

visualizations-v4

March 30, 2020

1 Visualizations, version 4

1.1 Setup packages.

```
[1]: require(abind)
      require(data.table)
      require(magrittr)

      require(ggplot2)
```

```
Loading required package: abind
Loading required package: data.table
Loading required package: magrittr
Loading required package: ggplot2
```

1.2 Read data tables.

1.2.1 3D dataset.

```
[2]: xs3d <- fread("xs-3d-20200322a.csv")[, case:=factor(case)]
      xs3d %>% dim
```

```
1. 1331 2. 4
```

```
[3]: ys3d <- fread("ys-3d-20200322a.csv")[, case:=factor(case)]
      ys3d %>% dim
```

```
1. 27951 2. 5
```

```
[4]: s3d <- merge(xs3d, ys3d)
      s3d %>% dim
```

```
1. 27951 2. 8
```

1.3 Reorganize as a tensor.

```
[5]: y <- array(
      as.matrix(s3d[order(t, x3, x2, x1)][, .(y1, y2, y3)]),
      dim = c(
        length(unique(s3d$x1)),
        length(unique(s3d$x2)),
```

```

        length(unique(s3d$x3)),
        length(unique(s3d$t )),
        3
    ),
    dimnames = list(
        x1=sort(unique(s3d$x1)),
        x2=sort(unique(s3d$x2)),
        x3=sort(unique(s3d$x3)),
        t =sort(unique(s3d$t )),
        i =1:3
    )
)
y %>% dim

```

1. 11 2. 11 3. 11 4. 21 5. 3

1.4 Compute differences.

1.4.1 First differences (Jacobians).

```

[6]: dy1 <- y[2:11, , , , ] - y[1:10, , , , ]
dy2 <- y[, 2:11, , , ] - y[, 1:10, , , ]
dy3 <- y[, , 2:11, , ] - y[, , 1:10, , ]

dy <- abind(
  (dy1[, 2:11, 2:11, , ] + dy1[, 1:10, 1:10, , ]) / 2,
  (dy2[2:11, , 2:11, , ] + dy2[1:10, , 1:10, , ]) / 2,
  (dy3[2:11, 2:11, , , ] + dy3[1:10, 1:10, , , ]) / 2,
  along=6
)
dy %>% dim

```

1. 10 2. 10 3. 10 4. 21 5. 3 6. 3

1.4.2 Second differences (Hessians).

```

[7]: ddy1 <- dy[2:10, , , , , ] - dy[1:9, , , , , ]
ddy2 <- dy[, 2:10, , , , ] - dy[, 1:9, , , , ]
ddy3 <- dy[, , 2:10, , , ] - dy[, , 1:9, , , ]

ddy <- abind(
  (ddy1[, 2:10, 2:10, , , ] + ddy1[, 1:9, 1:9, , , ]) / 2,
  (ddy2[2:10, , 2:10, , , ] + ddy2[1:9, , 1:9, , , ]) / 2,
  (ddy3[2:10, 2:10, , , , ] + ddy3[1:9, 1:9, , , , ]) / 2,
  along=7
)
ddy %>% dim

```

1. 9 2. 9 3. 9 4. 21 5. 3 6. 3 7. 3

1.5 Curvatures (determinant of Hessians).

1.5.1 Compute the tensor.

```
[8]: cy <- array(
  0,
  dim = c(
    dim(ddy)[1],
    dim(ddy)[2],
    dim(ddy)[3],
    dim(ddy)[4],
    dim(ddy)[5]
  ),
  dimnames = list(
    x1=dimnames(y)$x1[2:10],
    x2=dimnames(y)$x2[2:10],
    x3=dimnames(y)$x3[2:10],
    t =dimnames(y)$t,
    i =dimnames(y)$i
  )
)
for (x1 in 1:dim(cy)[1])
  for (x2 in 1:dim(cy)[2])
    for (x3 in 1:dim(cy)[3])
      for (t in 1:dim(cy)[4])
        for (i in 1:dim(cy)[5])
          cy[x1, x2, x3, t, i] <- det(ddy[x1, x2, x3, t, i, , ])
cy %>% dim
1.9 2.9 3.9 4.21 5.3
```

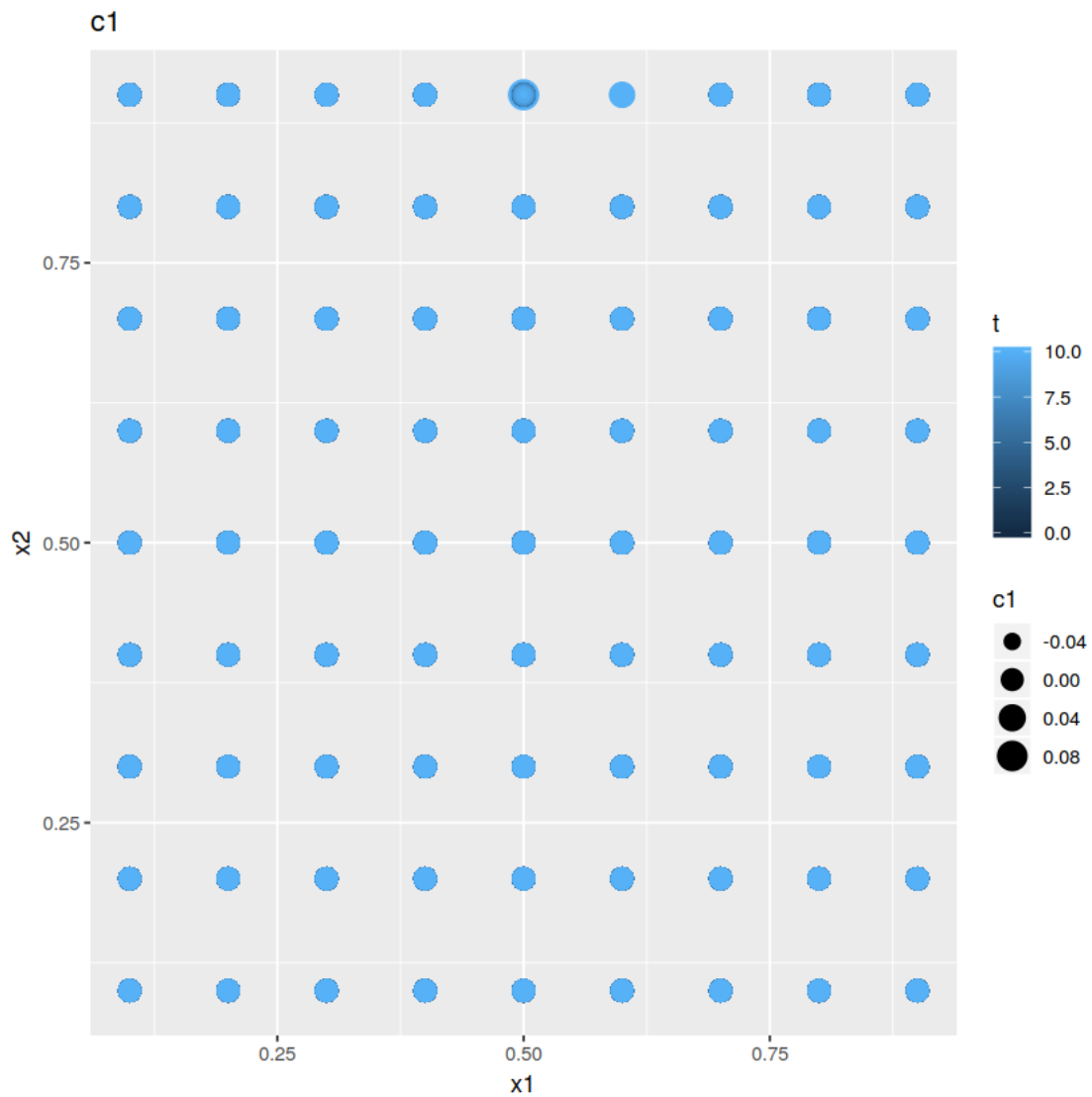
1.5.2 Organize as a data table.

```
[9]: curv <- merge(
  s3d,
  dcast(
    data.table(melt(cy)),
    x1 + x2 + x3 + t ~ i
  )[, .(x1, x2, x3, t, c1=`1`, c2=`2`, c3=`3`)],
  by=c("x1", "x2", "x3", "t")
)[, .(case, t, x1, x2, x3, y1, y2, y3, c1, c2, c3)]
curv %>% head
```

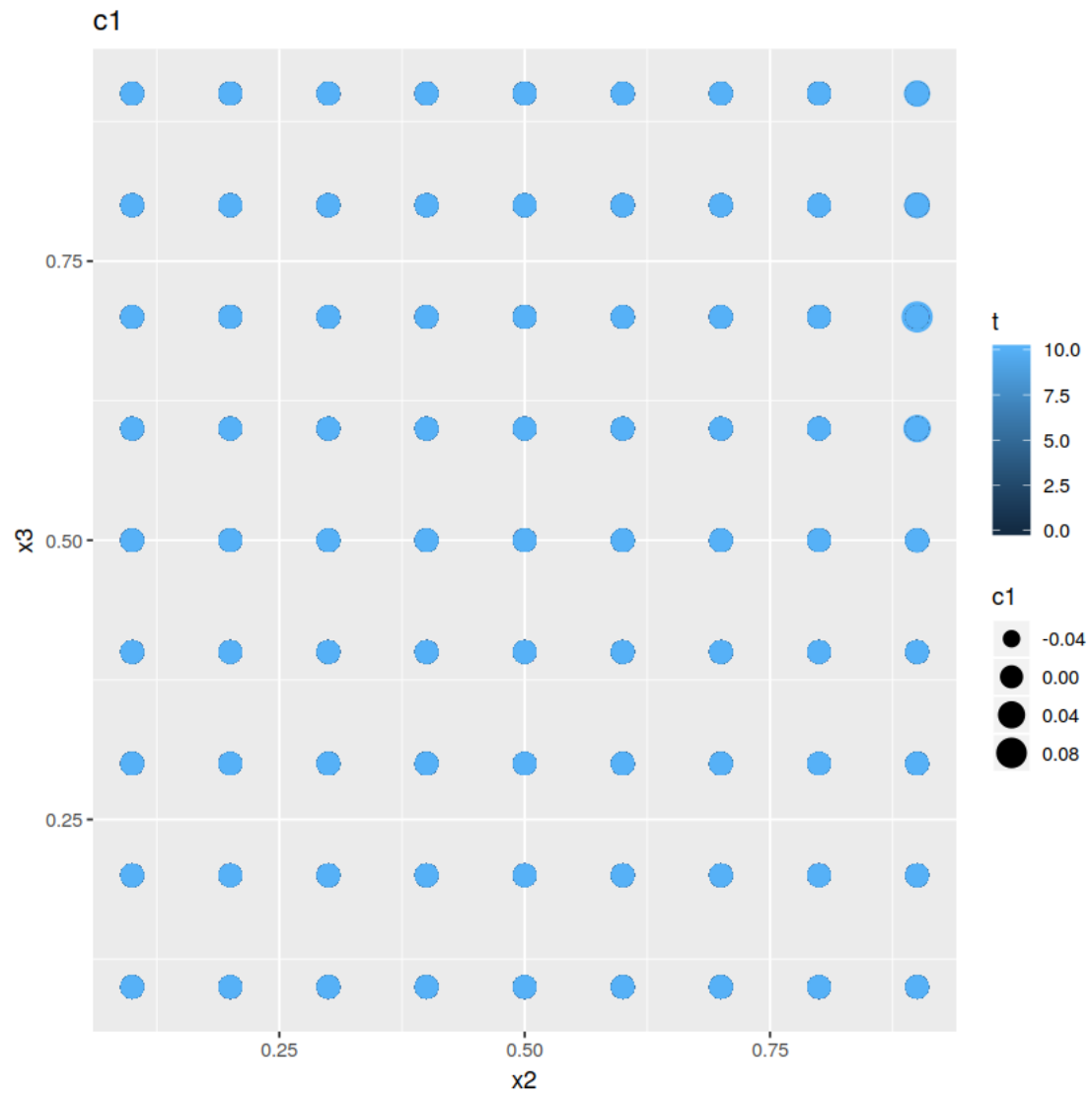
| | case <fct> | t <dbl> | x1 <dbl> | x2 <dbl> | x3 <dbl> | y1 <dbl> | y2 <dbl> | y3 <dbl> | c1 <dbl> | c2 <dbl> |
|----------------------|---------------|------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|
| A data.table: 6 x 11 | 134 | 0.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |
| | 134 | 0.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |
| | 134 | 1.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |
| | 134 | 1.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |
| | 134 | 2.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |
| | 134 | 2.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0 | 0 |

1.5.3 Plot results.

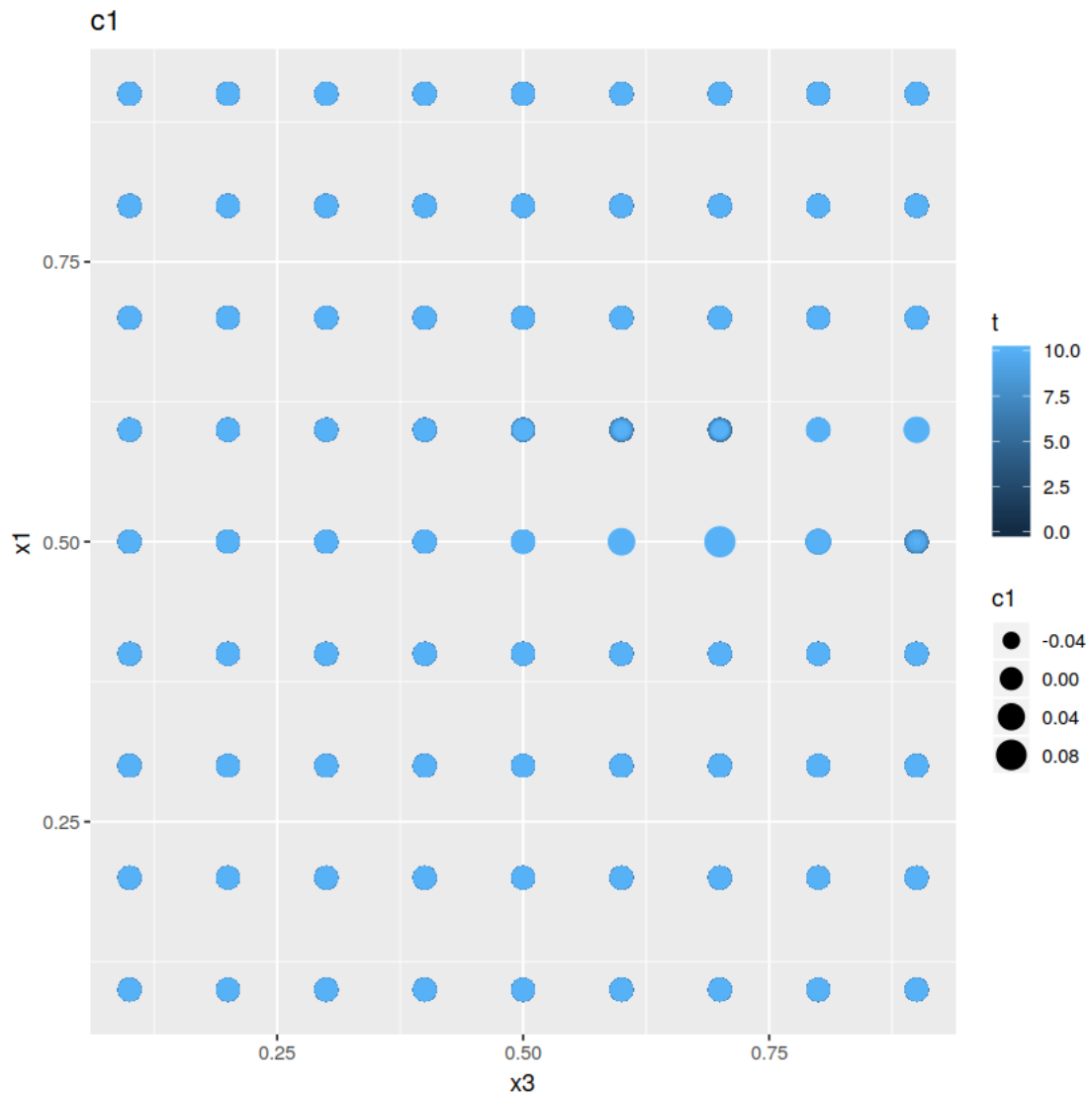
```
[10]: ggplot(curv, aes(x=x1, y=x2, color=t, size=c1)) + geom_point() + ggtitle("c1")
```



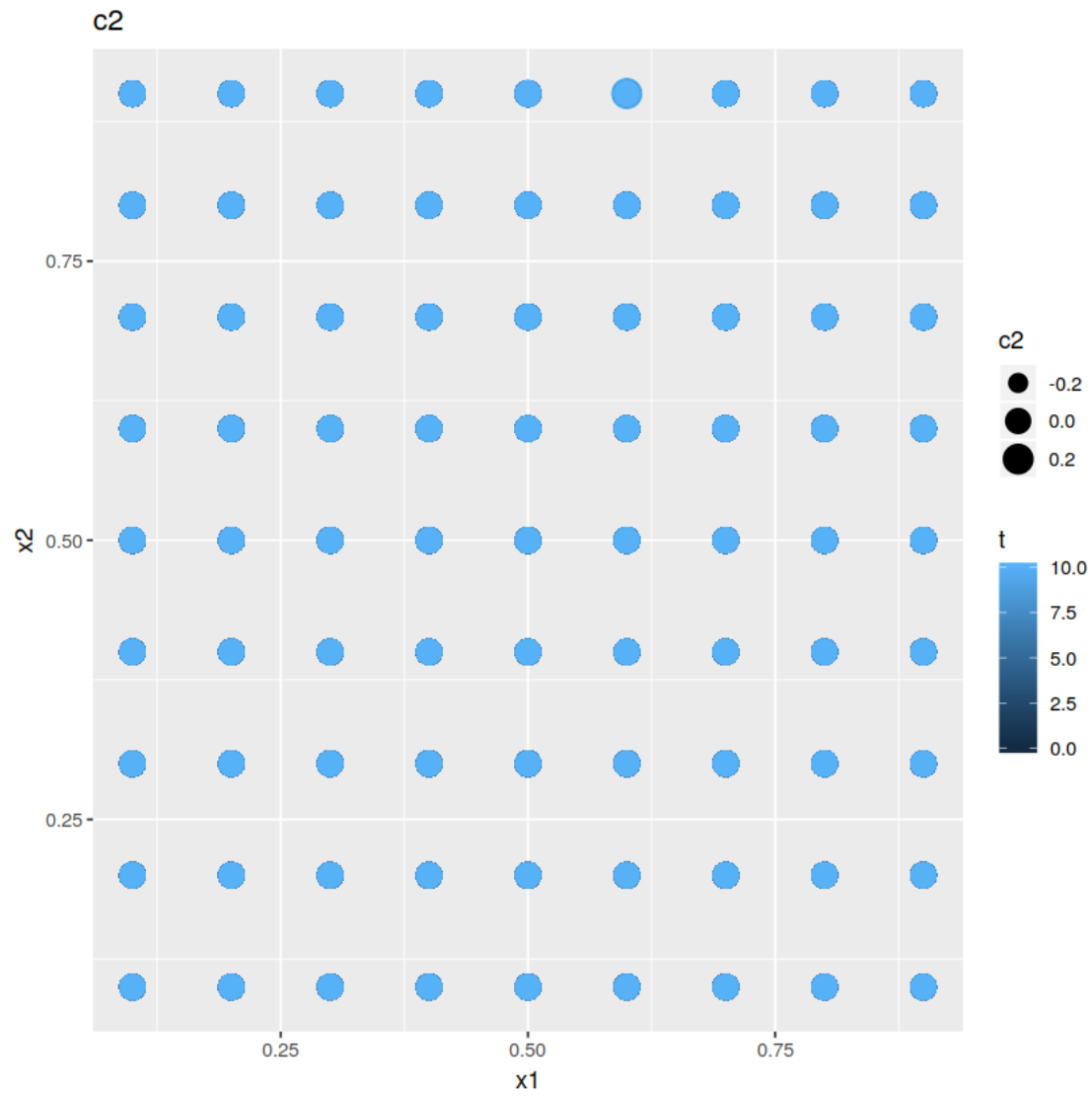
```
[11]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c1)) + geom_point() + ggtitle("c1")
```



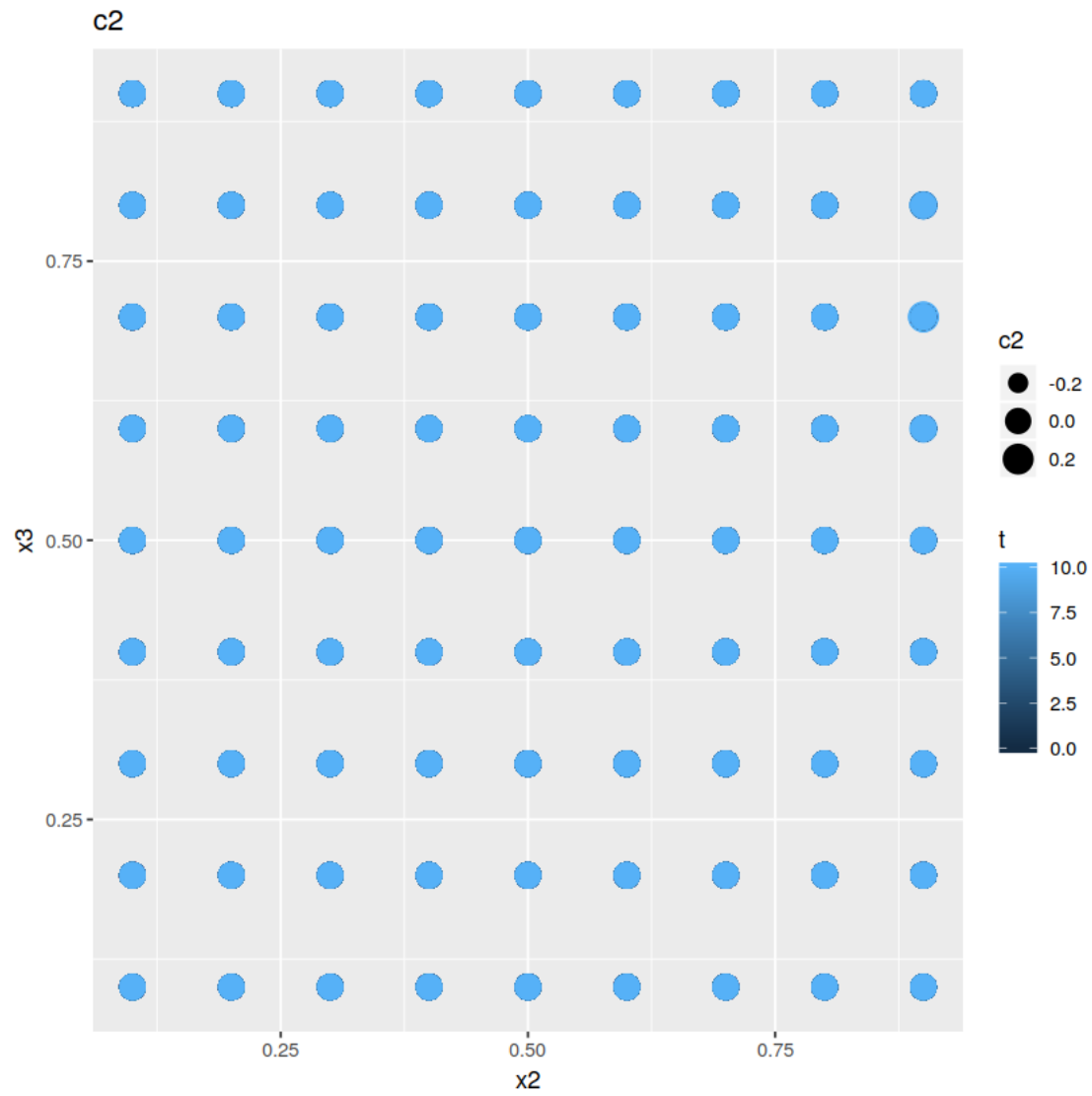
```
[12]: ggplot(curv, aes(x=x3, y=x1, color=t, size=c1)) + geom_point() + ggtitle("c1")
```



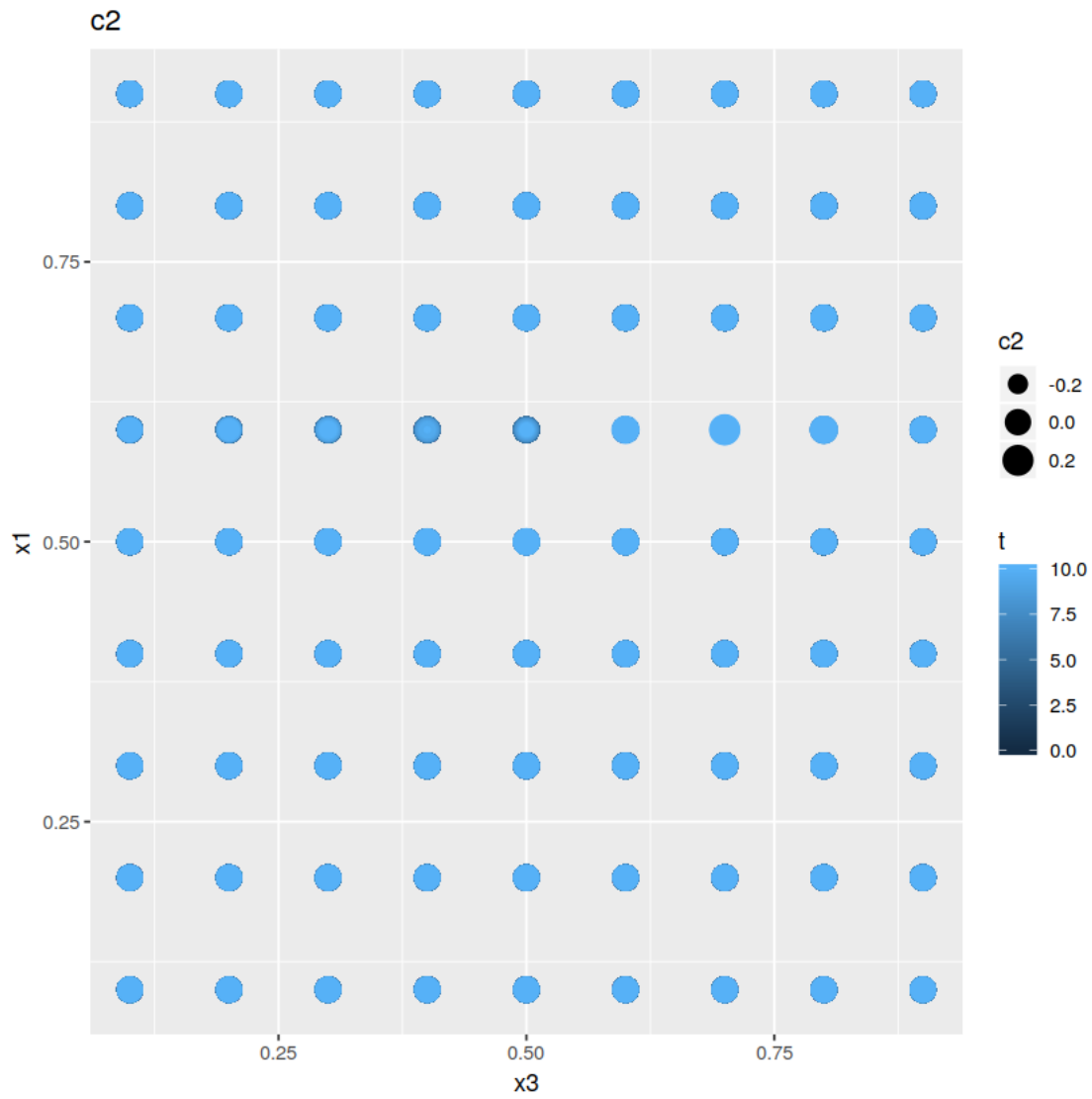
```
[13]: ggplot(curv, aes(x=x1, y=x2, color=t, size=c2)) + geom_point() + ggtitle("c2")
```



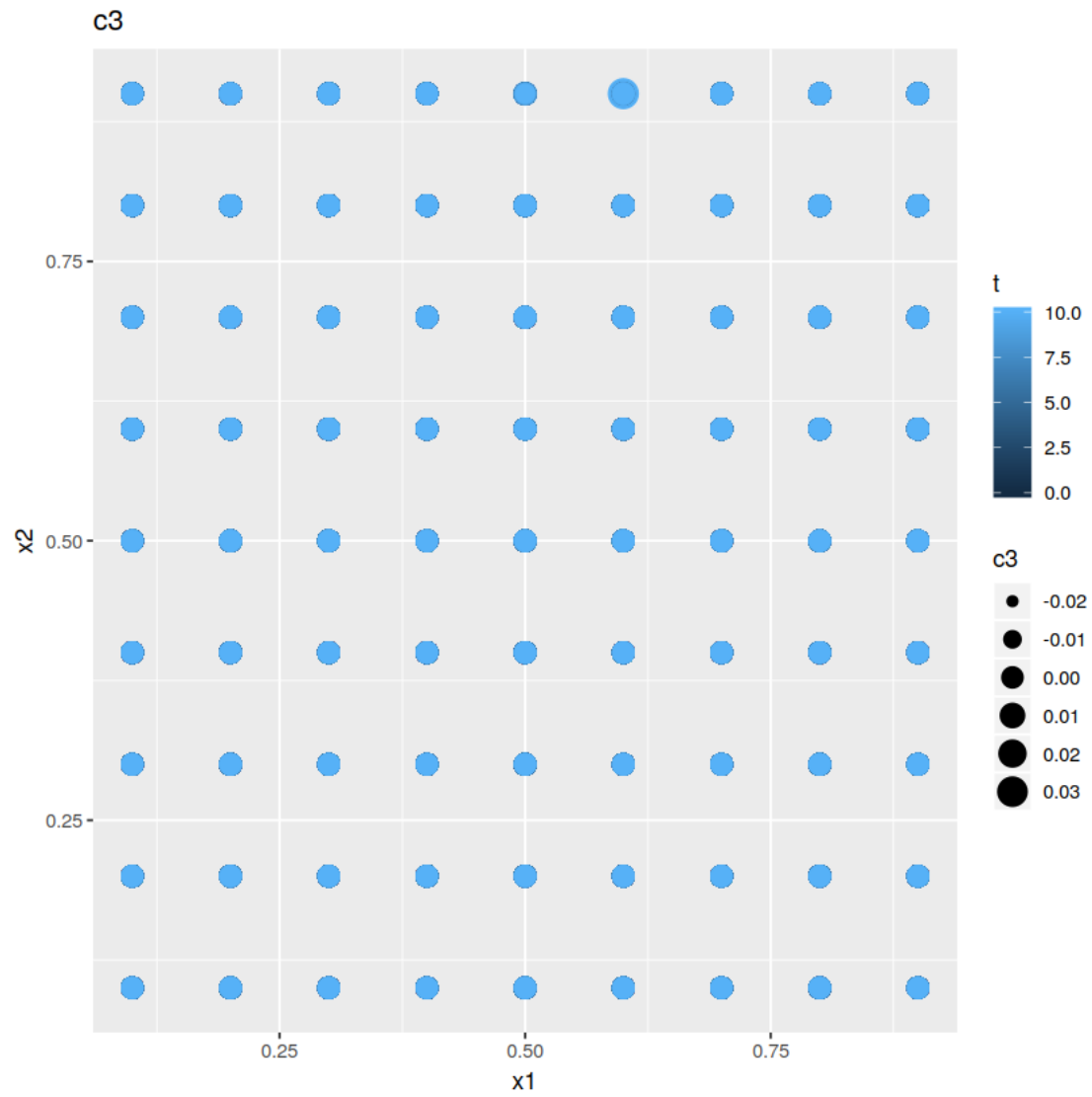
```
[14]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c2)) + geom_point() + ggtitle("c2")
```



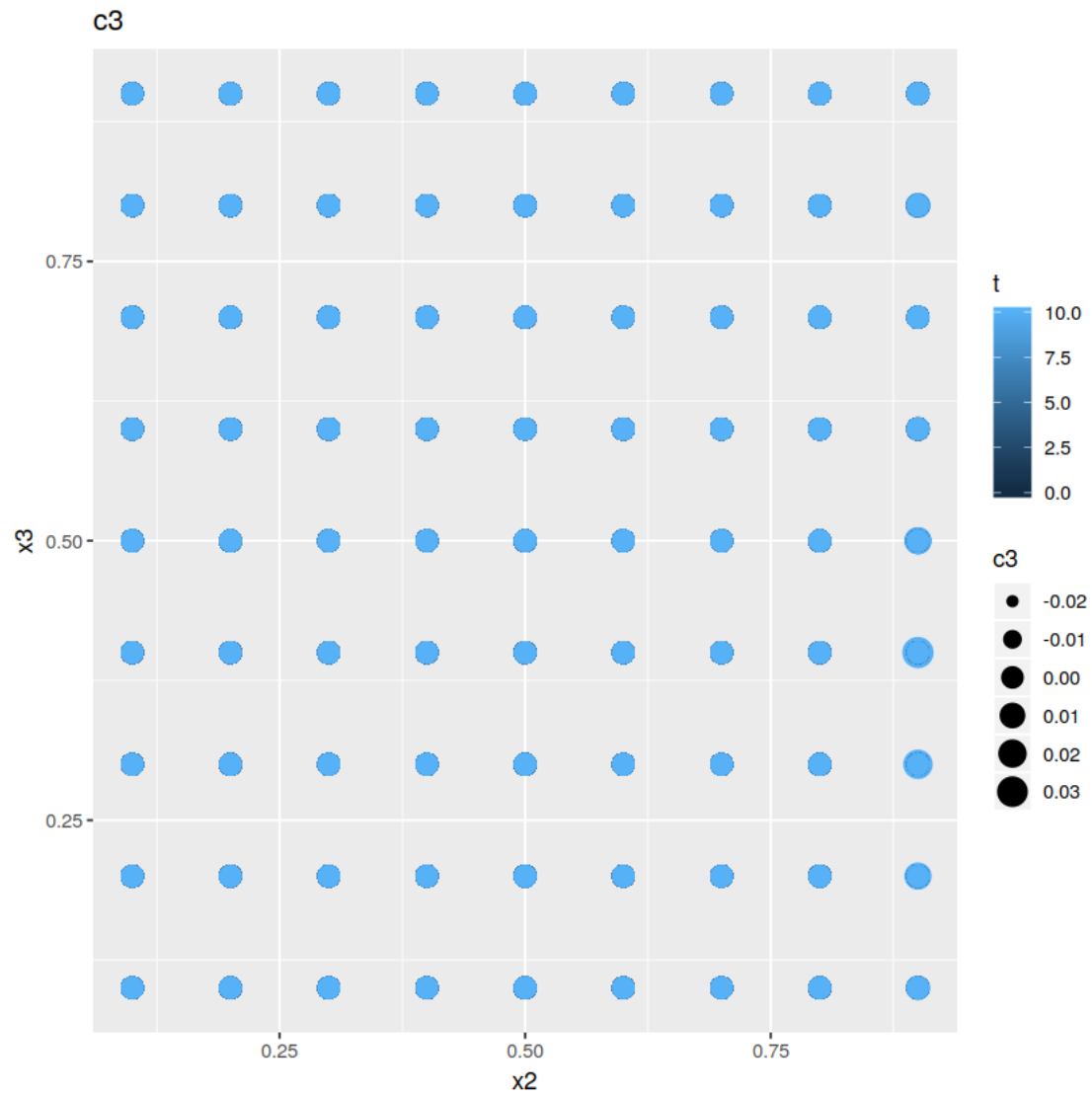
```
[15]: ggplot(curv, aes(x=x3, y=x1, color=t, size=c2)) + geom_point() + ggtitle("c2")
```

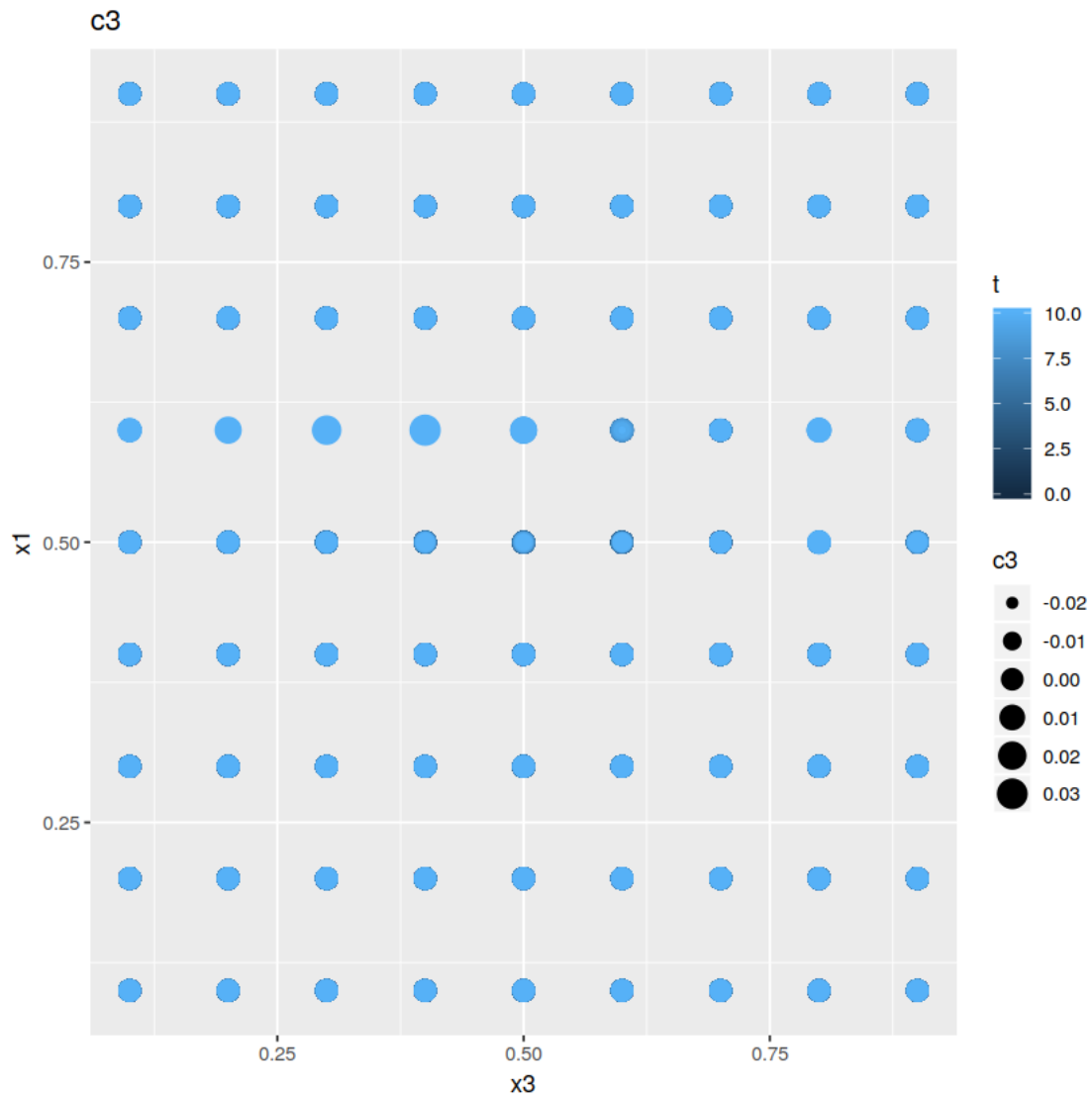
```
[16]: ggplot(curv, aes(x=x1, y=x2, color=t, size=c3)) + geom_point() + ggtitle("c3")
```



```
[17]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c3)) + geom_point() + ggtitle("c3")
```



```
[18]: ggplot(curv, aes(x=x3, y=x1, color=t, size=c3)) + geom_point() + ggtitle("c3")
```



1.6 Curvatures (maximum of Hessians).

1.6.1 Compute the tensor.

```
[19]: cy <- array(
  0,
  dim = c(
    dim(ddy)[1],
    dim(ddy)[2],
    dim(ddy)[3],
    dim(ddy)[4],
    dim(ddy)[5]
  ),
```

```

dimnames = list(
  x1=dimnames(y)$x1[2:10],
  x2=dimnames(y)$x2[2:10],
  x3=dimnames(y)$x3[2:10],
  t =dimnames(y)$t,
  i =dimnames(y)$i
)
)
for (x1 in 1:dim(cy)[1])
  for (x2 in 1:dim(cy)[2])
    for (x3 in 1:dim(cy)[3])
      for(t in 1:dim(cy)[4])
        for (i in 1:dim(cy)[5])
          cy[x1, x2, x3, t, i] <- max(abs(ddy[x1, x2, x3, t, i, , ]))
cy %>% dim
1.9 2.9 3.9 4.21 5.3

```

1.6.2 Organize as a data table.

```

[20]: curv <- merge(
  s3d,
  dcast(
    data.table(melt(cy)),
    x1 + x2 + x3 + t ~ i
  )[, .(x1, x2, x3, t, c1=`1`, c2=`2`, c3=`3`)],
  by=c("x1", "x2", "x3", "t")
)[, .(case, t, x1, x2, x3, y1, y2, y3, c1, c2, c3)]
curv %>% head

```

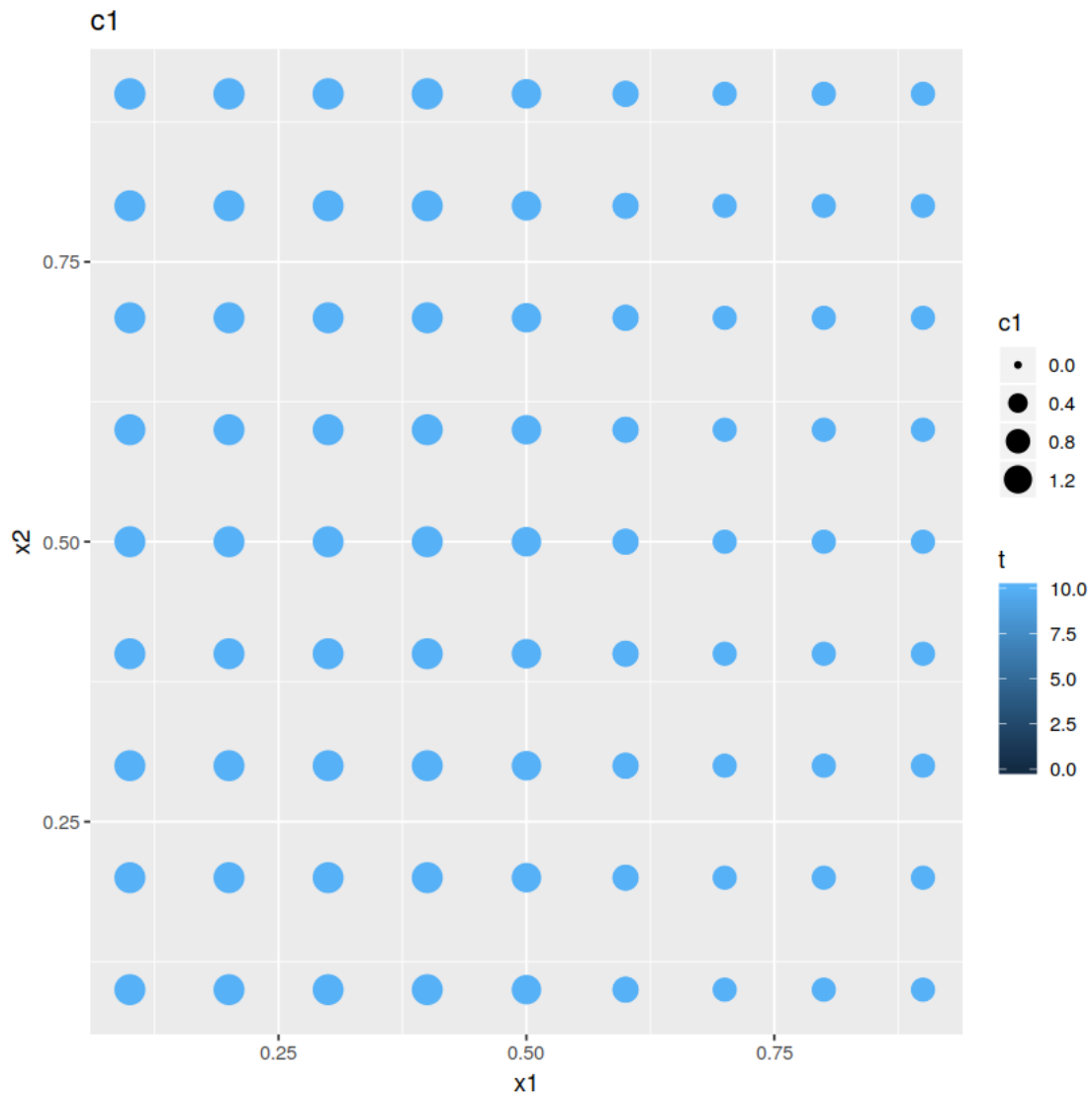
| | case <fct> | t <dbl> | x1 <dbl> | x2 <dbl> | x3 <dbl> | y1 <dbl> | y2 <dbl> | y3 <dbl> | c1 <dbl> |
|----------------------|---------------|------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|
| A data.table: 6 x 11 | 134 | 0.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00000000 |
| | 134 | 0.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00099455 |
| | 134 | 1.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00199070 |
| | 134 | 1.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00298847 |
| | 134 | 2.0 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00398785 |
| | 134 | 2.5 | 0.1 | 0.1 | 0.1 | -0.190032 | 0.5144967 | 0.4093612 | 0.00498885 |

1.6.3 Plot results.

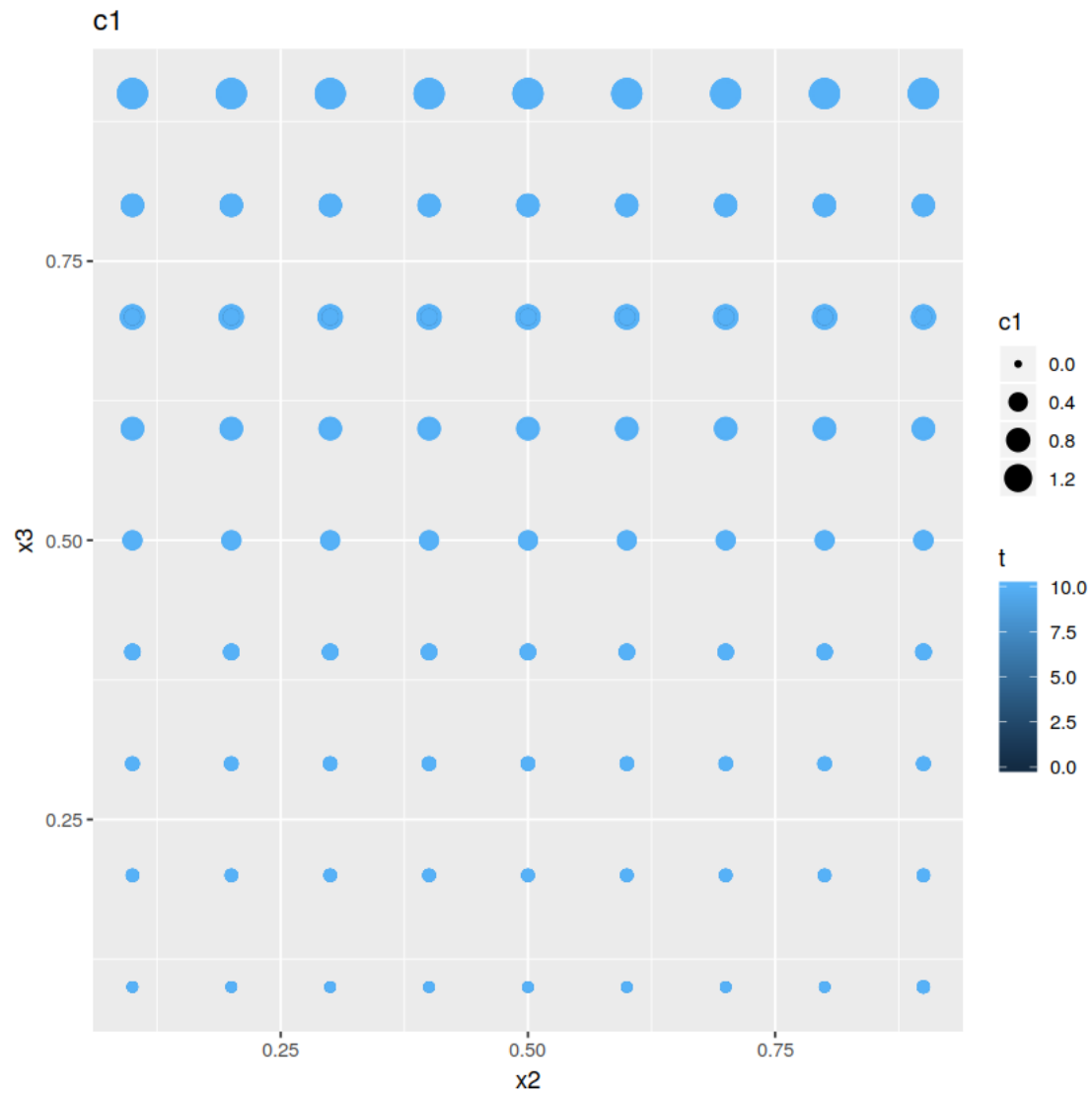
```

[21]: ggplot(curv, aes(x=x1, y=x2, color=t, size=c1)) + geom_point() + ggtitle("c1")

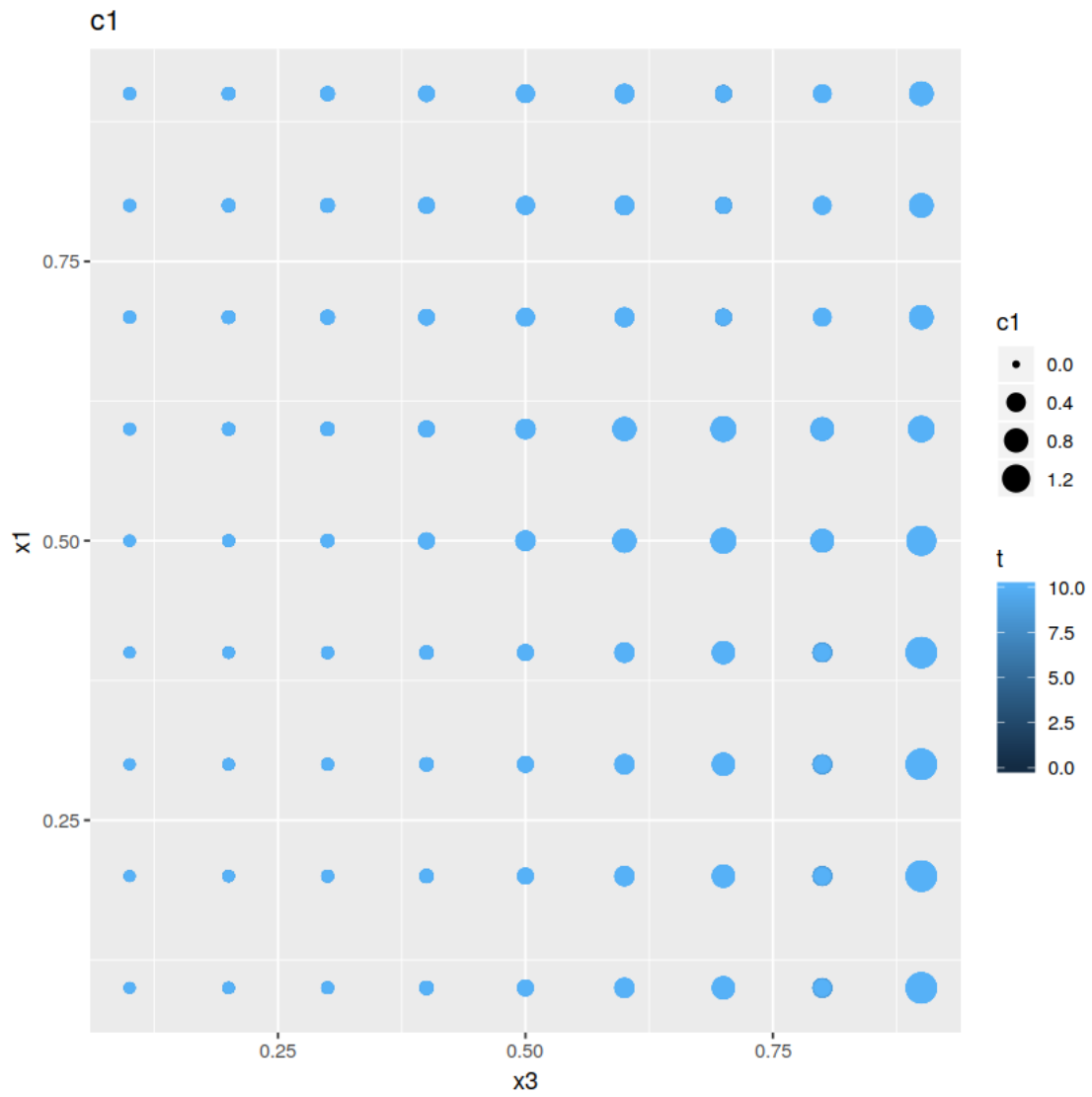
```



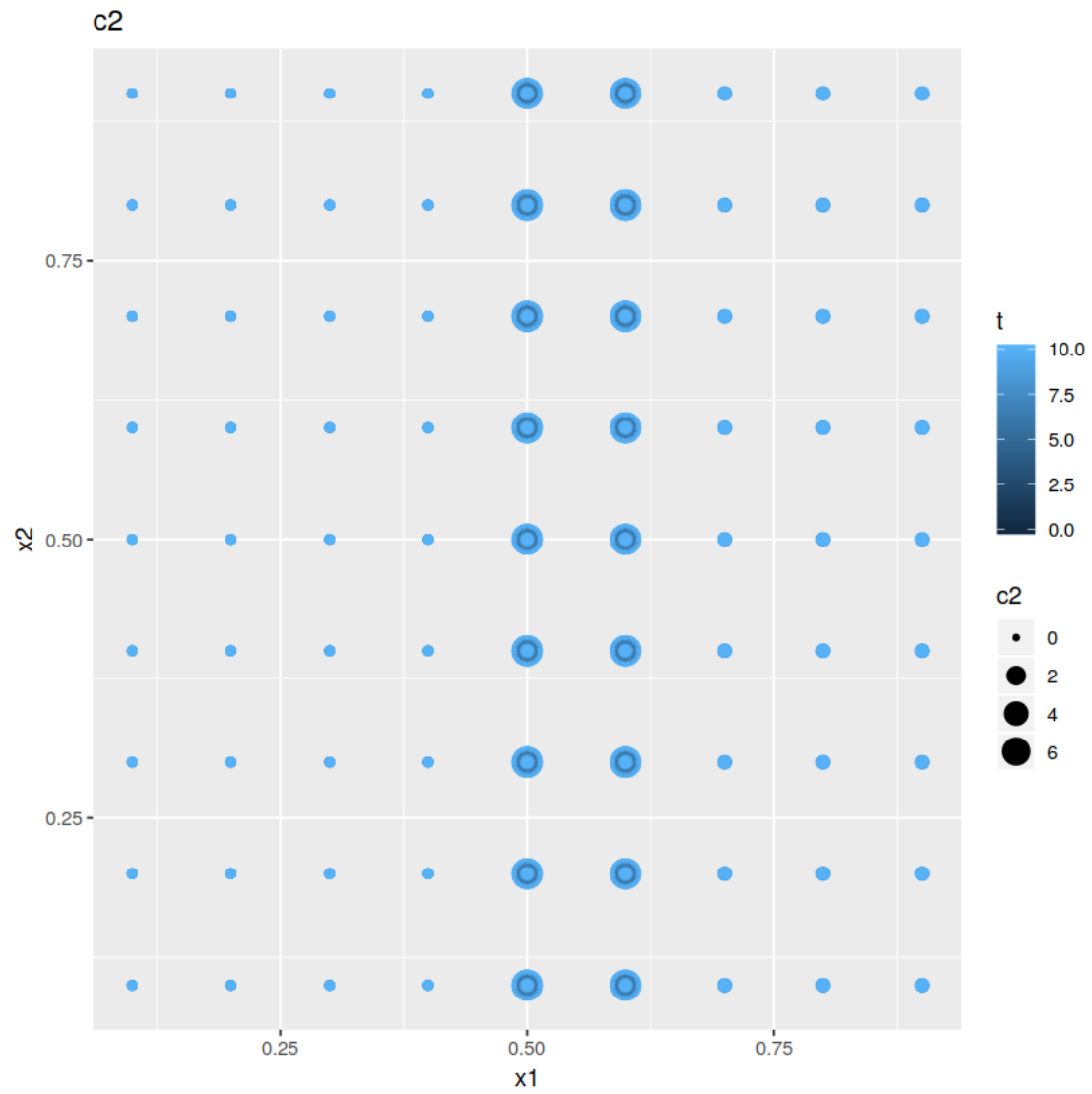
```
[22]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c1)) + geom_point() + ggtitle("c1")
```



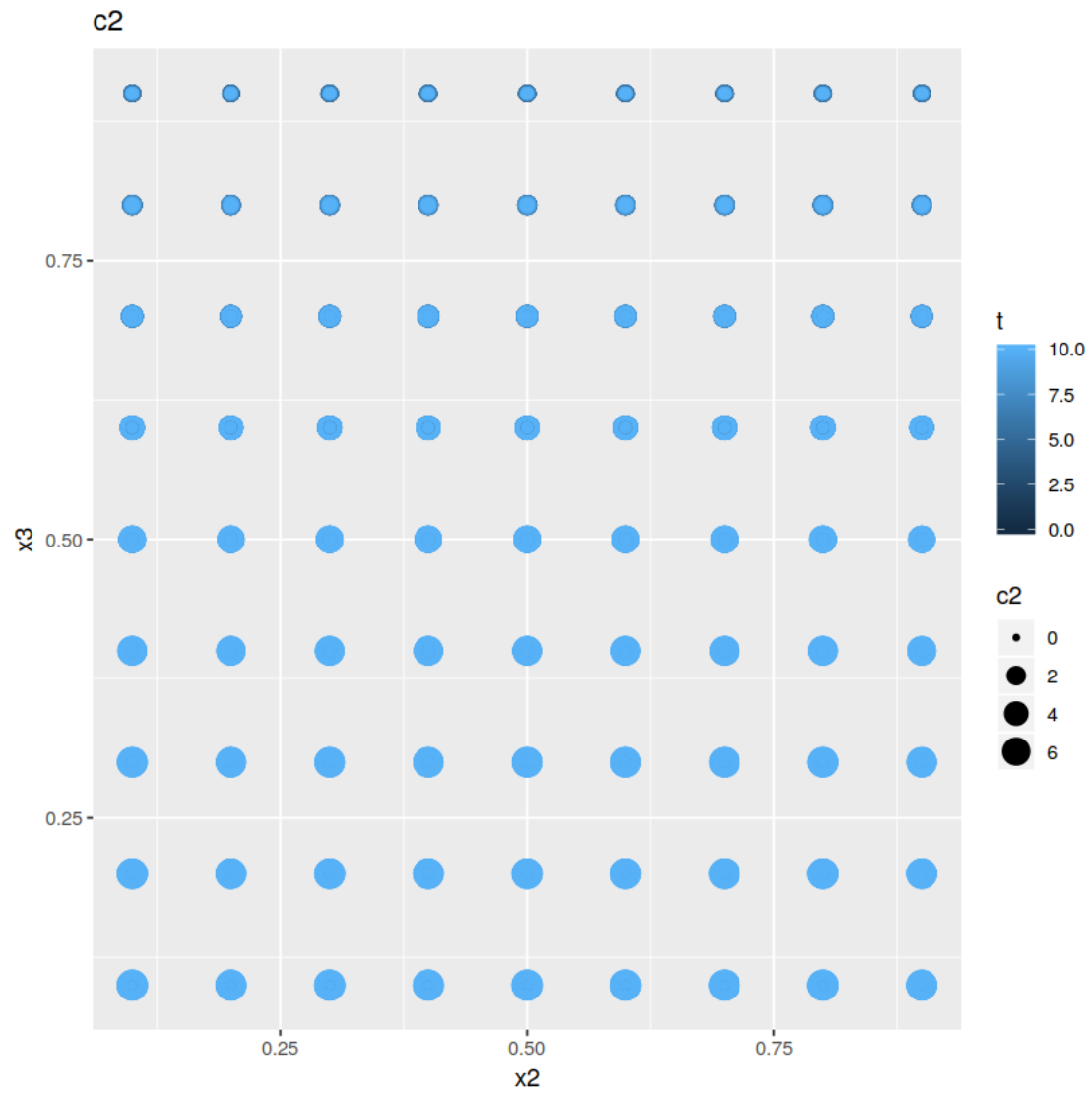
```
[23]: ggplot(curv, aes(x=x3, y=x1, color=t, size=c1)) + geom_point() + ggtitle("c1")
```



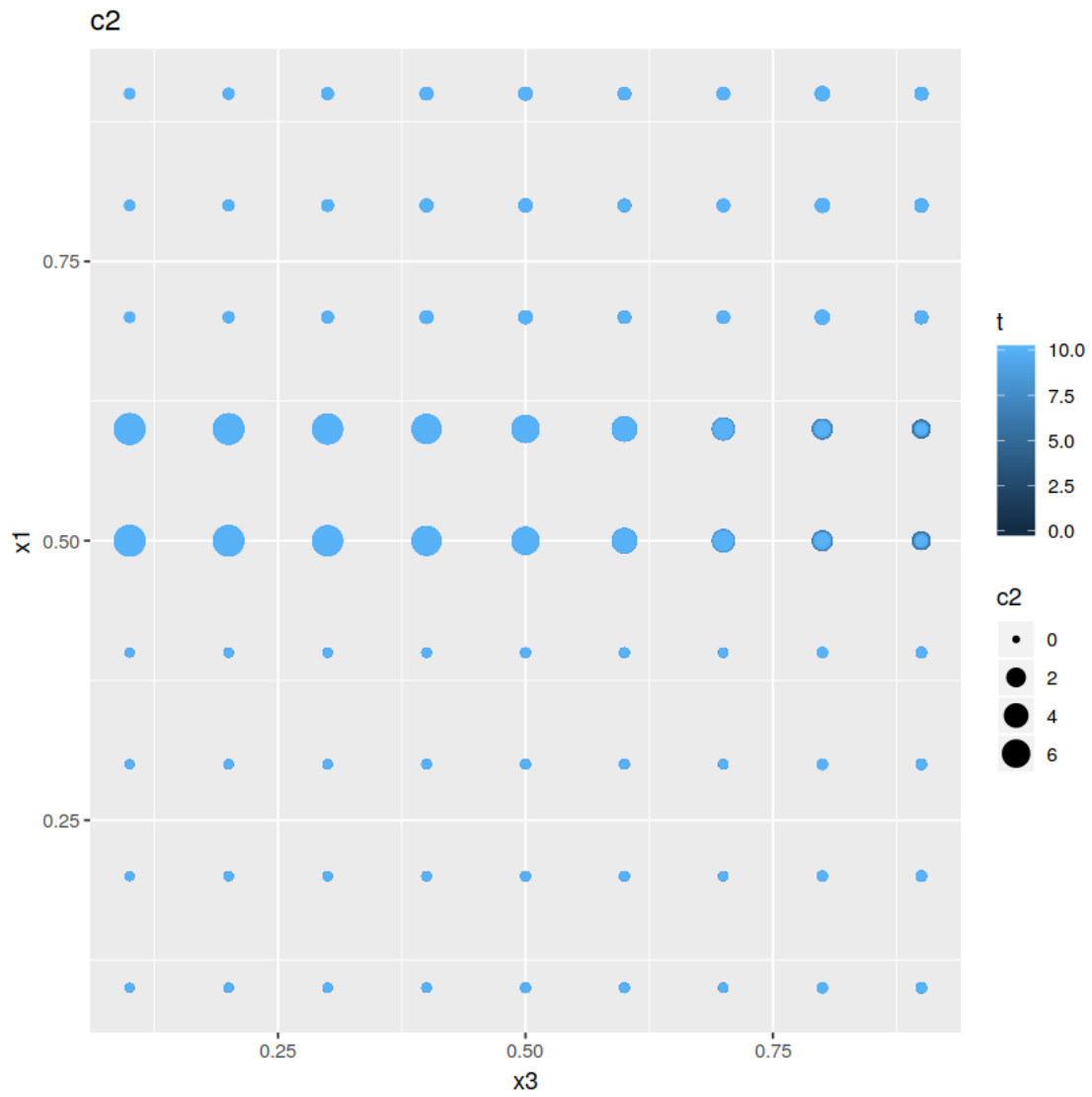
[24]: `ggplot(curv, aes(x=x1, y=x2, color=t, size=c2)) + geom_point() + ggtitle("c2")`



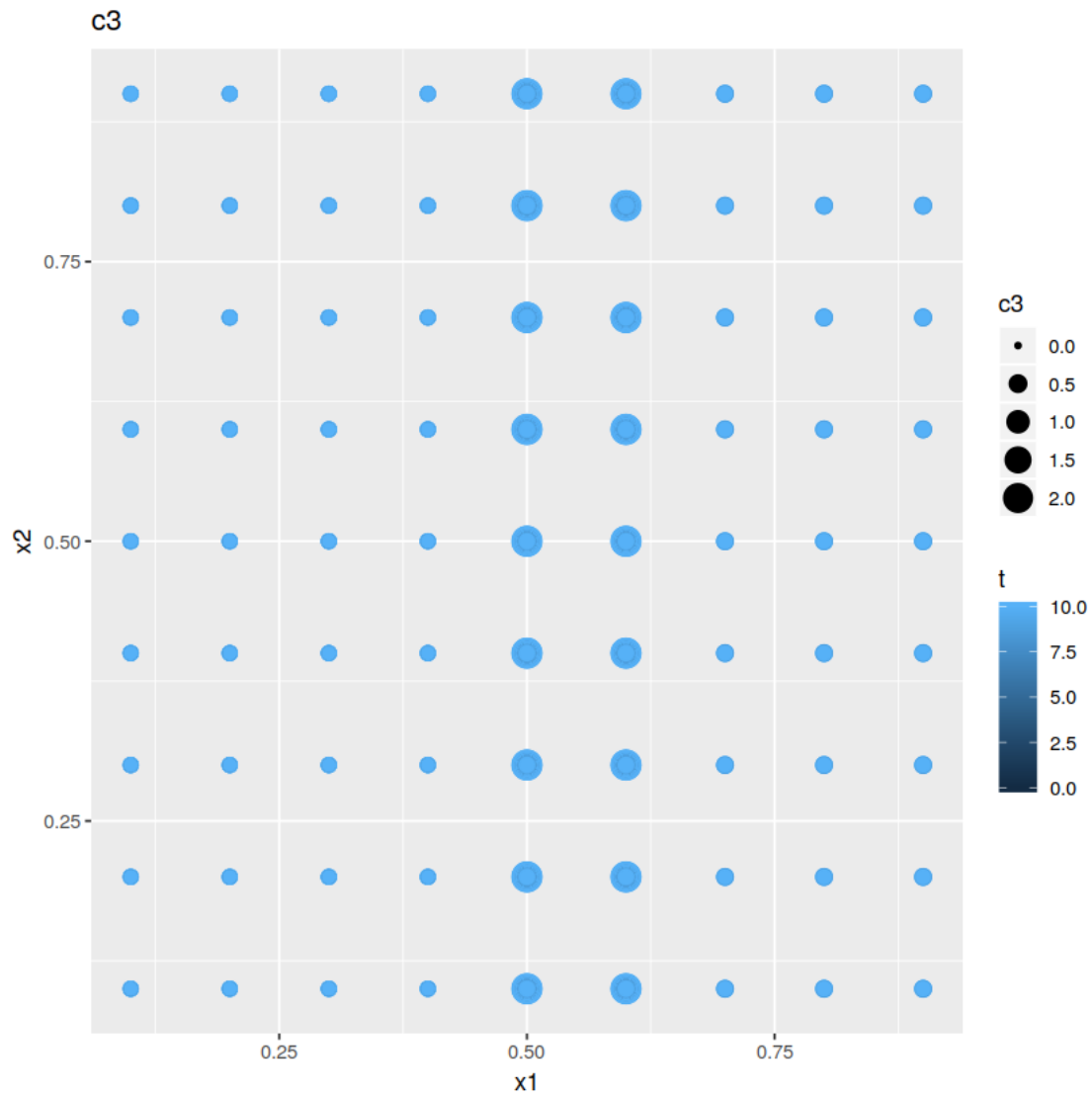
```
[25]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c2)) + geom_point() + ggtitle("c2")
```



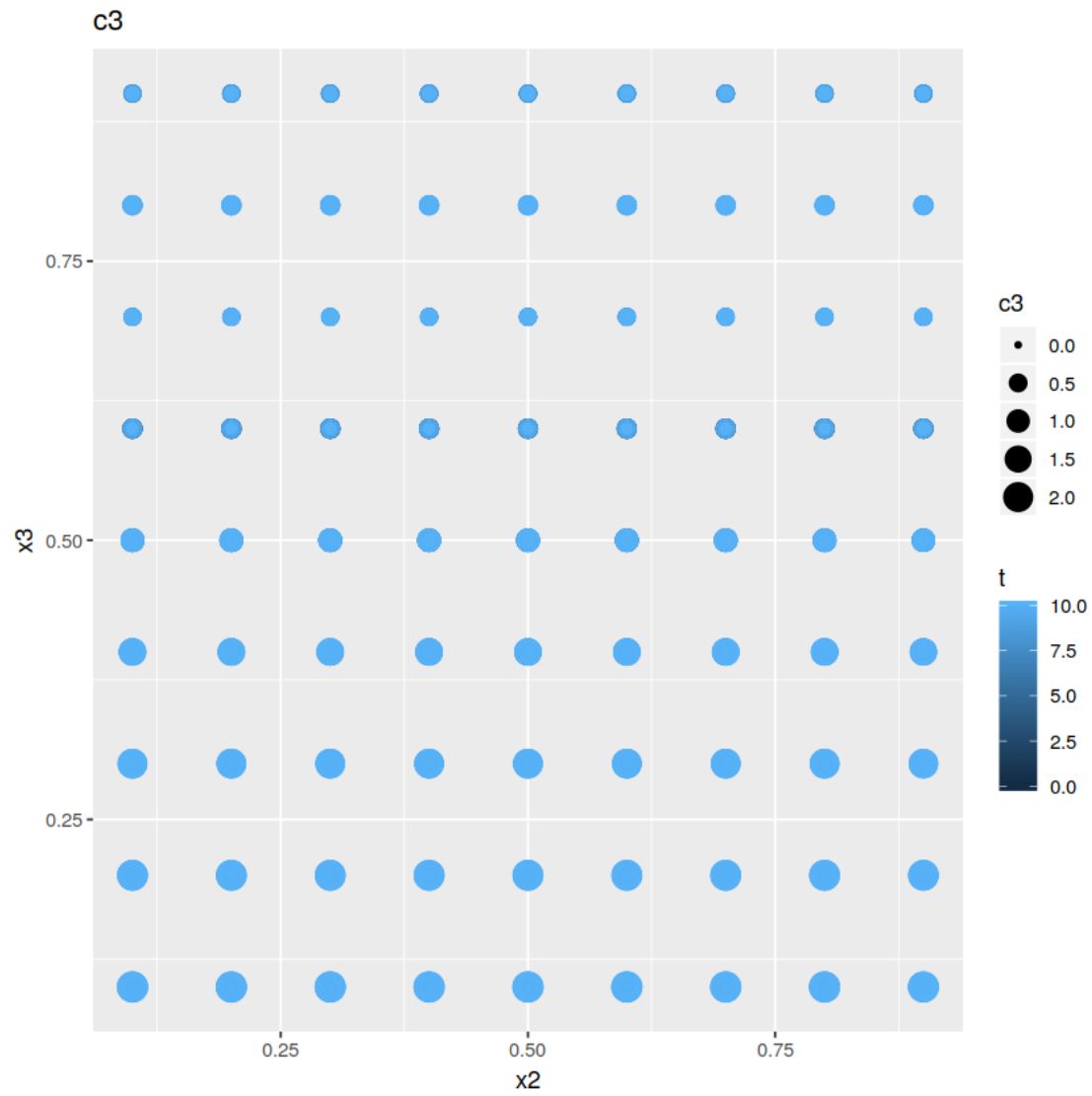
[26]: `ggplot(curv, aes(x=x3, y=x1, color=t, size=c2)) + geom_point() + ggtitle("c2")`



```
[27]: ggplot(curv, aes(x=x1, y=x2, color=t, size=c3)) + geom_point() + ggtitle("c3")
```



```
[28]: ggplot(curv, aes(x=x2, y=x3, color=t, size=c3)) + geom_point() + ggtitle("c3")
```



```
[29]: ggplot(curv, aes(x=x3, y=x1, color=t, size=c3)) + geom_point() + ggtitle("c3")
```

