

# Finding the Weakest Link in Person Detectors

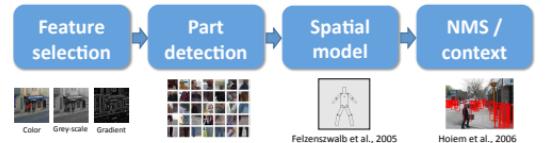
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## Introduction

### Person detection: Useful, Difficult



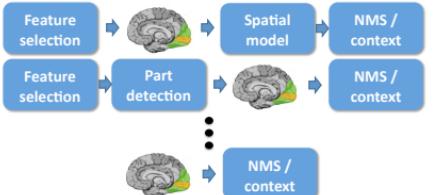
### How does it work?



### How can humans help?

- Supply training data: 100,000s labeled images
- We design the algorithms: Going on 40 years
- Can we use humans to debug?**

### Human Debugging



## Parts



VS.



Human Part Detection: Person

Human Part Detection: Not a person

Machine Part Detection: Person

Machine Part Detection: Not a person

Training data used for human studies

INRIA

PASCAL

AP

CH GH NH CL GL NL MP

Human spatial model

Machine spatial model

Human parts

Machine parts

Head

Torso

Arm

Hand

Leg

Foot

Person

Head

Torso

Arm

Hand

Leg

Foot

Person

## Spatial model



VS.



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## Features

What information is useful for recognition?



Human Person Detector

Human Part Detector

AP

CH GH NH CL GL NL MP

Human mm

Machine mm

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Machine parts

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Person

Human Part Detection: Person

Human Part Detection: Not a person

Machine Part Detection: Person

Machine Part Detection: Not a person

Training data used for human studies

## NMS / Context

### NMS



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### NMS + Context

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## Contributions

- Part detection is the weakest link in person detection, followed by NMS.
- Spatial models were not found to be crucial.
- Part Patch Dataset is available online.
- Human Debugging
  - Applicable to other visual recognition problems
  - Useful for other problem domains and AI in general

