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> # Initial code based on:
> # Example From Parameter Redundancy and Identifiability by Diana Cole
> # Section 9.2.2 : Immigration integrated model
> # `Additional exhaustive summaries considered for IPM Identifiability workshop, Bordeaux 24
  -28 April
> # Modified by FB 2023-06-23 to (i) remove immigration rate (mock Shrike example in Schaub &
  Kéry 2021 Chap 6) and (2) add the expansion exhaustive summary to check it produces the
  same result (yes)
>
> restart;
> with(LinearAlgebra) :
> Dmat := proc(se, pars)
local DD1, i, j;
description "Form the derivative matrix";
with(LinearAlgebra) :
DD1 := Matrix(1 .. Dimension(pars), 1 .. Dimension(se)) :
for i from 1 to Dimension(pars) do
  for j from 1 to Dimension(se) do
    DD1[i, j] := diff(se[j], pars[i])
  end do
end do;
DD1;
end proc:
> Estpar := proc(DD1, pars, ret)
local r, d, alphapre, alpha, PDE, FF, i, j, ans;
description "Finds the estimable set of parameters for derivative matrix DD1. If ret = 1 returns
  alpha, PDEs, estimable parameter combinations. Otherwise returns estimable parameter
  combinations";
with(LinearAlgebra) :
r := Rank(DD1); d := Dimension(pars) - r :
alphapre := NullSpace(Transpose(DD1)) :  $\alpha$  := Matrix(d, Dimension(pars)) : PDE :=
  Vector(d) :
FF := f(seq(pars[i], i = 1 .. Dimension(pars))) :
for i from 1 to d do
   $\alpha$ [i, 1 .. Dimension(pars)] := alphapre[i] :
  PDE[i] := add(diff(FF, pars[j]) ·  $\alpha$ [i, j], j = 1 .. Dimension(pars)) :
end do;
if ret = 1 then
  ans := <pdsolve({seq(PDE[i] = 0, i = 1 .. d)}), {alpha}, {PDE}> :
else
  ans := pdsolve({seq(PDE[i] = 0, i = 1 .. d)}) :
end if;
ans :
end proc:
> Ztransformys := proc(A, B, x0)
local II, ys, kappa;

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**description** "Finds the z-transform function";

$II := \text{IdentityMatrix}(\text{Dimension}(A)[1]) :$

$ys := \text{simplify}(\text{Multiply}(B, \text{Multiply}(\text{MatrixInverse}(z \cdot II - A), \text{Multiply}(A, x0)))) ;$

$ys :$

**end proc:**

>

>  $\text{caprecapexsum} := \text{proc}(y, z, r, c)$

**local**  $i, j, m, P, aa, b, P1, P2, P1ans, P2ans;$

**description** "Creates the simpler exhaustive summary for the capture-recapture model";

*with*(*LinearAlgebra*) :

$P1 := \text{Matrix}(c, c) :$

$P2 := \text{Matrix}(c, c) :$

**if**  $y = 1$  **then**

**for**  $i$  **from** 1 **to**  $c$  **do**

**for**  $j$  **from** 1 **to**  $c$  **do**

$aa[i, j] := \text{phi} :$

**end do:**

**end do:**

**elif**  $y = 2$  **then**

**for**  $i$  **from** 1 **to**  $c$  **do**

**for**  $j$  **from** 1 **to**  $c$  **do**

$aa[i, j] := \text{phi}[j] :$

**end do:**

**end do:**

**elif**  $y = 3$  **then**

**for**  $i$  **from** 1 **to**  $c$  **do**

**for**  $j$  **from** 1 **to**  $c$  **do**

$aa[i, j] := \text{phi}[i] :$

**end do:**

**end do:**

**else**

**for**  $i$  **from** 1 **to**  $c$  **do**

**for**  $j$  **from** 1 **to**  $c$  **do**

$aa[i, j] := \text{phi}[i, j] :$

**end do:**

**end do:**

**end if:**

**if**  $z = 1$  **then**

**for**  $i$  **from** 1 **to**  $(c + 1)$  **do**

**for**  $j$  **from** 1 **to**  $(c + 1)$  **do**

$b[i, j] := p :$

**end do:**

**end do:**

**elif**  $z = 2$  **then**

**for**  $i$  **from** 1 **to**  $(c + 1)$  **do**

**for**  $j$  **from** 1 **to**  $(c + 1)$  **do**

$b[i, j] := p[j] :$

**end do:**

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    end do:
  elif  $z = 3$  then
    for  $i$  from 1 to  $(c + 1)$  do
      for  $j$  from 1 to  $(c + 1)$  do
         $b[i, j] := p[i]$ :
      end do:
    end do:
  else
    for  $i$  from 1 to  $(c + 1)$  do
      for  $j$  from 1 to  $(c + 1)$  do
         $b[i, j] := p[i, j]$ :
      end do:
    end do:
  end if:

  for  $i$  from 1 to  $\text{Dimension}(P1)[1]$  do
    for  $j$  from  $i$  to  $\text{Dimension}(P1)[2]$  do
       $P1[i, j] := (aa[i, c + i - j]) \cdot b[i + 1, c + i + 1 - j]$ ;
    end do:
  end do:
   $P1ans := P1[.., c - r + 1 .. c]$ ;
  for  $i$  from 1 to  $\text{Dimension}(P2)[1]$  do
    for  $j$  from  $i$  to  $\text{Dimension}(P2)[2]$  do
       $P2[i, j] := (aa[i - 1, c + i - 1 - j]) \cdot (1 - b[i, c + i - j])$ ;
    end do:
  end do:
   $P2ans := P2[2 .. c, c - r + 1 .. c]$ ;
   $P := \langle P1ans, P2ans \rangle$ 
end proc:

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> Matvec := proc( $P$ )
  local  $sizekappa, i, j, kappa, kappaindex$ ;
  description "Converts the data matrix into a vector of non-zero terms";
  with(LinearAlgebra) :
   $sizekappa := 0$  :
  for  $i$  from 1 to  $\text{Dimension}(P)[1]$  do
    for  $j$  from 1 to  $\text{Dimension}(P)[2]$  do
      if ( $P[i, j] \neq 0$ ) then
         $sizekappa := sizekappa + 1$  :
      end if
    end do
  end do;
   $\kappa := \text{Vector}(sizekappa) : kappaindex := 0$  :
  for  $i$  from 1 to  $\text{Dimension}(P)[1]$  do
    for  $j$  from 1 to  $\text{Dimension}(P)[2]$  do
      if ( $P[i, j] \neq 0$ ) then
         $kappaindex := kappaindex + 1$  :
         $\kappa[kappaindex] := P[i, j]$  :
      end if:
    end do:
  end for:

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end do:
end do:
κ;
end proc:

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> # Exhaustive summary for the census data

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> B := ⟨1|1⟩; A := ⟨⟨  $\frac{\text{phi}[1] \cdot \text{rho}}{2}$  |  $\frac{\text{phi}[1] \cdot \text{rho}}{2}$  ⟩, ⟨phi[a]|phi[a]⟩⟩; x0 := ⟨x[0, 1], x[0, 2]⟩ :

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$$B := \begin{bmatrix} 1 & 1 \end{bmatrix}$$

$$A := \begin{bmatrix} \frac{\phi_1 \rho}{2} & \frac{\phi_1 \rho}{2} \\ \phi_a & \phi_a \end{bmatrix}$$

(1)

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> ys := Ztransformys(A, B, x0);

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$$ys := \frac{(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)}{-\phi_1 \rho + 2z - 2\phi_a}$$

(2)

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> kappa1 := Vector(2) :
kappa1[1] := coeff(numer(ys), z, 0) : kappa1[2] := coeff(denom(ys), z, 0) : kappa1 :=
kappa1;

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$$\kappa l := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \end{bmatrix}$$

(3)

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> pars1 := ⟨phi[1], phi[a], rho⟩ :

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> D1 := Dmat(kappa1, pars1);

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$$D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho \\ -2x_{0,1} - 2x_{0,2} & 2 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 \end{bmatrix}$$

(4)

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> nopars := Dimension(pars1); r := Rank(D1); d := Dimension(pars1) - r;

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nopars := 3

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r := 1

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d := 2

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(5)

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> Estpar(D1, pars1, 0);

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$$\{f(\phi_1, \phi_a, \rho) = \_F1(\phi_1 \rho + 2 \phi_a)\}$$

(6)

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> # Alternative expansion summary -- FB Addendum 2023-06-23

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kappa1alt := Vector(3) : kappa1alt[1] := (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) : kappa1alt[2] := (x_{0,1}
+ x_{0,2}) \cdot (\phi_1 \rho + 2 \phi_a)^2 : kappa1alt[3] := (x_{0,1} + x_{0,2}) \cdot (\phi_1 \rho + 2 \phi_a)^3 : kappa1alt :=

```

$kappa1alt$ ;

$$kappa1alt := \begin{bmatrix} (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)^2 \\ (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)^3 \end{bmatrix} \quad (7)$$

>  $D1 := Dmat(kappa1alt, pars1);$

$$D1 := \begin{bmatrix} (x_{0,1} + x_{0,2}) \rho & 2 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \rho & 3 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)^2 \rho \\ 2 x_{0,1} + 2 x_{0,2} & 4 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) & 6 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)^2 \\ (x_{0,1} + x_{0,2}) \phi_1 & 2 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \phi_1 & 3 (x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a)^2 \phi_1 \end{bmatrix} \quad (8)$$

>  $nopars := Dimension(pars1); r := Rank(D1); d := Dimension(pars1) - r;$

$nopars := 3$

$r := 1$

$d := 2$

(9)

>  $Estpar(D1, pars1, 0);$

$$\{f(\phi_1, \phi_a, \rho) = \_FI(\phi_1 \rho + 2 \phi_a)\}$$

(10)

> # We find the exact same result with the z-transfrom and the expansion exhaustive summary...

>

> # kappa2 is an exhaustive summary for the adult capture-recapture data, and kappa3 is for the juvenile capture-recapture

>  $P := caprecapexsum(1, 1, 2, 2) :$

>  $kappa2 := eval(Matvec(P), \{phi = phi[a], lambda = p\});$

$$\kappa2 := \begin{bmatrix} \phi_a p \\ \phi_a p \\ \phi_a p \\ \phi_a (1 - p) \end{bmatrix}$$

(11)

> # Simplified exhaustive summary by removing repeated terms

>  $kappa2s := \langle kappa2[3], kappa2[4] \rangle;$

$$kappa2s := \begin{bmatrix} \phi_a p \\ \phi_a (1 - p) \end{bmatrix}$$

(12)

>  $pars2 := \langle phi[a], p \rangle :$

>  $D2 := Dmat(kappa2s, pars2);$

$$D2 := \begin{bmatrix} p & 1-p \\ \phi_a & -\phi_a \end{bmatrix} \quad (13)$$

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> nopars := Dimension(pars2); r := Rank(D2); d := Dimension(pars2) - r;
    nopars := 2
    r := 2
    d := 0
```

(14)

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> P := capreapexsum(3, 1, 2, 2);
```

$$P := \begin{bmatrix} \phi_1 p & \phi_1 p \\ 0 & \phi_2 p \\ 0 & \phi_1 (1-p) \end{bmatrix} \quad (15)$$

```
> kappa3 := eval(Matvec(P), {seq(phi[j] = phi[a], j = 2..10), lambda = p});
```

$$\kappa 3 := \begin{bmatrix} \phi_1 p \\ \phi_1 p \\ \phi_a p \\ \phi_1 (1-p) \end{bmatrix} \quad (16)$$

```
> # Simplified by removing repeated terms:
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```
> kappa3s := <kappa3[1], kappa3[3], kappa3[4]>;
```

$$kappa3s := \begin{bmatrix} \phi_1 p \\ \phi_a p \\ \phi_1 (1-p) \end{bmatrix} \quad (17)$$

```
> pars3 := <phi[1], phi[a], p> :
```

```
> D3 := Dmat(kappa3s, pars3);
```

$$D3 := \begin{bmatrix} p & 0 & 1-p \\ 0 & p & 0 \\ \phi_1 & \phi_a & -\phi_1 \end{bmatrix} \quad (18)$$

```
> nopars := Dimension(pars3); r := Rank(D3); d := Dimension(pars3) - r;
    nopars := 3
    r := 3
    d := 0
```

(19)

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> # Exhaustive summary for productivity data
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$$\begin{aligned} &> \text{kappa4} := \langle \text{rho} \cdot R[t] \rangle; \\ &\quad \kappa_4 := \begin{bmatrix} \rho & R_t \end{bmatrix} \end{aligned} \quad (20)$$

$$\begin{aligned} &> \text{pars4} := \langle \text{rho} \rangle : \\ &> D4 := \text{Dmat}(\text{kappa4}, \text{pars4}); \\ &\quad D4 := \begin{bmatrix} R_t \end{bmatrix} \end{aligned} \quad (21)$$

$$\begin{aligned} &> \text{nopars} := \text{Dimension}(\text{pars4}); r := \text{Rank}(D4); d := \text{Dimension}(\text{pars4}) - r; \\ &\quad \text{nopars} := 1 \\ &\quad r := 1 \\ &\quad d := 0 \end{aligned} \quad (22)$$

#Exhaustive summary for different combinations of data sets:

$$\begin{aligned} &> \text{kappa} := \text{convert}(\langle \text{kappa1}, \text{kappa2s} \rangle, \text{Vector}); \\ &\quad \kappa := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \\ \phi_a p \\ \phi_a (1 - p) \end{bmatrix} \end{aligned} \quad (23)$$

$$\begin{aligned} &> \text{pars} := \langle \text{phi}[1], \text{phi}[a], \text{rho}, p \rangle : \\ &> D1 := \text{Dmat}(\text{kappa}, \text{pars}) \\ &\quad D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & 0 & 0 \\ -2 x_{0,1} - 2 x_{0,2} & 2 & p & 1 - p \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & 0 & 0 \\ 0 & 0 & \phi_a & -\phi_a \end{bmatrix} \end{aligned} \quad (24)$$

$$\begin{aligned} &> r := \text{Rank}(D1); d := \text{Dimension}(\text{pars}) - r; \\ &\quad r := 3 \\ &\quad d := 1 \end{aligned} \quad (25)$$

$$\begin{aligned} &> \text{Estpar}(D1, \text{pars}, 0); \\ &\quad \{f(\phi_1, \phi_a, \rho, p) = \text{FI}(\phi_a, \phi_1 \rho, p)\} \end{aligned} \quad (26)$$

$$\begin{aligned} &> \text{kappa} := \text{convert}(\langle \text{kappa1}, \text{kappa3s} \rangle, \text{Vector}); \\ &\quad \end{aligned} \quad (27)$$

$$\kappa := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \\ \phi_1 p \\ \phi_a p \\ \phi_1 (1 - p) \end{bmatrix} \quad (27)$$

>  $pars := \langle \text{phi}[1], \text{phi}[a], \text{rho}, p \rangle :$

>  $D1 := \text{Dmat}(\kappa, pars)$

$$D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & p & 0 & 1 - p \\ -2x_{0,1} - 2x_{0,2} & 2 & 0 & p & 0 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & 0 & 0 & 0 \\ 0 & 0 & \phi_1 & \phi_a & -\phi_1 \end{bmatrix} \quad (28)$$

>  $r := \text{Rank}(D1); d := \text{Dimension}(pars) - r;$

$$r := 4$$

$$d := 0$$

(29)

>

>  $\kappa := \text{convert}(\langle \kappa_1, \kappa_4 \rangle, \text{Vector});$

$$\kappa := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \\ \rho R_t \end{bmatrix} \quad (30)$$

>  $pars := \langle \text{phi}[1], \text{phi}[a], \text{rho} \rangle :$

>  $D1 := \text{Dmat}(\kappa, pars)$

$$D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & 0 \\ -2x_{0,1} - 2x_{0,2} & 2 & 0 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & R_t \end{bmatrix} \quad (31)$$

>  $r := \text{Rank}(D1); d := \text{Dimension}(pars) - r;$

$$r := 2$$

$$d := 1$$

(32)

>  $\text{Estpar}(D1, pars, 0);$

$$\left\{ f(\phi_1, \phi_a, \rho) = \text{FI} \left( \rho, \phi_a + \frac{\phi_1 \rho}{2} \right) \right\} \quad (33)$$

>  $\kappa := \text{convert}(\langle \kappa_1, \kappa_2s, \kappa_3s \rangle, \text{Vector});$





$$D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & p & 0 & 1-p & 0 \\ -2x_{0,1} - 2x_{0,2} & 2 & 0 & p & 0 & 0 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & 0 & 0 & 0 & R_t \\ 0 & 0 & \phi_1 & \phi_a & -\phi_1 & 0 \end{bmatrix} \quad (38)$$

$$\begin{aligned} &> r := \text{Rank}(D1); d := \text{Dimension}(pars) - r; \\ &\quad r := 4 \\ &\quad d := 0 \end{aligned} \quad (39)$$

$$\begin{aligned} &> \text{kappa} := \text{convert}(\langle \text{kappa1}, \text{kappa2s}, \text{kappa4} \rangle, \text{Vector}); \\ &\quad \kappa := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \\ \phi_a p \\ \phi_a (1-p) \\ \rho R_t \end{bmatrix} \end{aligned} \quad (40)$$

$$\begin{aligned} &> pars := \langle \text{phi}[1], \text{phi}[a], \text{rho}, p \rangle : \\ &> D1 := \text{Dmat}(\text{kappa}, pars) \\ &\quad D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & 0 & 0 & 0 \\ -2x_{0,1} - 2x_{0,2} & 2 & p & 1-p & 0 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & 0 & 0 & R_t \\ 0 & 0 & \phi_a & -\phi_a & 0 \end{bmatrix} \end{aligned} \quad (41)$$

$$\begin{aligned} &> r := \text{Rank}(D1); d := \text{Dimension}(pars) - r; \\ &\quad r := 4 \\ &\quad d := 0 \end{aligned} \quad (42)$$

$$\begin{aligned} &> \\ &> \# \text{ All 4 data sets:} \\ &> \text{kappa} := \text{convert}(\langle \text{kappa1}, \text{kappa2s}, \text{kappa3s}, \text{kappa4} \rangle, \text{Vector}); \end{aligned}$$

$$\kappa := \begin{bmatrix} -(x_{0,1} + x_{0,2}) (\phi_1 \rho + 2 \phi_a) \\ \phi_1 \rho + 2 \phi_a \\ \phi_a p \\ \phi_a (1 - p) \\ \phi_1 p \\ \phi_a p \\ \phi_1 (1 - p) \\ \rho R_t \end{bmatrix} \quad (43)$$

$\triangleright \text{pars} := \langle \text{phi}[1], \text{phi}[a], \text{rho}, p \rangle :$

$\triangleright D1 := Dmat(\kappa, \text{pars})$

$$D1 := \begin{bmatrix} -(x_{0,1} + x_{0,2}) \rho & \rho & 0 & 0 & p & 0 & 1 - p & 0 \\ -2 x_{0,1} - 2 x_{0,2} & 2 & p & 1 - p & 0 & p & 0 & 0 \\ -(x_{0,1} + x_{0,2}) \phi_1 & \phi_1 & 0 & 0 & 0 & 0 & 0 & R_t \\ 0 & 0 & \phi_a & -\phi_a & \phi_1 & \phi_a & -\phi_1 & 0 \end{bmatrix} \quad (44)$$

$\triangleright r := Rank(D1); d := Dimension(\text{pars}) - r;$

$r := 4$

$d := 0$

(45)

$\triangleright$

$\triangleright$