

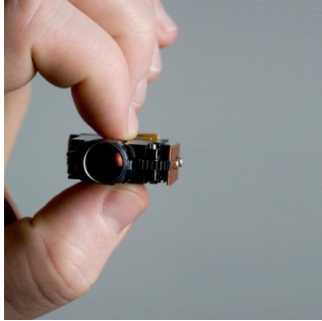
Embedding Imperceptible Codes into Video Projection and Applications in Robotics

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Introduction & Motivation



DLP Pico Projector

Mobile Phone



DC



DV



Previews Works

- **Non-Visible Spectrum (Infrared)**

- *IR Projector + IR Camera (Kinect)*
- *Normal Projector and Camera + IR Filters*

- **Imperceptible Structured Light (ISL)**

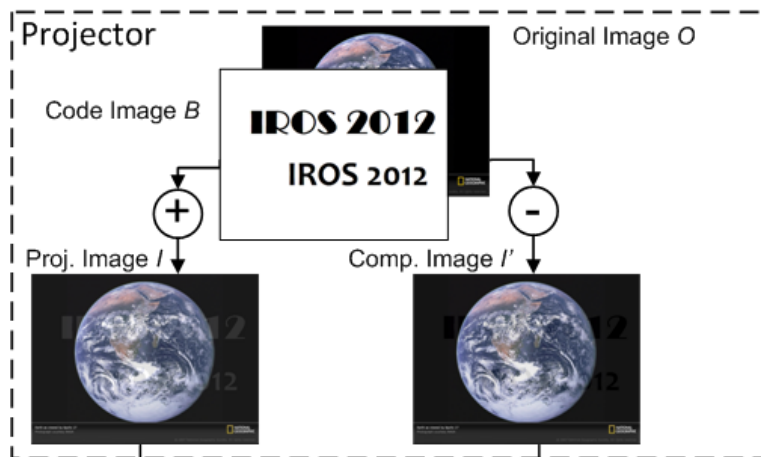
- *[Raskar1998]* -- fist proof of ISL
- *[Cotting2004]* -- micro-mirror states in DLP
- *[Park2007]* – intensity adaption in YIQ color space
- *[Grundhofer2007]* -- human contrast sensitivity function
- *[Park2010]* -- subjective evaluation for ISL

To the best of our knowledge, few works focus on the decoding method in imperceptible code embedding configuration.

Main Contributions

- **Using only off-the-shelf devices**
- **Robust codes design in coding stage**
- **Noise-tolerant geometrical primitives detection and classification in decoding stage**

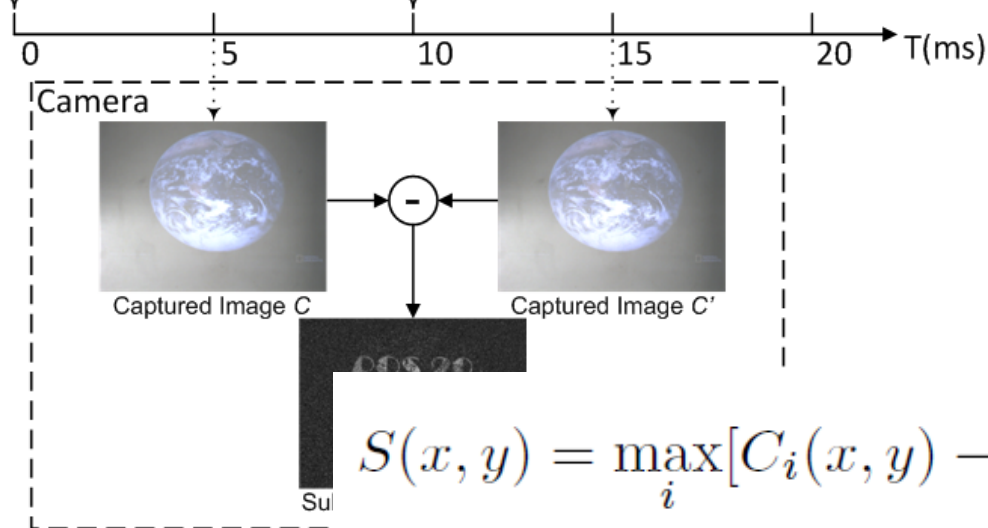
Principle of Embedding Imperceptible Codes



$$I_i(x, y) = O_i(x, y) + P(x, y),$$

$$I'_i(x, y) = O_i(x, y) - P(x, y),$$

$$P(x, y) = \begin{cases} \Delta, & \text{when } B(x, y) = 1; \\ 0, & \text{when } B(x, y) = 0. \end{cases}$$



$$S(x, y) = \max_i [C_i(x, y) - C'_i(x, y)], i = \{R, G, B\}.$$

Design of Embedded Pattern

■ Primitive Shapes

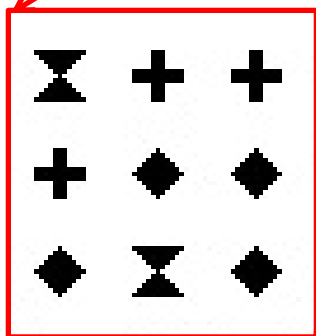
- Cross
- Sandglass
- Rhombus



Design of Embedded Pattern

■ Pattern Image

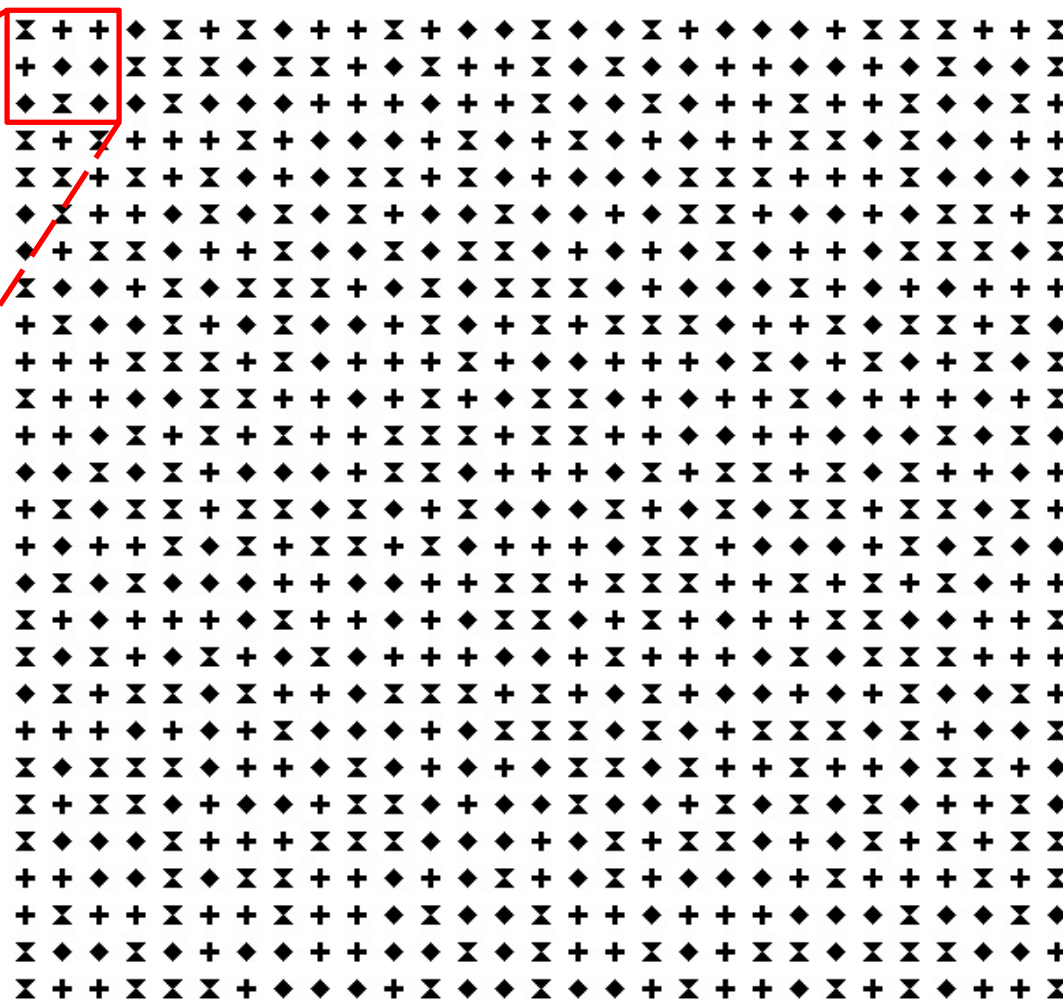
□ Size: $27 * 29 = 783$



Code = 100022212

□ $\bar{H} = 6.0084$

□ 95.97% ($H \geq 3$)

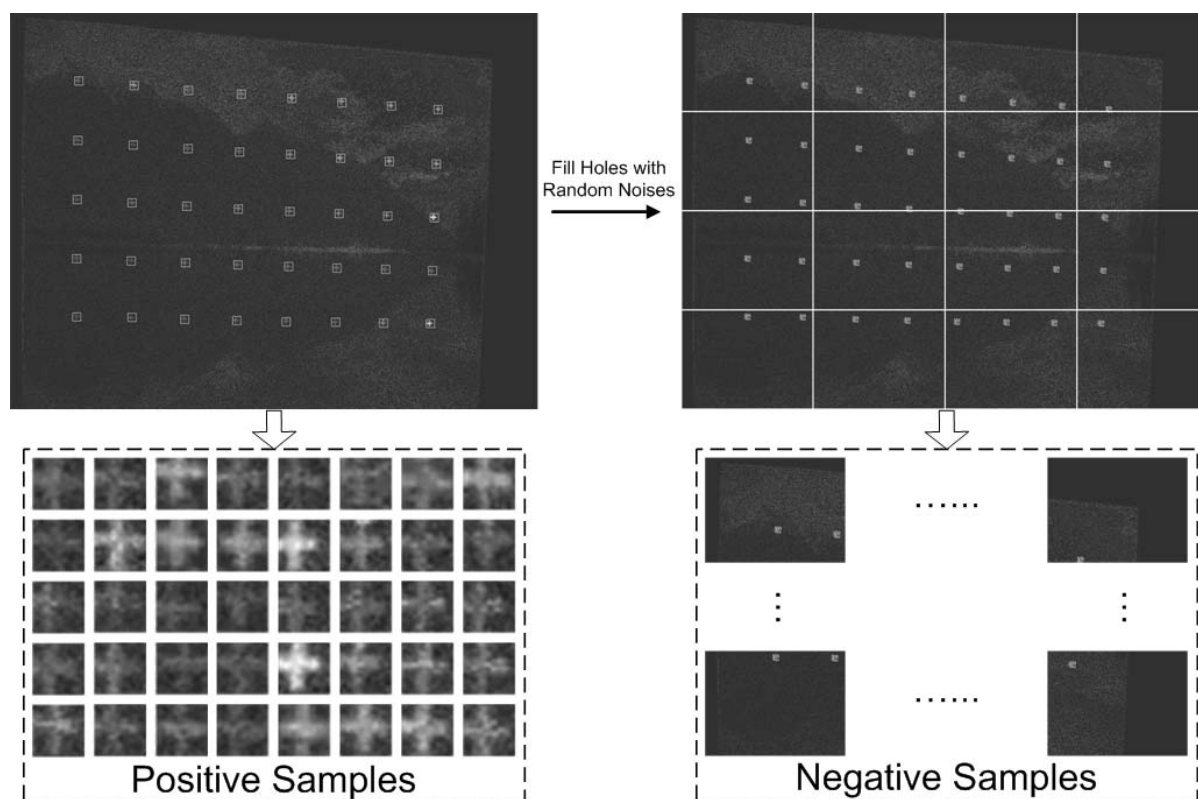


Primitive Shape Identification and Decoding

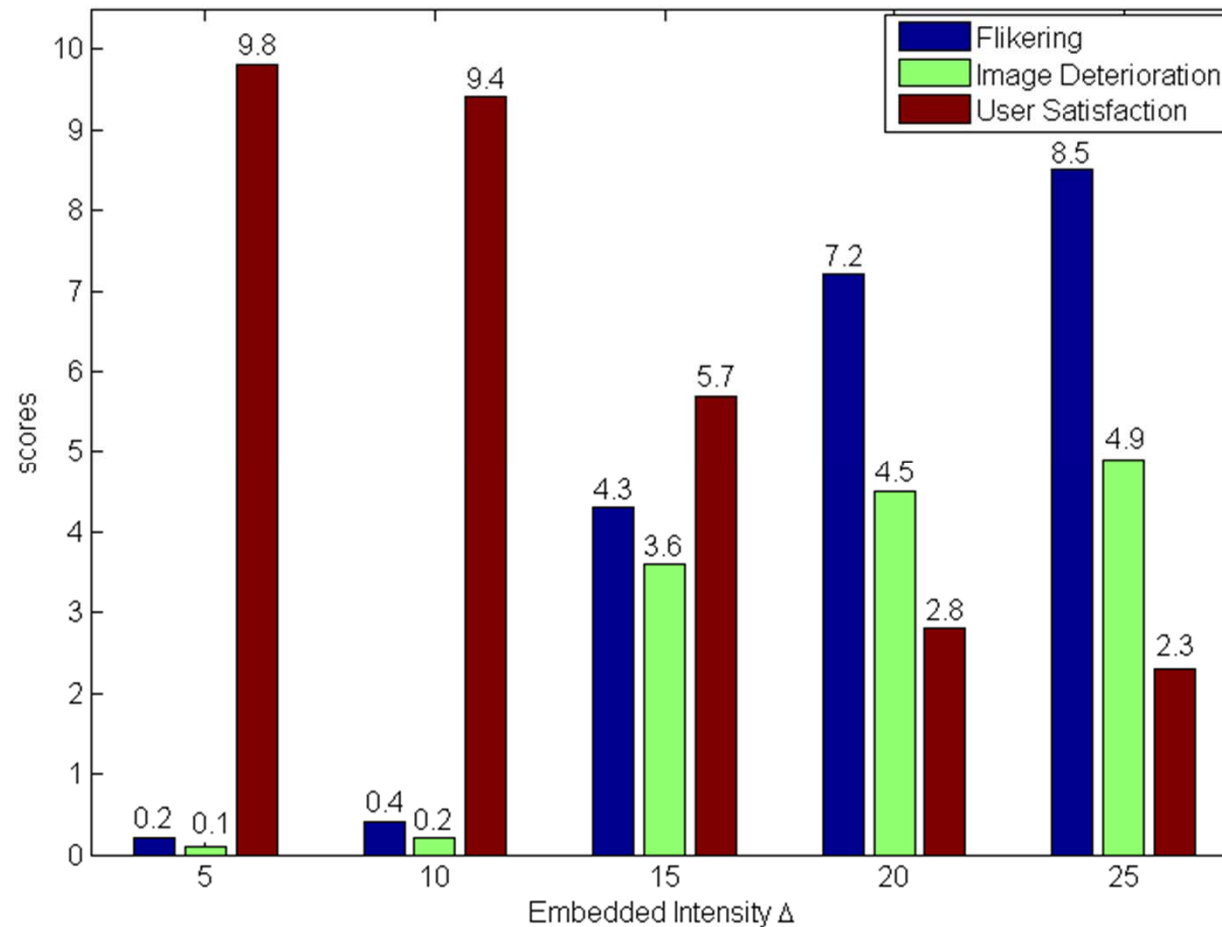
■ Adaboost Training

- **Harr-Like** Features
- Positive Sample Size
 $20 * 20$
- Pos./ Neg. Sample Num.
 $7000 / 3000$

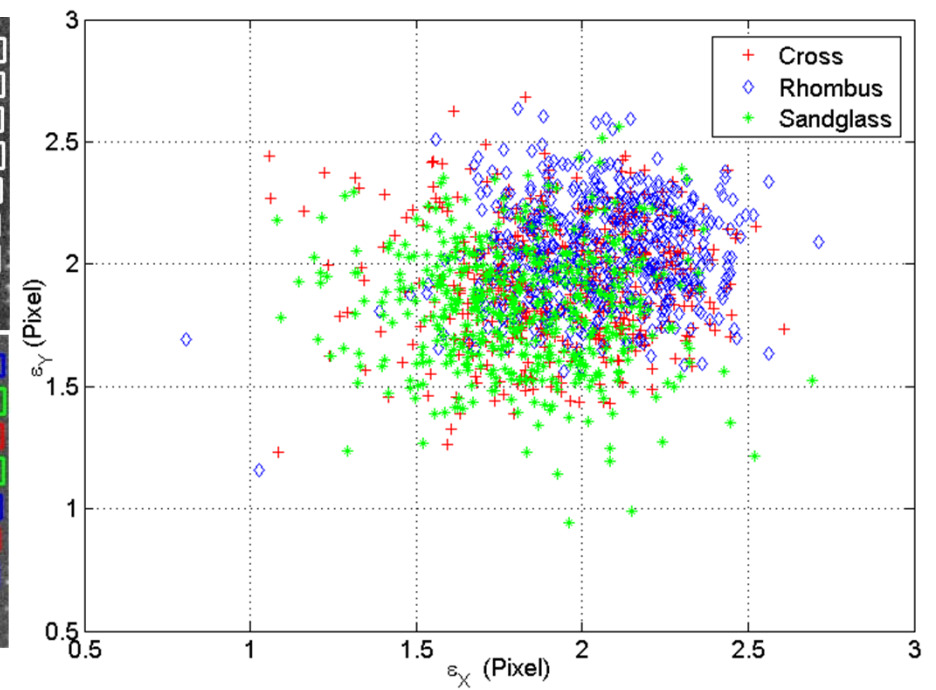
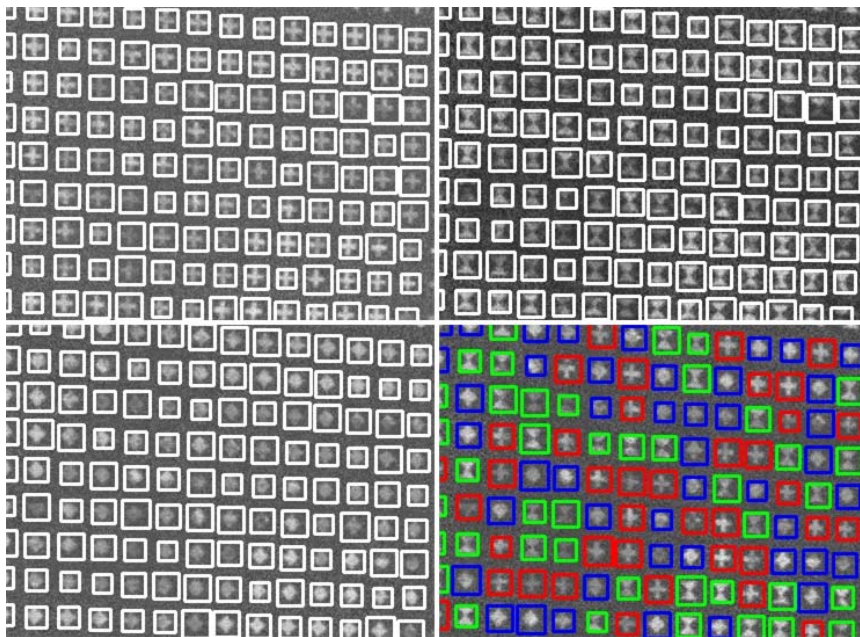
- **16-stage** cascade classifier



Experiments – *Imperceptibility Evaluation*



Experiments -- *Accuracy Evaluation*



Experiments –

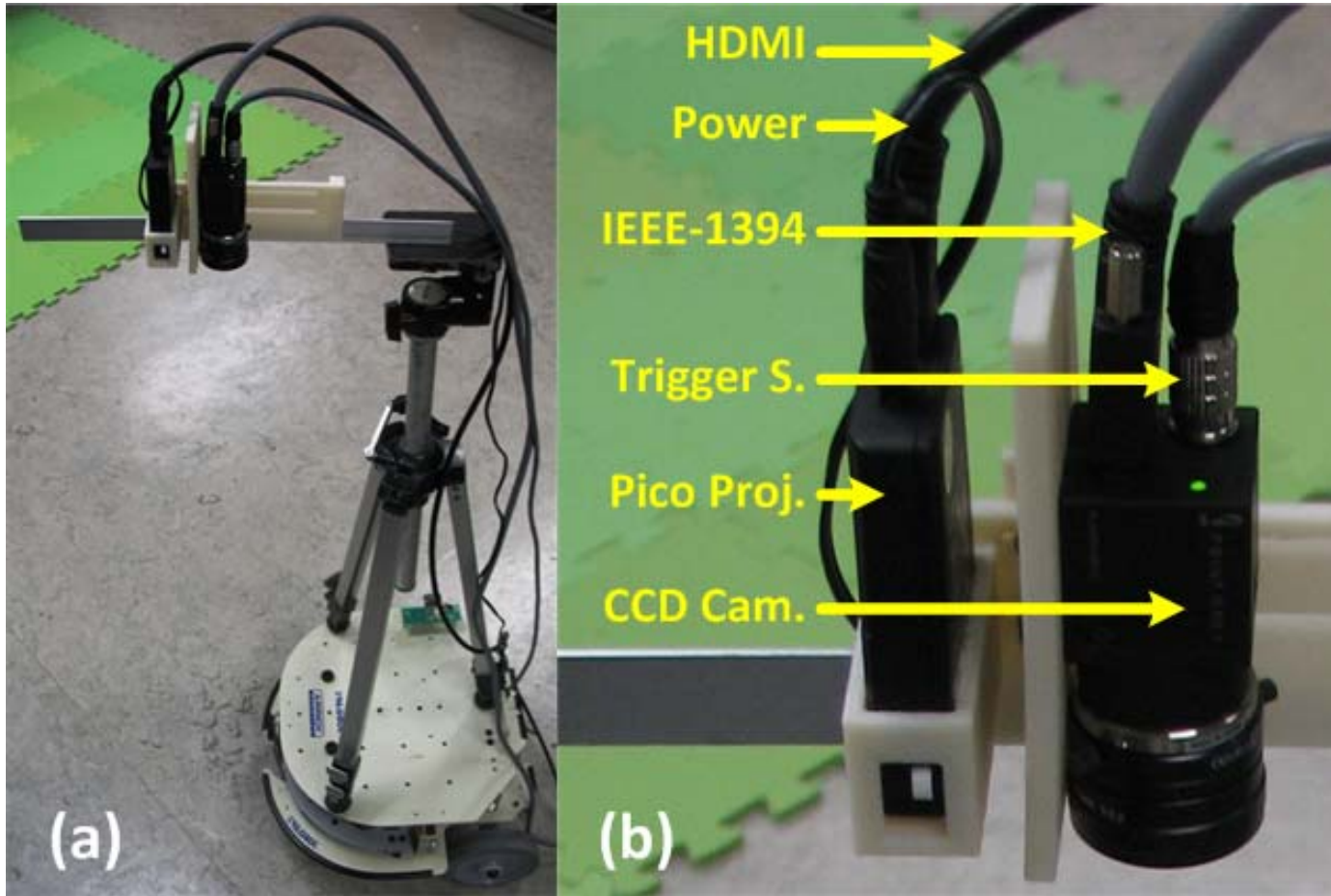
Accuracy Evaluation

| | Hits(%) | Missed(%) | False(%) | $[\epsilon_X, \epsilon_Y]$ (pixel) | Corr. Acc.(%) |
|---------------|---------|-----------|----------|------------------------------------|---------------|
| Cross | 86.21 | 11.63 | 2.16 | [1.931, 1.927] | — |
| Rhombus | 85.83 | 12.57 | 1.60 | [2.056, 2.051] | — |
| Sandglass | 87.49 | 11.64 | 0.87 | [1.816, 1.821] | — |
| Whole Pattern | 86.33 | 11.06 | 2.61 | [2.013, 2.043] | 91.23 |

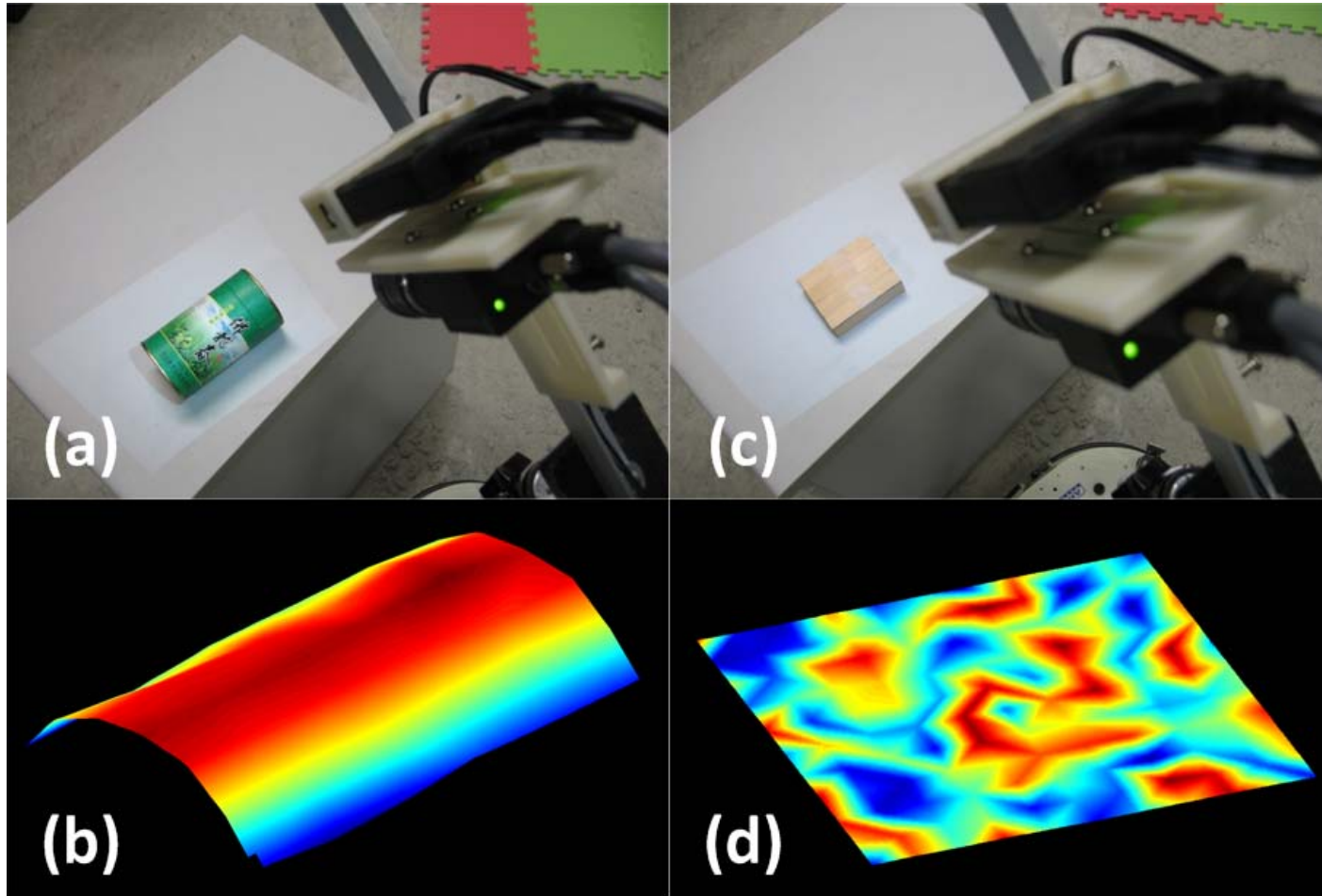
Table 1. The quantitative experiment results on (embedded) code detection accuracy.

Applications –

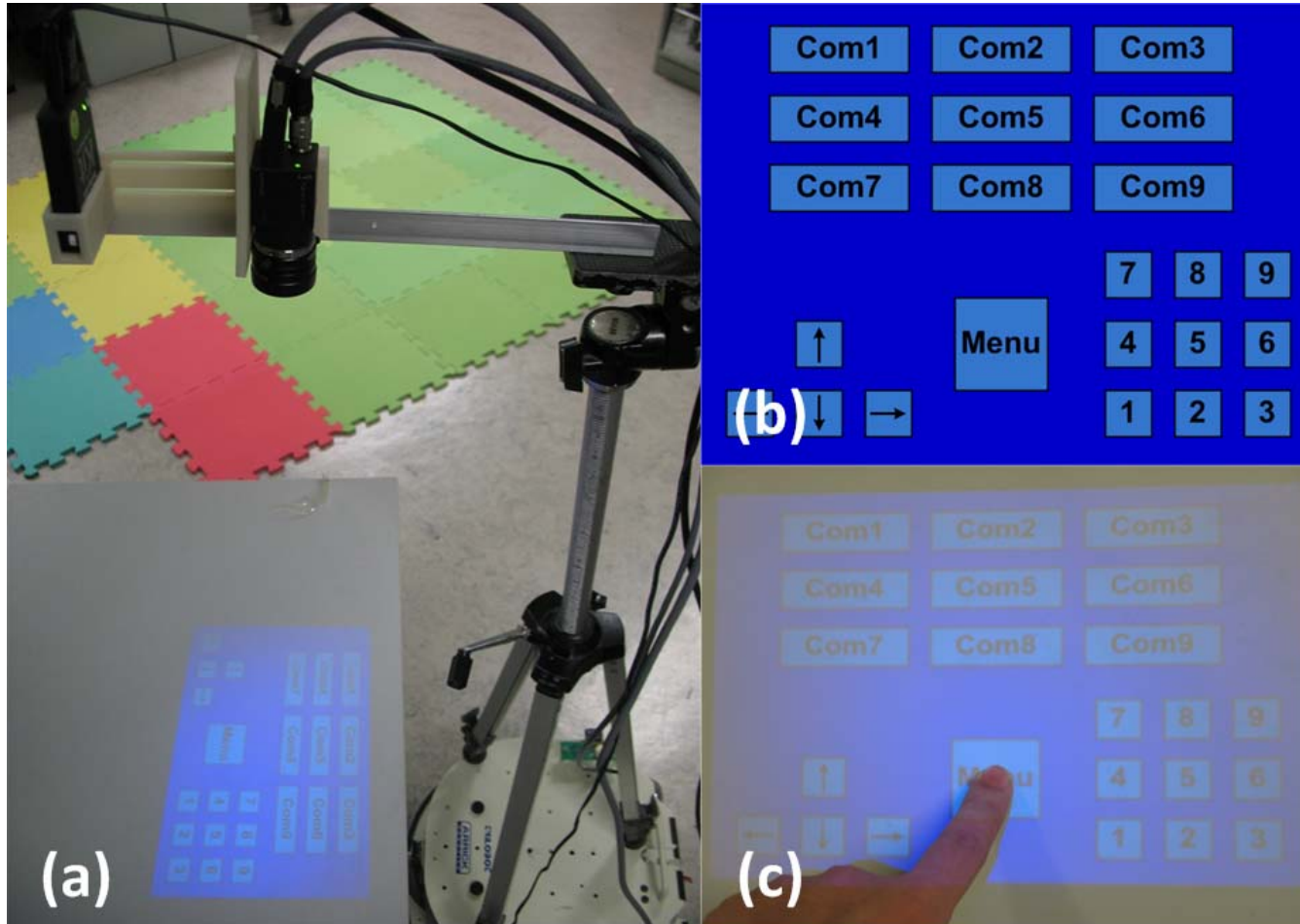
Integration with Mobile Robot System



Applications – *Sensing Surrounding Environment*



Applications – *Natural Human-Robot Interaction*



Conclusion and Future Works

A novel system of embedding imperceptible structured codes into normal projection.

- *Coding*: noise-tolerant schemes (specifically designed shapes and large hamming distance)
- *Decoding*: pre-trained primitive shape detectors are used to detect and identify the weakly embedded codes

Future Works

- *Denser Coding*
- *Motion Compensation*