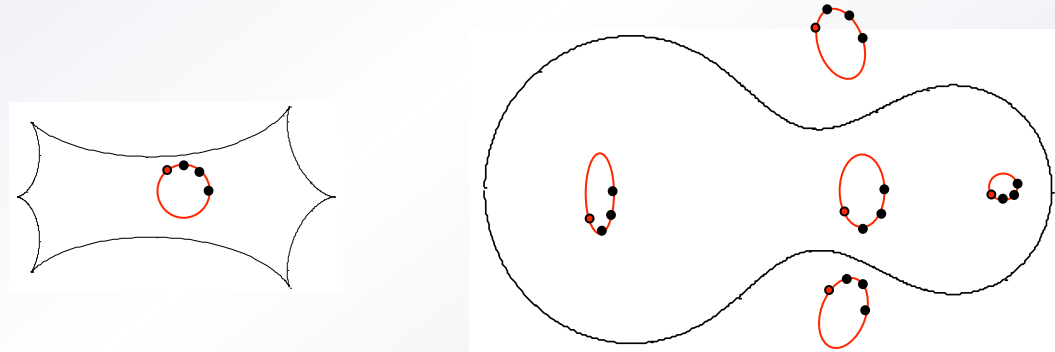


Light curve computation in binary microlensing

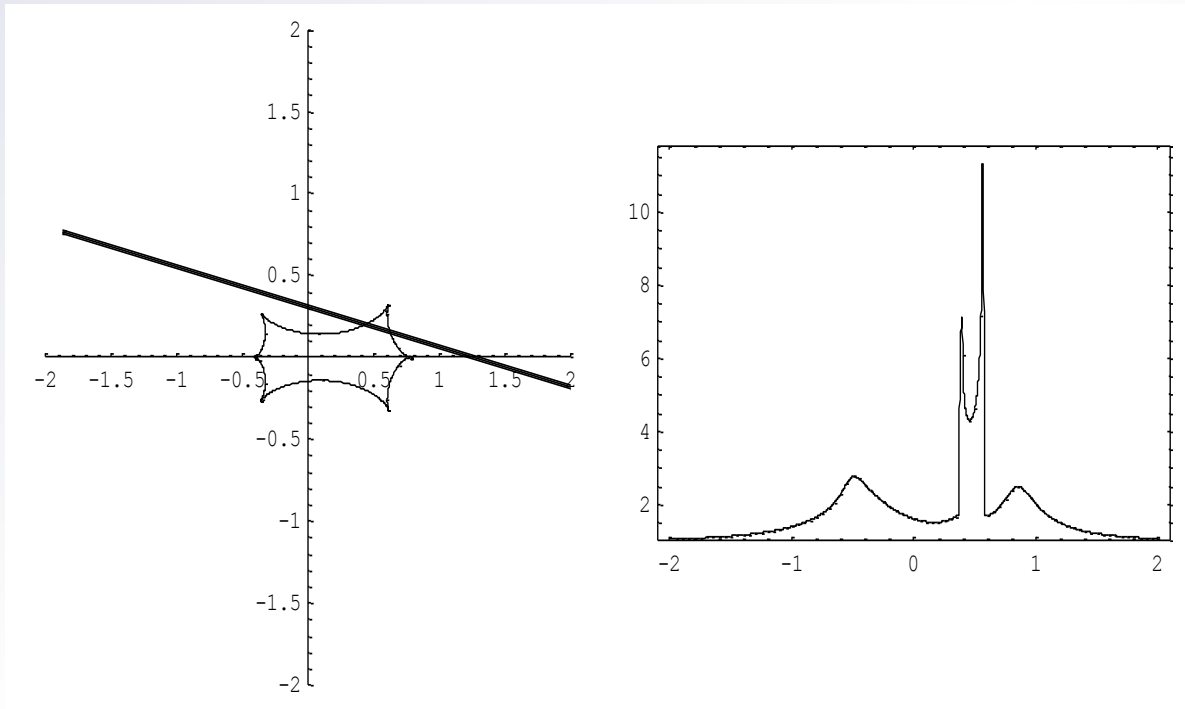


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Our goal

- Our purpose is to calculate microlensing light curves

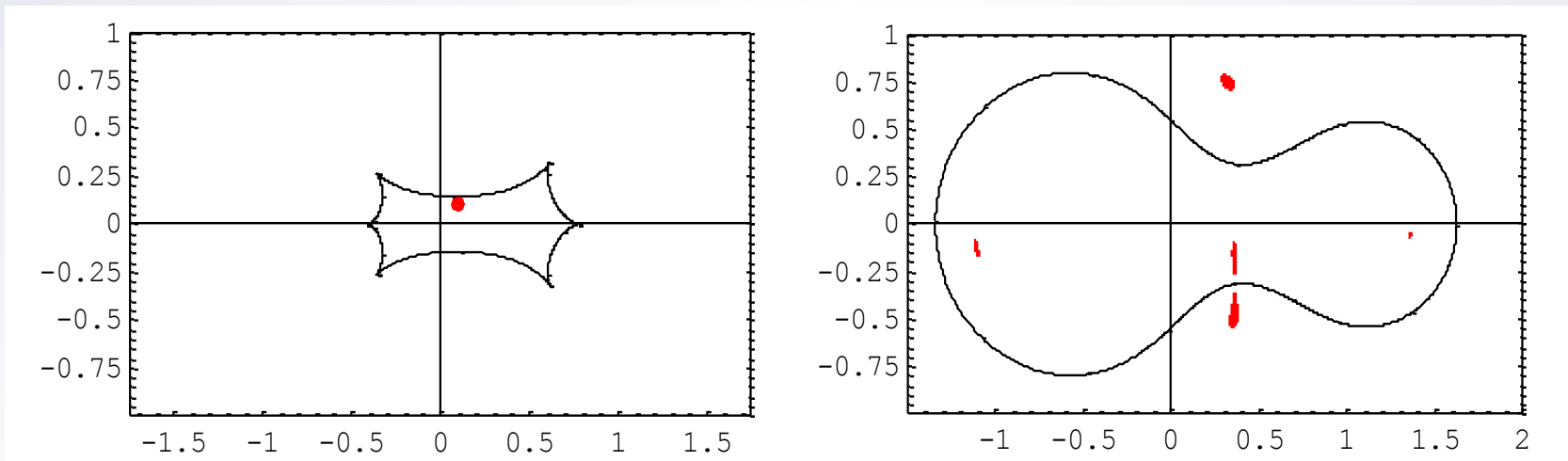


- ... that is the magnification of a given source that passes behind a given binary lens.

Our goal

- For a given source position and size and for a given lens model, we need to calculate the magnification factor

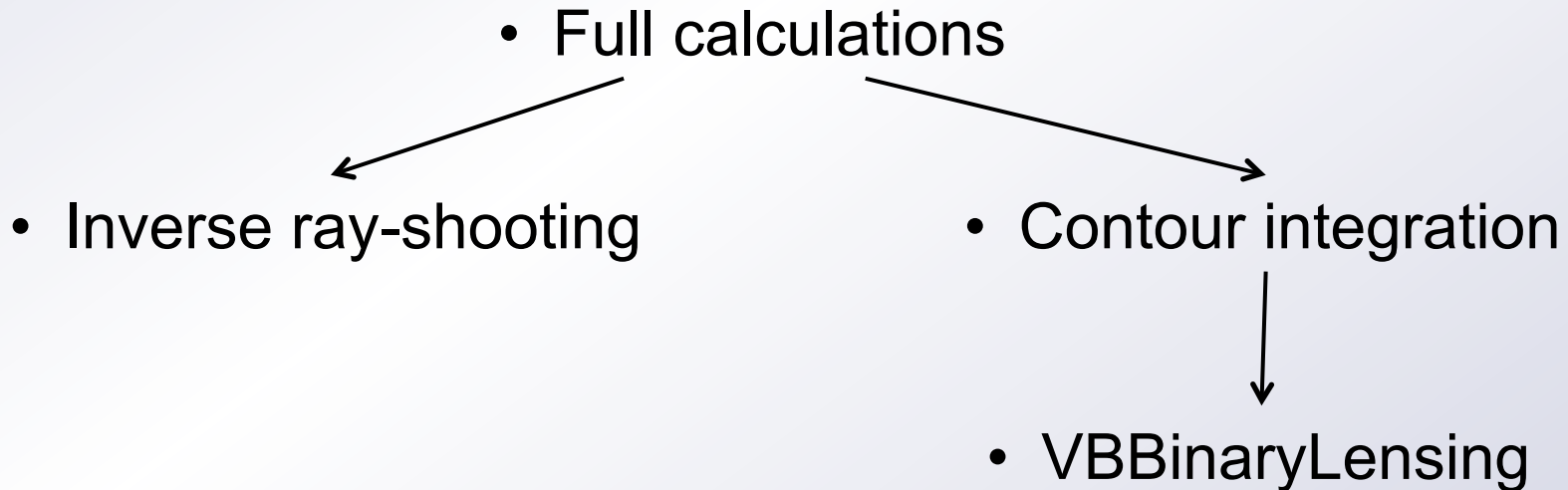
$$\mu = \frac{\sum_I A_I}{A_S}$$



- We must find the images and calculate their area.

Summary

- In order to reach this goal, we will take several steps:
 - Point-source magnification (Solving the lens equation)
 - Finite-source approximations (Quadrupole and Hexadecapole)



1. Point-source magnification

Lens equation

- Let us use complex notations (Witt 1990), in a frame centered on the lower mass object:

$$\xi = z - \frac{m_1}{\bar{z} - s} - \frac{m_2}{\bar{z}}$$

$$m_1 = \frac{1}{1+q}$$

$$m_2 = \frac{q}{1+q}$$

- \bar{z} can be eliminated using the conjugate equation.
- We end up with a fifth order polynomial equation

$$p(z) = \sum_{i=0}^5 c_i z^i = 0$$

$$\begin{aligned} c_0 &= s^2 \xi m_2^2 \\ c_1 &= -s m_2 (2 \xi + s (-1 + s \xi - 2 \xi \bar{\xi} + m_2)) \\ c_2 &= \xi - s^3 \xi \bar{\xi} + s (-1 + m_2 - 2 \xi \bar{\xi} (1 + m_2)) + s^2 (\bar{\xi} - 2 \bar{\xi} m_2 + \xi (1 + \bar{\xi}^2 + m_2)) \\ c_3 &= s^3 \bar{\xi} + 2 \xi \bar{\xi} + s^2 (-1 + 2 \xi \bar{\xi} - \bar{\xi}^2 + m_2) - s (\xi + 2 \xi \bar{\xi}^2 - 2 \bar{\xi} m_2) \\ c_4 &= \bar{\xi} (-1 + 2 s \xi + \xi \bar{\xi}) - s (-1 + 2 s \bar{\xi} + \xi \bar{\xi} + m_2) \\ c_5 &= (s - \bar{\xi}) \bar{\xi} \end{aligned}$$

1. Point-source magnification

Finding the roots

- Starting from an arbitrary initial condition z_0 , we can find a root of a n^{th} degree polynomial using Laguerre's method:

$$z_{k+1} = z_k - \frac{n}{G \pm \sqrt{(n-1)(nH - G^2)}} \quad G = \frac{p'(z_k)}{p(z_k)}, \quad H = G^2 - \frac{p''(z_k)}{p(z_k)}$$

- Once we have the first root z_1 , we can divide the original polynomial by $(z-z_1)$ and find the next root.
- After all roots have been found on the reduced polynomials, they must be “polished” using the original full polynomial.
- Numerical Recipes implements this algorithm by `zroots` and `laguer` (Press et al.)
- An optimized root finding algorithm was published by Skowron and Gould (2012).

http://www.astrouw.edu.pl/~jskowron/cmplx_roots_sg

1. Point-source magnification

Point-source magnification

- Not all roots of $p(z)$ are images. They must be checked with the original lens equation.
- When the source is outside the caustics, two roots are spurious and must be discarded.
- For each image we can calculate the magnification by the inverse Jacobian

$$\mu_I = J^{-1}(z_I) = \frac{1}{\left|1 - \left|\frac{\partial \bar{\xi}}{\partial z}\right|^2\right|} \quad \frac{\partial \bar{\xi}}{\partial z} = \frac{m_1}{(z_I - s)^2} + \frac{m_2}{z_I^2}$$

- The magnification of a point-source by a binary lens is then

$$\mu = \sum_I \mu_I$$

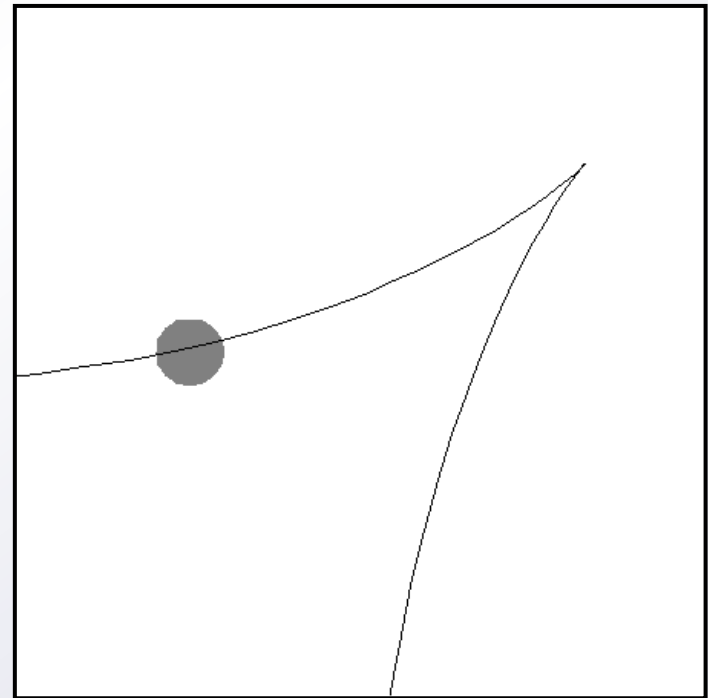
2. Finite-source approximations

Finite-source effect

- We know that binary lenses have extended caustics where the magnification diverges.
- Finite source effects show up much more often than in the single lens case.
- Direct integration in the source plane is extremely unstable due to divergences.

$$\mu_{FS} = \int_{source} \mu_{PS} d^2 y$$

- Alternative algorithms needed.



2. Finite-source approximations

Quadrupole and Hexadecapole

- Far from caustics, we can Taylor expand the magnification and take limb darkening into account

(Pejcha & Heyrovsky 2007; Gould 2008; Cassan 2017)

$$A_{FS} = A_0 + \frac{A_2 \rho^2}{2} \left(1 - \frac{1}{5} \Gamma\right) + \frac{A_4 \rho^4}{3} \left(1 - \frac{11}{35} \Gamma\right) + \dots$$

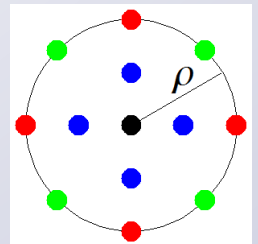
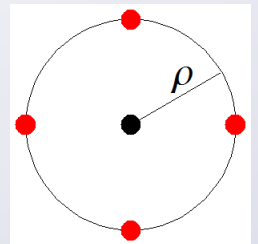
- The coefficients can be obtained by averaging the magnification calculated on few points on the boundary:

$$A_{\rho,+} = \frac{1}{4} \sum_{j=0}^3 A[\rho \cos(j\pi/2), \rho \sin(j\pi/2)] - A_0$$

- Quadrupole: $A_2 \rho^2 = A_{\rho,+}$

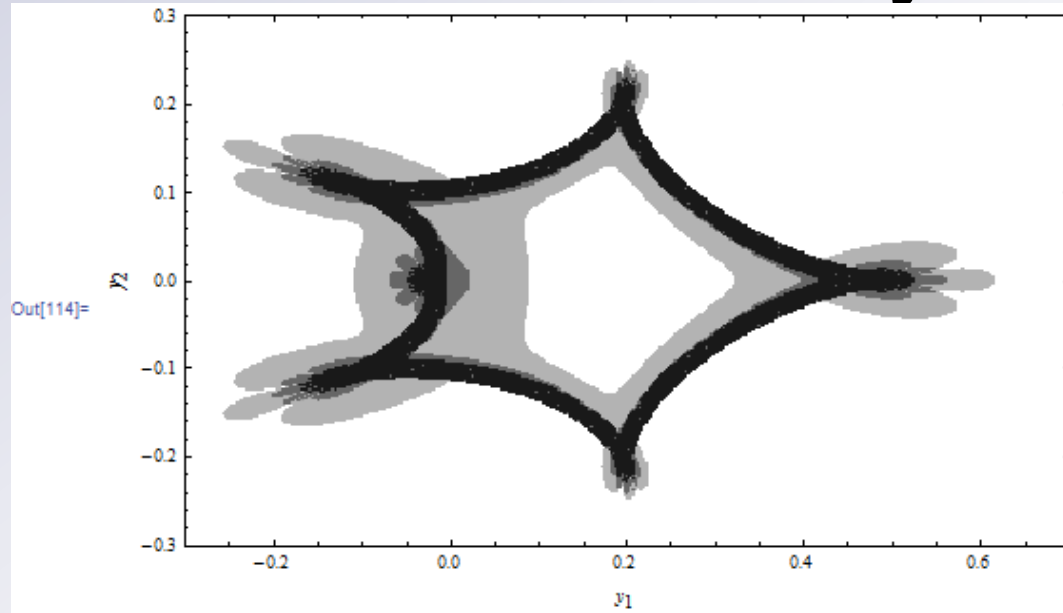
- Hexadecapole:

$$A_2 \rho^2 = \frac{16A_{\rho/2,+} - A_{\rho,+}}{3}; \quad A_4 \rho^4 = \frac{A_{\rho,+} + A_{\rho,x}}{2} - A_2 \rho^2$$



2. Finite-source approximations

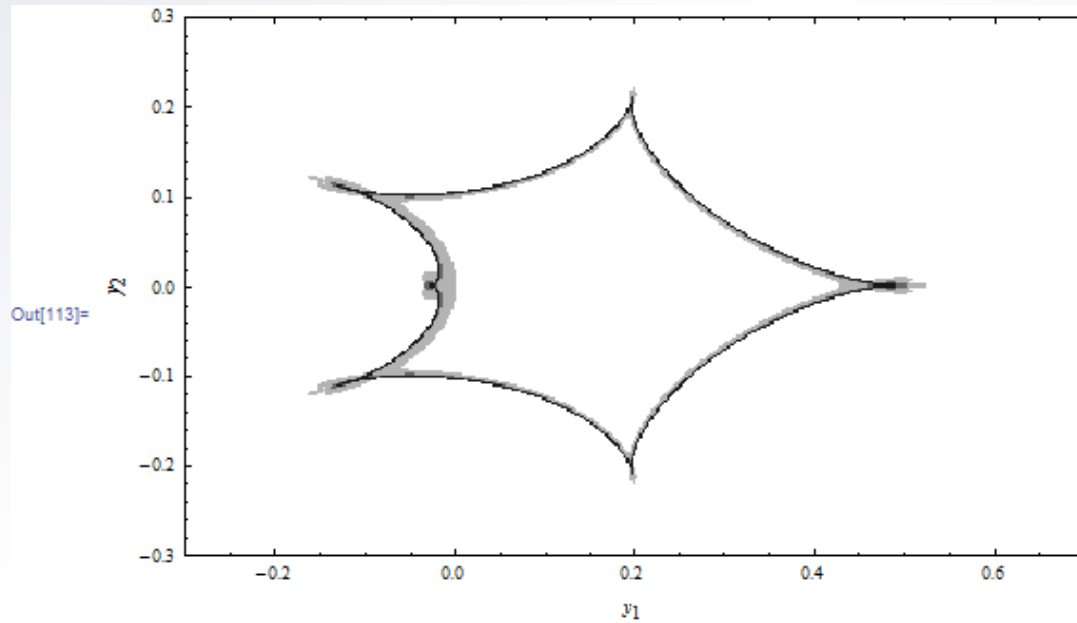
Validity range



$$\rho = 0.01$$

$$\text{Accuracy} = 0.01$$

- Point-source valid
- Quadrupole valid
- Hexadecapole valid
- Full calculation needed

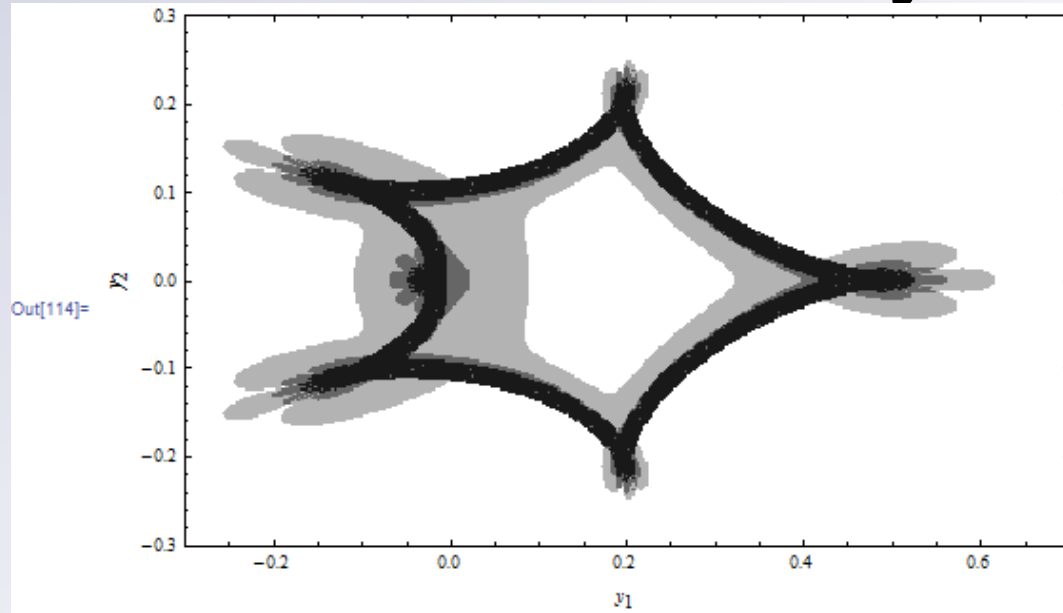


$$\rho = 0.001$$

$$\text{Accuracy} = 0.01$$

2. Finite-source approximations

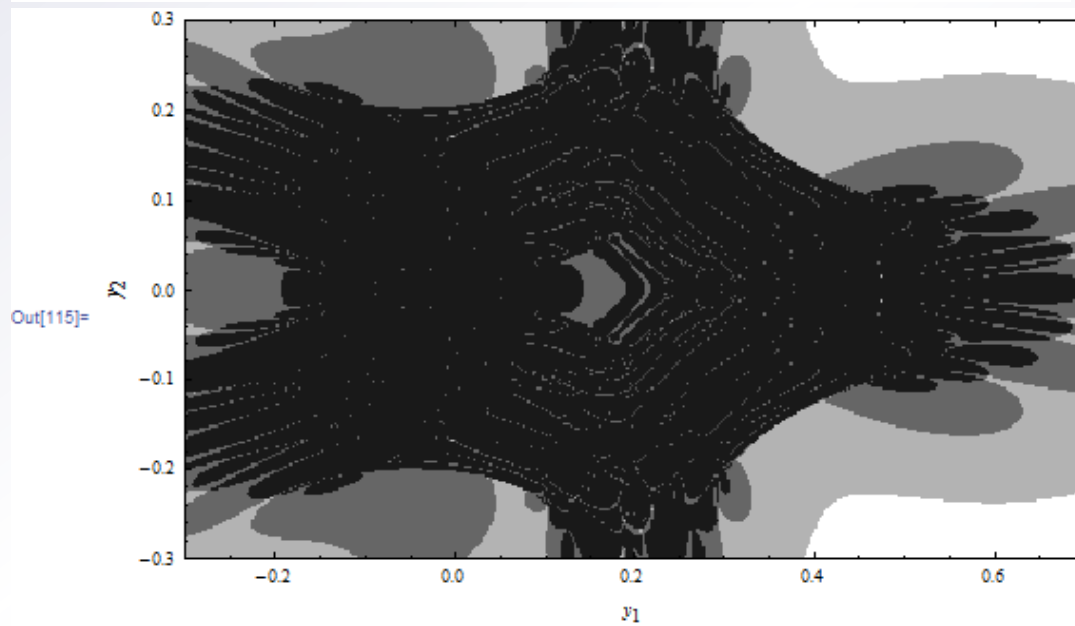
Validity range



$$\rho = 0.01$$

$$\text{Accuracy} = 0.01$$

- Point-source valid
- Quadrupole valid
- Hexadecapole valid
- Full calculation needed



$$\rho = 0.1$$

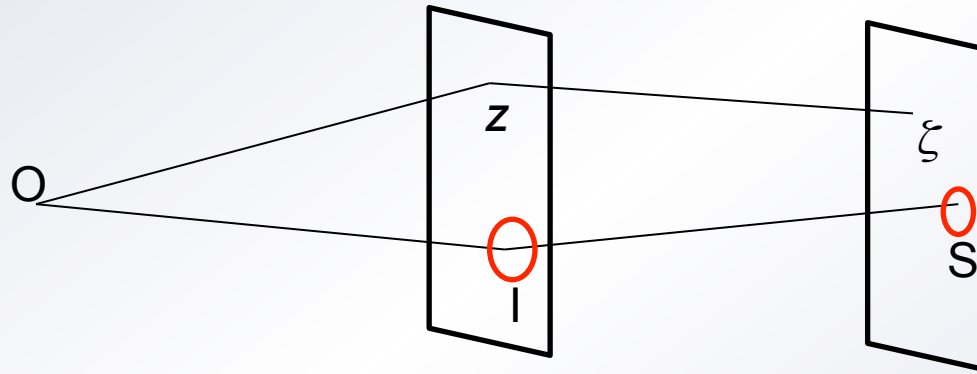
$$\text{Accuracy} = 0.01$$

3. Inverse ray-shooting

Inverse ray shooting

- For each point in the lens plane z , the lens map gives the position ζ in which a source should lie in order to have an image in z .

$$\zeta = z - \frac{m_1}{\bar{z} - s} - \frac{m_2}{\bar{z}}$$

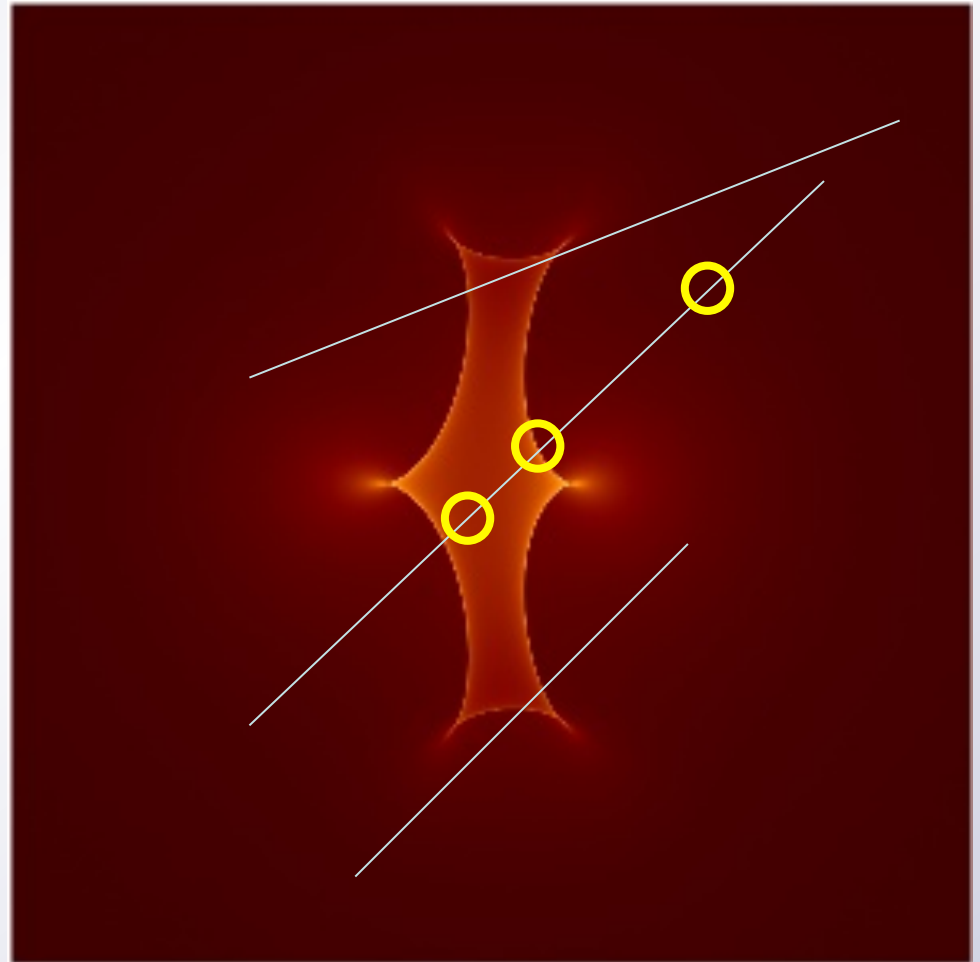


- By scanning the whole lens plane, we can find all images.
- The area of the images is proportional to the number of rays landing at the source.
- Limb darkening obtained by weighing rays by the source brightness at landing point.
- Every ray requires little computation.
- Large numbers of rays needed to be accurate.

3. Inverse ray-shooting

Magnification maps

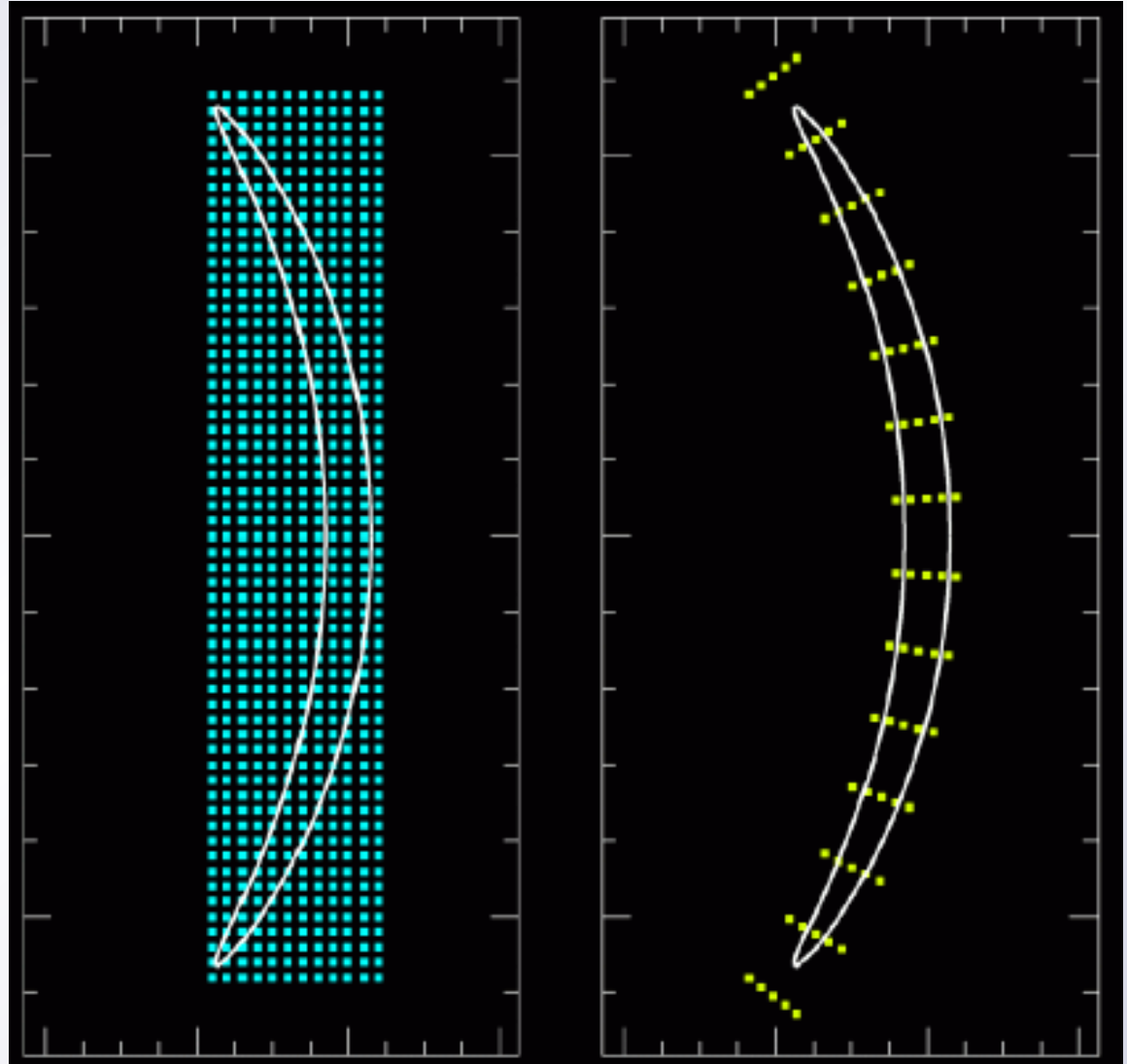
- A uniform scansion of the lens plane results in a magnification map in the lens plane. (Wambsganns 1992, 1997)
- This can be re-used for any source trajectories on the same lens model.
- A broad search in the parameter space is cheap for fixed s and q .



3. Inverse ray-shooting

Image-centered ray-shooting

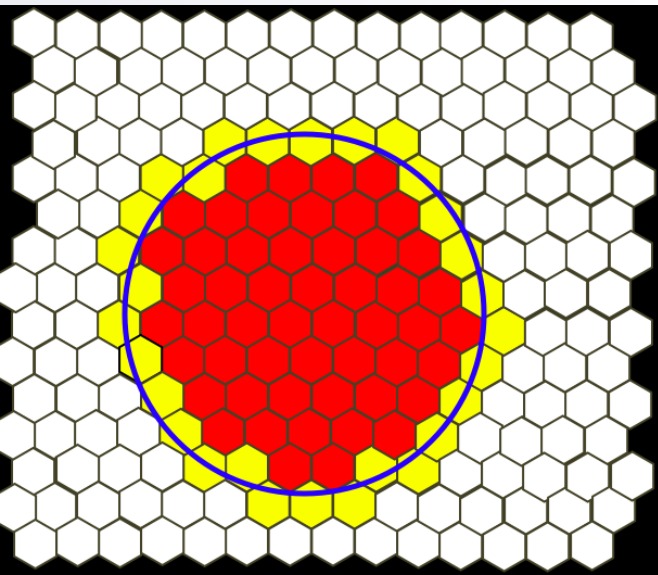
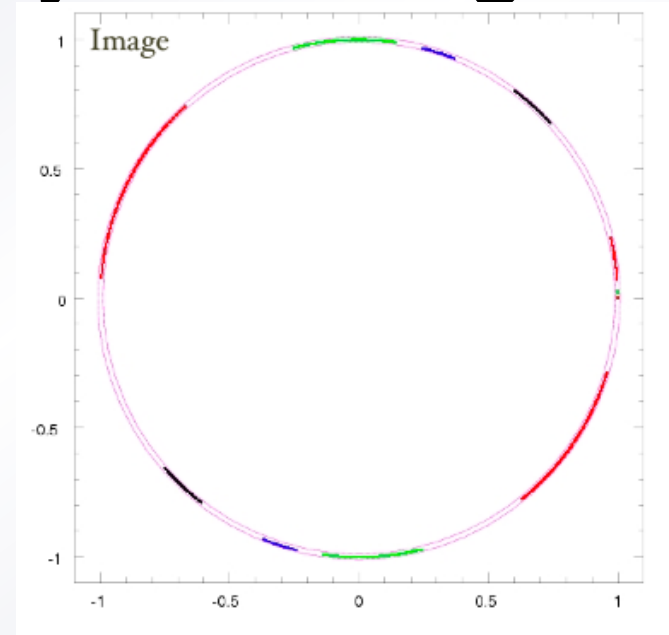
- First solve the lens equation for the center of the source.
- Then shoot rays around to get all the images
(Bennett & Rhie 1996;
Bennett 2010)
- Polar coordinates help diminish the number of rays.



3. Inverse ray-shooting

Contours for driving ray-shooting

- For high-magnification events, ray shooting can be limited to an annulus around the Einstein ring (Dong et al. 2006)
- Otherwise, the regions in which to shoot rays can be defined by the boundaries of the images of a circle larger than the source.



- Light rays can be collected in hexagonal pixels
- Check pixels instead of rays (Dong et al. 2009)

3. Inverse ray-shooting

Inverse-ray-shooting on GPUs

- The single ray shot is simple enough to be parallelized on GPUs.
- Joe Ling (NZ) has developed a fast working code for inverse-ray shooting on GPUs.
- Huge magnification maps can be generated quite rapidly.
- However, if they are not re-used, still we need image-centered shooting.



3. Inverse ray-shooting

Inverse-ray-shooting: pros and cons

Pros:

- Individual rays require few operations
- Can be implemented on GPUs
- Magnification maps can be re-used
- Incorporates limb darkening

Cons:

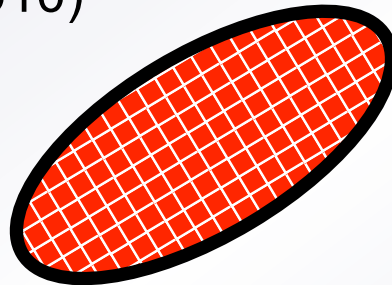
- Large number of rays (scales as the area)
- Denser sampling required for smaller sources
- For non-static lenses, maps cannot be re-used

Contour Integration Concept

- Contour integration concept:

The area enclosed in a curve is expressed by a simple contour integral on the boundary.

(Schramm & Kayser, 1987; Dominik 1995; Gould & Gaucherel 1997; Dominik 1998; VB 2010)



- We only need to find the boundaries of the images
- A surface integral becomes a one-dimensional integral
- In principle this is much faster and very elegant
- In practice, a lot of work is required to keep everything under control.

4. Contour Integration

Green's Theorem

- Green's theorem:
$$\oint_{\partial I} (L_1 dx_1 + L_2 dx_2) = \iint_I dx_1 dx_2 \left(\frac{\partial L_2}{\partial x_1} - \frac{\partial L_1}{\partial x_2} \right)$$

Note 1: ∂I is the counterclockwise boundary of I .

Note 2: Green's theorem is the two 2-d specification of Stokes' theorem.

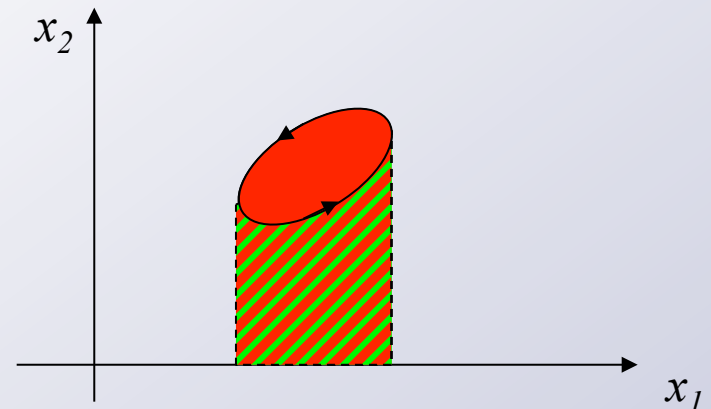
- If we want the area of the domain I we must choose

$$\left(\frac{\partial L_2}{\partial x_1} - \frac{\partial L_1}{\partial x_2} \right) = 1$$

- Possible choices for (L_1, L_2) are $(-x_2, 0)$, $(0, x_1)$, $(-x_2, x_1)/2$.

- Then the line integral takes the equivalent forms

$$A = -\oint_{\partial I} x_2 dx_1 = \oint_{\partial I} x_1 dx_2 = \frac{1}{2} \oint_{\partial I} \mathbf{x} \wedge d\mathbf{x}$$

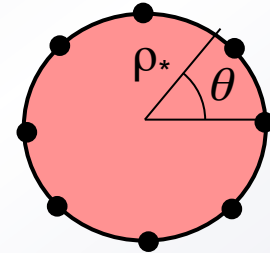


4. Contour Integration

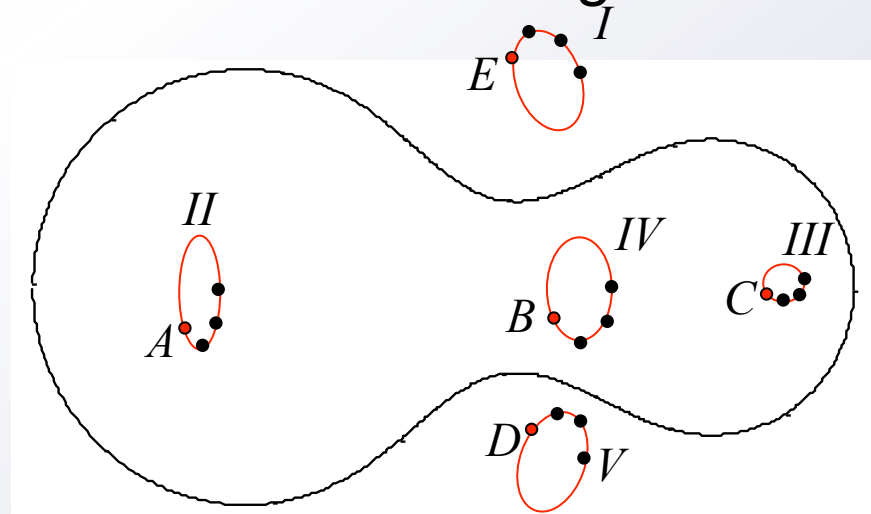
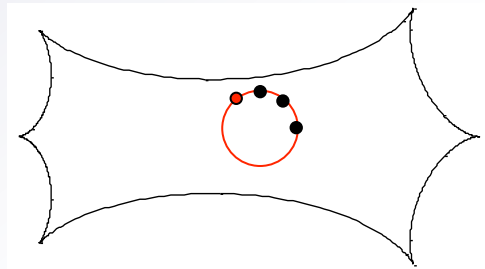
From source to image boundaries

- Parameterization of the source boundary:

$$\mathbf{y} = \mathbf{y}_0 + \rho_* \begin{pmatrix} \cos \theta \\ \sin \theta \end{pmatrix} \Leftrightarrow \zeta = \zeta_0 + \rho_* e^{i\theta}$$



- After inversion of the lens equation, for each θ_i we get 3 or 5 points $z_{i,I}$ lying on the boundaries of the images.

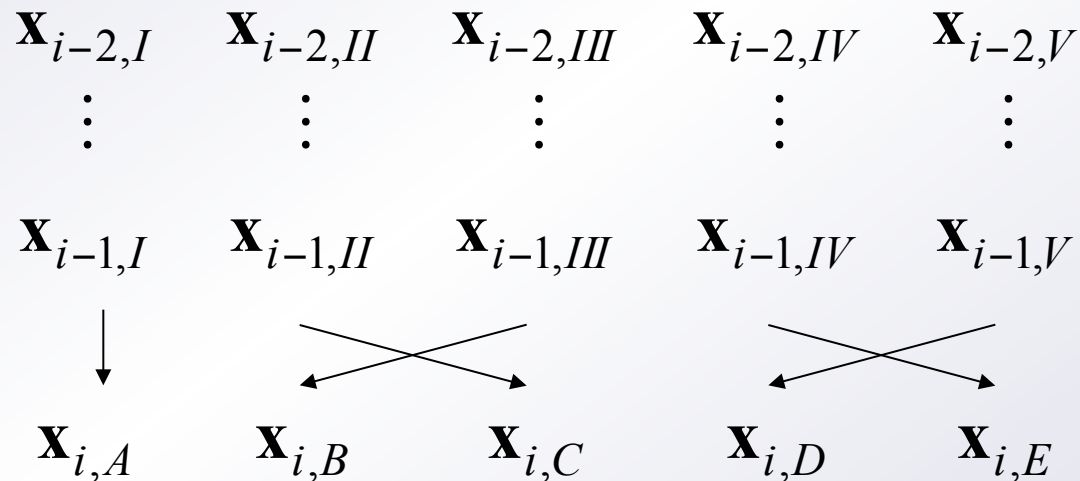


- We need to associate the roots $z_{i,I}$ at step i with the roots $z_{i-1,I}$ of the step $i-1$.

4. Contour Integration

Reconstruction of image boundaries

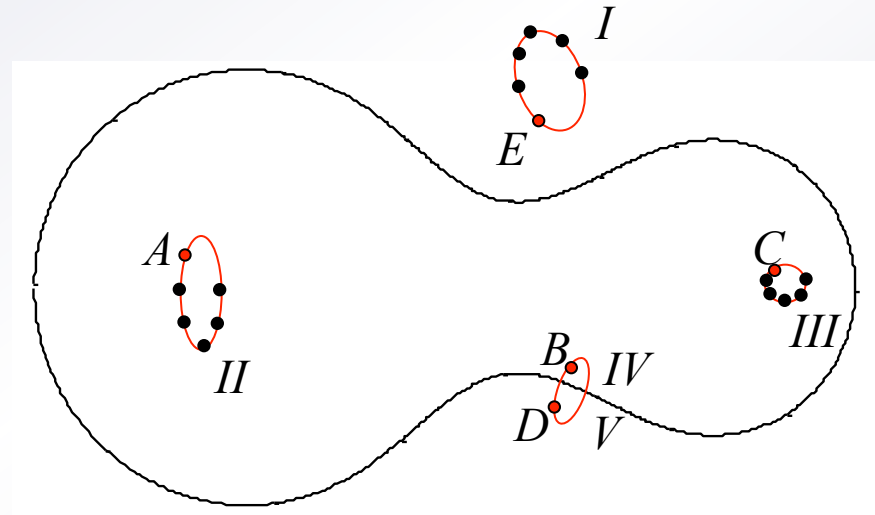
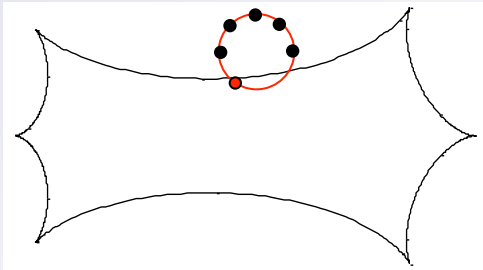
- We need to associate the roots $\mathbf{x}_{i,I}$ at step i with the roots $\mathbf{x}_{i-1,I}$ of the step $i - 1$.
- The simplest way is to use the least distance criterium.
- Only same parity solutions can be associated.



4. Contour Integration

Reconstruction of image boundaries

- If two new images are created at step i , we can recognize them as the last two unmatched roots.

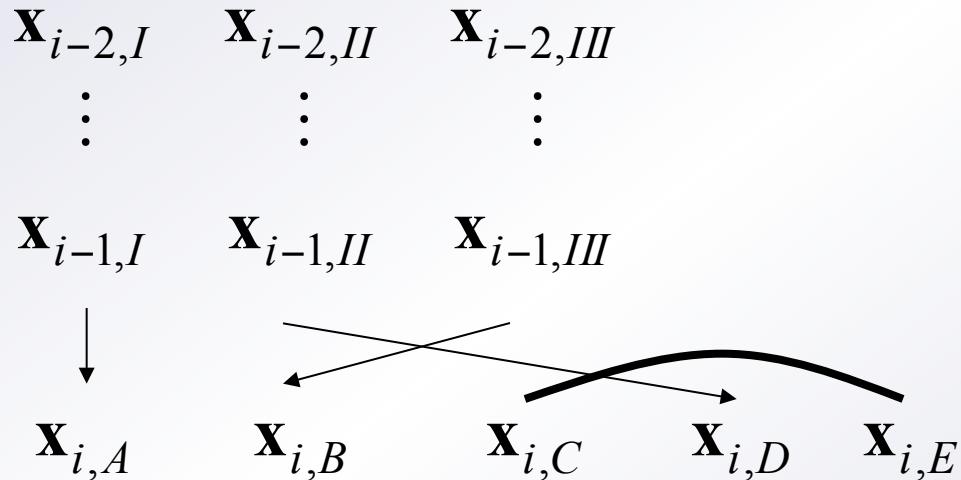


- The same can be done at destruction of two images.
- We must keep track of pairing between image boundaries when they are created or destroyed (see next).

4. Contour Integration

Reconstruction of image boundaries

- If two new images are created at step i , we can recognize them as the last two unmatched roots.



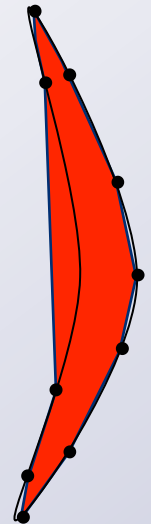
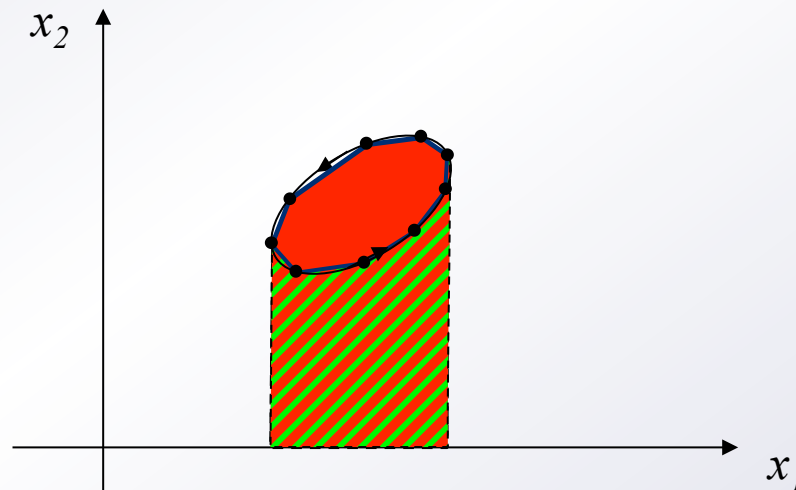
- The same can be done at destruction of two images.
- We must keep track of pairing between image boundaries when they are created or destroyed (see next).

4. Contour Integration

Contour integration by polygonal

- The trapezium approximation gives the area of the polygonal defined by our image boundary sample

$$A = \frac{1}{2} \oint_{\partial I} \mathbf{x} \wedge d\mathbf{x} \cong \frac{1}{4} \sum_{i=0}^{n-1} (\mathbf{x}_{i+1} + \mathbf{x}_i) \wedge (\mathbf{x}_{i+1} - \mathbf{x}_i) = \frac{1}{2} \sum_{i=0}^{n-1} \mathbf{x}_i \wedge \mathbf{x}_{i+1}$$



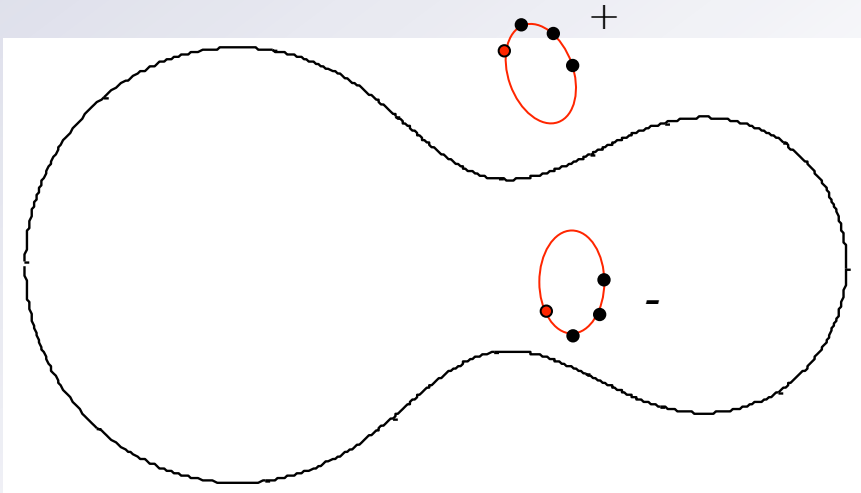
- Typically, the area is underestimated.
- ... with some exceptions.

4. Contour Integration

Contour integration by polygonal

- We must multiply the contour integrals by the parities of the boundaries:

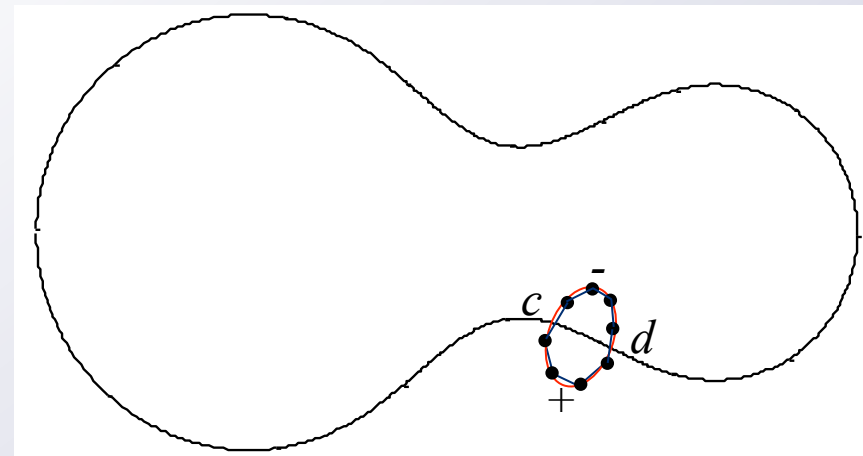
$$A_I = \frac{1}{2} p_I \sum_{i=0}^{n-1} \mathbf{x}_i \wedge \mathbf{x}_{i+1}$$



- For creation/destruction cases, we need to add a connection term.

$$\frac{1}{2} (\mathbf{x}_{\text{first},-} \wedge \mathbf{x}_{\text{first},+}) \quad \text{for creation}$$

$$\frac{1}{2} (\mathbf{x}_{\text{last},+} \wedge \mathbf{x}_{\text{last},-}) \quad \text{for destruction}$$



Summing up...

Steps in contour integration:

- Run a root finder routine for each point in the source boundary.
- At each step you must put the roots in the correct image boundary (least distance criterium) and keep track of created and destroyed pairs.
- Calculate the contour integral by polygonal approximation for each boundary.
- Sum up the contour integrals with the correct parity and add a connection term for each creation/destruction.

4. Contour Integration

Order of the error

Let us estimate the order of the error

- At each step, the contribution of the interval $\Delta\theta$ to the contour integral is

$$\Delta A_I = \frac{1}{2} \int_{I(\Delta\theta)} \mathbf{x}_I \wedge d\mathbf{x}_I = \frac{1}{2} \int_{\theta_i}^{\theta_i + \Delta\theta} \mathbf{x}_I \wedge \mathbf{x}'_I d\theta$$

- The trapezium approximation is actually

$$\Delta A_I^{(t)} = \frac{1}{2} \mathbf{x}_I(\theta_i) \wedge \mathbf{x}_I(\theta_i + \Delta\theta)$$

- Expanding in powers of $\Delta\theta$, the difference is of third order

$$\Delta A_I^{(t)} - \Delta A_I = O(\Delta\theta^3)$$

Parabolic correction

- We can increase the accuracy without adding new points to the boundary.
(VB, MNRAS 1365, 2966 (2010))

- If we add the following correction to the trapezium

$$\Delta A_I^{(p)} = \frac{1}{24} \left[(\mathbf{x}'_I \wedge \mathbf{x}''_I) \Big|_{\theta_i} + (\mathbf{x}'_I \wedge \mathbf{x}''_I) \Big|_{\theta_i + \Delta\theta} \right] \Delta\theta^3$$

... the residual is of fifth order

$$\Delta A_I^{(t)} + \Delta A_I^{(p)} - \Delta A_I = O(\Delta\theta^5)$$

- The wedge products of the derivatives can be calculated analytically using the lens map.
- Similar parabolic corrections can be introduced for creation/destruction terms.

4. Contour Integration

Error control

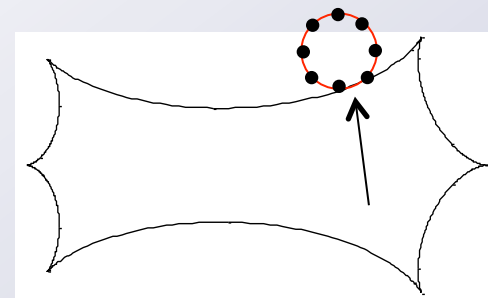
- In all numerical computations it is fundamental to have an estimate of the errors.
- The error estimators must be reliable but also cheap.

$$E_{I,i,1} = \frac{1}{48} \left| (\mathbf{x}'_I \wedge \mathbf{x}''_I) \Big|_{\theta_i} - (\mathbf{x}'_I \wedge \mathbf{x}''_I) \Big|_{\theta_i + \Delta\theta} \right| \Delta\theta^3$$

$$E_{I,i,2} = \frac{3}{2} \left| \Delta A_I^{(p)} \left(\frac{\Delta \tilde{\theta}^2}{\Delta \theta^2} - 1 \right) \right|$$

$$E_{I,i,3} = \frac{1}{10} \left| \Delta A_I^{(p)} \right| \Delta \theta^2$$

- These work in a complementary way and are combinations of quantities already calculated.
- Similar estimators can be introduced for creation/ destruction terms and to unveil “hidden” images.



4. Contour Integration

Error estimate at step i

- Our error estimate for the step i is thus

$$E_i = \sum_I (E_{I,i,1} + E_{I,i,2} + E_{I,i,3})$$

- If creation/destruction occurs at step i we add

$$E_i + = E_1^{(c)} + E_2^{(c)} + E_3^{(c)}$$

- The total error in the area of all images is $E = \sum_{i=0}^{n-1} E_i$

- At this point we are able to check if we have reached the target accuracy $\delta\mu$ in the magnification:

$$\frac{E}{\pi\rho_*^2} < \delta\mu$$

- If not, we must increase the sampling.

4. Contour Integration

Optimal sampling

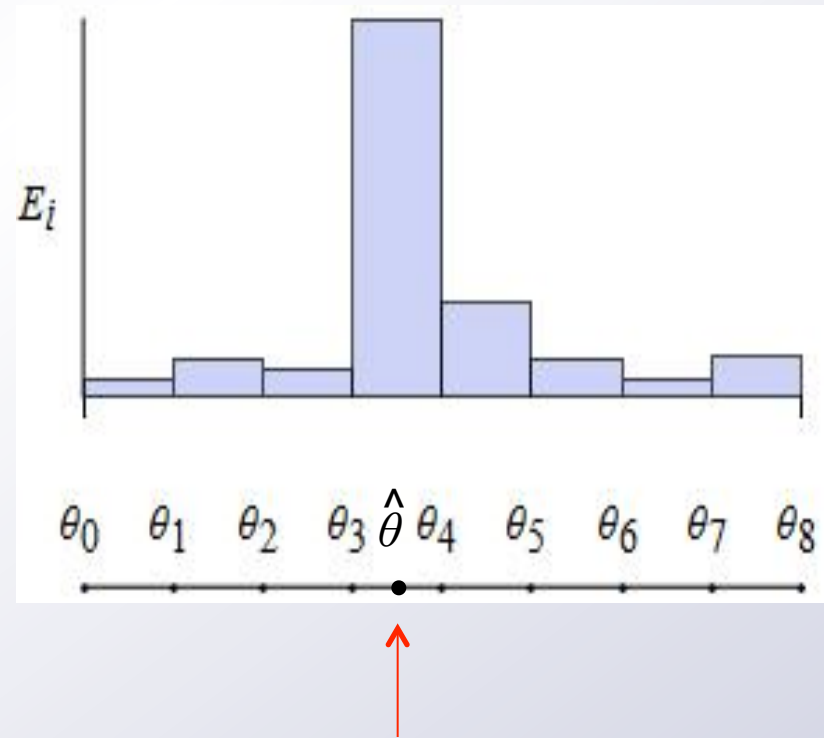
- We can pick the interval with the largest error

$$\text{Let } \hat{i} : E_i \leq E_{\hat{i}} \quad \forall i$$

- ... and add another point in the sample in the middle of this interval:

$$\hat{\theta} = \frac{\theta_{\hat{i}} + \theta_{\hat{i}+1}}{2}$$

- Then we just need to recalculate the contour integral and the error estimators in the new sub-intervals.
- In this way, sampling is increased only where needed, avoiding useless calculations.



4. Contour Integration

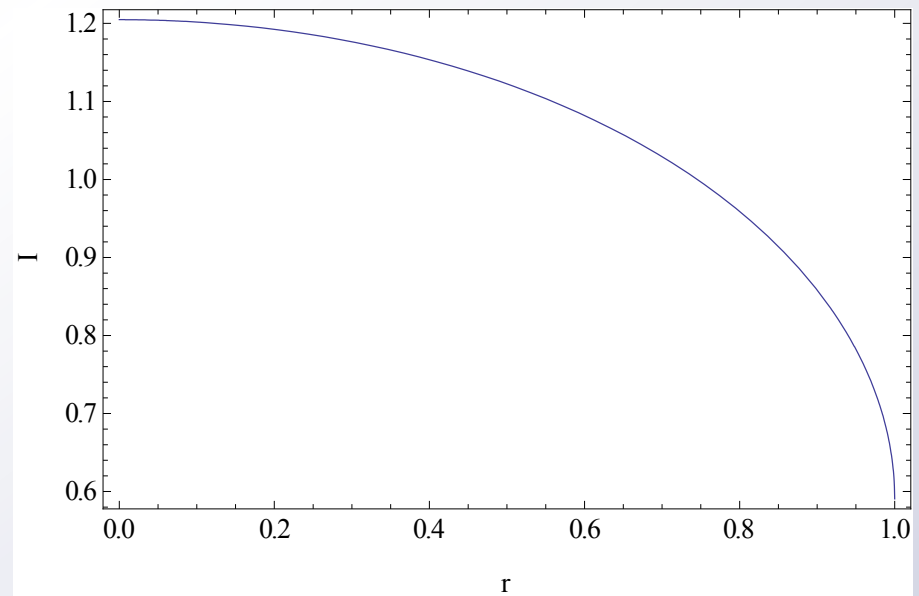
Limb darkening

- Up to now, we have assumed a uniform brightness source.
- However, physical stars have a limb-darkened profile, e.g. Milne's linear law

$$f(r) = \frac{1}{1 - a/3} \left[1 - a \left(1 - \sqrt{1 - r^2} \right) \right] \quad \text{with} \quad r = \frac{\rho}{\rho_*}$$

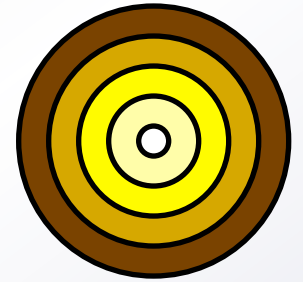
- In general, the source profile is a function $f(r)$, normalized in such a way that

$$\int_0^1 2rf(r)dr = 1$$



Limb darkening

- In order to account for limb darkening with contour integration we may divide the source in annuli.



- Each source annulus is magnified by microlensing. The exact contribution to the total amplification is

$$M_i = \frac{1}{\pi} \int_{r_{i-1}}^{r_i} dr 2r f(r) \int_0^{2\pi} \mu(r, \varphi) d\varphi$$

- In each annulus we instead use a uniform brightness given by the limb-darkened profile averaged over the annulus

$$f_i = \frac{F(r_i) - F(r_{i-1})}{r_i^2 - r_{i-1}^2} \quad \text{with} \quad F(r) = \int_0^r dr' 2r' f(r')$$

$$\tilde{M}_i = f_i [\mu_i r_i^2 - \mu_{i-1} r_{i-1}^2] \quad \text{where} \quad \mu_i = \frac{1}{\pi r_i^2} \int_{r_{i-1}}^{r_i} dr 2r \int_0^{2\pi} \mu(r, \varphi) d\varphi$$

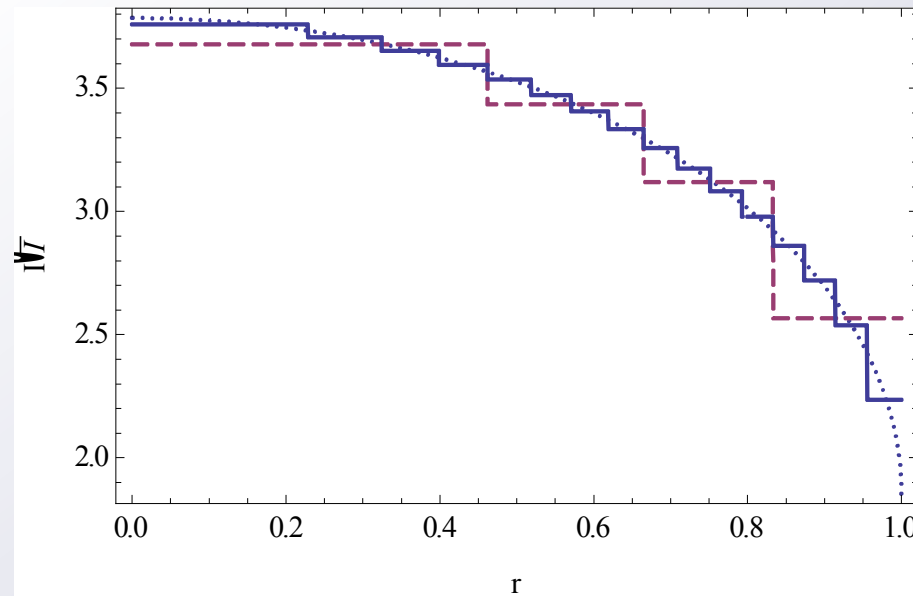
4. Contour Integration

Sampling the source profile

- Error estimators can be introduced also for limb darkening. They are then used to drive the profile sampling.
- We start with the two extremal annuli: the boundary ($r=1$) and the center ($r=0$).
- The new circle is put at an intermediate radius \bar{r} so that the two new annuli give the same contribution to the source luminosity:

$$F(r_j) - F(\bar{r}) = F(\bar{r}) - F(r_{j-1})$$

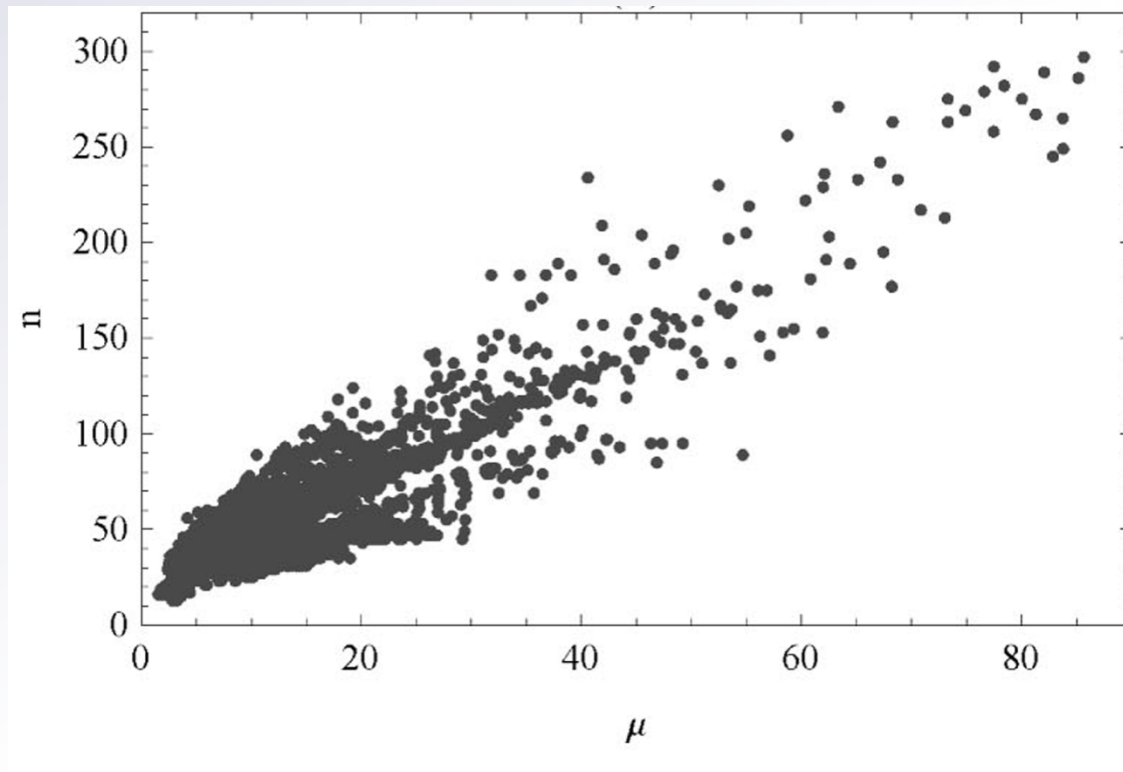
- We keep introducing annuli until the total error falls below the target accuracy.



4. Contour Integration

Testing

- This is a scatter plot of number of sampling points vs magnification (target accuracy is 10^{-2}).



Testing

- Summing up, at $\delta\mu=10^{-2}$ we get
 - a speed-up of 4 thanks to parabolic correction
 - a speed-up ranging from 3 to 20 thanks to optimal sampling
 - a slow-down from 2 to 10 if we include limb darkening
- No redundant calculation thanks to error estimators!

VBBinaryLensing

- **VBBinaryLensing** is a code for the calculation of **microlensing light curves** based on advanced contour integration (VB, MNRAS 1365, 2966 (2010)) .
 - Point-Source Point-Lens
 - Extended Source Point-Lens
 - Binary Source Point-Lens
 - Extended Source Binary Lens
- **Higher order effects** implemented:
 - Linear limb darkening
 - Annual and space parallax
 - Circular orbital motion
- C++ library.
- Tested on Windows, Linux, Mac OS.
- Importable in Python.
- Source code is public (but no specific standard has been adopted!).

5. VBBinaryLensing

Release of VBBinaryLensing

- **VBBinaryLensing** is available at <http://www.fisica.unisa.it/GravitationAstrophysics/VBBinaryLensing.htm>.
- The **zip file** contains:
 - `readmeVB.txt` Generic introductory information
 - `VBBinaryLensingLibrary.h` C++ header
 - `VBBinaryLensingLibrary.cpp` C++ source
 - `main.cpp` Sample code with examples and instructions.
 - `Makefile.dat` Example of a makefile (courtesy of Zhu)
 - `howtopython.txt` Instructions for wrapping the library in Python code (courtesy of Hundertmark)
 - `OB151212coords.txt` Sample coordinate file for an event (used in the examples in `main.cpp`)
 - `satellite1.txt` Table for the positions of a satellite for space parallax calculation (Spitzer)
 - `satellite2.txt` Same for Kepler.

5. VBBinaryLensing

Example of use

```
#include <stdio.h>
#include "VBBinaryLensingLibrary.h"

int main()
{
    VBBinaryLensing VBBL;

    double Mag,s,q,y1,y2,Rs,accuracy;
    s=0.8; //separation
    q=0.1; // mass ratio
    y1=0.01; // source position
    y2=0.3;
    Rs=0.01; // source radius

    accuracy=1.e-2; // Required accuracy of the result
    Mag=VBBL.BinaryMag(s,q,y1,y2,Rs,accuracy);

    printf("Magnification = %lf\n",Mag);

    return 0;
}
```

Contour integration: pros and cons

- Contour integration is a very elegant way to calculate the microlensing magnification.

Cons:

- Complicated!
- Limb darkening comes at a substantial cost.

Pros:

- 1-d integration instead of 2-d integration (much faster!)
- Faster on small sources
- Only public code available, with large feedback from the community.

Microlensing computation: outlook

- The huge data flow from WFIRST will require very high performance for microlensing calculations.
- Multiple systems likely to show up.
- Inverse-ray-shooting has already been implemented for triple and multiple lenses.
- Contour integration has never been tried beyond binary lensing so far.
- There is still room for optimizations, speed-up, parallelization on different codes.
- New ideas are always welcome.