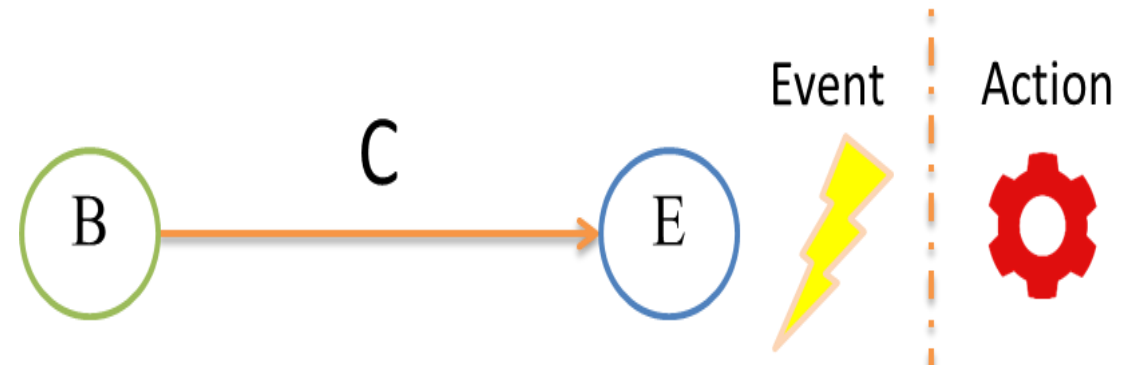
When the gesture ends

## Determine other key stages

Changes in motion direction

Pauses

...



## Definite gesture

Contact or release point

Direction

Initial velocity

## Continuous gesture

Frequency

Amplitude

# Detection Filter Only When Necessary!

Define clear context for when a gesture is expected

Provide clear feedback to the player

Run the gesture filter when the context warrants it

Cancel the gesture if context changes

# Causes of Missing Information

## Self Occlusion

Side poses

Player's position in play space

## Obstacles

Other players

Furniture

## Outside the camera's field of view

Left or right (easy to fix)

Top or bottom (hard to avoid)



# Algorithmic Detection

Wave Gesture Detection Sample

# Gesture Definition

Define gesture algorithmically:

Hand above elbow

Hand in front of shoulder

Hand moving long enough in same direction

Hand moving at certain velocity

Count number of direction changes

```
if(hand.y - elbow.y > threshold) &&  
    (hand.z - shoulder.z < threshold) &&  
    (hand.y - preHand.y < threshold) &&  
    ((hand.x - preHand.x)/dt < threshold)
```

# Implementation Overview

Set threshold

Calculate hand position

Calculate hand movement

Update wave state

# code

Static Postures: HandOnHead



```

class GestureRecognizer {
    public Dictionary<JointType, List<Joint>> skeletonSerie = new Dictionary<JointType, List<Joint>>() {
        { JointType.AnkleLeft, new List<Joint>() },
        { JointType.AnkleRight, new List<Joint>() },
        { JointType.ElbowLeft, new List<Joint>() },
        { JointType.ElbowRight, new List<Joint>() },
        { JointType.FootLeft, new List<Joint>() },
        { JointType.FootRight, new List<Joint>() },
        { JointType.HandLeft, new List<Joint>() },
        { JointType.HandRight, new List<Joint>() },
        { JointType.Head, new List<Joint>() },
        { JointType.HipCenter, new List<Joint>() },
        { JointType.HipLeft, new List<Joint>() },
        { JointType.HipRight, new List<Joint>() },
        { JointType.KneeLeft, new List<Joint>() },
        { JointType.KneeRight, new List<Joint>() },
        { JointType.ShoulderCenter, new List<Joint>() },
        { JointType.ShoulderLeft, new List<Joint>() },
        { JointType.ShoulderRight, new List<Joint>() },
        { JointType.Spine, new List<Joint>() },
        { JointType.WristLeft, new List<Joint>() },
        { JointType.WristRight, new List<Joint>() }
    };
}

```

```
protected List<DateTime> timeList;
```

```

private static List<JointType> typesList = new List<JointType>() {
    JointType.ElbowLeft, JointType.ElbowRight, JointType.FootLeft, JointType.FootRight, JointType.HandLeft,
    JointType.HandRight, JointType.Head, JointType.HipCenter, JointType.HipLeft, JointType.HipRight, JointType.KneeLeft,
    JointType.KneeRight, JointType.ShoulderCenter, JointType.ShoulderLeft, JointType.ShoulderRight, JointType.Spine,
    JointType.WristLeft, JointType.WristRight };
//... continue
}

```

Key	Value
AnkleLeft	<V <sub>t1</sub> , V <sub>t2</sub> , V <sub>t3</sub> , V <sub>t4</sub> ...>
AnkleRight	<V <sub>t1</sub> , V <sub>t2</sub> , V <sub>t3</sub> , V <sub>t4</sub> ...>
ElbowLeft	<V <sub>t1</sub> , V <sub>t2</sub> , V <sub>t3</sub> , V <sub>t4</sub> ...>


```
const int bufferLength=10;
```

```
public void Recognize(JointCollection jointCollection, DateTime date)    {  
    timeList.Add(date);  
    foreach (JointType type in typesList)    {  
        skeletonSerie[type].Add(jointCollection[type]);  
        if (skeletonSerie[type].Count > bufferLength)    {  
            skeletonSerie[type].RemoveAt(0);  
        }  
    }  
    startRecognition();  
}
```

```
List<Gesture> gesturesList = new List<Gesture>();
```

```
private void startRecognition()    {  
    gesturesList.Clear();  
    gesturesList.Add(HandOnHeadReconizerRT(JointType.HandLeft,  
                                           JointType.ShoulderLeft));  
    // Do ...  
}
```

```
Boolean isHOHRecognitionStarted;
DateTime StartTimeHOH = DateTime.Now;
private Gesture HandOnHeadReconizerRT (JointType hand, JointType shoulder)    {
    // Correct Position
    if (skeletonSerie[hand].Last().Position.Y > skeletonSerie[shoulder].Last().Position.Y + 0.2f) {
        if (!isHOHRecognitionStarted)    {
            isHOHRecognitionStarted = true;
            StartTimeHOH = timeList.Last();
        }
        else    {
            double totalMilliseconds = (timeList.Last() - StartTimeHOH).TotalMilliseconds;
            // time ok?
            if ((totalMilliseconds >= HandOnHeadMinimalDuration))    {
                isHOHRecognitionStarted = false;
                return Gesture.HandOnHead;
            }
        }
    }
    else { //Incorrect Position
        if (isHOHRecognitionStarted)    {
            isHOHRecognitionStarted = false;
        }
    }
    return Gesture.None;    }
}
```



Alternative: count  
number of  
occurrences

# How to notify a gesture?

Synchronous Solution: Return `gesturesList` to GUI

Asynchronous Solution: Use Event

```
public delegate void HandOnHeadHadler(object sender, EventArgs e);

public event HandOnHeadHadler HandOnHead;

private Gesture HandOnHeadReconizerRTWithEvent(JointType hand, JointType shoulder) {

    Gesture g = HandOnHeadReconizerRT(hand, shoulder);

    if (g == Gesture.HandOnHead) {

        if (HandOnHead != null) HandOnHead(this, EventArgs.Empty);

    }

    return g;}

}
```



# code

Swipe



```
const float SwipeMinimalLength = 0.08f;
const float SwipeMaximalHeight = 0.02f;
const int SwipeMinimalDuration = 200;
const int SwipeMaximalDuration = 1000;
const int MinimalPeriodBetweenGestures = 0;
```

```
private Gesture HorizontalSwipeRecognizer(List<Joint> positionList) {
    int start = 0;
    for (int index = 0; index < positionList.Count - 1; index++) {
```

```
        if ((Math.Abs(positionList[0].Position.Y - positionList[index].Position.Y) > SwipeMaximalHeight) ||
            Math.Abs((positionList[index].Position.X - positionList[index + 1].Position.X)) < 0.01f) {
            start = index;
        }
```

```
        if ((Math.Abs(positionList[index].Position.X - positionList[start].Position.X) > SwipeMinimalLength)) {
            double totalMilliseconds = (timeList[index] - timeList[start]).TotalMilliseconds;
```

```
            if (totalMilliseconds >= SwipeMinimalDuration && totalMilliseconds <= SwipeMaximalDuration) {
```

```
                if (DateTime.Now.Subtract(lastGestureDate).TotalMilliseconds > MinimalPeriodBetweenGestures) {
                    lastGestureDate = DateTime.Now;
                    if (positionList[index].Position.X - positionList[start].Position.X < 0)
                        return Gesture.SwipeRightToLeft;
                    else
                        return Gesture.SwipeLeftToRight;
                }
            }
        }
```

```
    } return Gesture.None; }
```

$\Delta_x$  too small or  $\Delta_y$  too big  $\rightarrow$  shift start

$\Delta_x >$  minimal length

$\Delta_t$  in the accepted range

```
public delegate void SwipeHandler(object sender, EventArgs e);
public event SwipeHandler Swipe;
```

```
private Gesture HorizontalSwipeRecognizer(JointType jointType) {
    Gesture g = HorizontalSwipeRecognizer(skeletonSerie[jointType]);
    switch (g) {
        case Gesture.None:
            break;
        case Gesture.SwipeLeftToRight:
            if (Swipe != null) Swipe(this, new EventArgs("SwipeLeftToRight"));
            break;
        case Gesture.SwipeRightToLeft:
            if (Swipe != null) Swipe(this, new EventArgs("SwipeRightToLeft"));
            break;
        default:
            break;
    }

    return g;
}
```

```
...
public class EventArgs : EventArgs
{
    public string text;
    public EventArgs(string text) { this.text = text; }
}
```

Personalized EventArgs



# demo

Heuristic Based Gesture Detection:  
FAAST



# Pros & Cons

## PROs

- Easy to understand
- Easy to implement (for simple gestures)
- Easy to debug

## CONs

- Challenging to choose best values for parameters
- Doesn't scale well for variants of same gesture
- Gets challenging for complex gestures
- Challenging to compensate for latency

## Recommendation

Use for simple gestures (like Hand wave, Head movement, ...)

# Weighted Networks Based Gesture Detection

Jump Gesture Detection Sample

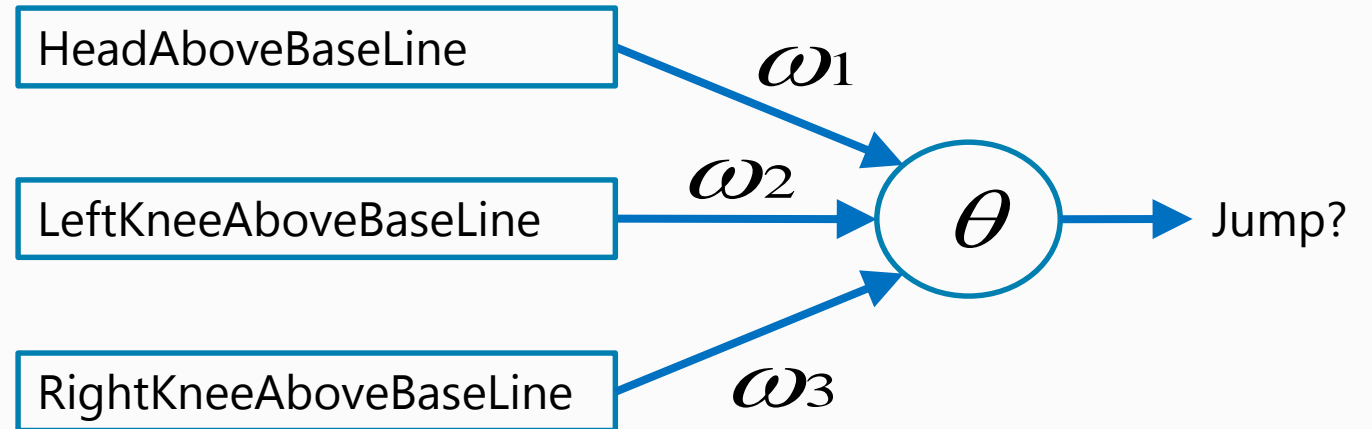
# Gesture Definition

Define gesture as weighted network

Simple neural network

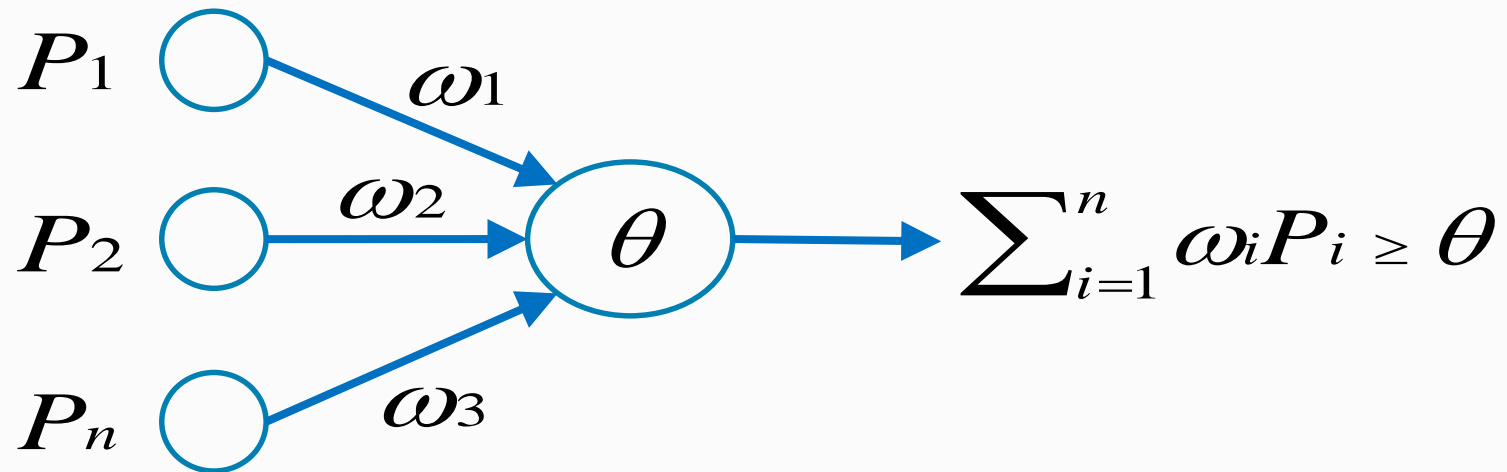
Simple algorithmic gestures as input nodes

Use fuzzy logic, i.e. probabilities, not Booleans



# Perceptron

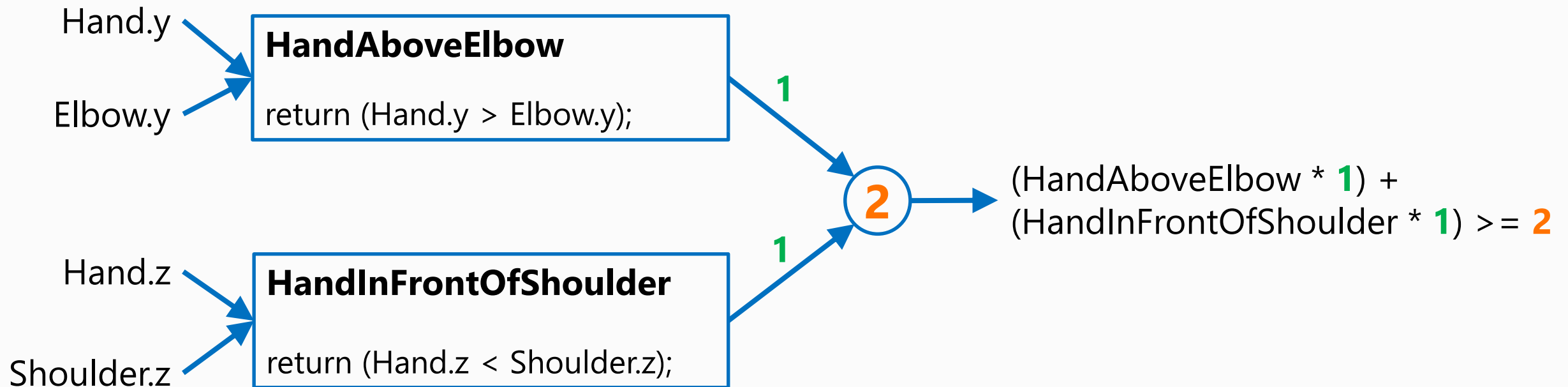
Simple network using weighted threshold elements





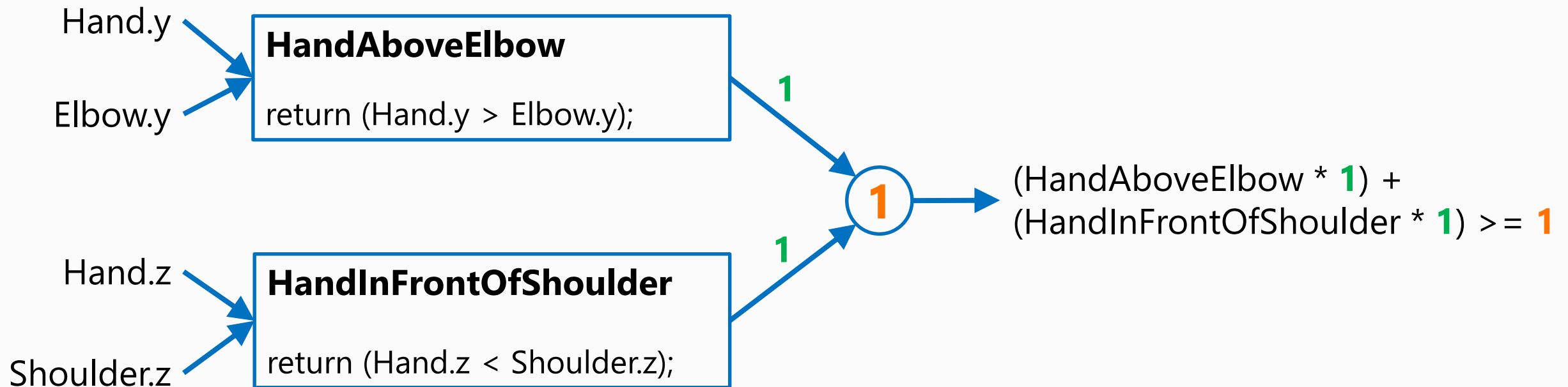
# Example

HandAboveElbow AND HandInFrontOfShoulder



# Example

HandAboveElbow OR HandInFrontOfShoulder

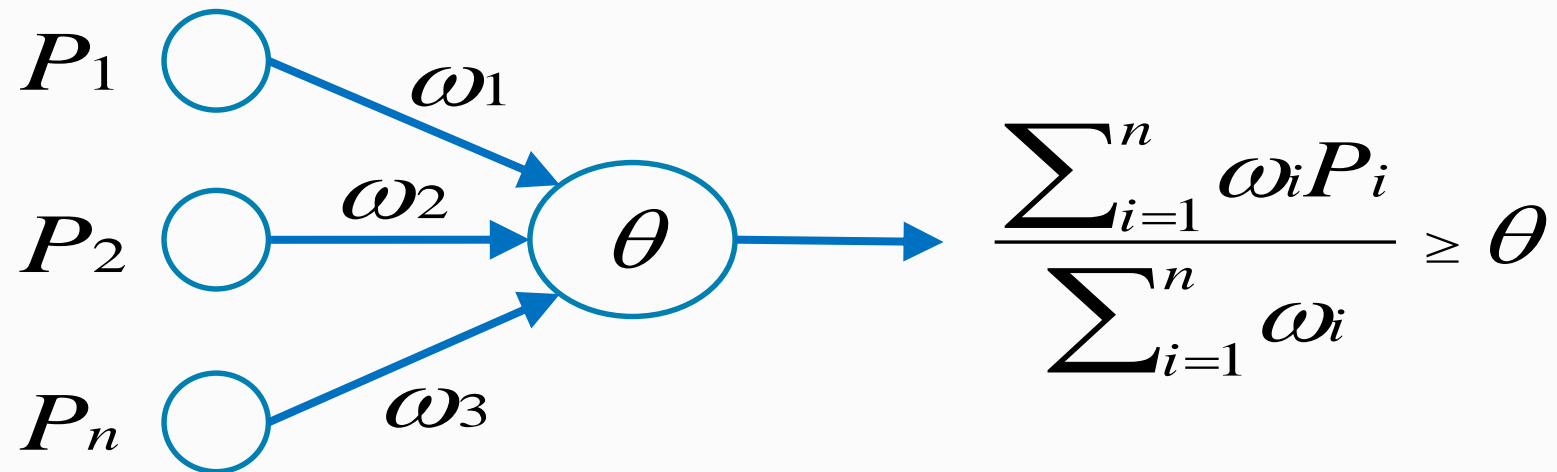


# Network Definition for Detector

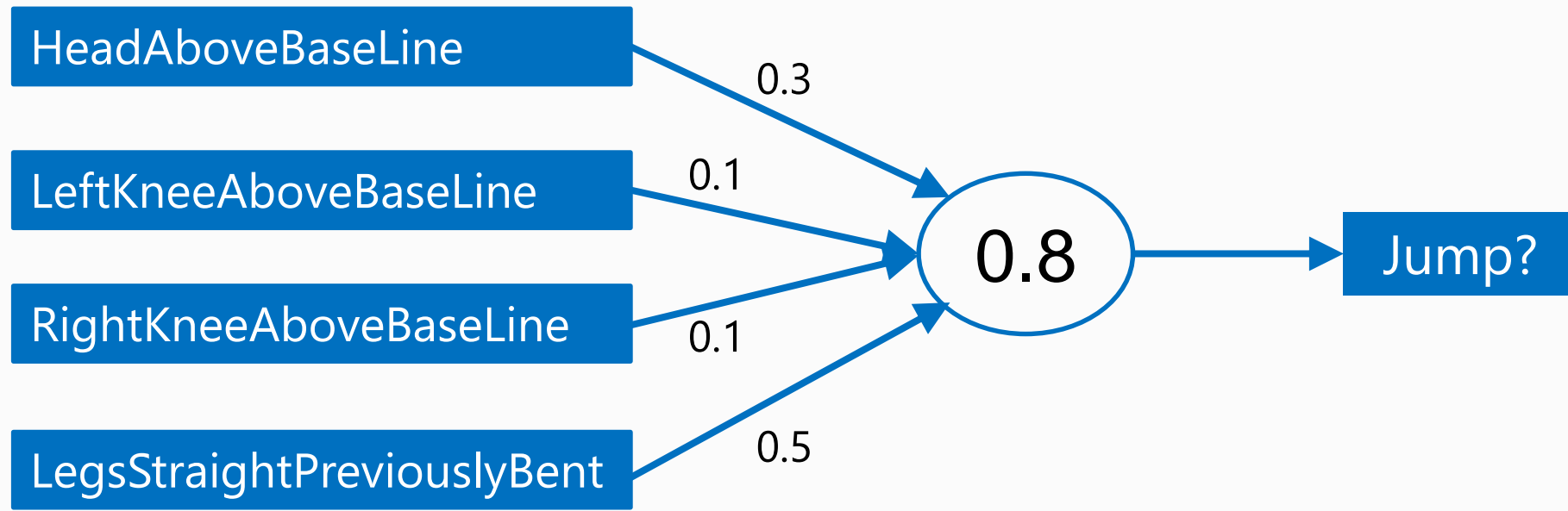
Similar to perceptron

Normalize using weights

Use probabilities, not Booleans



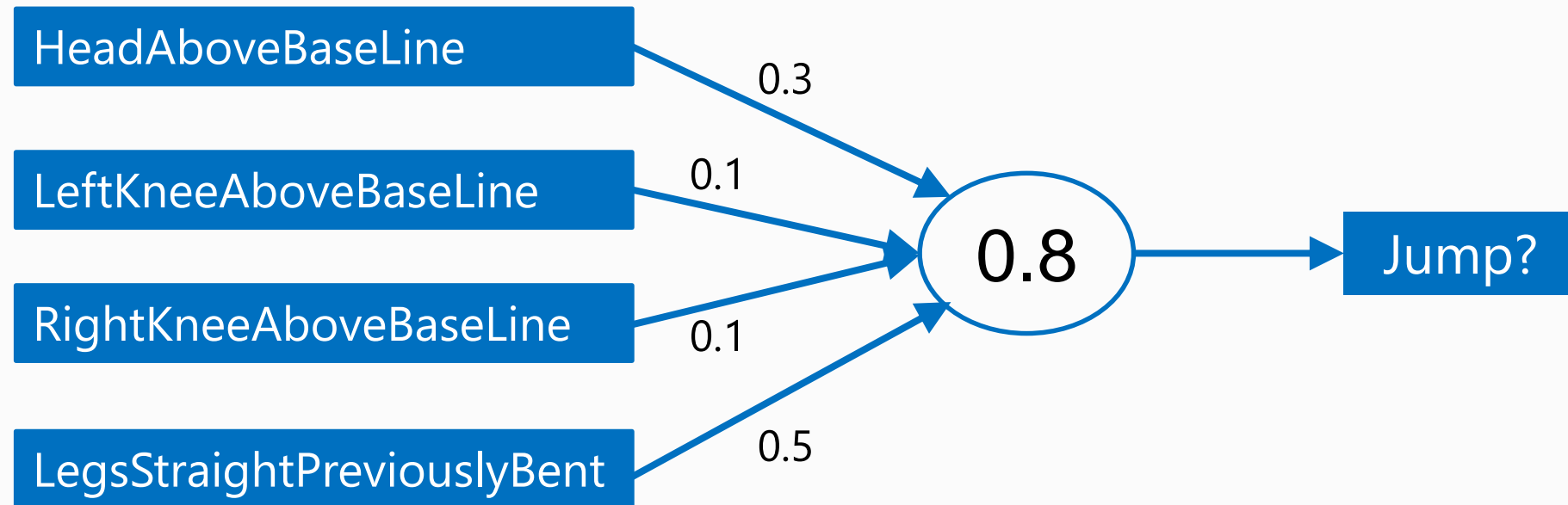
# Jump detection



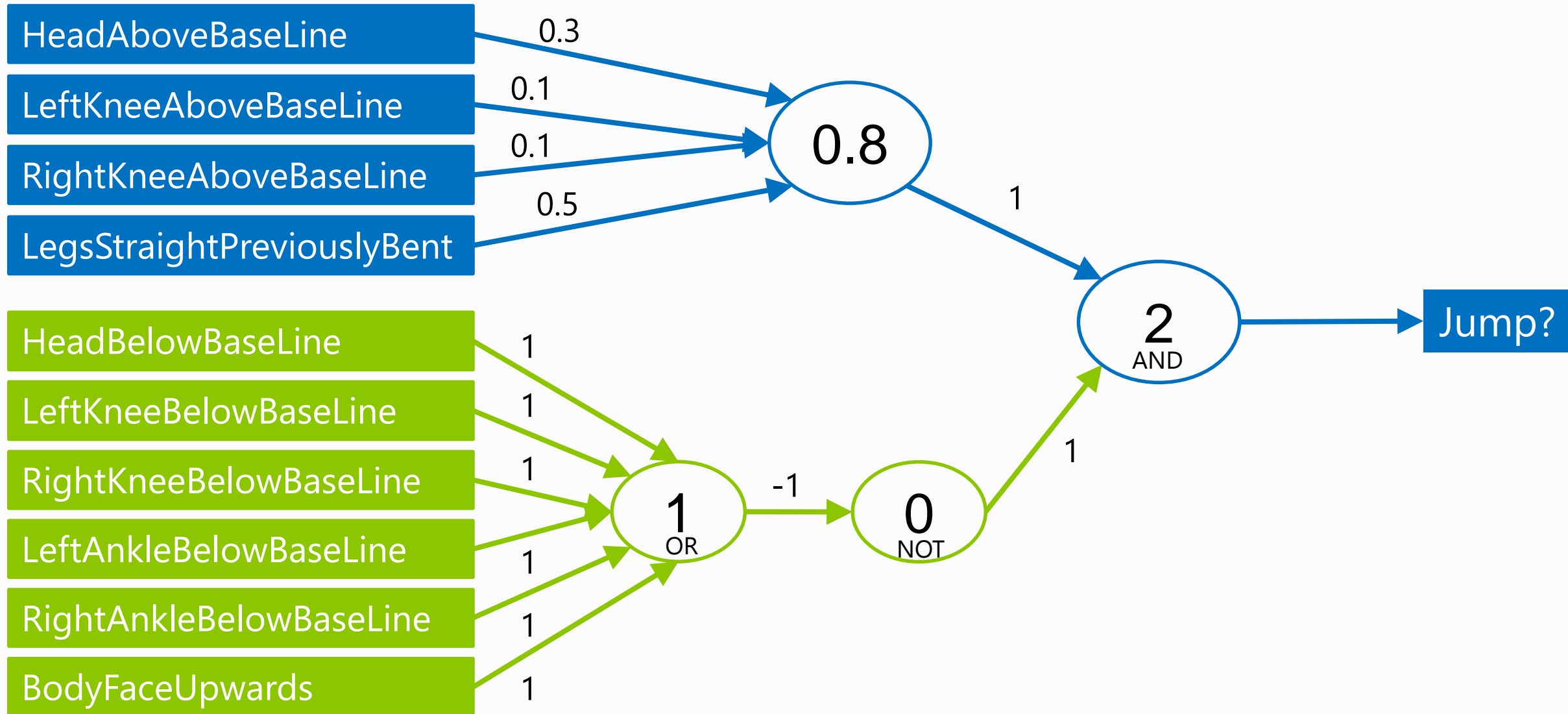
# Are we sure this is enough?

Due to noise, still many false positives

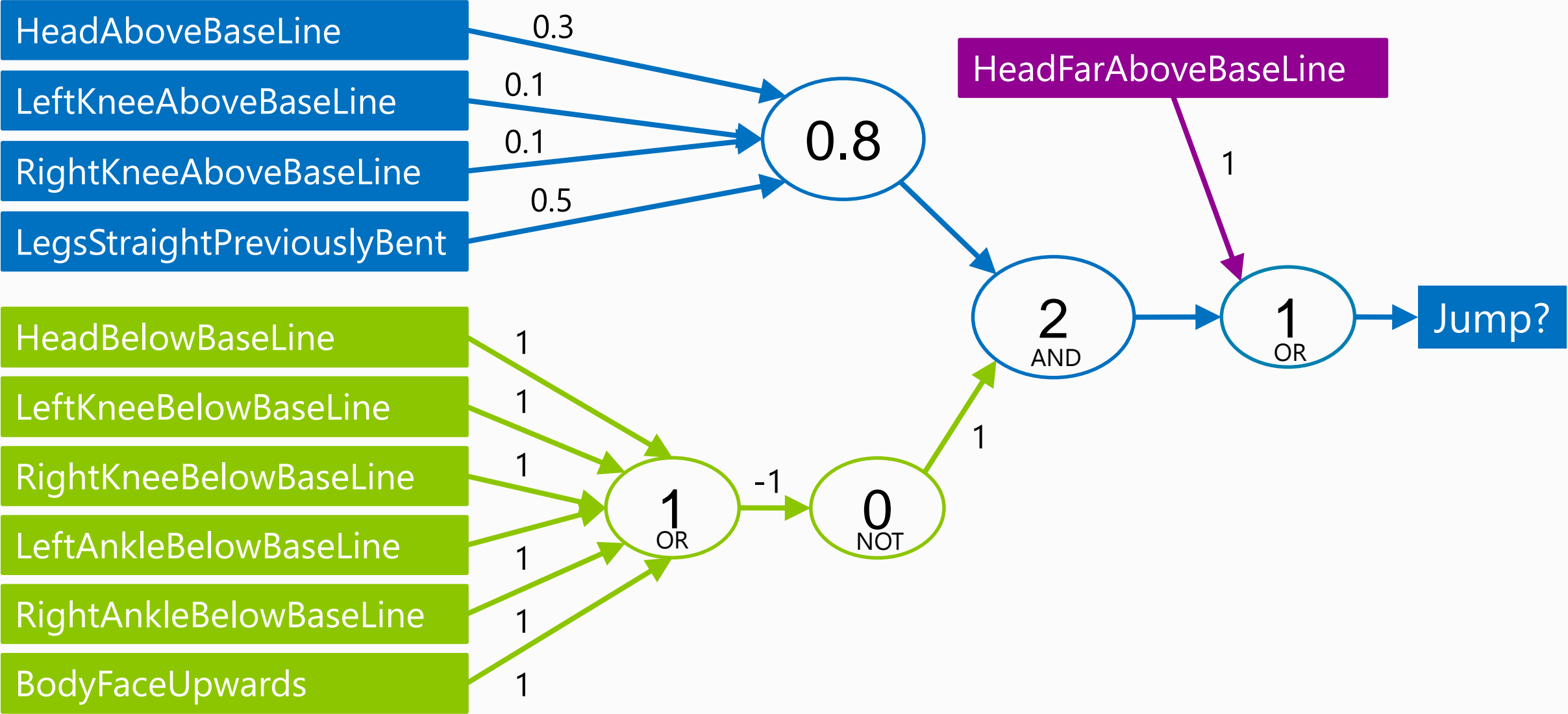
How can we reduce false positives?



# And We're Done!



# But Wait, If We Know For Sure...



# Pros & Cons

## PROs

- Complex gestures can be detected
- Good CPU performance
- Scale well for variants of same gesture
- Nodes can be reused in different gestures

## CONs

- Not easy to debug
- Challenging to compensate for latency
- Small changes in parameters can have dramatic changes in results
- Very time consuming to choose manually parameters

## Recommendation

- Use for composed gestures (Jump, duck, punch,...)
- Break complex gestures into collection of simple gestures



# Exemplar Matching Based Gesture Detection

# Gesture Definition

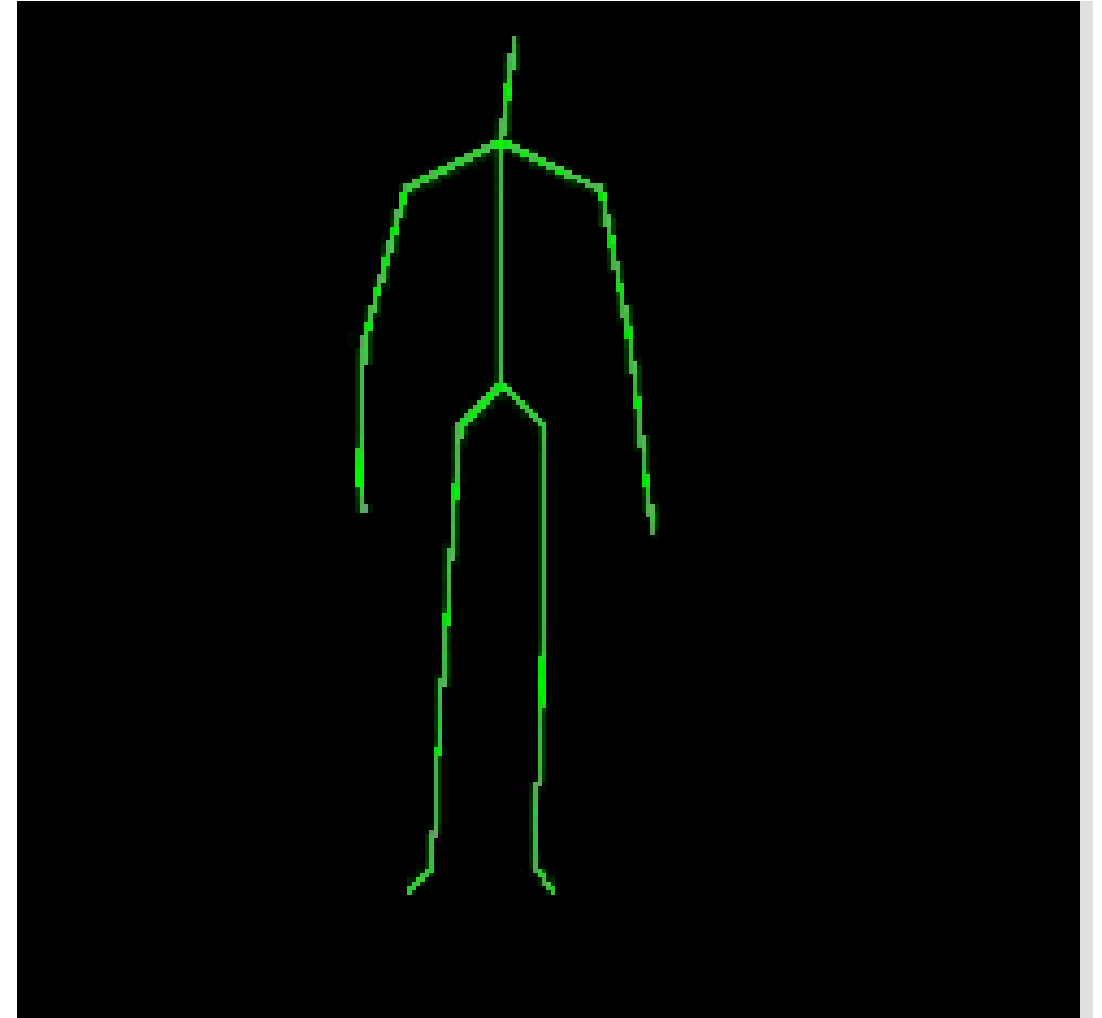
Define gesture as pre-recorded animations

Motion capture animations

Record different people doing same gesture

Each person doing same gesture multiple times

Pre-recorded animations are called Exemplars



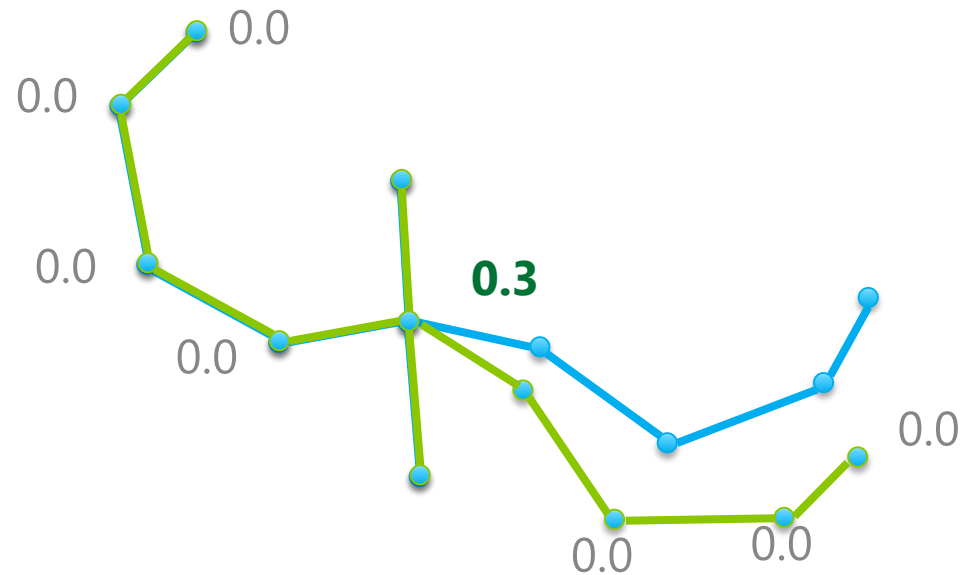
# Exemplar Matching

Need to compare skeleton frames

Define error metric for skeleton

Angular difference for each joint in local space

Peak Signal to Noise Ratio for whole skeleton



$$MSE = \frac{1}{N} \sum \text{Distance}_i^2$$

$$PSNR = 10 * \log_{10} (MAX^2 / MSE)$$

# Exemplar Matching

Search for best matching frames

Best matching frame has strongest signal

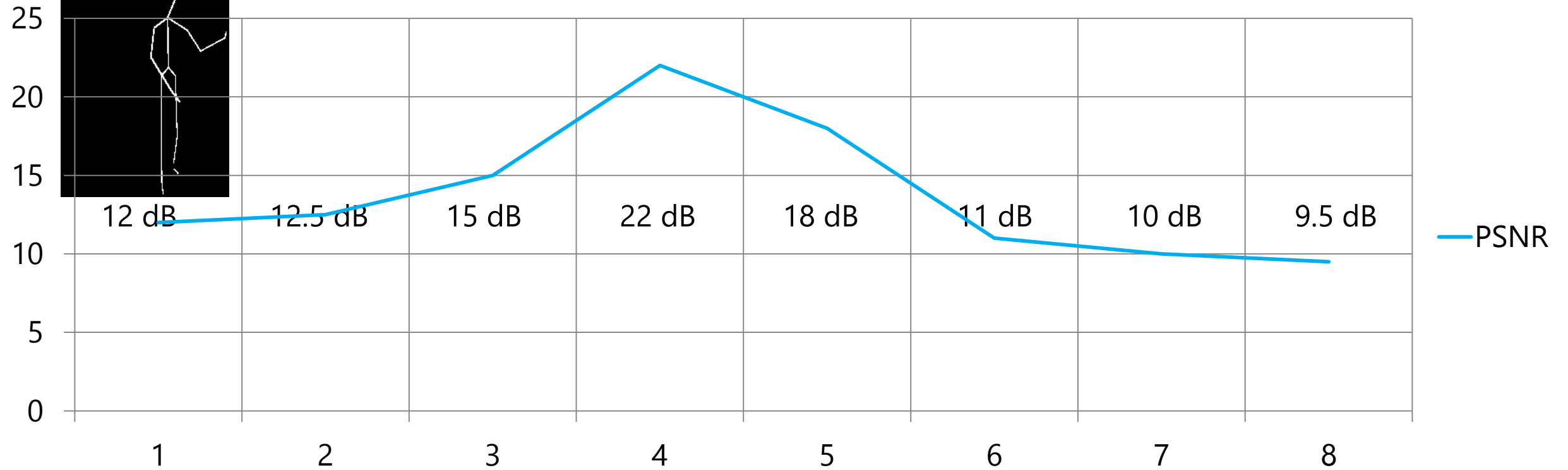
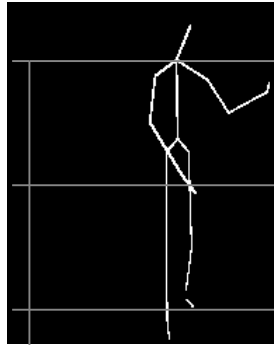
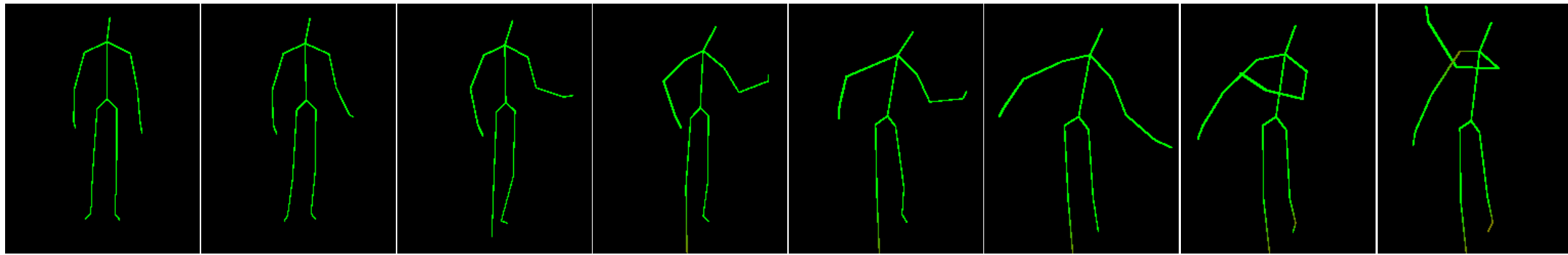
Different classifiers can be used

K-Nearest Neighbour

Dynamic Time Warping (DTW)

Hidden Markov Models (HMM)

# Exemplar Matching



# demo

DTW Based Gesture  
Detection: Swipe



# Pros & Cons

## PROs

Very complex gestures can be detected  
DTW allows for different speeds  
Can scale for variants of same gesture  
Easy to visualize exemplar matching

## CONs

Requires lots of resources to be robust  
Multiple recordings of multiple people for one gesture  
i.e. requires lots of CPU and memory

## Recommendation

Use for complex context-sensitive dynamic gestures  
- Dancing, fitness exercises,...

# Comparison

10 Gestures, 10 People,  
5 times = 500 Exemplars

K-Nearest

46 ms

DTW

156 ms

Weighted network

1 ms





# Performance

Skeleton processing is an expensive operation.

Use VS2012 Performance Tool

The screenshot displays the Visual Studio 2012 Performance Tool interface. On the left, a menu is open with 'Launch Performance Wizard...' selected. The main window shows the 'Cost Distribution' for the function `Skeleton1.MainWindow_KinectDevice_ColorFrameReady(object, class Microsoft.Kinect.ColorImageFrameReadyEventArgs)`. The performance metric is set to 'Elapsed Inclusive Time'.

**Cost Distribution Data:**

Function	Elapsed Inclusive Time
System.Windows.Application.Run(0)	922.0
Function Body	438.5
Microsoft.Kinect.ColorImageFrame.CopyPixelDataTo(uint8[])	269.6
System.Windows.Media.Imaging.Writeable...	208.5
Microsoft.Kinect.ColorImageFrameReadyE...	3.8
System.IDisposable.Dispose()	1.4

The 'Instrumentation Profiling Report' shows a line graph of CPU (% Usage) over Wall Clock Time (Seconds). The report indicates 22,587.63 milliseconds of total elapsed time.

**Hot Path Analysis:**

Function Name	Elapsed Inclusive Time %	Elapsed Exclusive Time %
Skeleton1.exe	100.00	0.00
Skeleton1.App.Main()	100.00	0.02
System.Windows.Application.Run()	99.98	88.25
Skeleton1.MainWindow_ctor()	7.12	0.00
Skeleton1.MainWindow_KinectDevice_ColorFrameReady(object, class Micr...	4.08	1.94

**Functions With Most Individual Work:**

Name	Exclusive Time %
System.Windows.Application.Run()	88.25
Microsoft.Kinect.KinectSensor.Start()	5.31
Skeleton1.MainWindow_KinectDevice_ColorFrameReady(object, class Microsoft.Kinect.ColorImageFrameRead...	1.94
Microsoft.Kinect.KinectSensor.get_KinectSensors()	1.60
Microsoft.Kinect.ColorImageFrame.CopyPixelDataTo(uint8[])	1.19

The 'Function Code View' shows the following code snippet:

```
void _KinectDevice_ColorFrameReady(object sender, ColorImageFrameReadyEventArgs e)
{
    using (ColorImageFrame frame = e.OpenColorImageFrame())
    {
        if (frame != null)
        {
            byte[] pixelData = new byte[frame.PixelDataLength];
            frame.CopyPixelDataTo(pixelData);

            this._ColorImageBitmap.WritePixels(this._ColorImageBitmapRect, pixelData,
                this._ColorImageStride, 0);
        }
    }
}
```

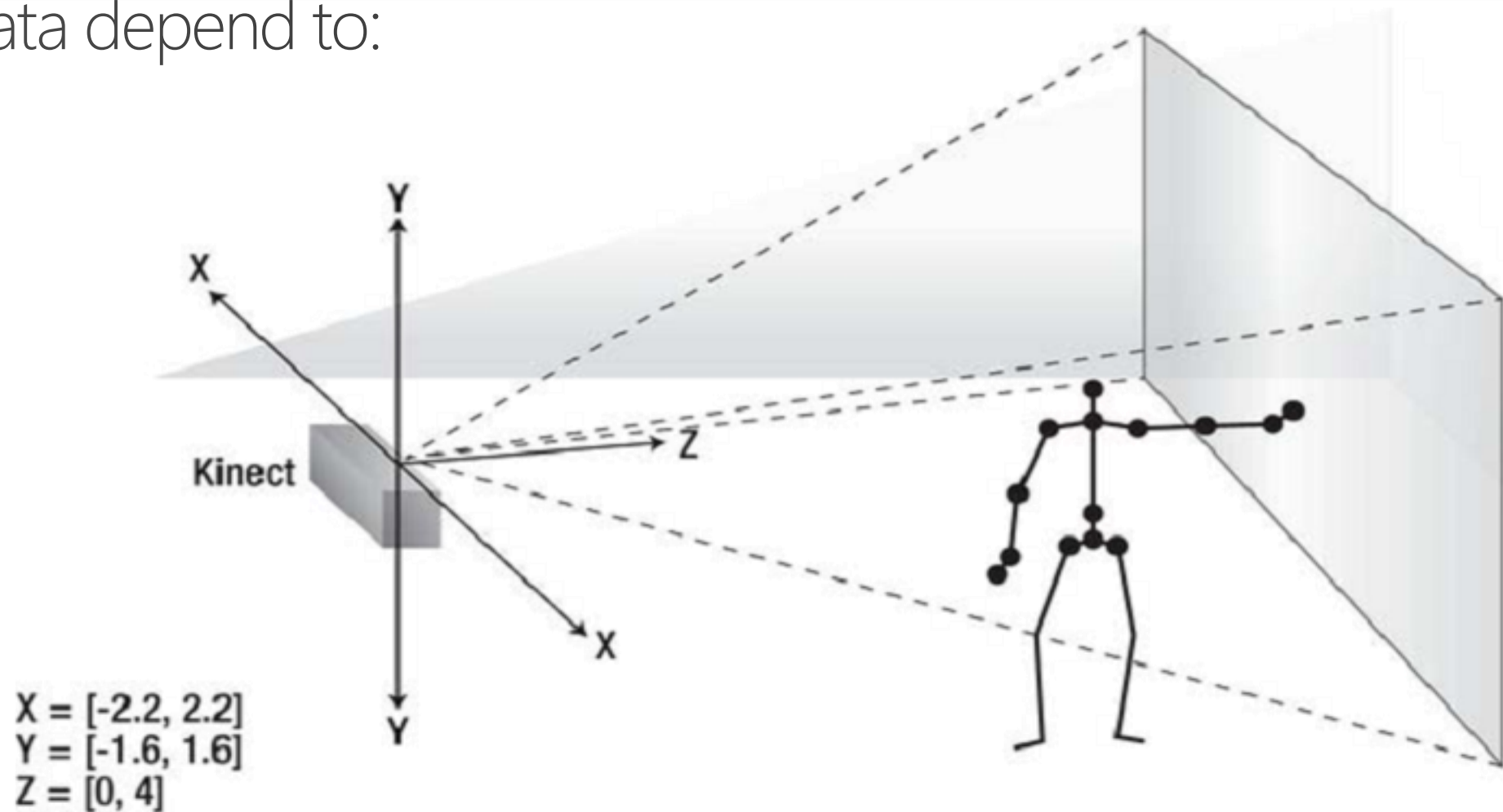
# Posture Abstraction and Normailization

# Posture Abstraction

Kinect SkeletonData depend to:

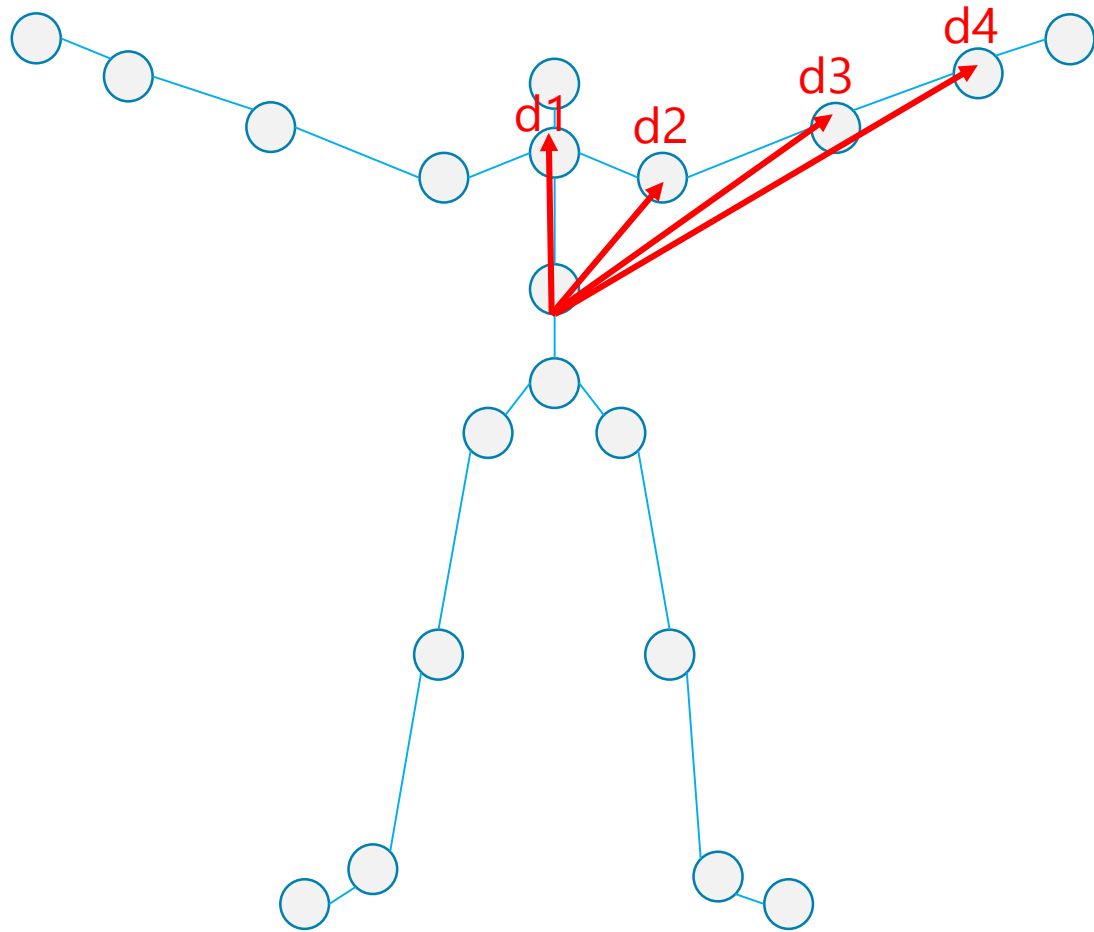
Kinect's location

User location



# Distance Model

Use distance between center of body and joints



Distances vector:

d1: 33

d2: 30

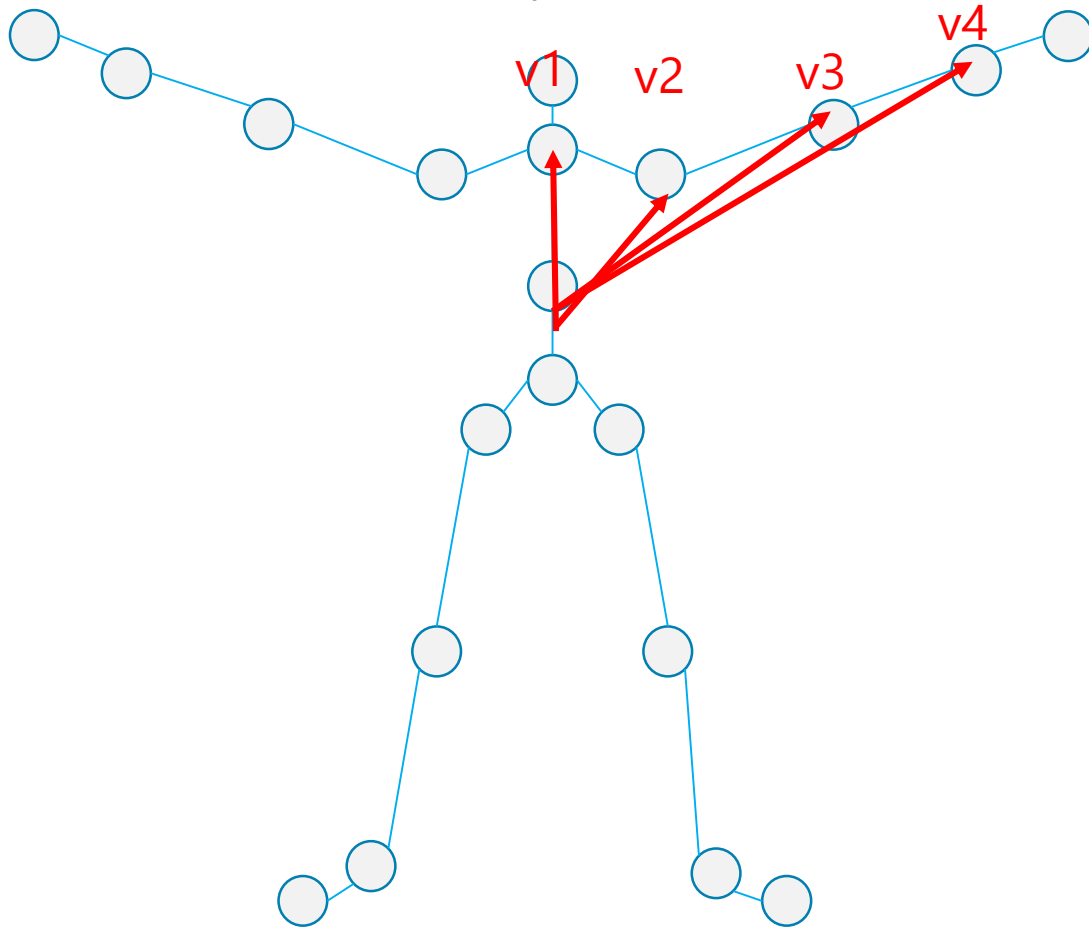
d3: 49

d4: 53

...

# Displacement Model

use displacements between center of body and joints (as distance but using difference of vector).



Displacement vector:

v1: 0, 33, 0

v2: 15, 25, 0

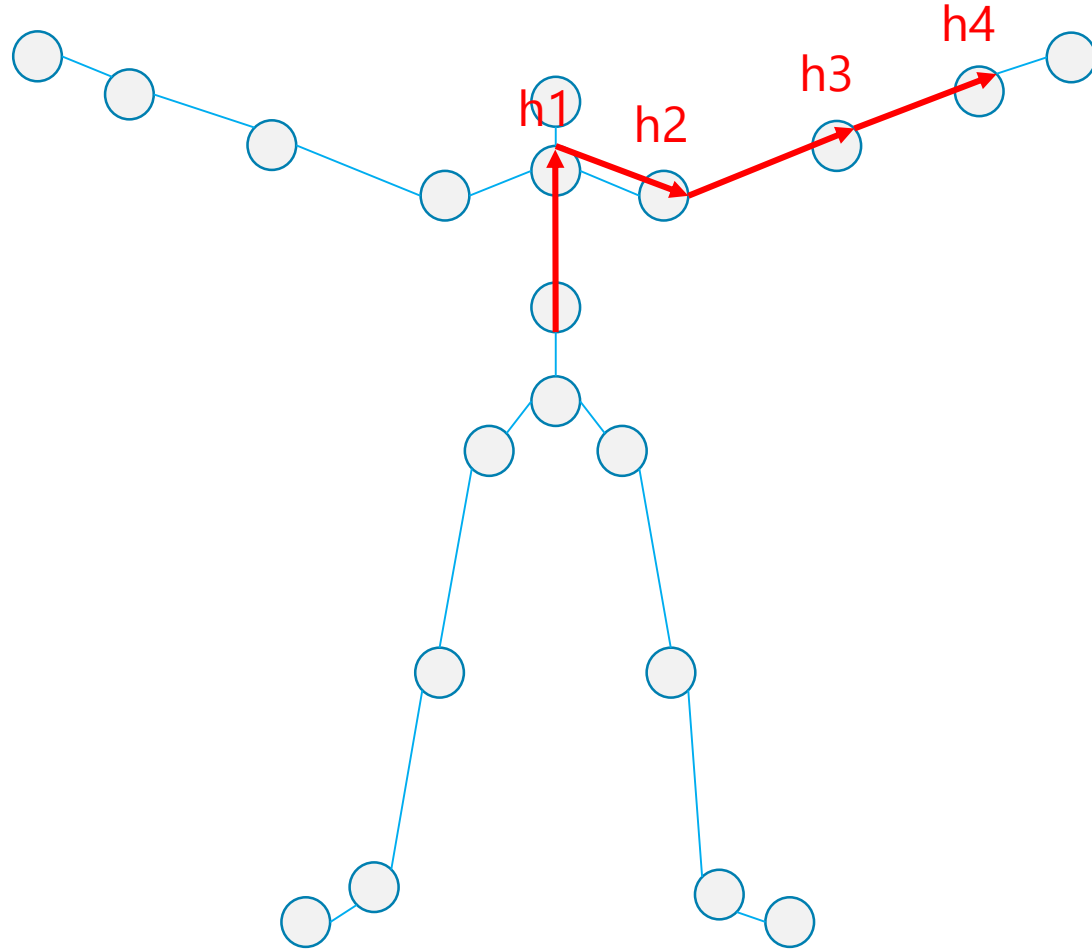
v3: 35, 27, 0

v4: 43, 32, 0

...

# Hierarchical Model

Skeletal body model as a tree where joints are nodes and the spine joint is the root. A feature represents the displacement between joint and its parent position.



Hierarchical vector:

$h_1: 0, 33, 0$

$h_2: 15, -7, 0$

$h_3: 20, 9, 0$

$h_4: 18, 9, 0$

...

# Normalization

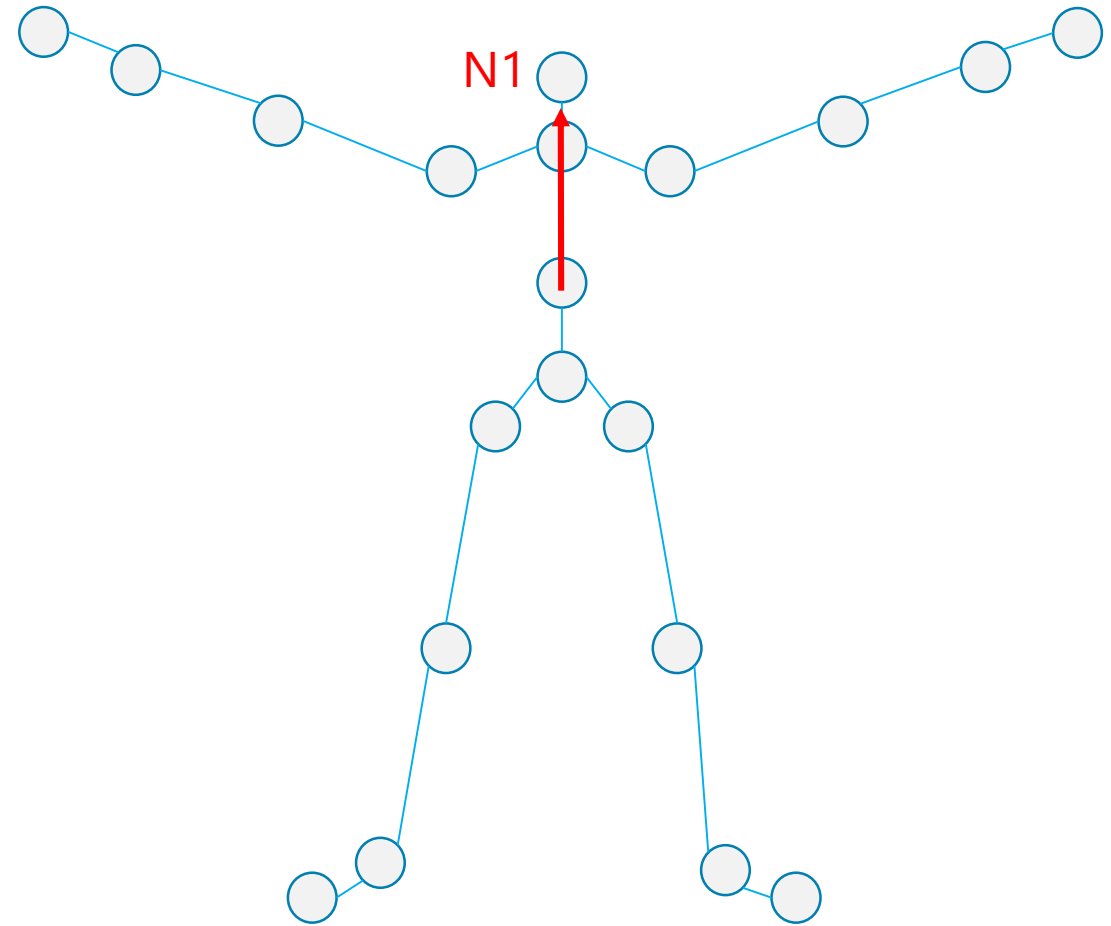
One dissimilarity source between the captured data from different individuals is related to their height.

The acquired skeletal data can be scaled properly, simply by dividing all limb lengths by a value that is proportional to a given user's height.



# Relative Normalization

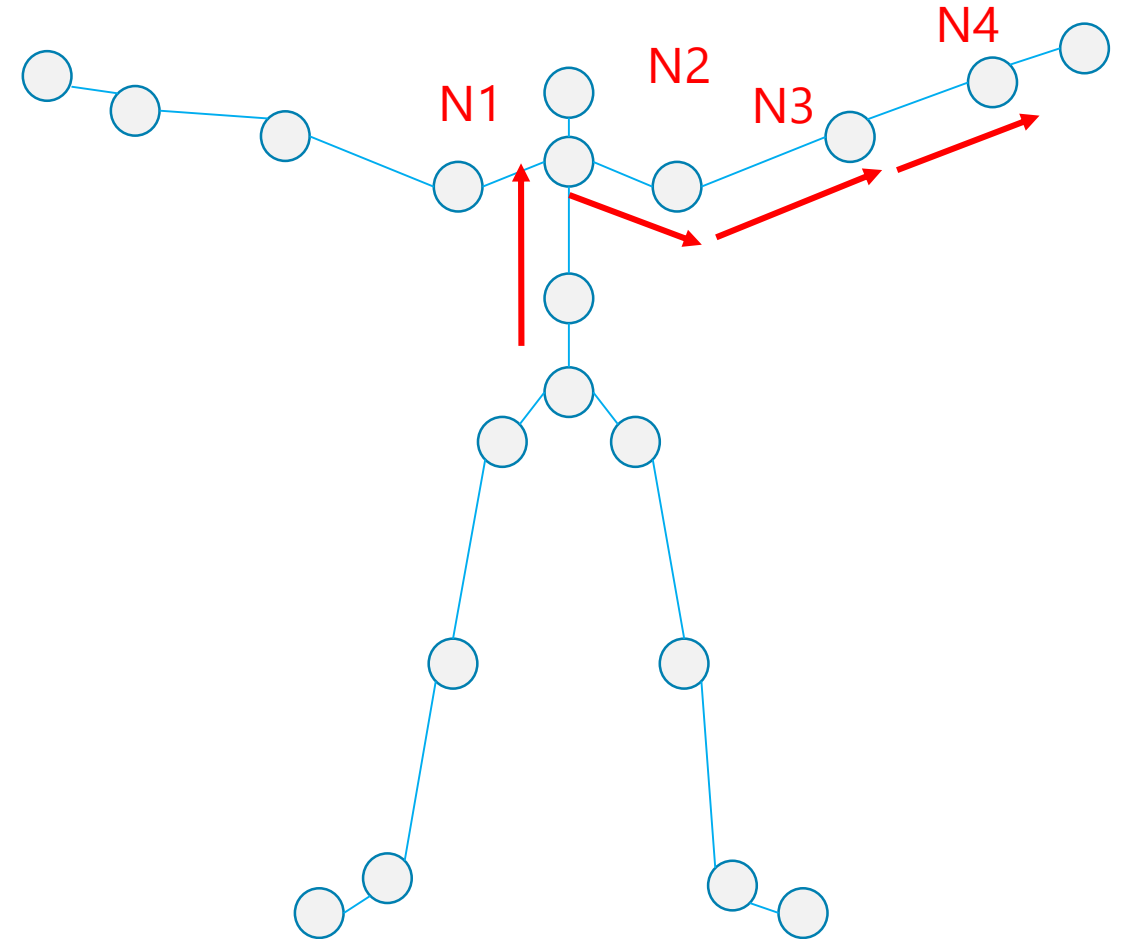
Use the distance between spine and head joints to normalize all information





# Unit Normalization

Scale all limb segments connecting two joints to unit length before computing the aforementioned features. This way, the vectors lose their length and keep their directions only.



# Speech Recognition

Artificial Intelligence for Kinect

# Several Info

The Kinect sensor's microphone array

It is an excellent input device for speech recognition-based applications.

Language Support

Improved audio quality

Beamforming and source localization

Noise problem?

Locale	Language
Australia	English
Canada	English
Canada	French
France	French
Germany	German
Ireland	English
Italy	Italian
Japan	Japanese
Mexico	Spanish
New Zealand	English
Spain	Spanish
United Kingdom	English
United States	English

# Defining a grammar

```
var directions = new Choices();
directions.Add(new SemanticResultValue("forward", "FORWARD"));
directions.Add(new SemanticResultValue("forwards", "FORWARD"));
directions.Add(new SemanticResultValue("straight", "FORWARD"));
directions.Add(new SemanticResultValue("backward", "BACKWARD"));
directions.Add(new SemanticResultValue("backwards", "BACKWARD"));
directions.Add(new SemanticResultValue("back", "BACKWARD"));
directions.Add(new SemanticResultValue("turn left", "LEFT"));
directions.Add(new SemanticResultValue("turn right", "RIGHT"));
```

```
var gb = new GrammarBuilder { Culture = ri.Culture };
gb.Append(directions);
```

```
var g = new Grammar(gb);
```

```
<grammar ...>
  <rule id="rootRule">
    <one-of>
      <item>
        <tag>FORWARD</tag>
        <one-of>
          <item>forward</item>
          <item>straight</item>
        </one-of>
      </item>
      <item>
        <tag>BACKWARD</tag>
        <one-of>
          <item>backward</item>
          <item>backwards</item>
          <item>back</item>
        </one-of>
      </item>
    </one-of>
  </rule>
</grammar>
```

# Let's see some code...

```
RecognizerInfo ri = GetKinectRecognizer();

if (null != ri)
{
    recognitionSpans = new List<Span> { forwardSpan, backSpan, rightSpan, leftSpan };

    this.speechEngine = new SpeechRecognitionEngine(ri.Id);

    using (var memoryStream = new MemoryStream(Encoding.ASCII.GetBytes(Properties.Resources.SpeechGrammar)))
    {
        var g = new Grammar(memoryStream);
        speechEngine.LoadGrammar(g);
    }

    speechEngine.SpeechRecognized += SpeechRecognized;
    speechEngine.SpeechRecognitionRejected += SpeechRejected;

    speechEngine.SetInputToAudioStream( sensor.AudioSource.Start(),
                                        new SpeechAudioFormatInfo (EncodingFormat.Pcm,16000, 16, 1, 32000, 2, null));
    speechEngine.RecognizeAsync(RecognizeMode.Multiple);
}
```

# Let's see more code...

```
private void SpeechRecognized(object sender, SpeechRecognizedEventArgs e)
{
    const double ConfidenceThreshold = 0.3;

    if (e.Result.Confidence >= ConfidenceThreshold)
    {
        switch (e.Result.Semantics.Value.ToString())
        {
            case "FORWARD": // do something
            case "BACKWARD": // do something
            case "LEFT": // do something
            case "RIGHT": // do something
            }
        }
        . . .
    }
}
```

# Let's see more code...

```
private void WindowClosing(object sender, CancelEventArgs e)
{
    if (null != this.sensor)
    {
        this.sensor.AudioSource.Stop();

        this.sensor.Stop();
        this.sensor = null;
    }

    if (null != this.speechEngine)
    {
        this.speechEngine.SpeechRecognized -= SpeechRecognized;
        this.speechEngine.SpeechRecognitionRejected -= SpeechRejected;
        this.speechEngine.RecognizeAsyncStop();
    }
}
```

# demo

Speech recognition:  
audio basics





# kinect

Application Showcase



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@MatteoValoriani

# What Next?

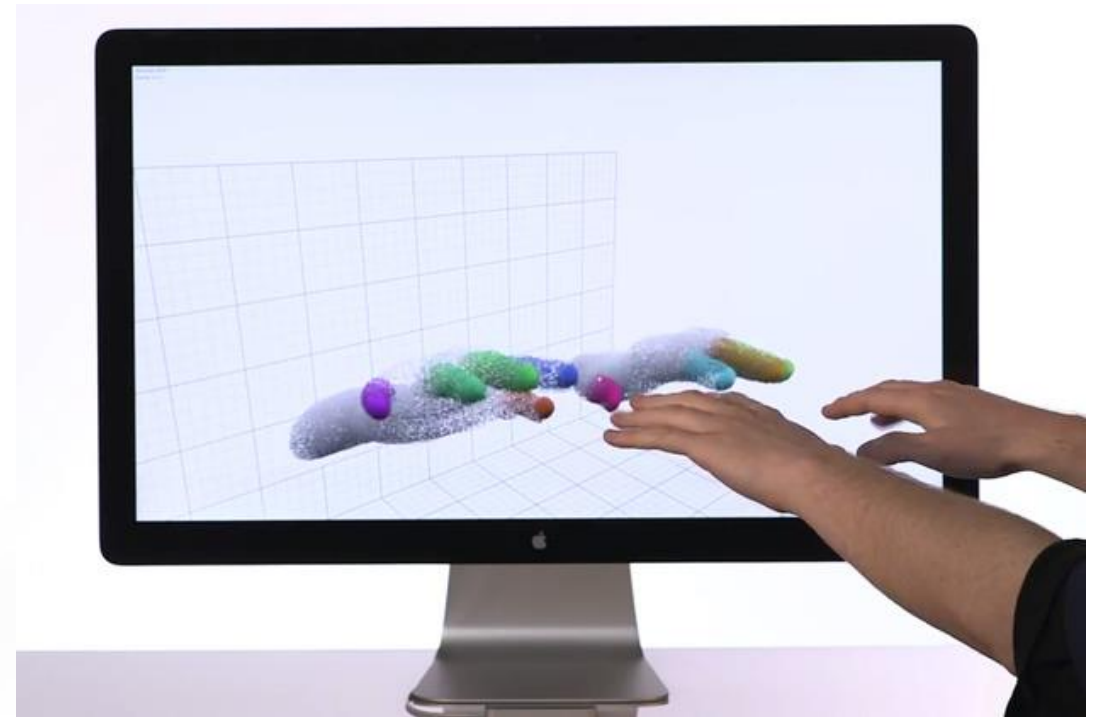
Kinect 2, Leap Motion, Intel  
Perceptual Computing



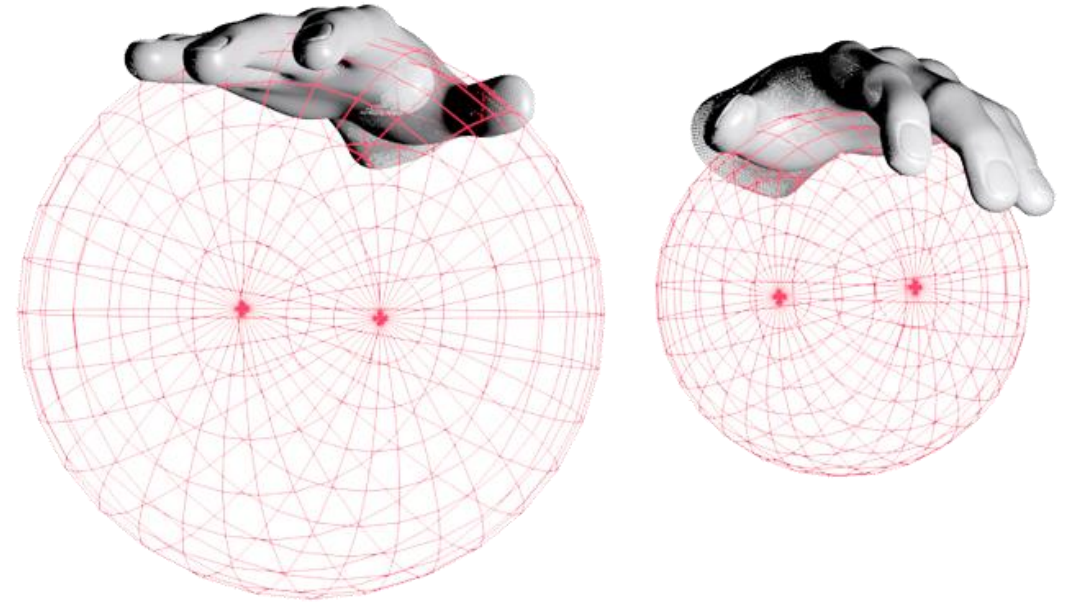
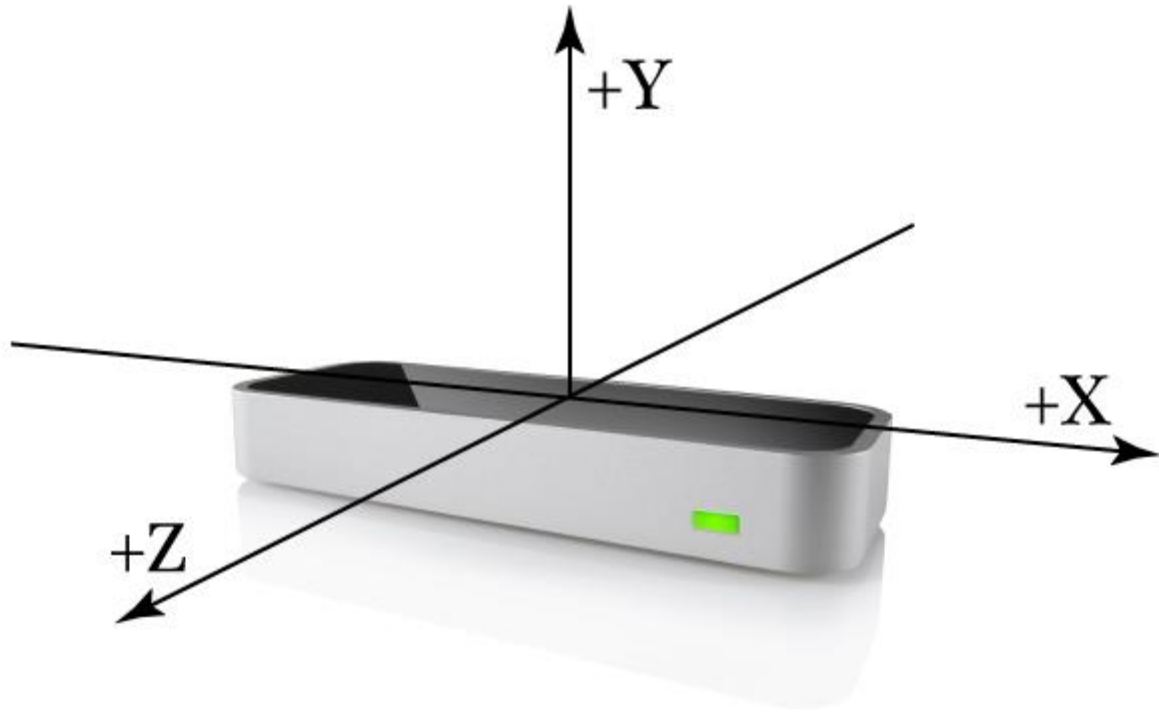
**Matteo Valoriani**  
mvaloriani AT gmail.com  
@MatteoValoriani

# Leap Motion

<https://www.youtube.com/watch?v=d6KuiutelA>



# Leap Motion for Developers



C++

C# and Unity

Java

JavaScript

Python

# Intel Perceptual Computing

<https://www.youtube.com/watch?v=WePIY7svVtg>



# Xbox One - Kinect 2



# Xbox One - Kinect 2



# Xbox One - Kinect 2

<http://youtu.be/Hi5kMNfgDS4>





# Which to choose? ALL

## Leap Motion Advantages:

Finger tracking is fast and accurate.

Smaller and less expensive: Developer friendly

Framework support: .NET, Processing, Cinder, etc.

Compatible: Mac OS and Windows.

## Leap Motion Issues:

Sensing range is fairly limited.

Only fingers are tracked.

There is no skeleton or face tracking.

No access to the raw sensor data.

## **Best for:**

Controlled kiosk environments with a pointing-based UI.

Generally best for general audience desktop apps which can be distributed in the Airspace store.

# Which to choose? ALL

## Intel Advantages:

Smaller and less expensive

Close-range tracking

Hand posture/gesture recognition

Facial analysis

Speech (built-in support for speech synthesis powered by Nuance).

Raw data

Framework support: Processing, Unity and OpenFrameworks

## Intel Issues:

Getting some of the deeper features (like age and gender detection) to work is a bit tricky.

Device and software are in beta.

Due to the close range of the tracking system, hand gestures must be designed such that a user's hand doesn't occlude their own view of the display.

## **Best for:**

Desktop/laptop applications where the user will be seated in front of the PC.

Close range applications where features, apart from hand tracking and recognition, are necessary without too much precision or accuracy.

# Which to choose? ALL

## Microsoft Kinect Advantages:

Skeletal tracking

Face tracking

Multiple sensors:

Raw data

Voice control

## Microsoft Kinect Issues:

The device is fairly large

A dedicated power cord is required

The amount of data generated by the sensor also tends to saturate a USB controller

Kinect cannot easily distinguish individual fingers on a hand

Most of the features listed above require the Microsoft SDK, which is only supported for desktop applications on Windows 7 and 8.

## **Best for:**

Kiosks, installations, and digital signage projects where the user will be standing fairly far away from the display.



... **TIRED?**

# Q&A

Tutto il materiale di questa sessione su

<http://www.communitydays.it/>

@MatteoValoriani

# 42





FOLLOW ME ON  
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[@MatteoValoriani](https://twitter.com/MatteoValoriani)

So Long  
and  
Thanks for  
all the Fish



# Resources and tools

<http://channel9.msdn.com/Search?term=kinect&type=All> (Others projects)

<http://kinecthacks.net/> (Others projects)

<http://www.modmykinect.com> (Others projects)

<http://kinectforwindows.org/resources/> (Microsoft SDK)

<http://www.kinecteducation.com/blog/2011/11/13/9-excellent-programming-resources-for-kinect/> (resources)

<http://kinectdtw.codeplex.com/> (gesture recognition library)

<http://kinectrecognizer.codeplex.com/> (gesture recognition library)

<http://projects.ict.usc.edu/mxr/faast/> (gesture recognition library)

<http://leenissen.dk/fann/wp/> (gesture recognition library)



# Credits & References

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Zsolt Mathe