## WHERE TO PLACE: A REAL-TIME VISUAL SALIENCY BASED LABEL PLACEMENT FOR AUGMENTED REALITY APPLICATIONS

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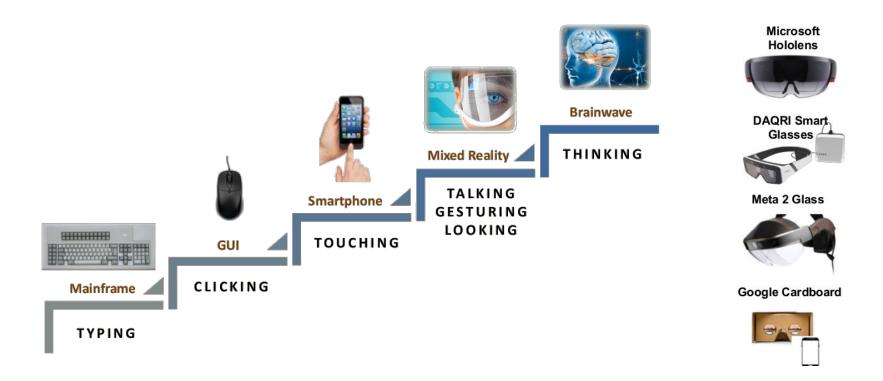
- 1. Introduction to label placement in AR and its importance
- 2. Previous works
- 3. Our proposed Method: Where2Place
- 4. Evaluation
- 5. Live demo of single label placement on phone
- 6. Live demo of multi-label placement in cluttered scene
- 7. Conclusion

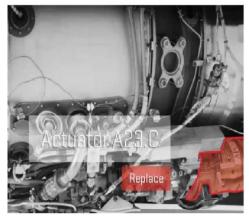


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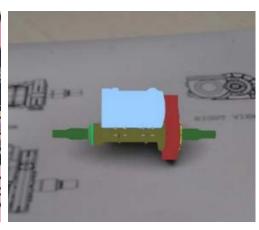
## Introduction to label placement in AR and its importance











## Label Placement in Augmented Reality

- Augmented Reality is a metaphor for situated Computing.
- Augmentations can take the form of Text/label, image, sound, and Video.
- Textual overlays/labels add contextual information in Augmented Reality (AR) applications.





## Label Placement in Augmented Reality

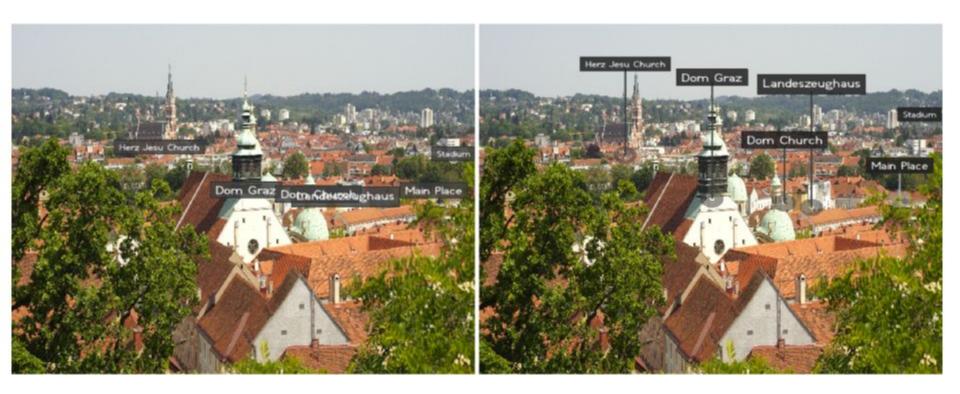
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## Why label placement is important?



# Objectives for label placement

Label should not occlude the salient regions

Label should be closed to object of interest

Labels should not overlap each other

in real-time and temporally coherent on device



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### **Related Works**

- Related studies of optimal placement of textual labels based on –
   Geometry based layout and Image-based layouts for rendering labels, aesthetic rule, and adaptive overlays.
- These approaches work on images not suited for real-time camera streams. These are computationally heavy and lack real-time performance.
- Owing to occlusions, dim light scenarios, scene variations in the live field of view, overlays have their own challenges.



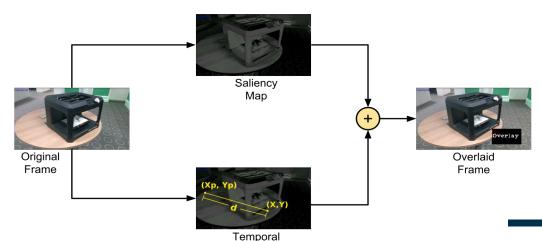
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## First attempt towards single label placement

- Label should be placed at real-time applications are scene summarisation, effective captioning of a scene, AR applications
- Label should be placed on non-salient areas interesting areas should not be occluded by the label
- 3. Label should be temporally coherent facilitating in scene understanding than causing jitter

Therefore, we formulate this method by an objective function that minimizes -

- Occlusion with visually salient regions in scenes of interest
- Temporal jitter for facilitating coherence in real-time
   AR applications



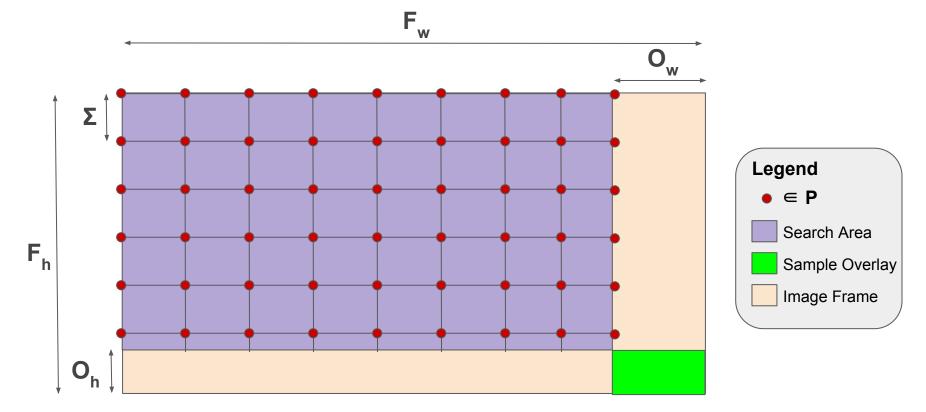
## **Algorithm Overview**

Optimization problem to select optimal label position

**Jitter** 

$$\label{eq:subject} \begin{split} & \underset{(X,Y)}{\text{minimize}} & S((X,Y)) + \lambda d((X,Y); (X_p,Y_p)) \\ & \text{subject to} & X \leq F_w - O_w, \quad X \geq 0 \\ & Y \leq F_h - O_h, \quad Y \geq 0 \end{split}$$

- Input to our algorithm video frames
- First leg compute saliency maps<sup>[1]</sup>
- Second leg compute Euclidean distance between previous and current overlay positions
- Combine saliency and Euclidean distance - predict overlay position



#### Legend:

- K: Frames to skip
- λ: Temporal Coherence (Jitter/Threshold) Parameter
- $\Sigma$  :Search space sampling parameter
- $O_h$ ,  $O_w$ : Overlay height and overlay width  $X_p$ ,  $Y_p$ : Optimal position of overlay

- X, Y: Optimal position of overlay computed in the current iteration
- SM: Computed saliency map
- P : set of sampled pixels from search space
- F<sub>w</sub>, F<sub>h</sub>: Width and height of video frames

### Algorithm 1 PROPOSED ALGORITHM

- 1:  $(X_p, Y_p) = (frame\_width/2, frame\_height/2)$ 
  - 2: For every  $k^{th}$  frame

  - SM = AchantaSal(frame)3:
  - for  $(x,y) \in P$ 4:

  - $L = \{(a, b) | x \le a \le x + O_w, y \le b \le y + O_h\}$ 5:
  - $s_{x,y} = \sum_{(a,b) \in L} SM(a,b)$ 6:
- $d_{x,y} = \lambda \times Distance((X,Y),(X_p,Y_p))$ 7:
- $s_{min} = min(s_{x,y} + d_{x,y})$ 8:
- $(X,Y) \coloneqq arg\_min(s_{x,y})$ 9:
- $(X_n, Y_n) := (X, Y)$  // Use linear interpolation 10: for overlay transition

#### Legend:

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### **Evaluation**

#### **Objective Evaluation**

Label Occlusion Over Saliency (S)

$$S = \frac{\sum_{(x,y)\in L} G(x,y)}{\parallel L \parallel}$$

Our algorithm had an average LOS score of 0.042 and it took 0.021s of time to compute the overlay position.

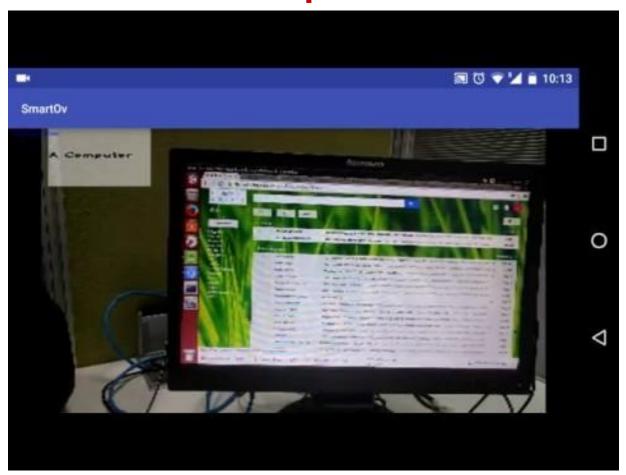
#### **Subjective Evaluation**

Subjective metrics	Value (0-5)
Position of Overlay	4.5
Responsiveness of Overlay box	4.7
Lack of Jitter	4.2
Color of Overlay box	3.9

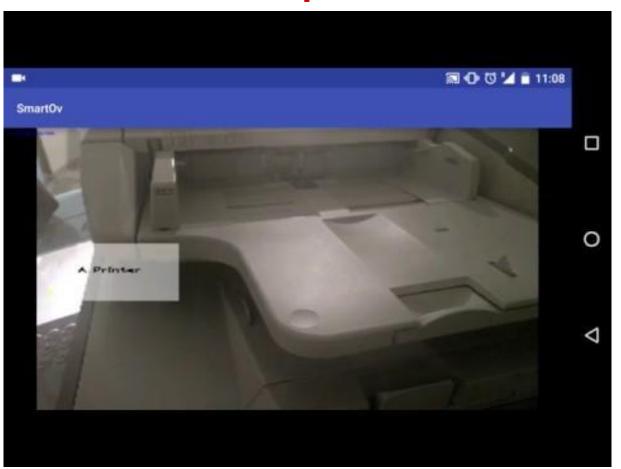


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## Where2Place: Demo 1 on phone



## Where2Place: Demo 2 on phone





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## Version 2 Demo: Multilabel placement on server





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We have presented a novel method for placement of overlays on device (resource constrained environment)

We formulated it as objective function that minimizes visual saliency around the object of interest and minimises the temporal jitter facilitating coherence in real-time AR applications.

## Conclusions

The main focus algorithm should run in
real-time on a low-end
android phone/tablet

Applications include:
situational awareness for
museum exploratory
tasks, industrial
inspection and repair
operations, advertisement
and media, and in tourism
industry.

## Questions?

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