

## Level Set Method

① Represent contour as zero level set of a two dim function  $\phi(x, y)$

i.e.  $C(s) = \{x, y : \phi(x, y) = 0\}$ . Many choice of  $\phi$  for a given contour  $C$ .

For e.g.  $\phi(x, y)$  = Signed Distance Function, i.e.

$$\phi(x, y) = \begin{cases} -d(x, y, C) & (x, y) \text{ inside } C \\ +d(x, y, C) & (x, y) \text{ outside } C \end{cases}$$

$d(x, y, C)$  = minimum distance of  $(x, y)$  to any point on the contour  $C$ .

②  $\phi$  is zero level set of the contour

Consider an "evolving" function  $\phi(x, y, t)$ .

~~level set~~ By definition,  $\phi$  maintains the property

$$\phi(C_x(s), C_y(s), t) = 0 \quad \forall t.$$

i.e.  $\frac{d\phi}{dt} = 0.$

$$\frac{d\phi}{dt} = \frac{\partial \phi}{\partial x} \frac{dC_x}{dt} + \frac{\partial \phi}{\partial y} \frac{dC_y}{dt} + \frac{\partial \phi}{\partial t} = 0$$

$$\frac{\partial \phi}{\partial t} = -\nabla \phi \cdot \frac{dC}{dt}$$

$$\frac{dC}{dt} = -\nabla_C E \quad \begin{array}{l} \text{can} \\ \text{comes from gradient descent of} \\ \text{desired energy functional} \end{array}$$

or

$\frac{dc}{dt}$  : may come from some random motion applied to the contour (needed for M.C. methods)

eg.  $\frac{dc}{dt} = \underbrace{B_s}_{\text{smoothing term}} \underbrace{U_s}_{\text{smoothing term}}$

② Extension velocity : In either case, ~~we~~  $\frac{dc}{dt}$  is available only on the contour, but we want to ~~apply~~ find a "velocity" for entire ~~contour~~  $x-y$  plane.

Different ways: only need to satisfy smoothness at  $C$ .

If perform normal extension (same value along each normal), all level sets ~~move~~ have same motion as zero level set: signed distance function property maintained.

④ Computing zero level set : ~~After  $Q$  at any time~~  
After "evolving" the level set function to convergence, need to find the corresponding contour (i.e. zero level set) ~~of the~~  
→ use contour command, or `bwtrace contour`

⑤ Re-initialization : Due to numerical errors, even with normal extension velocities, level sets bunch up: resulting in instability/errors.



If <sup>do</sup> not use normal extension: this occurs more often...

## ⑥ Narrowband method

Evolve LSF only in a  $\pm 3$  pixel. (or other size) narrowband about the zero level set.

Re-init whenever zero level set is near boundary of narrowband.

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## Geometric Reps. of Contour

With parametric reps., initially chose uniformly spaced points on the contour. Later evolved the points according to  $\frac{dc}{dt} = -\nabla c \cdot E$ .

After sometime, some points will move too close, others more too far away.

Also contour may break,



Need to keep re-parameterizing the contour every so often. Re-parameterize: choose points unif on arclength

Also, the contour evolution is defined not ~~with~~ w.r.t. arclength but w.r.t. some parameter  $p$ .

~~$s$~~   $C_s = \frac{\partial c}{\partial s}$   ~~$s$~~   $s_0$  arclength at  $t=0$  but not later.

$t > 0$

$$ds = \left\| \frac{\partial c}{\partial p} \right\| dp = \left[ \left( \frac{\partial c}{\partial p} \right)^2 + \left( \frac{\partial c}{\partial p} \right)^2 \right]^{1/2} dp$$

$$\frac{\partial c}{\partial s} = \frac{1}{\| \frac{\partial c}{\partial p} \|} \frac{\partial c}{\partial p}$$

Snake: ignores this distinction.

↓  
 Energy is a function of parametric derivatives  
 i.e.  ~~$\int \|c\|^2 dp$~~   $\int_0^{L_0} \| \frac{\partial c}{\partial p} \|^2 dp$

$C_p$  implemented  $\nabla E = -C_{pp}$

as  $(C_{x1} - C_x)$   
 (assuming unit  
 disk as length disk)

$L_0$  initial contour length.

ideally:

"geometric energy"  $E = \int_0^L ds$  : arc length

$L =$  depends on current contour

$$\int_0^1 \| \frac{\partial c}{\partial p} \| dp$$

$p: 0 \rightarrow 1$

or  $0$  to  $L_0$ : same

thing is  
 constant  
 integral

$$\nabla E = \frac{1}{\|c\|} \frac{\partial (c_p)}{\partial p} \frac{1}{\|c\|}$$

w.r.t  $\nabla E \cdot \alpha \triangleq \int_0^1 \frac{\partial E}{\partial p} \alpha(p) \frac{1}{\|c\|} dp$   
 $\int_0^1 \frac{\partial E}{\partial x} \alpha(x) ds$

limits are const  
 easy to differentiate

"parametric rep"

eg circle:  $x = r \cos \theta$   
 $y = r \sin \theta$

$$c(p) = \begin{bmatrix} r \cos 2\pi p \\ r \sin 2\pi p \end{bmatrix}$$

$p: 0 \rightarrow 1$

or  $c(q) = \begin{bmatrix} r \cos 2\pi q^2 \\ r \sin 2\pi q^2 \end{bmatrix}$  : same circle

Implicit:  $\mathcal{U}(x, y) = x^2 + y^2 - 1 = 0$

$$\tilde{\mathcal{V}}(x, y) = x^4 + y^4 + 2x^2y^2 - 1 = 0$$

Unit Tangent

$$\vec{T} = \frac{\frac{\partial \vec{c}}{\partial p}}{\left\| \frac{\partial \vec{c}}{\partial p} \right\|}$$

$$\text{curvature: } \kappa = \left\| \frac{\partial^2 \vec{c}}{\partial s^2} \right\| = \frac{1}{\left\| \frac{\partial \vec{c}}{\partial p} \right\|} \left\| \frac{\partial}{\partial p} \left( \frac{\frac{\partial \vec{c}}{\partial p}}{\left\| \frac{\partial \vec{c}}{\partial p} \right\|} \right) \right\|$$

$$\frac{\partial^2 \vec{c}}{\partial s^2} = \kappa \vec{N}$$

geometric: can be expressed in terms of arc length & its derivatives

↓  
can write compute using level set function

$$\text{e.g. } \vec{N} = \frac{\nabla \phi}{\|\nabla \phi\|} \quad (\text{if } \phi \text{ is } \perp \vec{T} \text{ (}\phi \text{ constant along the contour)})$$

$$\kappa = \nabla \cdot \left( \frac{\nabla \phi}{\|\nabla \phi\|} \right)$$