

Assembling LEGO set with augmented reality instructions

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Abstract

For our project for Object recognition and computer vision course, we tackled the problem of assembling Lego set using computer vision techniques. The aim is to make use of new holographic tools in order to suggest the right instructions to the user who is performing assembly task. We will first present our approach of the problem, show how we used computer vision algorithms to track the evolution of the assembly phase and suggesting the right instructions. For that task we will present the new and fast object detection framework called YOLO (You Only Live Once), which we used as a base image recognition tool by adapting it the LEGO pieces. We will present our training results accompanied by what difficulties we faced when using this young framework, and finally we will expose the work we did on the interface part of the project which means, building a hololens app that annotates the holographic world of the user by adding 3D LEGO objets on the detected pieces to move suggesting, this way, the next step to perform.

1. Introduction

The advent of augmented reality devices such as Microsoft Hololens, Sony SmartEyeglass or Google Glass and others have made possible many interesting applications that augment the visual experience of the user with 3D holograms that are blended on his reality. Applications range from interior decoration and design, gaming but also increasing productivity in businesses by enhancing the real world and giving birth to broader imagination.

Among the applications of this new promising technology, still in development, one can be interested providing instructions for people to help them accomplish tasks either with human supervision or by annotating reality through an artificial agent that sees the world and suggests instructions through holograms as it is shown in figure 1. In fact, as presented in [1], we can extract from the tutorial videos available online instructions for performing many tasks such as changing car tires, assembling furniture and also performing Cardiopulmonary resuscitation. These instructions can be efficiently provided to user with a 3D augmented reality



Figure 1. Annotating the world with Microsoft Hololens.

device in the form of holograms and world annotations that are much comprehensible than paper instructions.

2. Project organization

We organized the work on this project in two consecutive sections, first detecting and localizing LEGO assemblies from a 2D video feed, for example the 2D locatable camera in the front of the Hololens and secondly present the relevant instructions for the corresponding step on the Hololens by blending LEGO Holograms on the user's reality. Note that it is possible to save the augmented reality video of both the camera feed and the annotating holograms from the Hololens thanks to a functionality called mixed capture.

3. Learning to recognize the assemblies and their location on an image

3.1. Suggested approach

In order to suggest the right instruction our algorithm should be able to detect the state or advancement of building the set and detect the assemblies. The problem can get complex if we think about the multitude of possibilities the user can do to fool the algorithm, but we focus on the use case where the user starts building one assembly gradually and not multiple assemblies. For each step, there are only 3 instances to recognize: the current assembly state, the part

that has to be added, and the global assembly when the instruction has been fulfilled. As a consequence, we want to build a system which is able at each state to recognize the 3 current instances and to locate them in the image.

In order to do so, we use the method described in (YOLO) [4], which we will presented in subsection 3.3 which allows to perform local classification efficiently thanks to a convolution neural network. This approach requires to first generate relevant data in order to perform the training.

3.2. Generating the data

Since we are not able to directly generate a dataset of annotated pictures for the lego set, we generate it artificially. We first create the 3D model the lego parts. In order to do so, we did use the software SolidWorks. Then, we built a script that generates the annotated pictures with Blender [2] and OpenCV [3]. Another possibility would be to use a software fro LEGO company called LEGO Digital Designer which provides all the LEGO parts 3D models and facilitates the assembly virtually.

In this section, we detail this script created for generating random rendering

3.2.1 Build

On the machine, we need to build Python 3 from source with `./configure --enable-shared`. Then we need to compile Blender as a module for this Python distribution as well as OpenCV. Then, we have all the tools needed to perform the generation.

3.2.2 Input

The important point here is that the classes of our classification task are the assemblies, not the parts themselves. As a consequence, we have created a standard csv file that enables to defines an assembly by specifying each file that constitutes the assembly, the diffuse color for each part, and the world matrix that enables to place each part in space. Here is an example (some columns were skipped in order to fit the page) :

Note that it is easy to place an assembly in blender gui and to obtain the World Matrix for each object thanks to the python command `'bpy.context.active_object.matrix_world'`. As a consequence, we need as

3.3. About Yolo framework

4. Porting to Hololens

Microsoft Hololens is not a cheap platform to work on as it cost at least 3000\$. We would like to thank our profes-

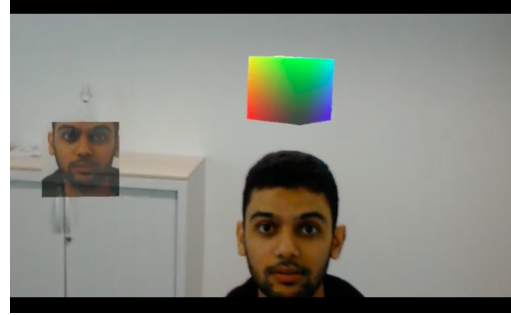


Figure 2. Annotation based on specified location using frontal camera info.

sor for providing this device for development. Ans thankfully there is the possibility of working on an emulator for hololens on Visual Studio. This requires a certain setup: (Visual Studio 2015 working on Windows 10 Pro or Education edition which support virtualization needed by the emulator). There are two possible ways of creating an app for the Hololens, either by creating a scene on the game engine Unity, with a specified setup and then building the VS solution, or directly creating a DirectX C++ app which is more low-level than the first one.

In order to draw holograms in the correct place in the 3D scene in Unity and thus rendered in the right 3D location in user's vision, we need to map the pixel position on the RGB 2D frame obtained from the hololens locatable camera to the 3D coordinate in the Holographic Scene. This mapping provides only the ray toward which the object should be place, however we still need to determine the distance of the hologram from the user. This can be achieved through two different methods. One can for example place the holograms relative to the surrounding space of the user by intersecting the ray found previously with the spatial mapping information provided by the Hololens. Or one can use the size of the detected bounding box and the known size of the tracked object to infer the depth of the hologram.

We demonstrated the second approach based on a code from Microsoft Universal Samples where we detect a face and superpose a rotating colored cube using a DirectX app as we can see in the figure 2

References

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