

# **Offline 1000-Class Classification on a Smartphone**

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# Background

- **Rapid progress of smartphone**
  - Obtain enough computational power for image recognition.
  - **But, rapid mobile recognition is still a challenging task.**
- **Large-scale object recognition**
  - 1000 class (ex. ILSVRC)
  - More practical system
  - **But, smartphone's memory is limited**



# Objective

## Mobile Recognition System

- recognize many kinds of object
- require **no communication** with a server
  - Recognition on a smartphone
- Offline recognition system
  - **Real-time** image recognition

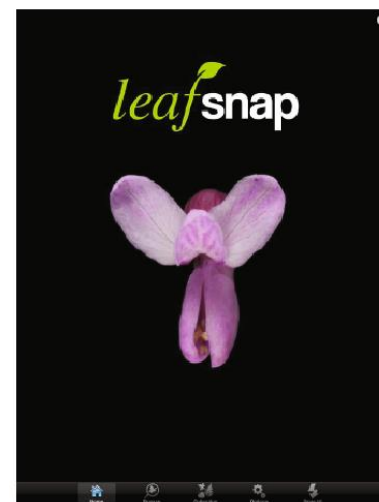
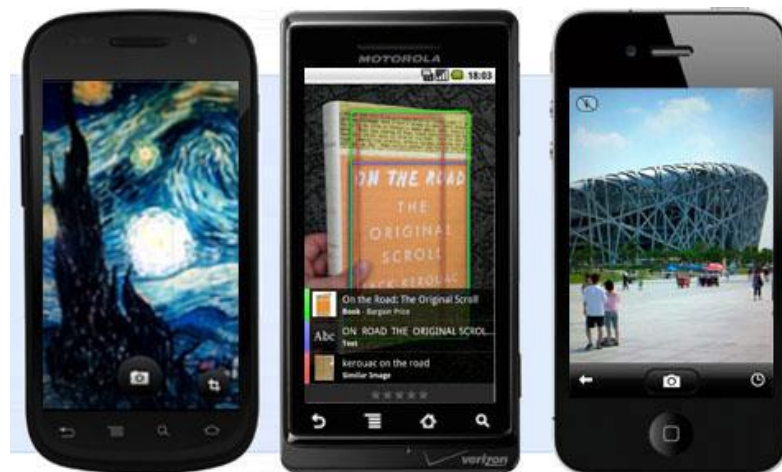
# Offline vs. Online

- **Advantage** 😊
  - Able to use anywhere
  - real-time recognition
    - thanks to **no communication** overhead
  - Not required the server
- **Disadvantage** 😞
  - × computational power and memory size
  - × electricity consumption



# Related Work

- **Google Goggles**
  - **Specific object Rec**
  - **Similar image search**
  - **OCR**
- **Leaf snap (Kumar et al, ECCV'12)**
  - Identifying **plant species**



# Image Recognition

- **Image Features:**

- **Color Patch FV (only mean)**

- 24 dim local color descriptor

- **RootHOG Patch FV (only mean)**

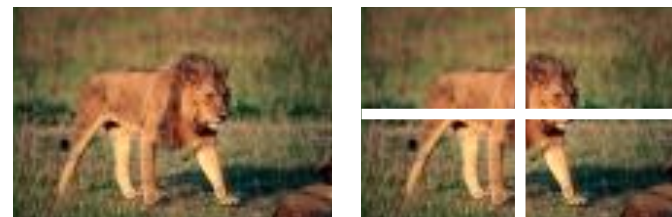
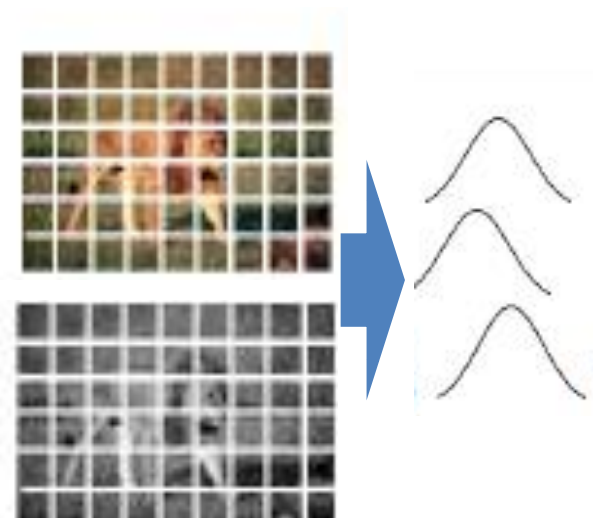
- 32 dim local RootHOG descriptor
- Similar to RootSIFT

- **SPM**

- Level 1 (1x1+2x2)

- **FeatureSize**

- Color FV: 7680dim, RootHOG FV: 10240dim



# Classifier

- **Linear Classifier:**

- **AROW**

- Online classifier

- **one-vs-rest**

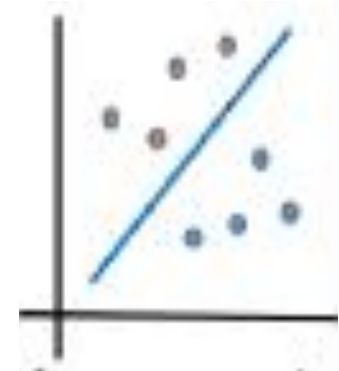
**Independent of the number of samples**

**computation:  $O(N)$**

**memory :  $O(N)$**

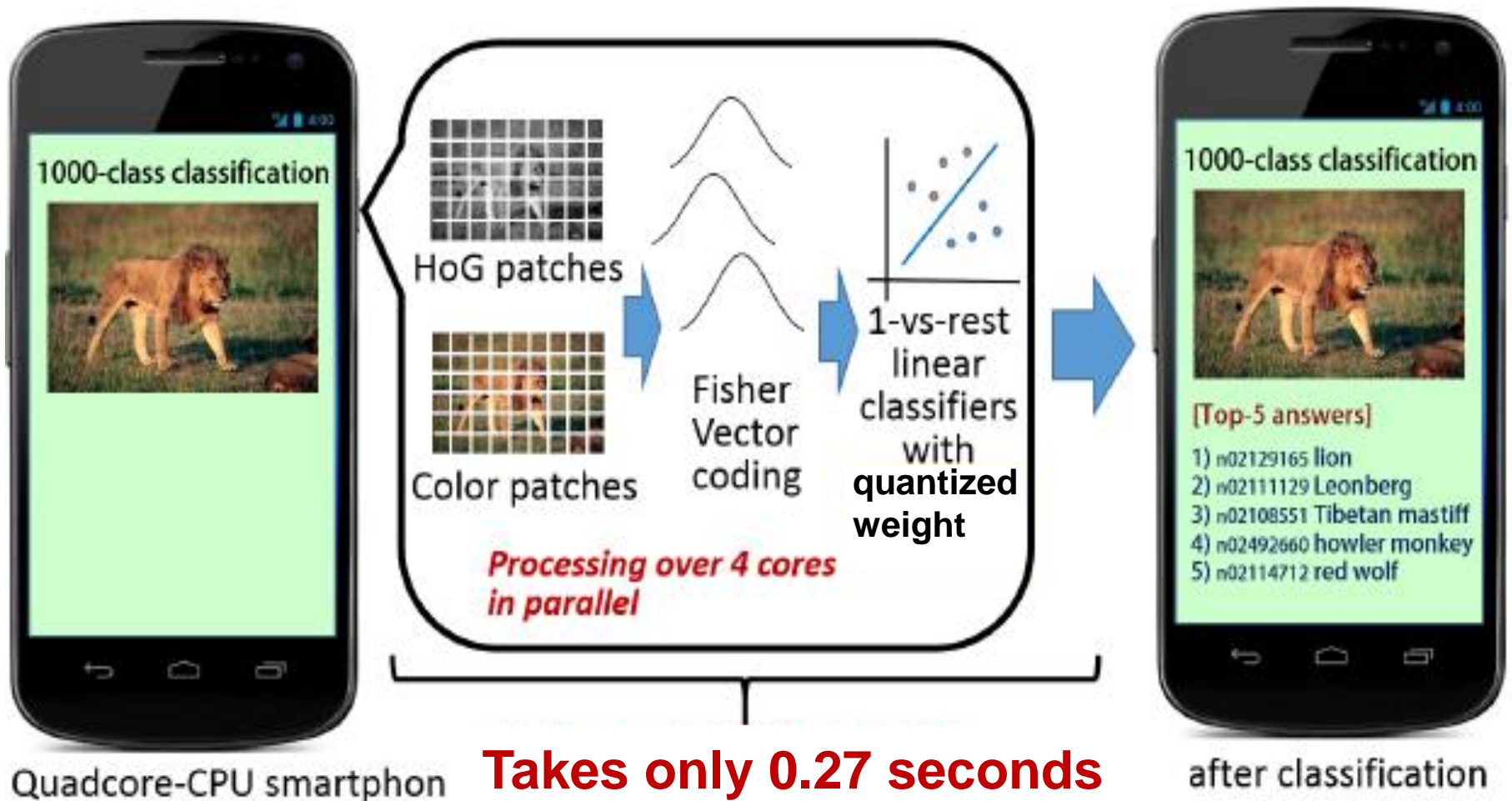
- **Weight vectors**

- **compressed by scalar-based quantization**



# Recognition Step

We use **light weight features** and **quantized weight**



Quadcore-CPU smartphon

**Takes only 0.27 seconds**

after classification



# Performance

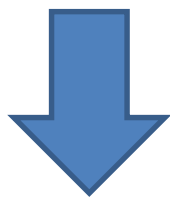
- **Top-5 classification rate on ILSVRC**

	uncompressed	compressed
Rate	48.7%	47.9%
Memory	71.7MB	9.0MB

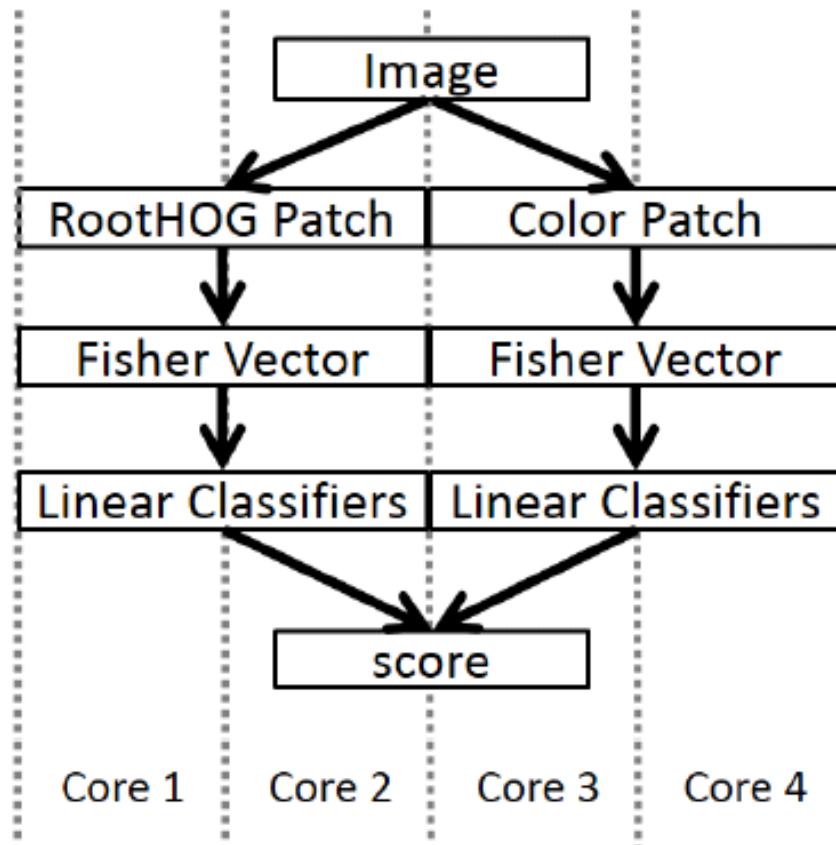
- **Only slight performance loss**
  - About 1%

# Implementation

- **4 core processing**
  - Extract descriptors
  - Feature coding
  - Classifies
- **Offline processing**

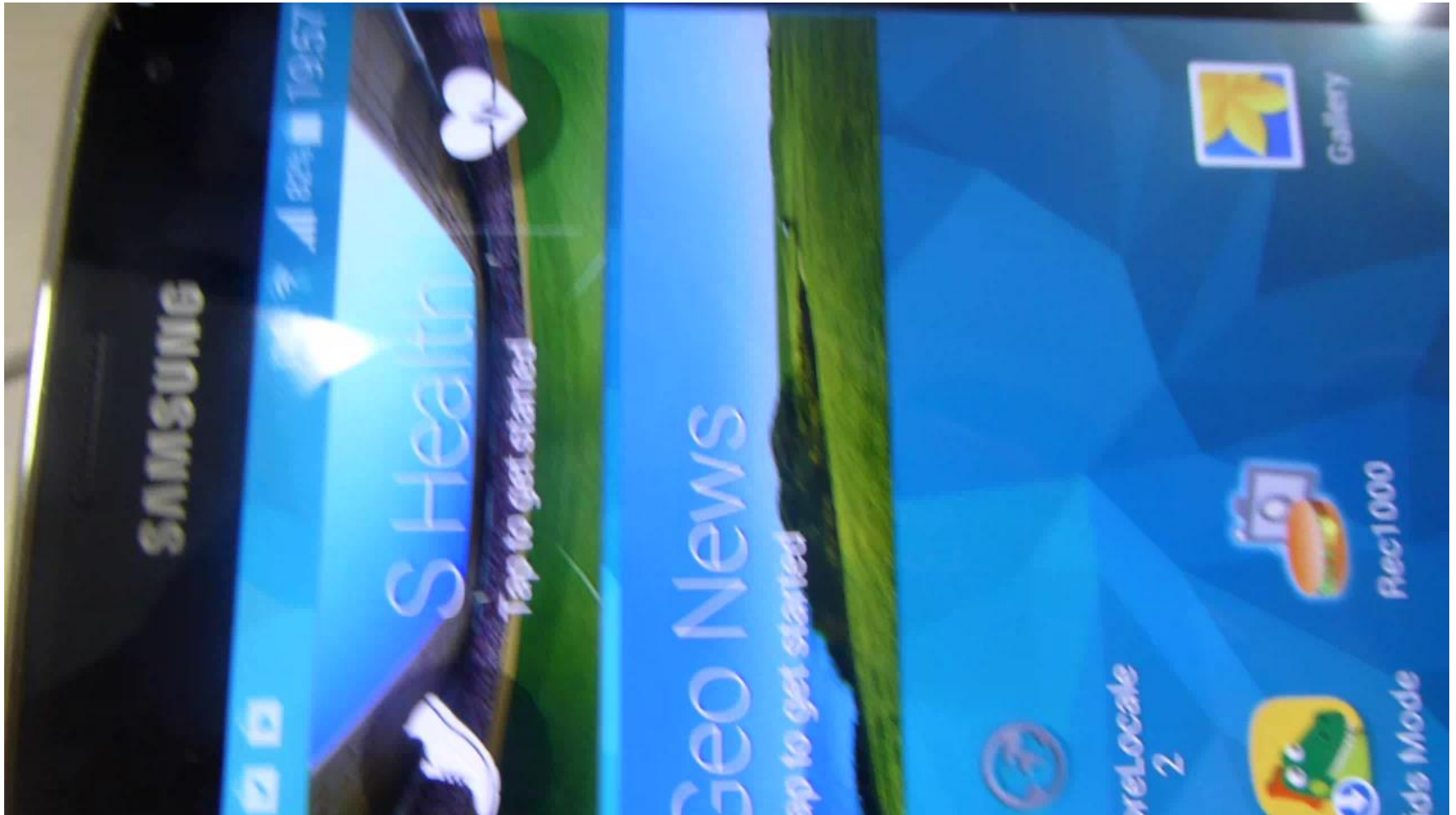


- **Recognition time: 0.27 second**
  - 1.6GHz Quad Core (Galaxy Note 2)

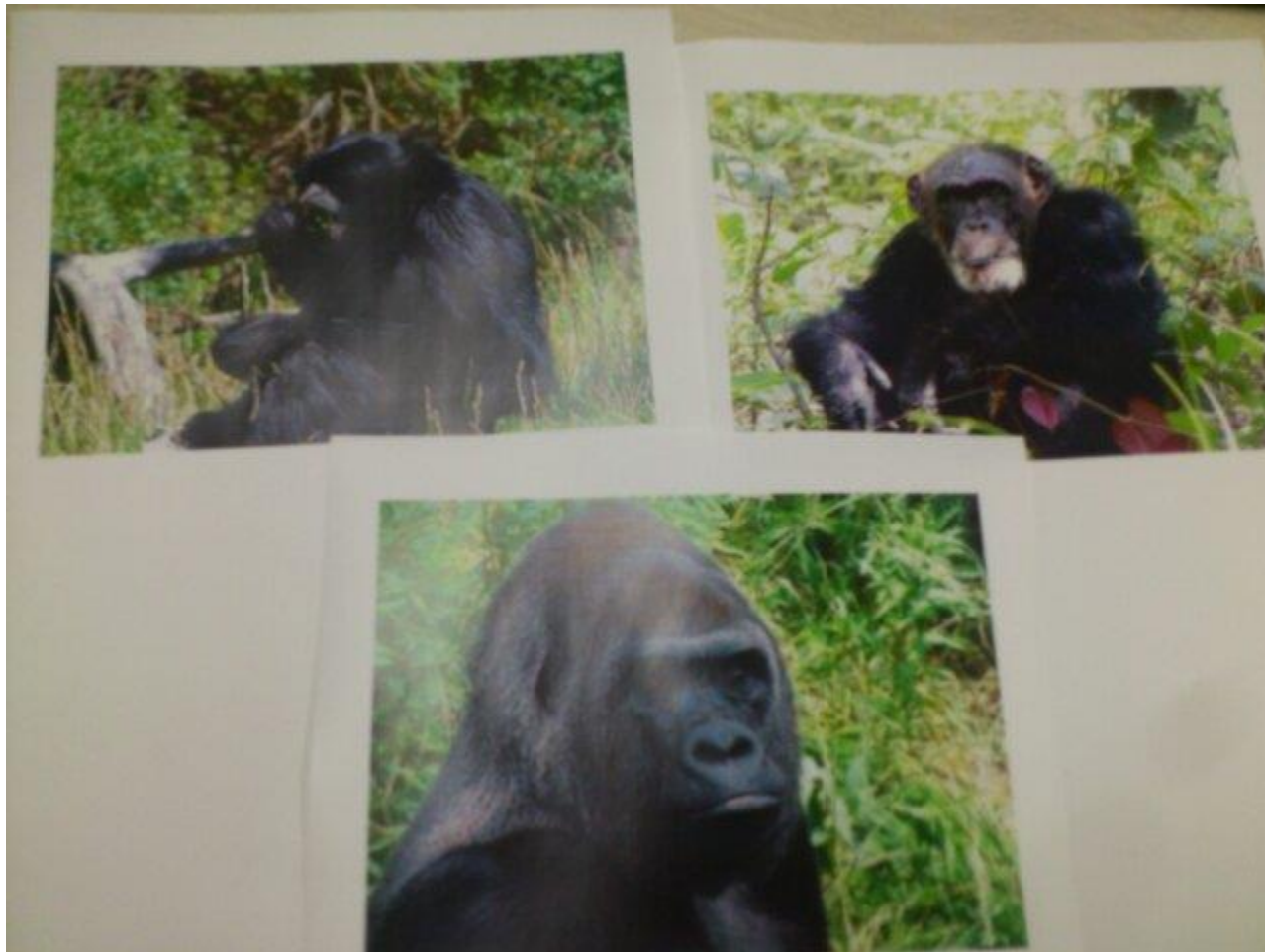


# DEMO

# Mouse -> cup -> desktop -> web



# siamang, gollira, chimpanzee



# siamang -> gollira -> chimpanzee

