

# Implementation of Contracting Curve Density Algorithm for Applications in Personal Robotics

April 26, 2011

Motivation

Outline of the talk

How the original CCD  
works?

Related work

Improvements of the  
original algorithm

The CCD tracker

Results of the  
experiments

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# Outline

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- 3 How the original CCD works?
- 4 Related work
- 5 Improvements of the original algorithm
- 6 The CCD tracker
- 7 Results of the experiments

# Motivation

## Some challenging task in personal robotics

- Image segmentation
  - Pose estimation
  - Object recognition and tracking
- 
- Model-based methods: these problems require much information external to the image
  - Curve-fitting process: a crucial part of these problems

## Requirements

- Robustness: stable in texture, clutter, poor contrast environment
- Accuracy: high sub-pixel accuracy
- Efficiency: time-constrained, limited computer hardware resources in personal robotics

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# How the original CCD works?

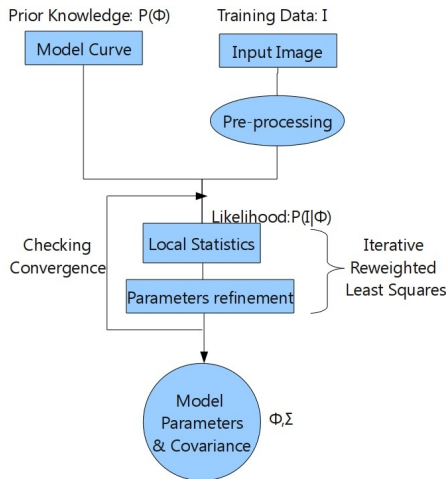


Figure: the CCD algorithm

# Sketch of the CCD algorithm

## Basic steps of the CCD algorithm

- Contour initialization
- Learning of local statistics
- Refinement of model parameters



**Figure:** The contour of a pan

# An alternative view of the CCD algorithm

## Bayesian logistic regression

- Evaluation of conditional distribution  $p(\Phi|\mathbf{I})$

$$p(\Phi|\mathbf{I}) \propto \underbrace{p(\mathbf{I}|\mathbf{m}_\Phi, \Sigma_\Phi)}_{\text{local statistics}} \times \underbrace{p(\Phi)}_{\text{prior distribution}}$$

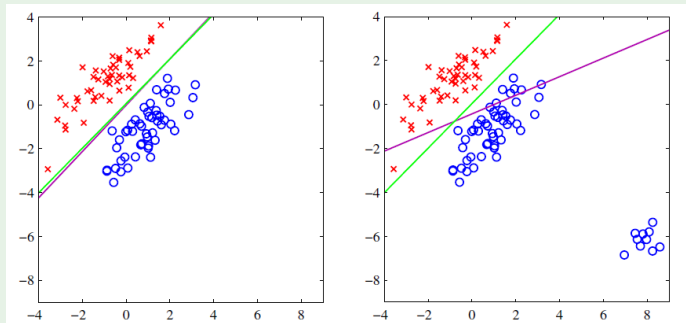
- Goal: MAP (maximum a posteriori probability) solution of cost function  $\mathcal{Q}(\Phi)$

$$\mathcal{Q}(\Phi) = \arg \max_{\Phi} \ln(p(\Phi|\mathbf{I}))$$

Approach: iterative reweighted least squares (IRLS) e.g. Gaussian Newton method, SVM

# An alternative view of the CCD algorithm

## A classification problem



**Figure:** A classification problem



# 3-4 papers

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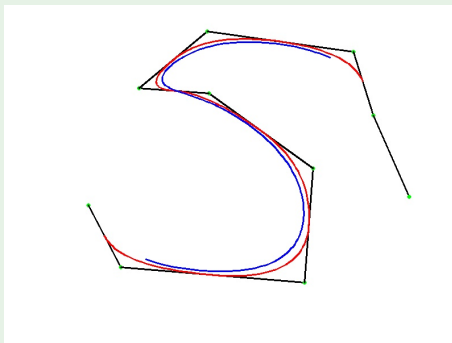
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# Quadratic and Cubic B-spline curves

## B-spline curves

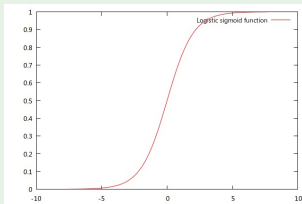
$$\mathbf{C}(u) = \sum_{i=0}^{m-n-2} P_i B_{i,n}(u), u \in [u_n, u_{m-n-1}]$$



**Figure:** B-spline curves of degree = 1, 2, 3

# Logitic and Probit function

## Logistic function

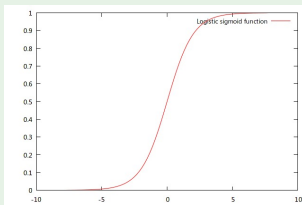


**Figure:** Logistic function

$$f(\cdot) = \frac{1}{1 + e^{-x}}$$

# Logitic and Probit function

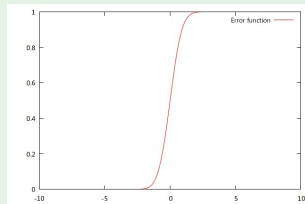
## Logistic function



**Figure:** Logistic function

$$f(\cdot) = \frac{1}{1 + e^{-x}}$$

## Probit function



**Figure:** Probit function

$$f(\cdot) = \frac{1}{2} \left( \frac{1}{\sqrt{2}} \operatorname{erf}(x) + 1 \right)$$

# Three-dimensional Affine Shape-space

## Parallax effect in two-dimensional affine shape-space



**Figure:** Parallax effect

## Three-dimensional affine shape-space



**Figure:** Three-dimensional affine  
shape-space

# Initialization from SIFT Features

## Initialization from SIFT Features



**Figure:** Initialization from SIFT Features

# algorithm

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# manually initialization

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# initialization from SIFT

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