## SMOOTH SURFACES AND THEIR OUTLINES II

- The second fundamental form
- Koenderink’s Theorem
- Aspect graphs
- More differential geometry
- A catalogue of visual events
- Computing the aspect graph
- http://www.di.ens.fr/~ponce/geomvis/lect8.ppt
- http://www.di.ens.fr/~ponce/geomvis/lect8.pdf


## Smooth Shapes and their Outlines



Can we say anything about a 3D shape from the shape of its contour?

What can happen to a curve in the vicinity of a point?

(a) Regular point;
(b) inflection;
(c) cusp of the first kind;
(d) cusp of the second kind.

## The Gauss Map



- It maps points on a curve onto points on the unit circle.
- The direction of traversal of the Gaussian image reverts at inflections: it folds there.

The curvature


- $C$ is the center of curvature;
- $R=C P$ is the radius of curvature;

$$
d t / d s=\kappa \boldsymbol{n}
$$

- $\kappa=\lim \delta \theta / \delta s=1 / R$ is the curvature.

Closed curves admit a canonical orientation..


Normal sections and normal curvatures


Principal curvatures: minimum value $\kappa_{1}$ maximum value $\kappa_{2}$

Gaussian curvature:

$$
K=\kappa_{1} \kappa_{2}
$$

The differential of the Gauss map


$$
d \boldsymbol{N}(\boldsymbol{t})=\lim _{\delta s \rightarrow 0} \frac{1}{\delta s} \delta \boldsymbol{N}
$$

Second fundamental form: $\operatorname{II}(\boldsymbol{u}, \boldsymbol{v})=\boldsymbol{u}^{T} \boldsymbol{d} \boldsymbol{N}(\boldsymbol{v})$
(II is symmetric.)

- The normal curvature is $\kappa_{t}=\operatorname{II}(\boldsymbol{t}, \boldsymbol{t})$.
- Two directions are said to be conjugated when II ( $\boldsymbol{u}, \boldsymbol{v}$ ) $=0$.


## The local shape of a smooth surface



Elliptic point
K > 0


Hyperbolic point
$K<0$

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Parabolic point $\quad K=0$


The parabolic lines marked on the Apollo Belvedere by Felix Klein

$N \cdot v=0 \Rightarrow \operatorname{II}(\boldsymbol{t}, \boldsymbol{v})=0$

## Asymptotic directions:



The contour cusps when when a viewing ray grazes the surface along an asymptotic direction.


## The Gauss map



## The Gauss map folds at parabolic points.

$$
K=d A^{\prime} / d A
$$

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## Smooth Shapes and their Outlines



Can we say anything about a 3D shape from the shape of its contour?


Theorem [Koenderink, 1984]: the inflections of the silhouette are the projections of parabolic points.

Koenderink's Theorem (1984)

$$
K=\kappa_{r} \kappa_{C}
$$

Note: $\kappa_{r}>0$.
Corollary: $K$ and $\kappa_{C}$ have the same sign!

Proof: Based on the idea that, given two conjugated directions,


$$
K \sin ^{2} \theta=\kappa_{u} \kappa_{v}
$$

## What are the contour stable features??



Reprinted from "Computing Exact Aspect Graphs of Curved Objects:
Algebraic Surfaces," by S. Petitjean,
J. Ponce, and D.J. Kriegman, the

International Journal of Computer
Vision, 9(3):231-255 (1992). © 1992
Kluwer Academic Publishers.

How does the appearance of an object change with viewpoint?


## Imaging in Flatland: Stable Views

Visual Event: Change in Ordering of Contour Points


TrapmqueiDD bjbject

Visual Event: Change in Number of Contour Points


Trapmquerobjbject

## Exceptional and Generic Curves



The Aspect Graph In Flatland


## The Geometry of the Gauss Map

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Asymptotic directions at ordinary hyperbolic points


The integral curves of the asymptotic directions form two families of asymptotic curves (red and blue)

Asymptotic curves


Parabolic curve

Asymptotic curves’ images


Fold

- Asymptotic directions are self conjugate: $\boldsymbol{a} \cdot d \boldsymbol{N}(\boldsymbol{a})=0$
- At a parabolic point $d N(\boldsymbol{a})=0$, so for any curve

$$
\boldsymbol{t} \cdot \mathrm{d} \boldsymbol{N}(\boldsymbol{a})=\boldsymbol{a} \cdot d \boldsymbol{N}(\boldsymbol{t})=0
$$

- In particular, if t is the tangent to the parabolic curve itself $d N(a) \approx d N(t)$


## The Lip Event

$$
v . d N(\boldsymbol{a})=0 \Rightarrow \boldsymbol{v} \approx \boldsymbol{a}
$$




A


B


C

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International Journal of Computer Vision, 43(2):113-131 (2001). © 2001 Kluwer Academic Publishers.

## The Beak-to-Beak Event

## $\boldsymbol{v} \cdot d \boldsymbol{N}(\boldsymbol{a})=0 \Rightarrow \boldsymbol{v} \approx \boldsymbol{a}$



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International Journal of Computer Vision, 43(2):113-131 (2001). © 2001 Kluwer Academic Publishers.

## Ordinary Hyperbolic Point

 International Journal of Computer
Vision, 43(2):113-131 (2001).
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Publishers.


Red asymptotic curves


Red flecnodal curve

Cusp pairs appear or disappear as one crosses the fold of the asymptotic spherical map.
This happens at asymptotic directions along parabolic curves, and asymptotic directions along flecnodal curves.

## The Swallowtail Event



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The Bitangent Ray Manifold:

Ordinary
bitangents..


## ..and exceptional (limiting) ones.

Reprinted from "Toward a Scale-Space Aspect Graph: Solids of Revolution," by S. Pae and J. Ponce, Proc. IEEE Conf. on Computer Vision and Pattern Recognition (1999). © 1999 IEEE.

## The Tangent Crossing Event



Reprinted from "On Computing Structural Changes in Evolving Surfaces and their Appearance," by S. Pae and J. Ponce, the International Journal of Computer Vision, 43(2):113-131 (2001). © 2001 Kluwer Academic Publishers.

## The Cusp Crossing Event



After "Computing Exact Aspect Graphs of Curved Objects: Algebraic Surfaces," by S. Petitjean, J. Ponce, and D.J. Kriegman, the International Journal of Computer Vision, 9(3):231-255 (1992). © 1992 Kluwer Academic Publishers.


After "Computing Exact Aspect Graphs of Curved Objects: Algebraic Surfaces," by S. Petitjean, J. Ponce, and D.J. Kriegman, the International Journal of Computer Vision, 9(3):231-255 (1992). © 1992 Kluwer Academic Publishers.

## Tracing Visual Events

## Computing the Aspect Graph

$F(x, y, z)=0$


$$
P_{1}\left(x_{1}, \ldots, x_{n}\right)=0
$$

$$
P_{n}\left(x_{1}, \ldots, x_{n}\right)=0
$$

- Curve Tracing


After "Computing Exact Aspect Graphs of Curved Objects: Algebraic Surfaces," by S. Petitjean, J. Ponce, and D.J. Kriegman, the International Journal of Computer Vision, 9(3):231-255 (1992). © 1992 Kluwer Academic Publishers.

- Cell Decomposition


An Example


## Approximate Aspect Graphs（Ikeuchi \＆Kanade，1987）

| Aspect 7 | $\begin{aligned} & 00000000 \\ & \text { nil } \end{aligned}$ |
| :---: | :---: |
| Aspect6 | $\begin{aligned} & 00010000 \\ & (4) \end{aligned}$ |
| Aspect5 | $\begin{gathered} -00001100 \\ (5)(6) \end{gathered}$ |
| Aspect4 | $\begin{aligned} & \left.-\quad \begin{array}{l} 11000001 \\ (1)(2)(8) \end{array}\right) \end{aligned}$ |
| Aspect3 | $\begin{aligned} & -11000010 \\ & (1)(2)(7) \end{aligned}$ |
| Aspect2 | $\begin{aligned} & -11000000 \\ & (1)(2) \end{aligned}$ |
| Aspect1 | $\begin{array}{r} -11100000 \\ (1)(2)(3) \end{array}$ |


| （a） $0^{2}$ |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
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| － |  | （1） |  | \％ | （0） | \％ | （20） |  |
| （ |  |  |  | Q | 6） | $\square$ | 5ag［ |  |

Reprinted from＂Automatic Generation of Object Recognition Programs，＂by K．Ikeuchi and T．Kanade，Proc．of the IEEE，76（8）：1016－1035（1988）． © 1988 IEEE．

Approximate Aspect Graphs II: Object Localization (Ikeuchi \& Kanade, 1987)


Reprinted from "Precompiling a Geometrical
Model into an Interpretation Tree for Object Recognition in Bin-Picking Tasks," by K. Ikeuchi, Proc. DARPA Image Understanding Workshop, 1987.

## VISUAL HULLS

- Visual hulls
- Differential projective geometry
- Oriented differential projective geometry
- Image-based computation of projective visual hulls







Aspect graphs Koenderink \& Van Doorn (1976)
 structure
Lazebnik \& Ponce (2003)


The visual hull
Baumgart (1974); Laurentini (1995); Petitjean (1998); Matusik et al. (2001);
Lazebnik, Boyer \& Ponce (2001); Franco \& Boyer (2005).


Aspect graphs Koenderink \& Van Doorn (1976)

## $\square$

 Oriented projective structureLazebnik \& Ponce (2003)


The visual hull
Baumgart (1974); Laurentini (1995); Petitjean (1998);

Matusik et al. (2001);
Lazebnik, Boyer \& Ponce (2001)

Durand et al. (1997)


Aspect graphs Koenderink \& Van Doorn (1976)

## $\square$

 Oriented projective structureLazebnik \& Ponce (2003)


The visual hull
Baumgart (1974); Laurentini (1995); Petitjean (1998);

Matusik et al. (2001);
Lazebnik, Boyer \& Ponce (2001)

Durand et al. (1997)



Elliptical


Hyperbolic


Parabolic

$$
K=\ln ^{\prime}-m^{2} \quad\left\{\begin{array}{l}
l=\left|X, X_{u}, X_{v}, X_{u u}\right| \\
m=\left|X, X_{u}, X_{v}, X_{u v}\right| \\
n=\left|\boldsymbol{X}, X_{u}, X_{v}, X_{w}\right|
\end{array}\right.
$$



Koenderink (1984)


## Projective visual hulls



Lazebnik, Furukawa \& Ponce (2004)

## Affine structure and motion



Furukawa, Sethi, Kriegman \& Ponce (2004)

## What about plain projective geometry?



With X. Goaoc, S. Lazard, S. Petitjean, M. Teillaud.


What about polyhedral approximations of smooth surfaces?

With X. Goaoc and S. Lazard.





