

Computational

Vision

Signal-in-noise

U. Minn. Psy 5036

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Lecture 5

```

stdnoise = 1.0;
ndist =
  NormalDistribution[0,
    stdnoise];
size = 64;
(* image size *)
i = 0;
pc = 0;

```

Signal-in-noise
psychophysics demo
initialize

In[696]:=

```
Off[General::spell1]
```

In[698]:= $z[p_]$:=

```

Sqrt[2]
  InverseErf[1 - 2 p];
dprime[x_] :=
  N[-Sqrt[2] z[x], 2];

```

Various frequencies, vertical
orientations, and fixed width

```

In[705]:= stdnoise = 1.0;
ndist =
NormalDistribution[0, {i1, 4}]
vf stdnoise, 4];
width 64; {.25, 1, 4};
(* image size *)
i = 0;
pc = 0;

```

Define test images

Basis set: Cartesian representation of
Gabor functions:

```

In[703]:= cgabor[x_, y_, fx_, fy_, s_] :=
Exp[-(x^2 + y^2)/s^2] Cos[2 Pi
sgabor[x_, y_, fx_, fy_, s_] :=
Exp[-(x^2 + y^2)/s^2] Sin[2 Pi

```

In[708]:= **signal =** Various frequencies, vertical
orientations, and fixed width
Table

```
In[705]:= vtheta = Table[i1 Pi/4, {i1, 4}]
vf = N[Cgabor[x, y,
{1, 1, 2, 4}], 4];
width = {0.25, 1, 4};
vf[[1]] Cos[vtheta[[1]],
vf[[1]] Sin[vtheta[[1]],
width[[2]]],
{x, -2, 2,  $\frac{4}{\text{size} - 1}$ },
{y, -2, 2,  $\frac{4}{\text{size} - 1}$ }]];
Print [Max [signal], " ",
Min [signal], " ",
Dimensions [signal]];
noise :=
Table [RandomReal [ndist],
{size}, {size}];
```

0.997986

-0.782989 {64, 64}

```

In[708]:= signal =
  Table[
    N[cgabor[x, y,
      vf[[1]] Cos[vtheta[[1]],
      vf[[1]] Sin[vtheta[[1]],
      swidth[[2]]]],
      {x, -2, 2,  $\frac{4}{\text{size} - 1}$ },
      {y, -2, 2,  $\frac{4}{\text{size} - 1}$ }]];
Print[Max[signal], " ",
  Min[signal], " ",
  Dimensions[signal]];
noise :=
  Table[RandomReal[ndist],
    {size}, {size}];

0.997986
-0.782989 {64, 64}

```

```

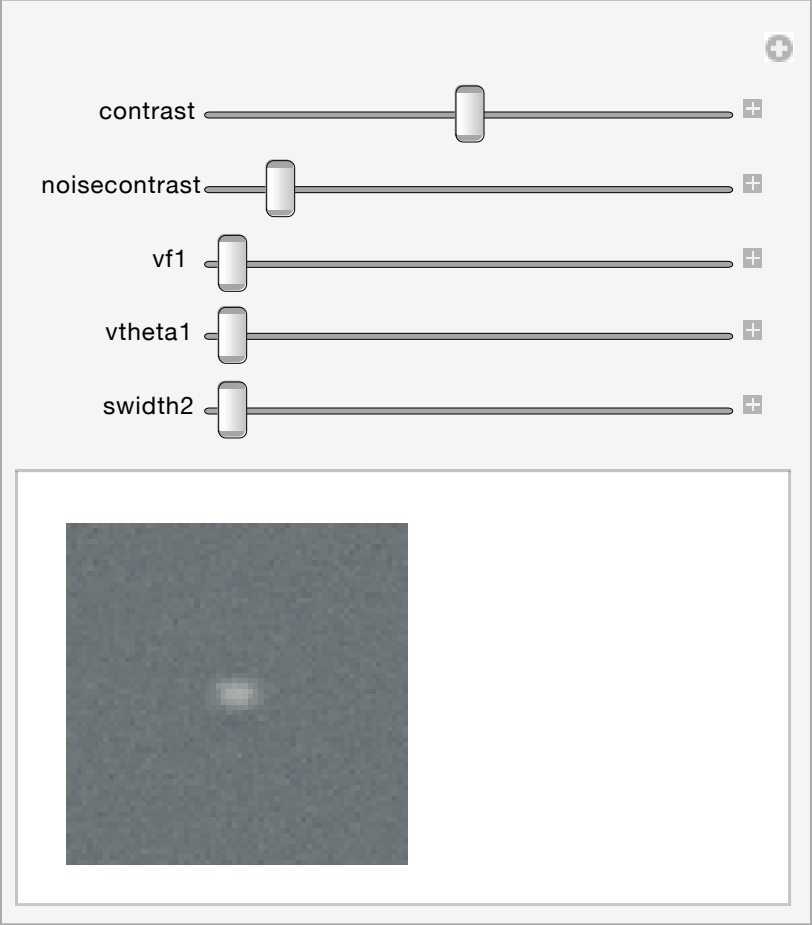
signal2 =
  Table[contrast *
    N[cgabor[x, y,
      vf1 Cos[vtheta1],
      vf1 Sin[vtheta1],
      swidth2]],
    {x, -2, 2,  $\frac{4}{\text{size} - 1}$ },
    {y, -2, 2,  $\frac{4}{\text{size} - 1}$ }]];
noises = noisecontrast *
  noise;

ArrayPlot[signal2 + noises,
  Mesh → False,
  PlotRange → {-1, 1},
  ColorFunction →
  "GrayTones"],
  {{contrast, .5}, 0, 1},
  {{noisecontrast, .03},

```

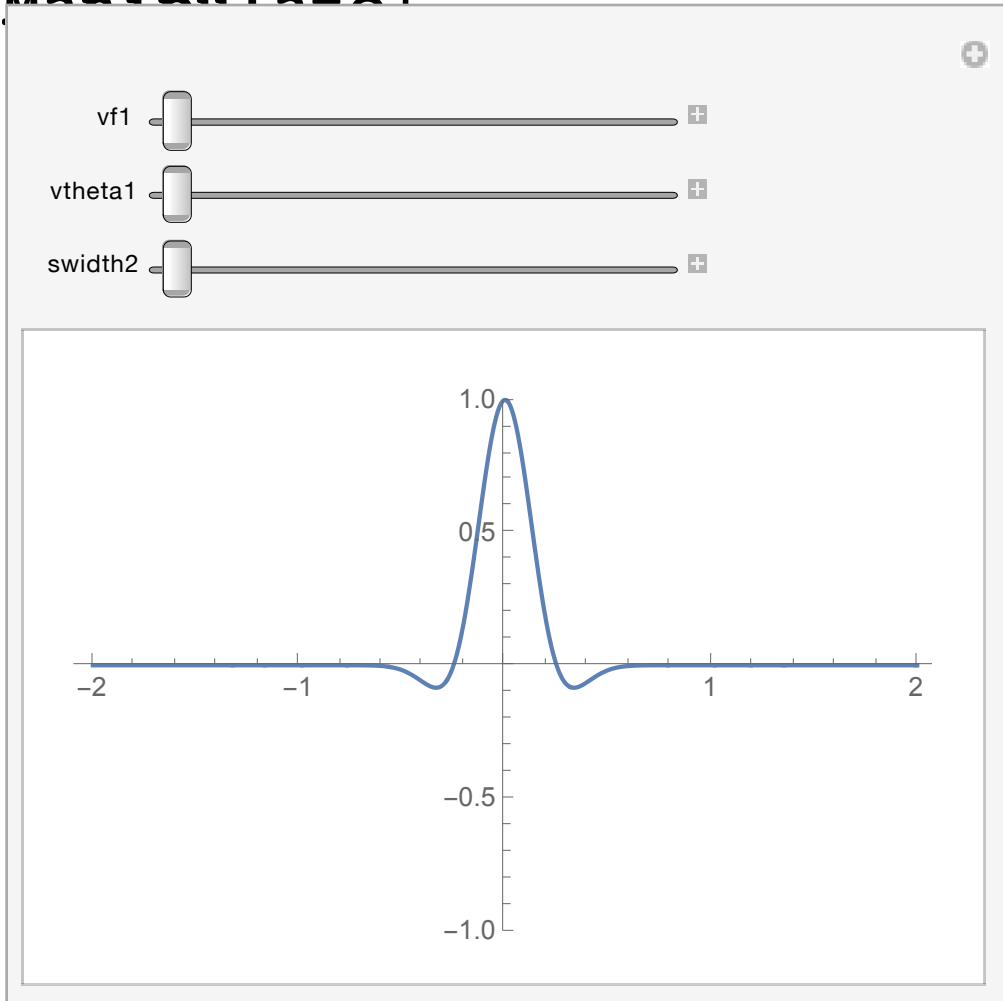
```
0, .3}, {vf1, 1, 4},  
{vtheta1, 0, Pi},  
{swidth2, .25, 4}]
```

Out[711]=



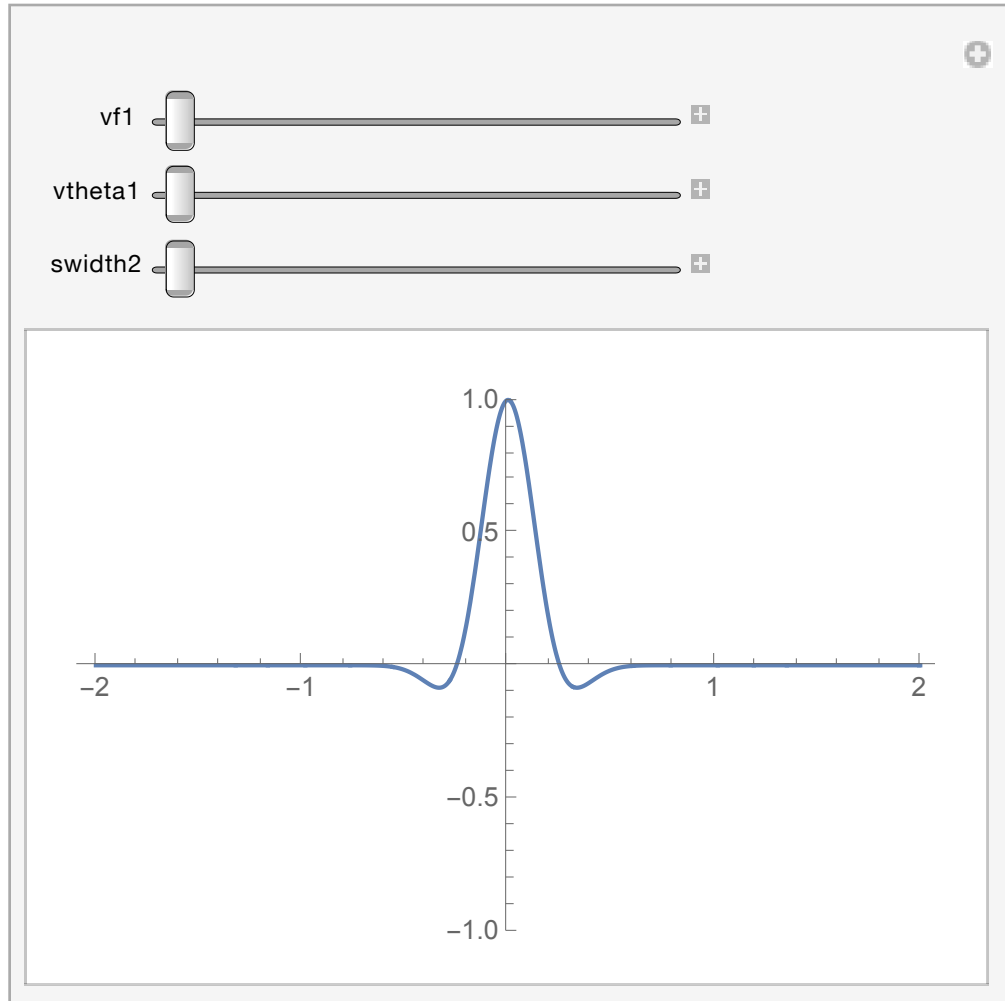
The image shows a Mathematica interface with five sliders and a resulting image. The sliders are labeled: contrast, noisecontrast, vf1, vtheta1, and swidth2. The contrast slider is positioned at approximately 50%. The noisecontrast slider is at approximately 25%. The vf1, vtheta1, and swidth2 sliders are all at their minimum values. Below the sliders is a small square image showing a faint, blurry spot on a dark background.

In[720]:= Manipulate[



Out[720]=

Out[720]=



```

In[724]:= blank = Table[0.0,
  { {x, y} = 2, 2, CorrectSize - 1 } ,
  { "WasIdeal",
    4 / CorrectSize } ]];
gabor = 5;
ArrayPlot[blank,
  (* Signal -> noise
  contrast -> false,
  score -> Range -> {-1, 1},
  (* ColorFunction ->
    0.01 "Gray" ]];
flash = 0.15;
ncon = .15;

```

```
In[724]:= data =  
    {{ "Was I Correct?",  
      "Was Ideal  
      Correct?" }};  
numtrials = 5;  
  
(*Signal and noise  
  contrasts:*)  
scon = 0.1;  
(*scon =  
  0.01 is closer to  
  threshold.*)  
ncon = .15;
```

Put up stimulus window

```
In[728]:= nb = CreateDocument [
    Dynamic [flash] ,
    ShowCellBracket → False ,
    WindowSize → {300, 300} ,
    WindowMargins →
        {{Automatic, 0} ,
         {Automatic, 0}} ,
    WindowElements → {} ,
    Background → Black ,
    NotebookFileName →
        "2AFC Pattern
        Detection"] ;
```

Define a trial

```
In[729]:= twoflashes :=
    Module [ {tempmean} ,
        Table [whichflash =
            RandomInteger [ {0, 1} ] ;
            If [whichflash == 1,
```

```
leftnumsample =  
  ArrayPlot [  
    leftx =  
      scon * signal +  
      ncon * noise,  
    Mesh → False,  
    PlotRange → {-1, 1},  
    ColorFunction →  
      "GrayTones"];  
rightnumsample =  
  ArrayPlot [  
    rightx = ncon * noise,  
    Mesh → False,  
    PlotRange → {-1, 1},  
    ColorFunction →  
      "GrayTones"],  
leftnumsample =  
  ArrayPlot [  
    leftx = ncon * noise,  
    Mesh → False,  
    PlotRange → {-1, 1},
```

```
ColorFunction →  
  "GrayTones"];  
rightnumsample =  
ArrayPlot [  
  rightx =  
    scon * signal +  
    ncon * noise,  
  Mesh → False,  
  PlotRange → {-1, 1},  
  ColorFunction →  
    "GrayTones"]]];
```

```
flash = leftnumsample;  
Pause [.25];  
flash = blank;  
Pause [.25];  
flash = rightnumsample;  
Pause [.25];  
flash = blank;
```

```
myanswer =
```

```
ChoiceDialog[
  "Signal on",
  {"First" → 1,
   "Second" → 0},
  WindowSize →
    {300, 80},
  WindowMargins →
    {{Automatic, 0},
     {Automatic,
      330}}];
```

```
If [myanswer ==
    whichflash,
    WasICorrect = 1,
    WasICorrect = 0];
```

```
idealanswer =
  If [
    Flatten [leftx] .
      Flatten [signal] >
    Flatten [rightx] .
```

```
        Flatten[signal],  
        1, 0];  
  
If[idealanswer ==  
    whichflash,  
    WasIdealCorrect = 1,  
    WasIdealCorrect = 0];  
data = Append[data,  
    {WasICorrect,  
    WasIdealCorrect}],  
  
    {numtrials}];  
]
```

Run a block of trials

```
In[730]:= twoflashes  
NotebookClose[nb];
```


Take a look at the raw data

```
data // TableForm
```

Was I Correct?	Was Ideal
1	1
1	1
1	1
1	1
1	1

Analyze the data

Let's drop the table heading stored in row 1, and then transpose the matrix so that the columns become the rows:

```
In[733]:= data2 = Transpose [  

           Drop[data, 1]]
```

```
Out[733]= { {1, 1, 1, 1, 1},  

            {1, 1, 1, 1, 1} }
```

Let's use a combination of Map[]

and `Count[]` (used earlier to make histograms) to count up all occurrences of an event type. So the total for `myhits` is:

```
dprime [
  myproportioncorrect];
idealdprime =
dprime [
  idealproportioncorrect];
mystatisticalefficiency =
Round [
  100 *
  (mydprime /
  idealdprime) ^ 2];
```

```
In[739]:= Print [
  Style [
    Grid [
      { {"my prop correct",
        How can you measure absolute
        efficiency if the signal-to-noise ratio
        is so high the ideal observer doesn't
        make enough mistakes to get a
        reliable estimate of its d' ? Recall
        that we don't need to simulate this
        SKE observer. Its d' is: v.s.s
        ideal proportion correct,
        mydprime,
        idealdprime,
        mystatisticalefficiency}},
      Frame → All], 9]];
```

my prop correct	ideal's prop correct	my d'	ideal's d'	my efficiency (%)
1.	1.	∞	∞	Indeterminate

To get a reasonably reliable estimate, you need at least 100 or

more trials, preferably more. And you and the ideal need to make mistakes!

How can you measure absolute efficiency if the signal-to-noise ratio is so high the ideal observer doesn't make enough mistakes to get a reliable estimate of its d' ? Recall that we don't need to simulate this

SKE observer. Its d' is: $\frac{\sqrt{s.s}}{\sigma}$

References

Burgess, A. E., Wagner, R. F., Jennings, R. J., & Barlow, H. B. (1981). Efficiency of human visual signal discrimination. *Science*, *214*, 93-94.

De Valois, R. L., Albrecht, D. G., & Thorell, L. G. (1982). Spatial frequency selectivity of cells in macaque visual cortex. *Vision Research*, *22*(5), 545–559.

- Kersten, D. (1984). Spatial summation in visual noise. Vision Research, 24, 1977-1990.
- Morgenstern, Y., & Elder, J. H. (2012). Local Visual Energy Mechanisms Revealed by Detection of Global Patterns. *Journal of Neuroscience*, 32(11), 3679–3696.
- Watson, A. B., Barlow, H. B., & Robson, J. G. (1983). What does the eye see best? Nature, 31, 419-422.