

```
> s:=(x,y)->r(y)*(1-(a(y,x)*K(x))/K(y)); #invasion fitness
```

$$s := (x, y) \rightarrow r(y) \left(1 - \frac{a(y, x) K(x)}{K(y)} \right)$$

```
> K:=x->exp(-x^2);
```

$$K := x \rightarrow e^{(-x^2)}$$

```
> a:=(x,y)->exp(-alpha*(x-y)^2);
```

$$a := (x, y) \rightarrow e^{(-\alpha(x-y)^2)}$$

```
> r:=x->1;
```

$$r := x \rightarrow 1$$

```
> s(x,x); #the fitness of the resident strategy in the res.pop.  
must be 0!! it's always good to check this
```

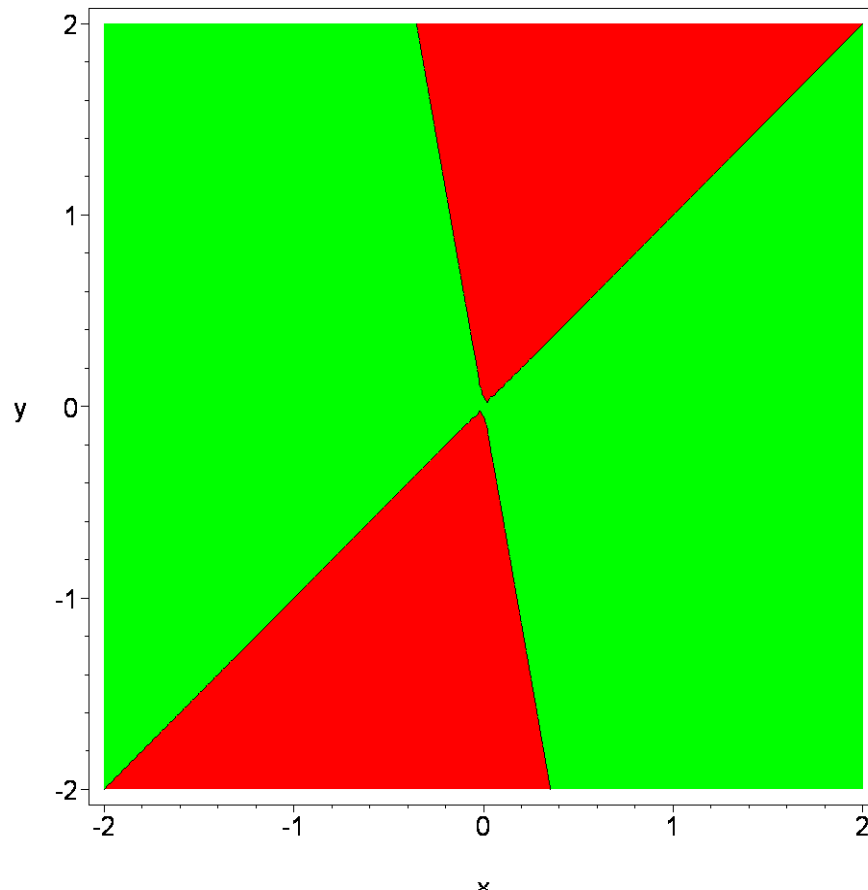
0

```
> alpha:=0.7;
```

$$\alpha := 0.7$$

```
> with(plots): #you need this to make, e.g., contourplots
```

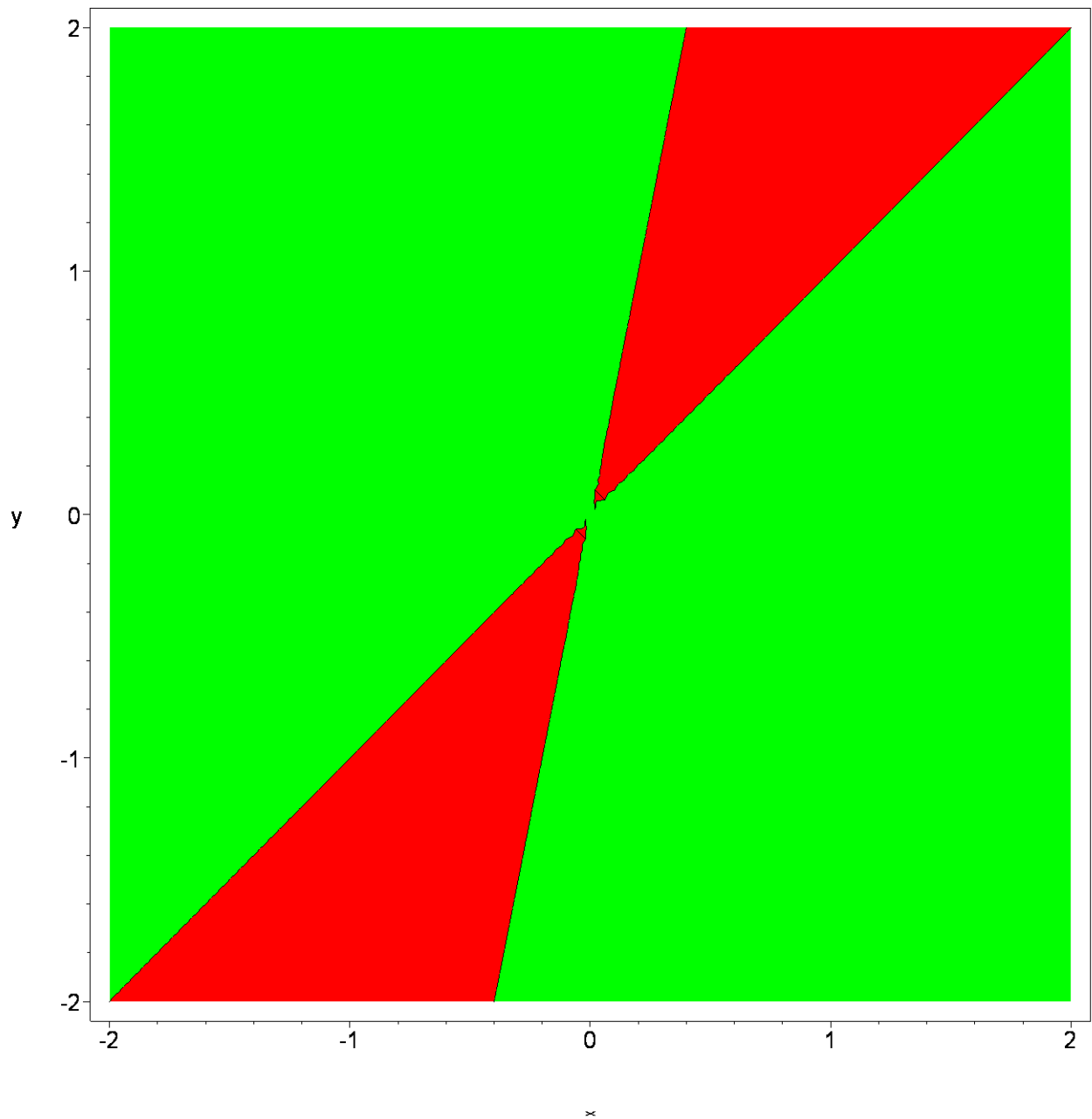
```
> contourplot(s(x,y),x=-2..2,y=-2..2,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed); #pairwise invadability plot (PIP)
```



```
> alpha:=1.5; #let's do a PIP with another value for alpha
```

$$\alpha := 1.5$$

```
> contourplot(s(x,y),x=-2..2,y=-2..2,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed);
```



```
> s(0,1);
```

$$1 - \frac{0.2231301601}{e^{(-1)}}$$

```
> evalf(%); #this evaluates the previous expression, we see that
the colour green in the PIP indeed corresponds to s(x,y)>0
```

$$0.3934693405$$

```
> K:=x->exp(-(x-delta)^4)+exp(-(x+delta)^2);
```

$$K := x \rightarrow e^{-(x-\delta)^4} + e^{-(x+\delta)^2}$$

```
> a:=(x,y)->exp(-alpha*(x-y)^2-beta*(x-y));
```

$$a := (x, y) \rightarrow e^{(-\alpha(x-y)^2 - \beta(x-y))}$$

```
> alpha:=2;
```

$$\alpha := 2$$

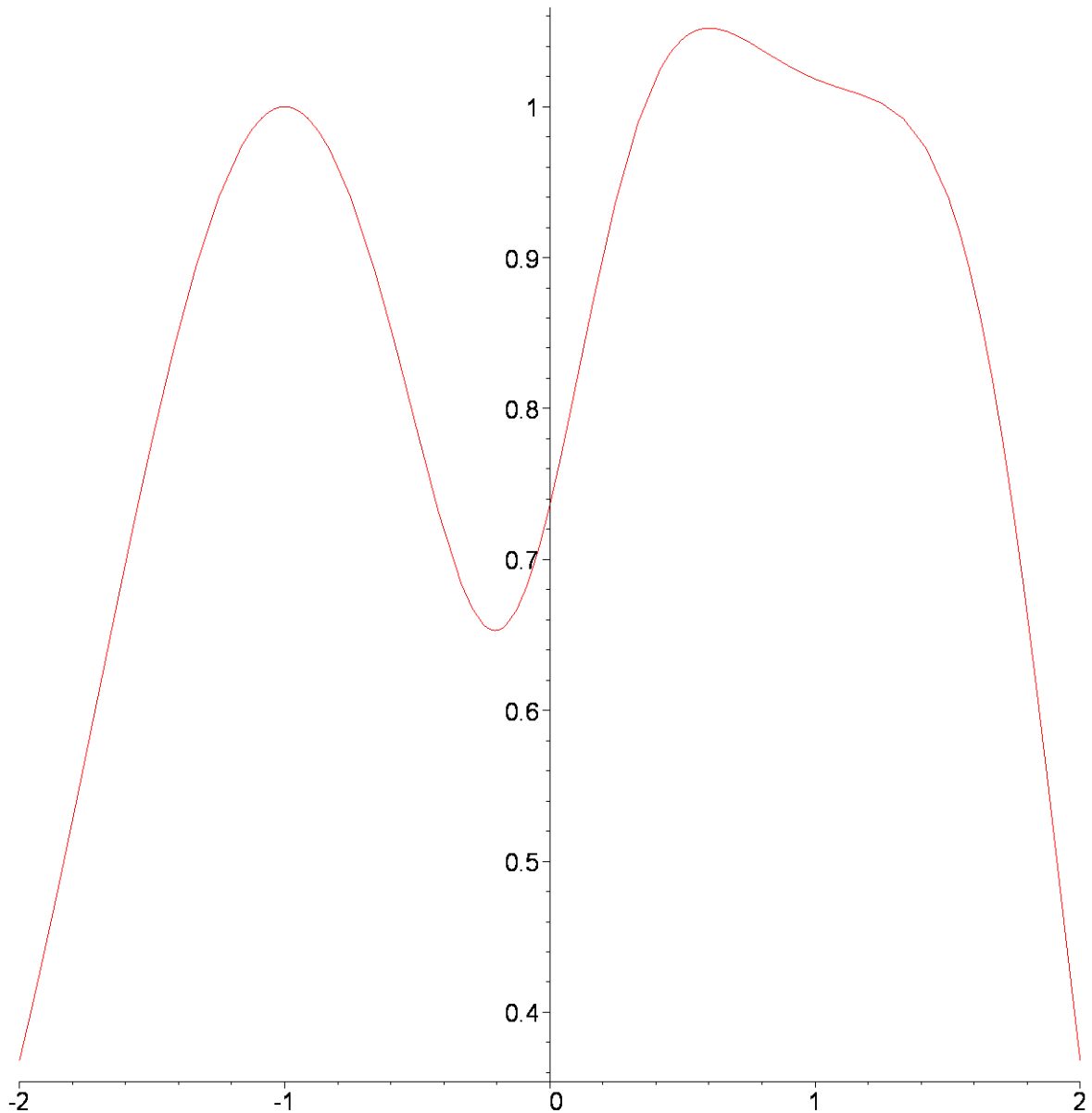
```
> beta:=-.4;
```

```
 $\beta := -0.4$ 
```

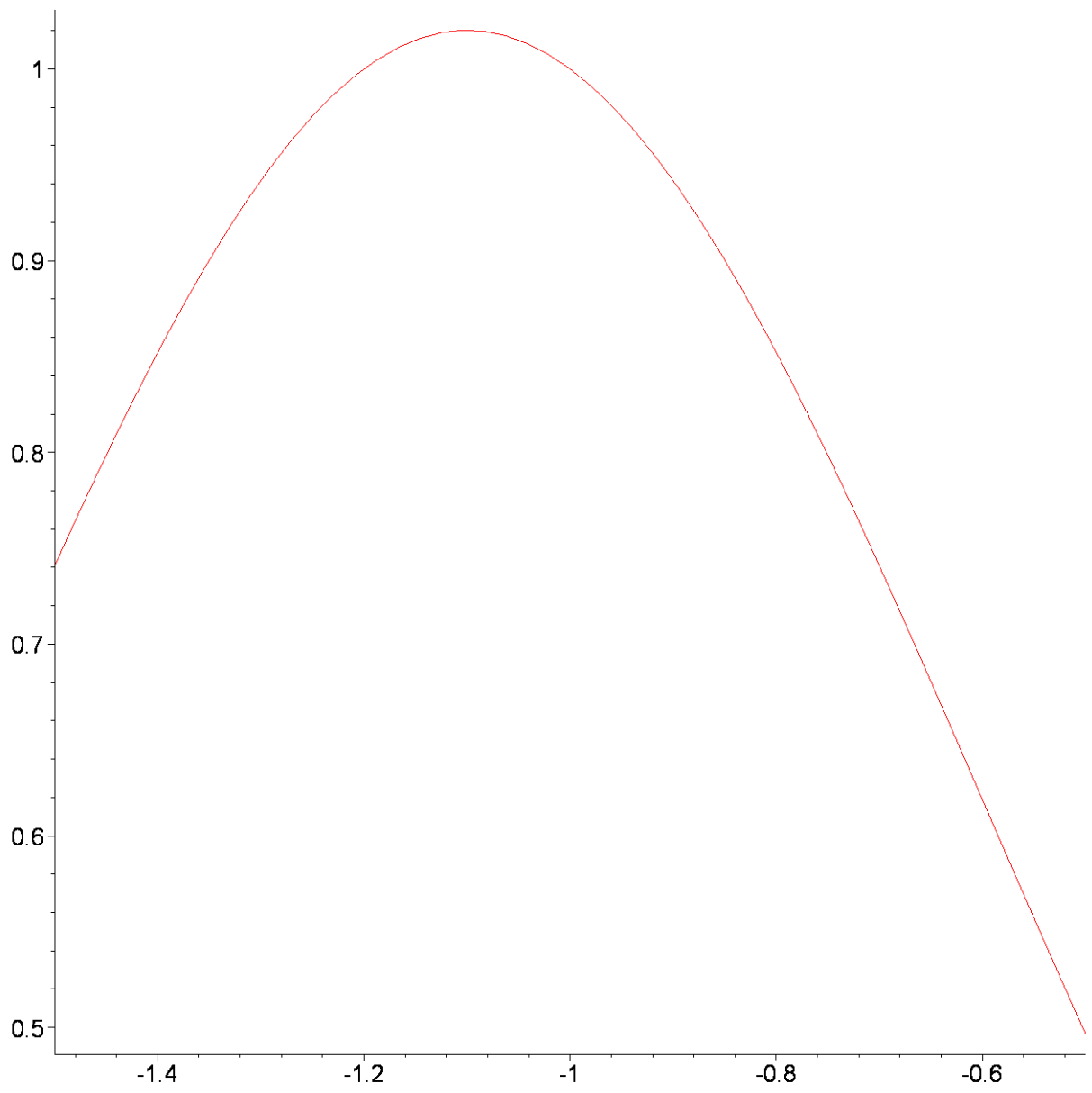
```
> ;delta:=1;
```

```
 $\delta := 1$ 
```

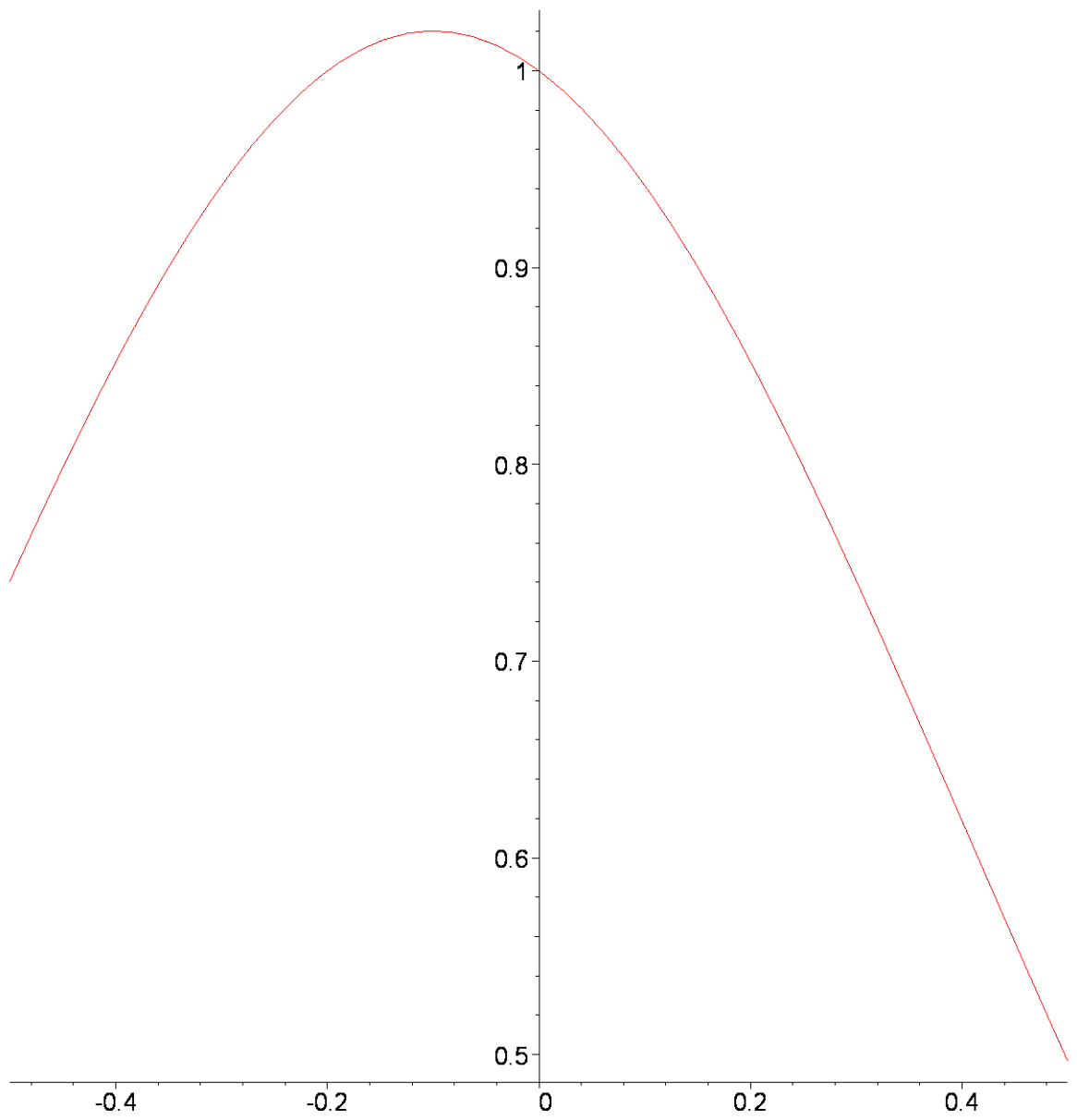
```
> plot(K(x),x=-2..2); #carrying capacity as a function of x, note  
that moving sufficiently far away from x=0, the carrying  
capacity goes towards zero, i.e., the population is less and  
less viable
```



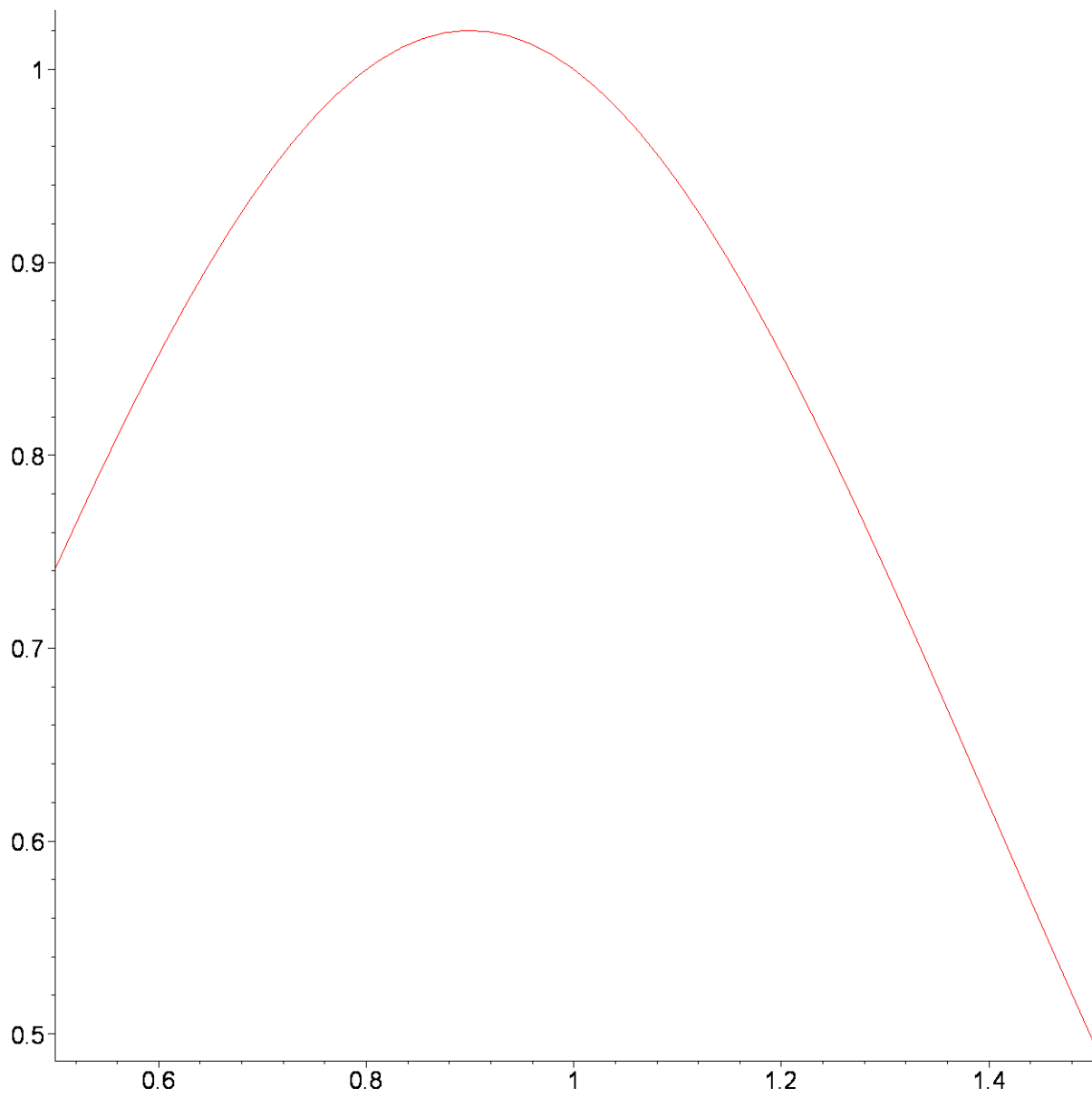
```
> plot(a(-1,y), y=-1.5..-0.5); #note how  $a(-1,y) > a(-1,-1)$  for some  
 $y < x$  close to  $x$  and  $a(-1,y) < a(-1,-1)$  for  $y > x$  -> competition is  
asymmetric!
```



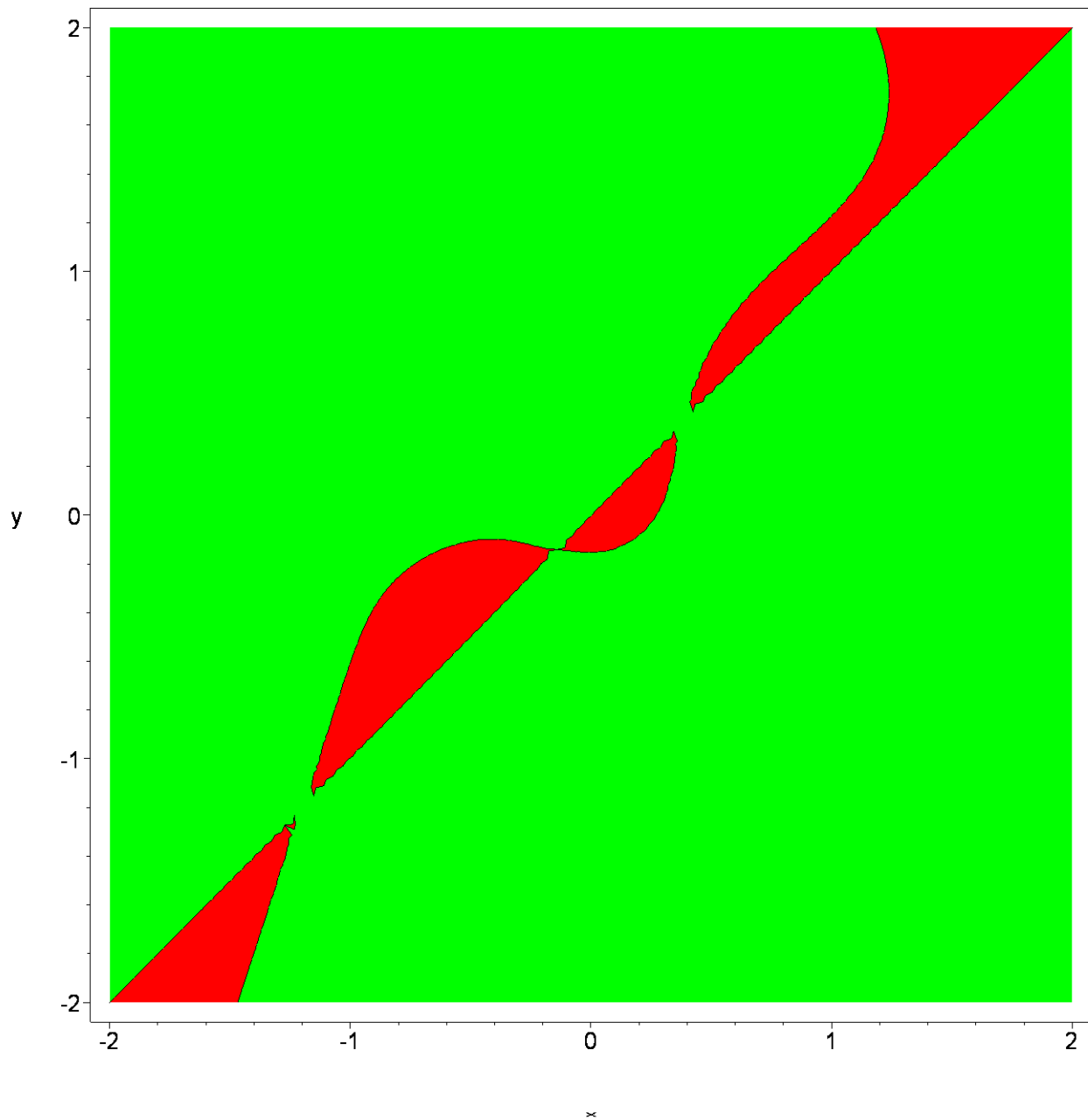
```
> plot(a(0,y),y=-.5..0.5);
```



```
> plot(a(1,y),y=.5..1.5);
```



```
> contourplot(s(x,y),x=-2..2,y=-2..2,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed); #three singularities, two attractors and a repeller in between
```



```
> s(0,1);
```

$$1 - \frac{0.4037930360 e^{(-1)}}{1 + e^{(-4)}}$$

```
> evalf(%);
```

0.8541246439

```
> restart; #clears the memory
```

```
> s:=(x,y,beta)->r(y)*(1-(a(y,x,beta)*K(x))/K(y)); #defines the
invasion fitness as a function of x,y and beta!
```

$$s := (x, y, \beta) \rightarrow r(y) \left(1 - \frac{a(y, x, \beta) K(x)}{K(y)} \right)$$

```
> a:=(x,y,beta)->exp(-alpha*(x-y)^2-beta*(x-y)); #now also the
competition kernel is a function of x,y and beta
```

$$a := (x, y, \beta) \rightarrow e^{(-\alpha(x-y)^2 - \beta(x-y))}$$

> `K:=x->exp(-(x-delta)^4)+exp(-(x+delta)^2); #K is still a function of x, delta is a constant`

$$K := x \rightarrow e^{-(x-\delta)^4} + e^{-(x+\delta)^2}$$

> `r:=x->1;`

$$r := x \rightarrow 1$$

> `s(x,y,beta); #just to see what the fitness function looks like`

$$1 - \frac{e^{(-\alpha(y-x)^2 - \beta(y-x))} (e^{-(x-\delta)^4} + e^{-(x+\delta)^2})}{e^{-(y-\delta)^4} + e^{-(y+\delta)^2}}$$

> `s(x,x,beta);`

$$0$$

> `eval(diff(s(x,y,beta),y),y=x); #differentiation of s(x,y,beta) with respect to y and then evaluating at y=x (this is the selection gradient!)`

$$\beta + \frac{-4(x-\delta)^3 e^{-(x-\delta)^4} + (-2x-2\delta) e^{-(x+\delta)^2}}{e^{-(x-\delta)^4} + e^{-(x+\delta)^2}}$$

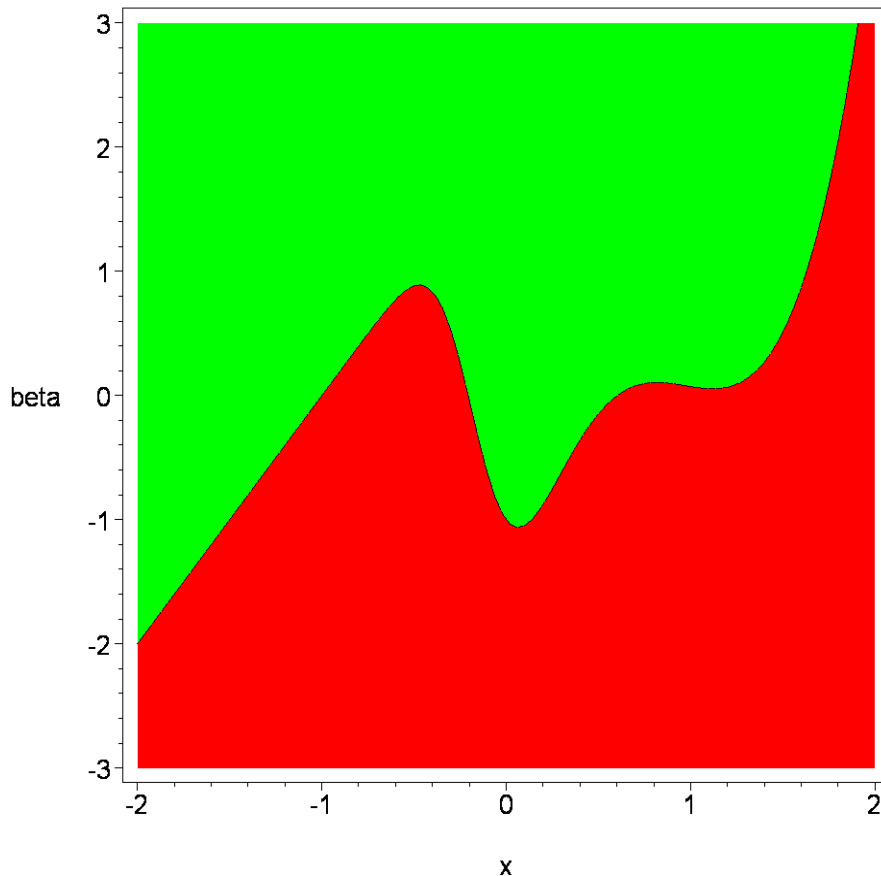
> `Ds:=(x,beta)->beta+1/(exp(-(x-delta)^4)+exp(-(x+delta)^2))*(-4*(x-delta)^3*exp(-(x-delta)^4)+(-2*x-2*delta)*exp(-(x+delta)^2)); #defines the selection gradient as a function of x and beta`

$$Ds := (x, \beta) \rightarrow \beta + \frac{-4(x-\delta)^3 e^{-(x-\delta)^4} + (-2x-2\delta) e^{-(x+\delta)^2}}{e^{-(x-\delta)^4} + e^{-(x+\delta)^2}}$$

> `alpha:=2:delta:=1: #set the parameters`

> `with(plots):`

> `contourplot(Ds(x,beta),x=-2..2,beta=-3..3,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed); #Try reading this plot. Lets take, e.g., beta=2, which is a horizontal line in the plot. There is only one singularity for this parameter value at around x'=1.8. When x<x', then the selection gradient is positive and we have evolution to higher trait values (to the right). When x>x', the selection gradient is negative and the system evolves to the left. So, the singularity is attracting.`



> `eval(diff(s(x,y,beta),y$2),y=x);` #the second derivative of `s(x,y,beta)` with respect to `y`, evaluated at `y=x`

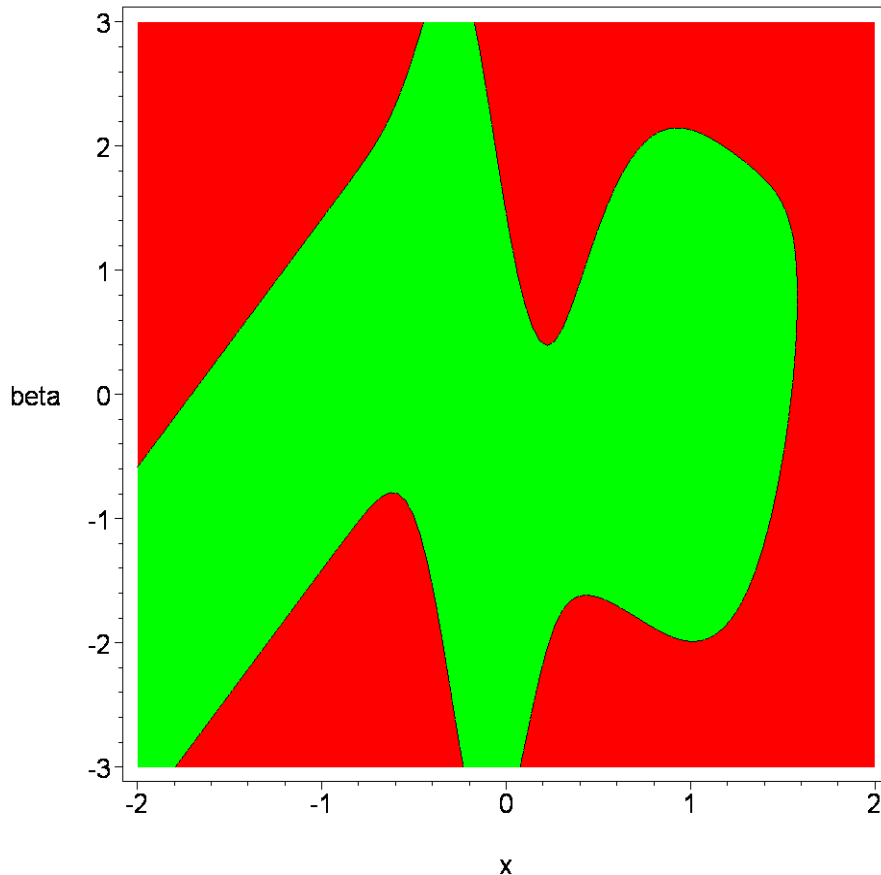
$$4 - \beta^2 - \frac{2\beta(-4(x-1)^3 e^{-(x-1)^4} + (-2x-2)e^{-(x+1)^2})}{e^{-(x-1)^4} + e^{-(x+1)^2}} - \frac{2(-4(x-1)^3 e^{-(x-1)^4} + (-2x-2)e^{-(x+1)^2})^2}{(e^{-(x-1)^4} + e^{-(x+1)^2})^2} + \frac{-12(x-1)^2 e^{-(x-1)^4} + 16(x-1)^6 e^{-(x-1)^4} - 2e^{-(x+1)^2} + (-2x-2)^2 e^{-(x+1)^2}}{e^{-(x-1)^4} + e^{-(x+1)^2}}$$

> `D2s := (x,beta) -> 4 - beta^2 - 2*beta/(exp(-(x-1)^4) + exp(-(x+1)^2)) * (-4*(x-1)^3*exp(-(x-1)^4) + (-2*x-2)*exp(-(x+1)^2)) - 2/(exp(-(x-1)^4) + exp(-(x+1)^2))^2 * (-4*(x-1)^3*exp(-(x-1)^4) + (-2*x-2)*exp(-(x+1)^2))^2 + 1/(exp(-(x-1)^4) + exp(-(x+1)^2)) * (-12*(x-1)^2*exp(-(x-1)^4) + 16*(x-1)^6*exp(-(x-1)^4) - 2*exp(-(x+1)^2) + (-2*x-2)^2*exp(-(x+1)^2));`

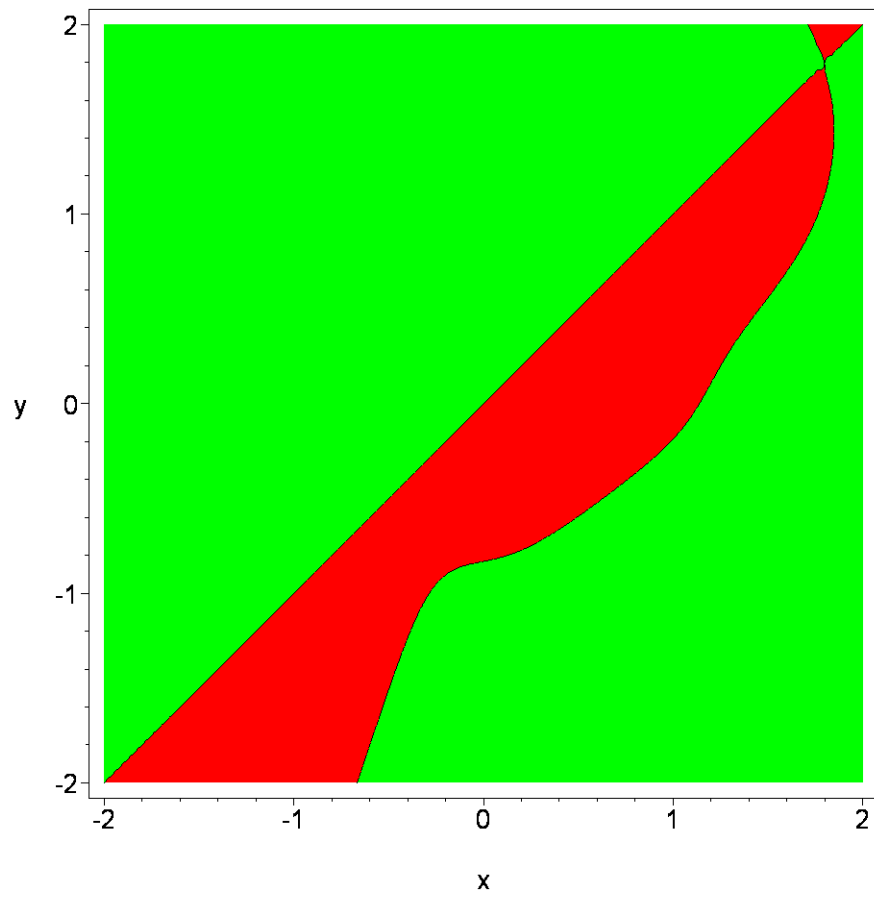
$$D2s := (x, \beta) \rightarrow 4 - \beta^2 - \frac{2\beta(-4(x-1)^3 e^{-(x-1)^4} + (-2x-2)e^{-(x+1)^2})}{e^{-(x-1)^4} + e^{-(x+1)^2}}$$

$$\begin{aligned}
& - \frac{2(-4(x-1)^3 e^{-(x-1)^4} + (-2x-2) e^{-(x+1)^2})^2}{(e^{-(x-1)^4} + e^{-(x+1)^2})^2} \\
& + \frac{-12(x-1)^2 e^{-(x-1)^4} + 16(x-1)^6 e^{-(x-1)^4} - 2 e^{-(x+1)^2} + (-2x-2)^2 e^{-(x+1)^2}}{e^{-(x-1)^4} + e^{-(x+1)^2}}
\end{aligned}$$

> `contourplot(D2s(x,beta),x=-2..2,beta=-3..3,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed);` #From the previous plot we saw that for $\beta=2$, there is only one singularity and it is at about $x=1.8$. Here we can see that the point in question has a negative value of $D2s$; this means that it is dimorphically attracting (there is a minus region straight on top of and below the singularity in the PIP). If $D2s$ was positive, the singularity would be dimorphically repelling.



> `contourplot(s(x,y,2),x=-2..2,y=-2..2,contours=[0],filled=true,coloring=[red,green],grid=[100,100],axes=boxed);` #here is the PIP for $\beta=2$ and voila, it looks just like we have predicted! There is only one singularity, which is monomorphically attracting. If we draw a vertical line through the singularity, we can see that nearby mutants have negative invasion fitness. The singularity is an ESS.



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