

# Construction of Cascaded Traffic Sign Detector Using Generative Learning

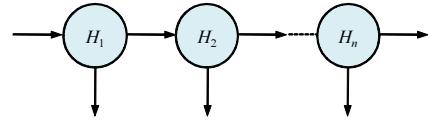
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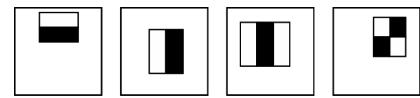
## Abstract

We propose a method for construction of a cascaded traffic sign detector. Viola et al. have proposed a robust and extremely rapid object detection method based on a boosted cascade of simple feature classifiers. To obtain a high detection accuracy in real environment, it is necessary to train the classifier with a set of learning images which contain various appearances of detection targets. However, collecting the traffic sign images manually for training takes much cost. Therefore, we use a generative learning method for constructing the traffic sign detector. In this paper, shape, texture and color changes are considered in the generative learning. By this method, the performance of the traffic sign detection improves and the cost of collecting the training images is reduced at the same time. Experimental results using car-mounted camera images showed the effectiveness of the proposed method.

## 1. Introduction



**Figure 1. Architecture of a classifier-cascade.**



**Figure 2. Examples of Haar-like features.**



**Figure 3. Examples of Japanese traffic signs captured in various conditions.** These captured images contain various changes on shape, texture and color, such as 3D-rotation, stretching, optical blurring, background pattern, discoloration and reflection.

## 2. Construction of cascaded traffic sign detector using generative learning

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## 2.1. Modeling shape, texture and color changes

- Shape and texture change models

**Rotation :**

$x$      $y$      $z$

## Shifting :

### **Stretching :**

### **Optical blurring :**

$$(\quad) = \frac{1}{2} \exp \left[ -\frac{\mu^2 + \sigma^2}{2} \right]$$

**Background pattern :**

- Color change models

#### **Discoloration :**

$$\begin{pmatrix} & i & i \\ i & & i \end{pmatrix}$$

### **Reflection and shadow :**

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## 2.2. Generation of traffic sign images

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### 2.3. Construction of a cascaded traffic sign detector

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- $$\bullet = \quad = \quad = \quad = + +$$

$$\bullet = 0.2989 + 0.5866 + 0.1145$$



**Figure 4.** Examples of the generated traffic sign images. In the experiments, detection targets are these twenty kinds of round regulatory signs.

### 3. Experiments

#### 3.1. Conditions

640 × 480

$$\begin{array}{cc} \mu & \sigma \\ \text{fi} & \text{fi} \end{array}$$

#### 3.2. Methods

### 4. Conclusion

**Table 1. Mean and standard deviation of generation parameters.**

	Shape and texture models						Color models							
	Rotation °			Shifting		Stretching		Optical blurring		Discoloration			Reflection & shadow	
	$\theta_x$	$\theta_y$	$\theta_z$	$x$	$y$	$w$	$h$	$\sigma$	$h_r$	$s_r$	$v_r$	$h_b$	$s_b$	$v_b$
$\mu$														-0.25
$\sigma$														

**Table 2. Comparison of detection ability.**

fl		
		0.97
		0.93
		0.95



## References

Proc. of 2007 IEEE International Conference on Intelligent Transportation Systems

Proc. of 2004 IEEE/RSJ International Conference on Intelligent Robots and Systems

Proc. of 2001 IEEE Computer Society Conference on Computer Vision and Pattern Recognition

Proc. of 2005 IEEE Intelligent Vehicles Symposium

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**Figure 5. Examples of the detection results. Each rectangle represents detected traffic sign.**

tional Conference on Pattern Recognition