

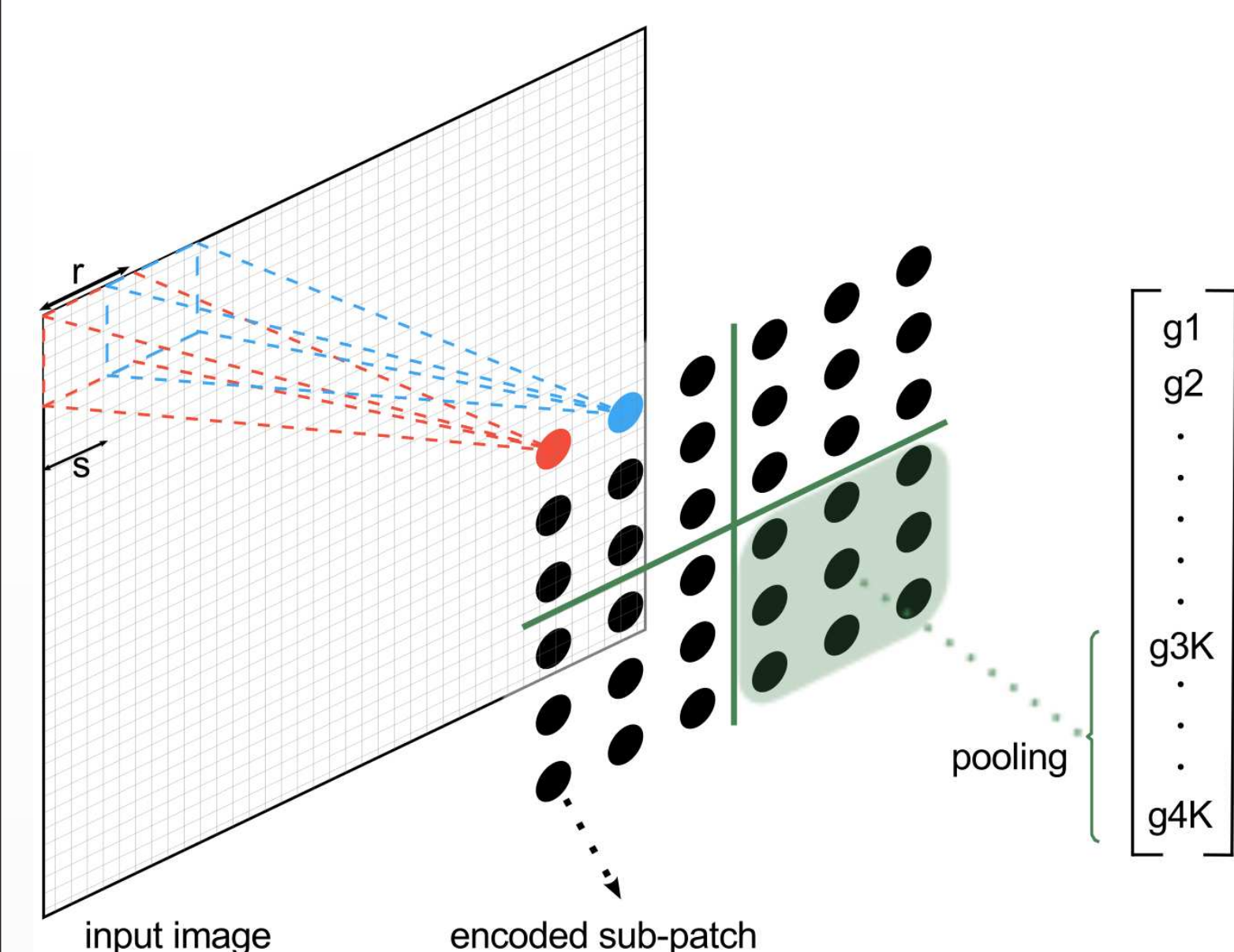
IMAGE-BASED ROAD TYPE CLASSIFICATION

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Abstract

The ability to automatically determine the road type from sensor data is of great significance for automatic annotation of routes and autonomous navigation of robots and vehicles. In this paper, we present a novel algorithm for content-based road type classification from images. The proposed method learns discriminative features from training data in an unsupervised manner. Experiments performed on a comprehensive real-world road image dataset show the advantages of our approach.

Feature learning



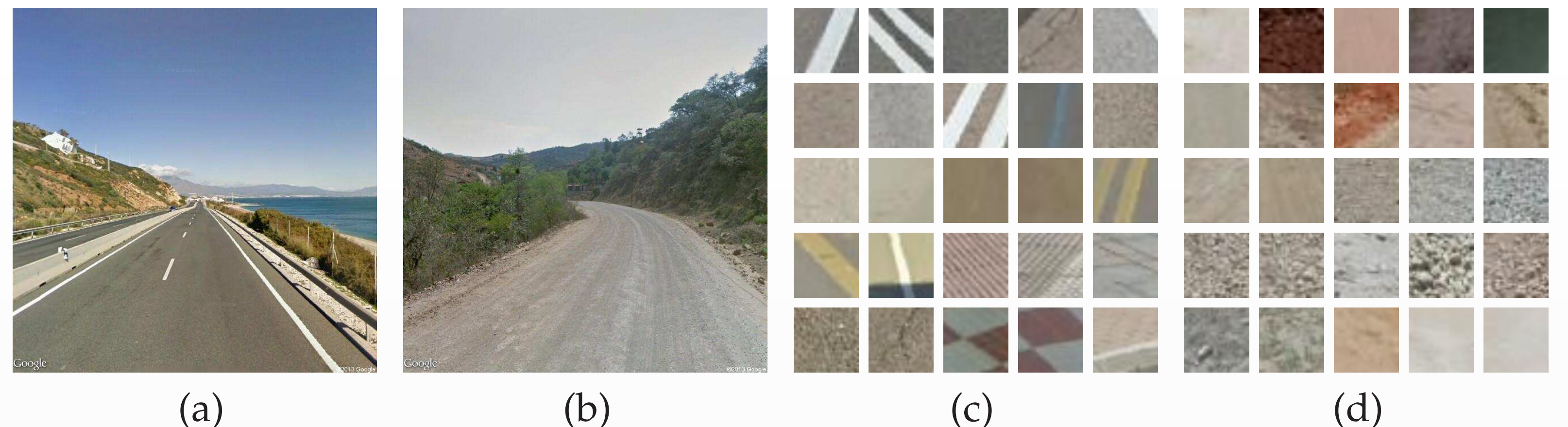
Encoding & classification

- Sparse non-linear encoding [1]
- Feature dimensionality reduction
- Linear SVM classification [2]

Results

Algorithm	OCA
Baseline	74.23%
Engineered Features	84.25%
Unsupervised Features	85.30%

Road image dataset



Google Street View sample images from the paved (a) and unpaved (b) road classes. Examples of extracted sub-images, from each class respectively, are shown in (c) and (d).

Mini-batch stochastic gradient descent algorithm

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1: procedure KMEANS( $k, b, t, X$ )
2:   Input:  $k$ , mini-batch size  $b$ , iterations  $t$ , dataset  $X$ 
3:   Return: centroids  $C$ 
4:   Initialize each  $c \in C$  with  $k - means++$  initialization
5:    $v \leftarrow 0$  ▷ Per-centroid counts
6:   for  $i \leftarrow 1, t$  do
7:      $M \leftarrow b$  examples picked randomly from  $X$ 
8:      $m \leftarrow 0$  ▷ Batch centers
9:      $u \leftarrow 0$  ▷ Batch per-center counts
10:    for all  $x \in M$  do
11:       $d \leftarrow f(C, x)$  ▷ Cache centroid nearest to  $x$ 
12:       $D \leftarrow D \cup d$ 
13:       $u[d] \leftarrow u[d] + 1$ 
14:       $m[d] \leftarrow m[d] + x$ 
15:    end for
16:    for all  $c \in D$  do
17:       $\mu \leftarrow \frac{m[c]}{u[c]}$  ▷ Mean sample
18:       $v[c] \leftarrow v[c] + u[c]$  ▷ Update counts
19:       $\eta \leftarrow \frac{1}{v[c]}$  ▷ Learning rate
20:       $c \leftarrow (1 - \eta)c + \eta\mu$  ▷ Take gradient step
21:    end for
22:  end for
23:  return  $C$  ▷ Return the centroids
24: end procedure

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References