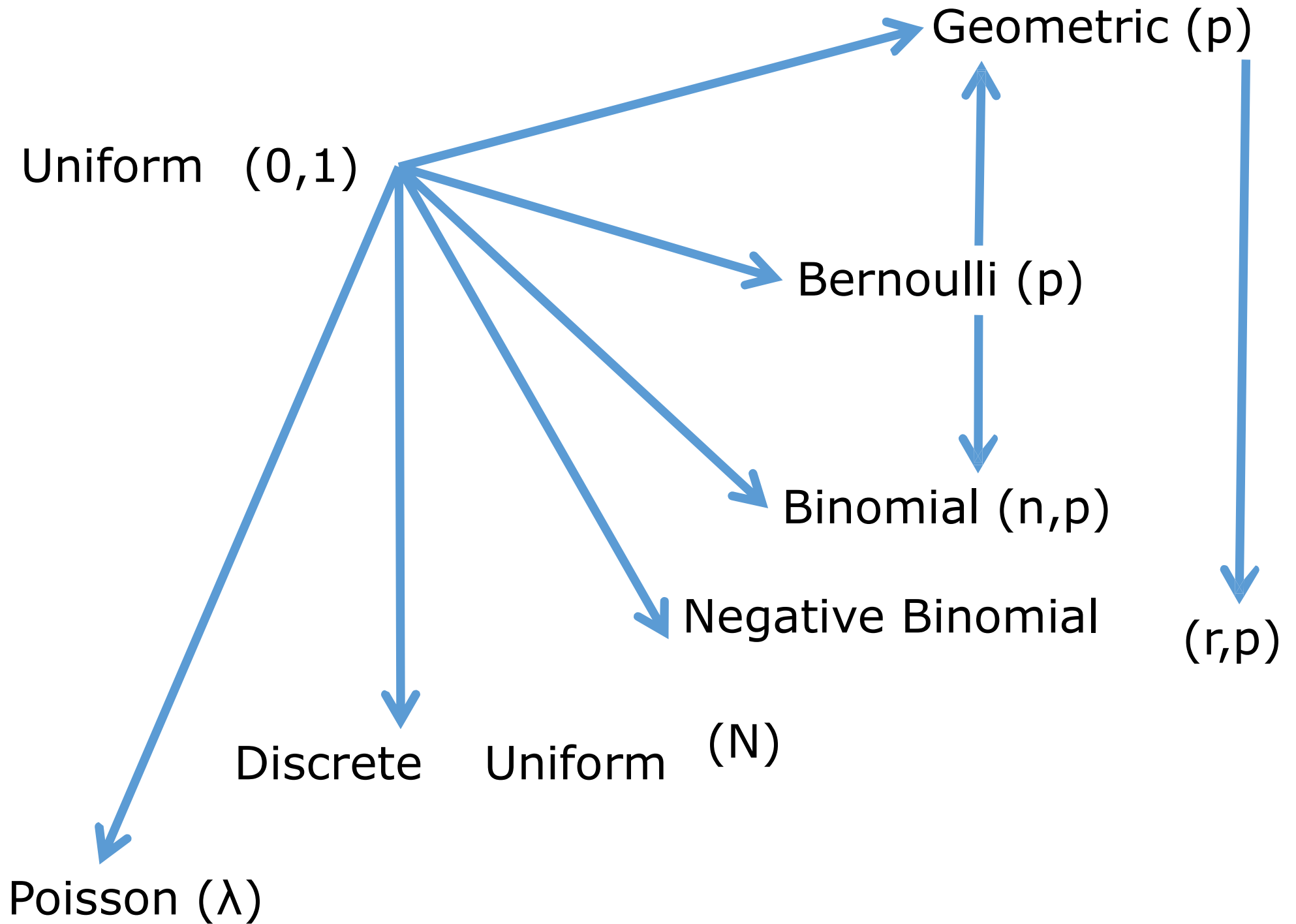


Discrete & Continuous Random Number

STK473 – Praktikum 3

Discrete Random Number



Bernoulli (p)

→ $X \sim \text{Uniform}(0,1)$

Uniform (0,1)

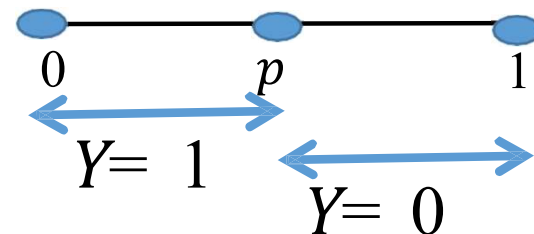
$F_X(x)$



Bernoulli (p)

$$0 \leq F_X(x) \leq 1$$

$$0 \leq X \leq 1$$



→ $Y \sim \text{Bernoulli}(p)$

Bernoulli(p)

pmf $P(X = x|p) = p^x(1 - p)^{1-x}; \quad x = 0, 1; \quad 0 \leq p \leq 1$

mean and variance $EX = p, \quad \text{Var } X = p(1 - p)$

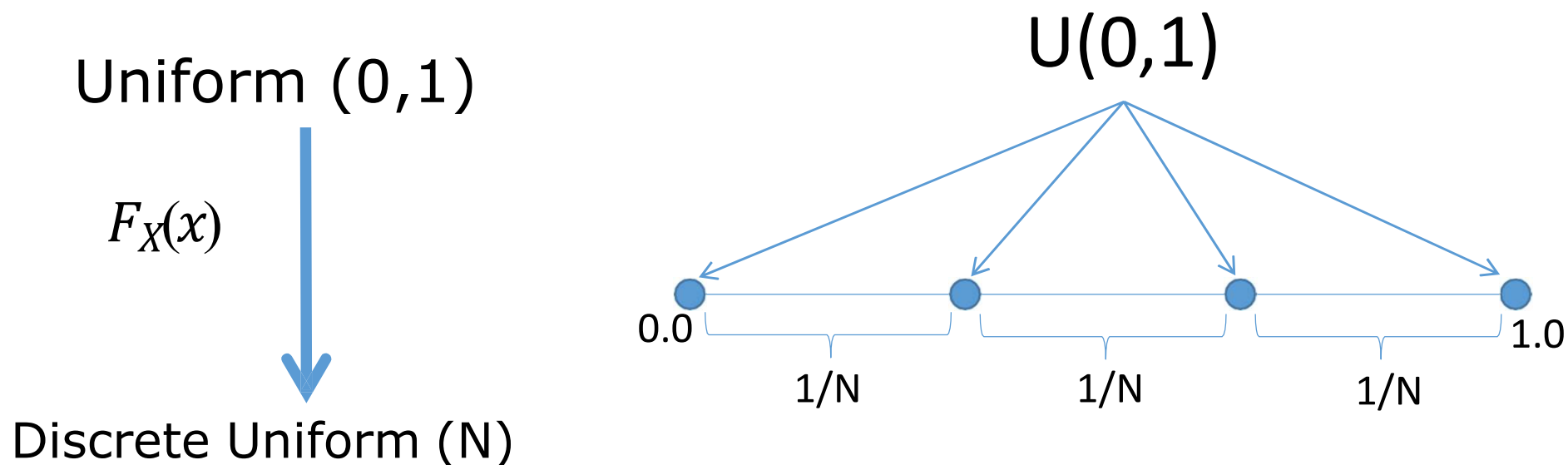
mgf $M_X(t) = (1 - p) + pe^t$

Application in R

```
i<-1000
p<-.65
X<-runif(i)
Y<-NULL
for (z in 1:i) ifelse (X[z]<=p,Y[z]<-1,Y[z]<-0)
(tabel<-table(Y)/length(Y))
barplot(tabel,main="Bernoulli")
```

```
i<-1000
p<-.65
X<-runif(i)
Y<-(X<=p)+0
(tabel<-table(Y)/length(Y))
barplot(tabel,main="Bernoulli")
```

Discrete Uniform (N)



Discrete uniform

pmf $P(X = x|N) = \frac{1}{N}; \quad x = 1, 2, \dots, N; \quad N = 1, 2, \dots$

mean and variance $EX = \frac{N+1}{2}, \quad \text{Var } X = \frac{(N+1)(N-1)}{12}$

mgf $M_X(t) = \frac{1}{N} \sum_{i=1}^N e^{it}$

Application in R

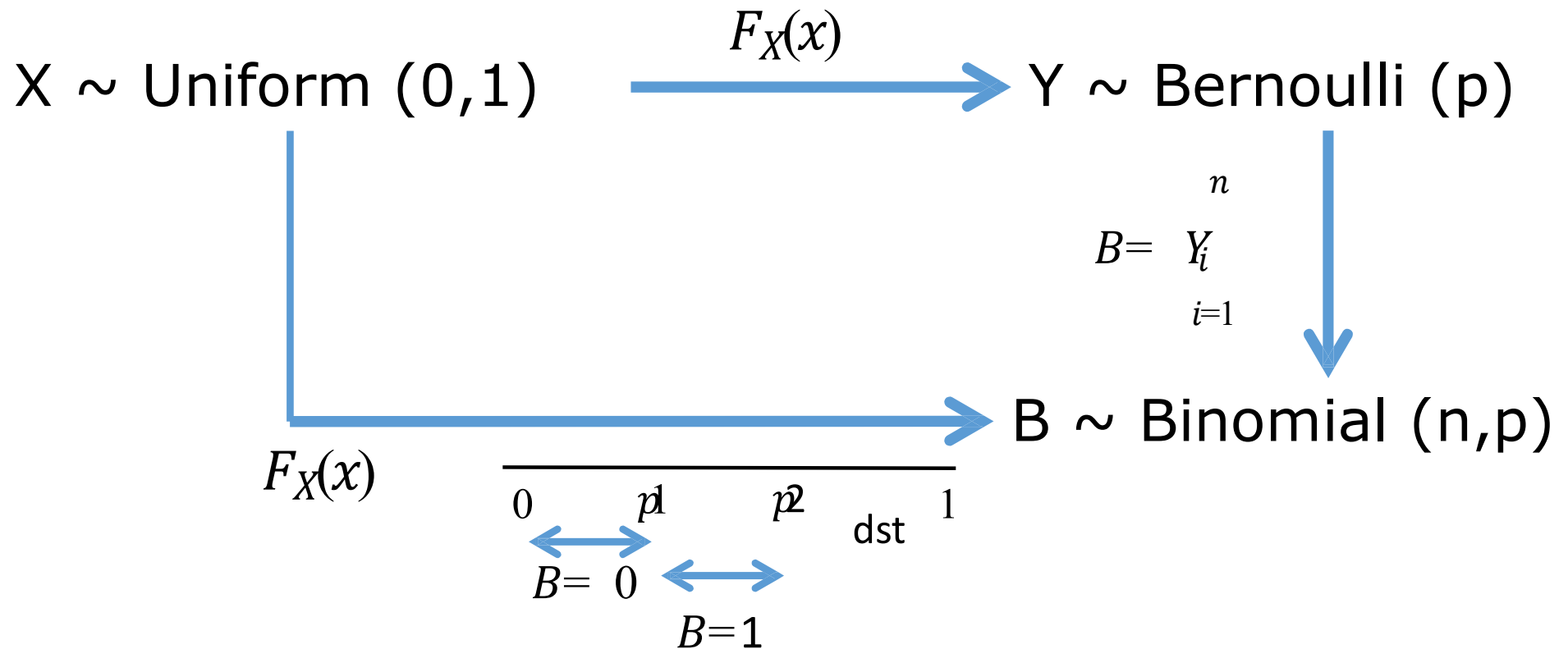
```
i<-1000
N<-4
X<-runif(i)
DU<-NULL
for (z in 1:i){
  if (X[z]<=1/N) DU[z]<-1
  else if (X[z]<=2/N) DU[z]<-2
  else if (X[z]<=3/N) DU[z]<-3
  else DU[z]<-4
}
(tabel<-table(DU)/length(DU))
barplot(tabel,main="Seragam Diskret")
```

Application in R

```
i<-1000
N<-4
X<-runif(i)
DU<-as.numeric(cut(X,breaks=c(0,1/N,2/N,3/N,1),
  include.lowest = T))
(tabel<-table(DU)/length(DU))
barplot(tabel,main="Seragam Diskret")
```

```
i<-1000
N<-4
X<-runif(i)
DU<-1+floor(N*X)
(tabel<-table(DU)/length(DU))
barplot(tabel,main="Seragam Diskret")
```


Binomial (n,p)



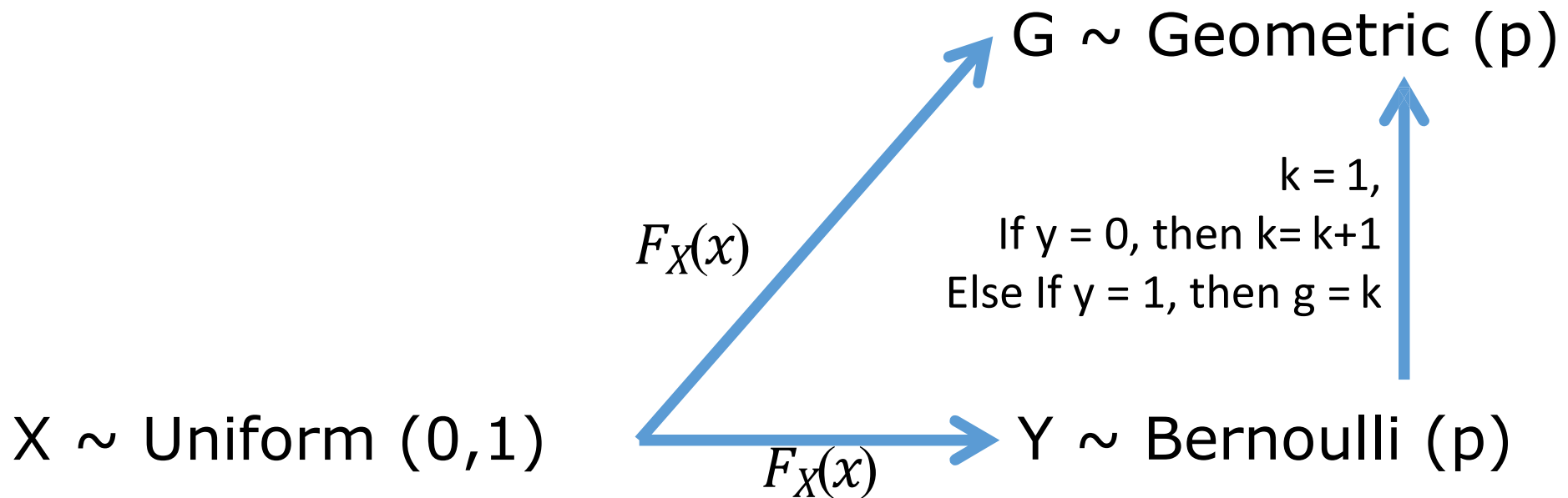
Application in R

```
#Binomial (5,0.65)
i<-1000
n<-5
p<-0.65
Binom<-NULL
for (z in 1:i){
  m<-0
  for (k in 1:n){
    y<-(runif(1)<=p)+0
    m<-m+y
  }
  Binom[z]<-m
}
(tabel<-table(Binom)/length(Binom))
barplot(tabel,main="Binomial")
```

Application in R

```
#Binomial (3,0.5)
i<-1000
X<-runif(i)
Binom<-as.numeric(cut(X,breaks=c(0,1/8,4/8,7/8,1),
  include.lowest = T))-1
(tabel<-table(Binom)/length(Binom))
barplot(tabel,main="Binomial")
```

Geometric (p)



Geometric(p)

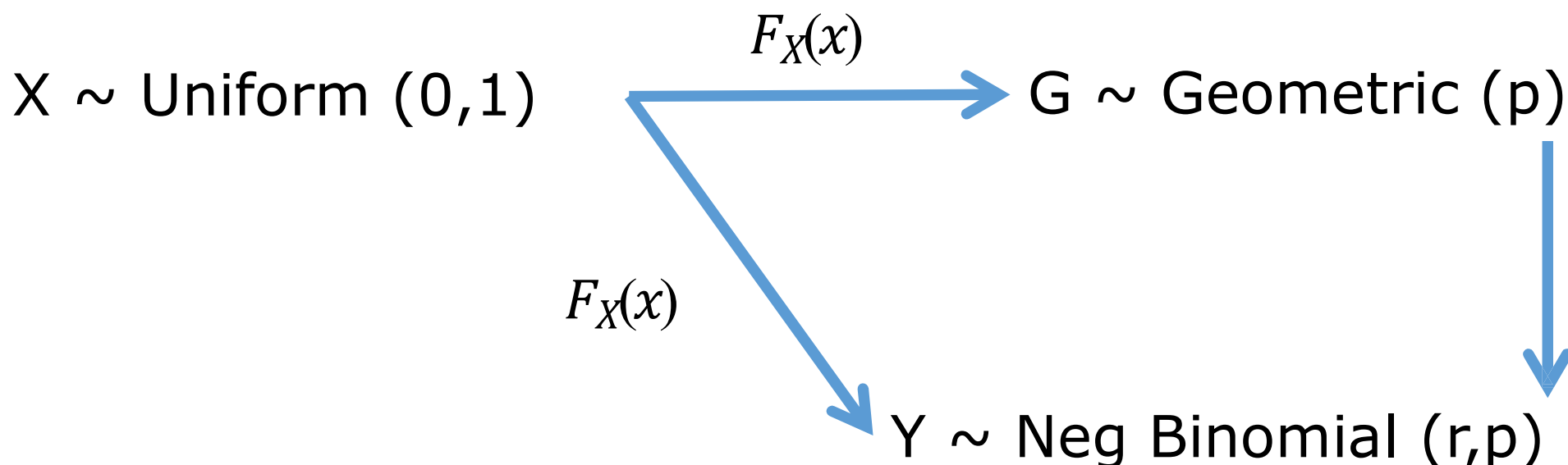
pmf $P(X = x|p) = p(1 - p)^{x-1}; \quad x = 1, 2, \dots; \quad 0 \leq p \leq 1$

mean and variance $EX = \frac{1}{p}, \quad \text{Var } X = \frac{1-p}{p^2}$

mgf $M_X(t) = \frac{pe^t}{1 - (1-p)e^t}, \quad t < -\log(1-p)$

notes $Y = X - 1$ is negative binomial(1, p). The distribution is *memoryless*:
 $P(X > s | X > t) = P(X > s - t).$

Negative Binomial (r,p)



Negative binomial(r, p)

pmf $P(X = x|r, p) = \binom{r+x-1}{x} p^r (1-p)^x; \quad x = 0, 1, \dots; \quad 0 \leq p \leq 1$

mean and variance $EX = \frac{r(1-p)}{p}, \quad \text{Var } X = \frac{r(1-p)}{p^2}$

mgf $M_X(t) = \left(\frac{p}{1-(1-p)e^t} \right)^r, \quad t < -\log(1-p)$

notes An alternate form of the pmf is given by $P(Y = y|r, p) = \binom{y-1}{r-1} p^r (1-p)^{y-r}$, $y = r, r+1, \dots$. The random variable $Y = X + r$. The negative binomial can be derived as a gamma mixture of Poissons. (See Exercise 4.34.)

Tugas 1

Buatlah program R untuk membangkitkan 1000 bilangan acak yang menyebar:

- **Geometrik**
- **Binomial Negatif**

Dikumpulkan paling lambat hari
di GCR.

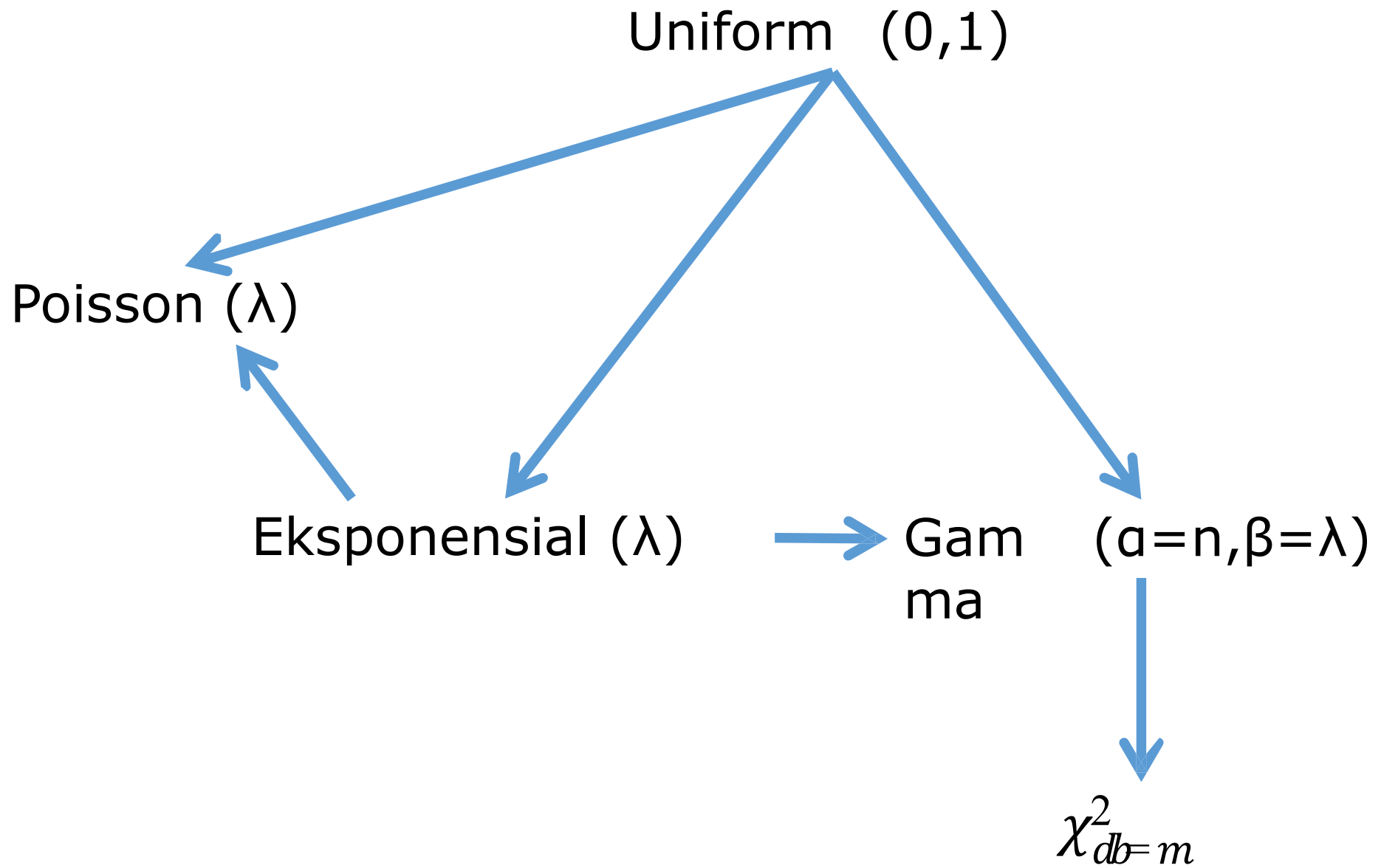
Format:

- Nama file: “Tugas 1 Kelompok [no kelompok]”
- Ekstensi file: “.r” atau “.txt”

Continuous Random Numbers

Inverse Transform Method

- Metode Transformasi Kebalikan
- Dikenal juga sebagai Look-Up Table Method
- Didasari pada kenyataan bahwa
 - jika U adalah bilangan acak Seragam(0, 1)
 - dan didefinisikan $X = F^{-1}(U)$, dengan $F^{-1}(U)$ adalah fungsi kebalikan dari $F(X)$
 - maka X akan memiliki sebaran yang diinginkan
- Algoritma untuk mendapatkan bilangan acak X dengan sebaran tertentu
 - Tentukan bentuk dari fungsi sebaran kumulatif X yang diinginkan, misal $F(x)$
 - Cari fungsi kebalikan dari $F(x)$, yaitu $F^{-1}(x)$
 - Bangkitkan bilangan acak Seragam (0, 1), misal dilambangkan U
 - Hitung $X = F^{-1}(U)$



Inverse Transform Method

Seragam (a, b)

- Ilustrasi untuk membangkitkan sebaran Seragam(a, b)
- $X \sim \text{Seragam}(a, b)$
 - $F(x) = (x - a) / (b - a)$
 - $U = (x - a) / (b - a)$
 - $X = a + (b - a) U$
- Algoritma:
 - Bangkitkan U, bilangan acak Seragam(0, 1)
 - Hitung $X = a + (b - a) * U$
 - Ulangi berkali-kali sesuai dengan banyaknya bilangan yang diinginkan

Inverse Transform Method

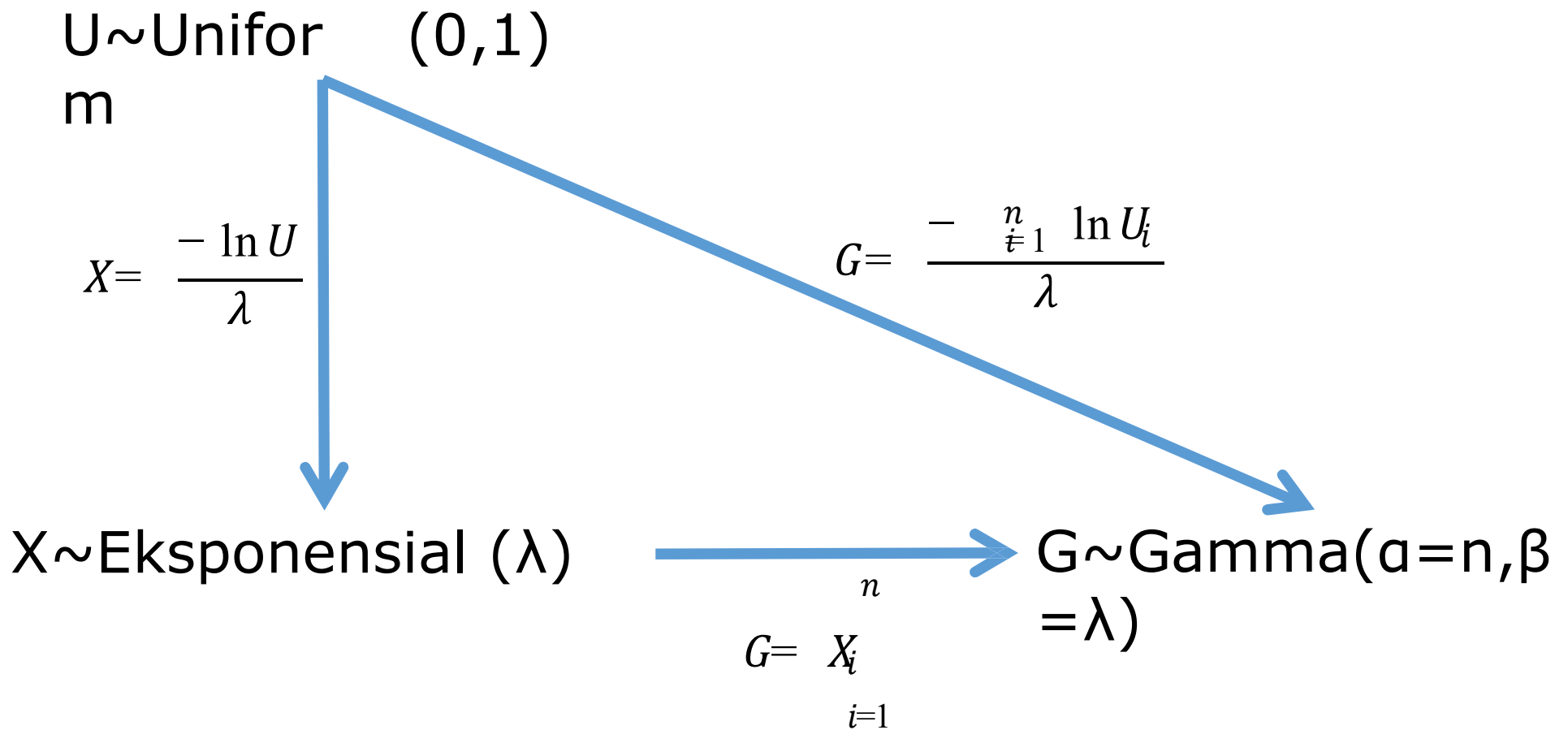
Eksponensial (λ)

- Ilustrasi untuk membangkitkan sebaran Eksponensial(λ)
- $X \sim \text{Eksponensial}(\lambda)$
 - $f(x) = \lambda e^{-\lambda x}$, untuk $x \geq 0$
 - $F(x) = 1 - e^{-\lambda x}$, untuk $x \geq 0$
 - $U = 1 - e^{-\lambda x}$, untuk $x \geq 0$
 - $X = -\ln(1 - U) / \lambda$
- Algoritma:
 - Bangkitkan U, bilangan acak Seragam(0, 1)
 - Hitung $X = -\ln(1 - U) / \lambda$
 - Ulangi berkali-kali sesuai dengan banyaknya bilangan yang diinginkan

Application in R

```
#Eksponensial ( $\lambda=3$ )  
i<-1000  
lambda<-3  
U<-runif(i)  
X $\leftarrow$  -log(U) / lambda  
hist(X)
```

Gamma (α, β)




Application in R

```
#Gamma ( $\alpha=5$ ,  $\beta=3$ )  
i<-1000  
lambda<-3  
alpha<-5  
U<-log(runif(i*alpha))  
Um<-matrix(U,i)  
Y<-apply(Um,1,sum)  
Gama<--Y/lambda  
hist(Gama)
```

Chi-Square (m)

$G \sim \text{Gamma}(a=n, \beta=\lambda)$



$$\chi^2_{db=m=2n}$$

$$\text{Gamma}(v/2, 2) \rightarrow \chi^2_{db=v}$$



n

Sehingga ketika v ganjil maka $n = v/2$ akan menghasilkan bilangan pecahan
 \rightarrow tidak sesuai

Ingat:

- Jika $Z \sim N(0, 1)$, maka $Z^2 \sim \chi^2_{db=1}$
- Jika $X_1 \sim \chi^2_{db=m}$ dan $X_2 \sim \chi^2_{db=n}$, maka $X_3 = X_1 + X_2 \sim \chi^2_{db=(m+n)}$

Sehingga

A diagram showing the distribution of $\chi^2_{db=v}$ branching into two cases based on the parity of v . Two blue arrows originate from the $\chi^2_{db=v}$ term and point towards the two cases.

$\chi^2_{db=v}$

v genap

$\text{Gamma}(v/2, 2)$

v ganjil

$\text{Gamma}\left(\frac{(v-1)}{2}, 2\right) + Z^2$

$Z^2 \sim N(0, 1)$

Application in R

```
#chi-square(10)
i<-1000
lambda<-2
alpha<-5
U<-log(runif(i*alpha))
Um<-matrix(U,i)
Y<-apply(Um,1,sum)
chi<--Y/lambda
hist(chi)
```

```
#chi-square(11)
i<-1000
lambda<-2
alpha<-5
U<-log(runif(i*alpha))
Um<-matrix(U,i)
Y<-apply(Um,1,sum)
chi<--Y/lambda
chi<-chi+(rnorm(i))^2
hist(chi)
```

Inverse Transform Method

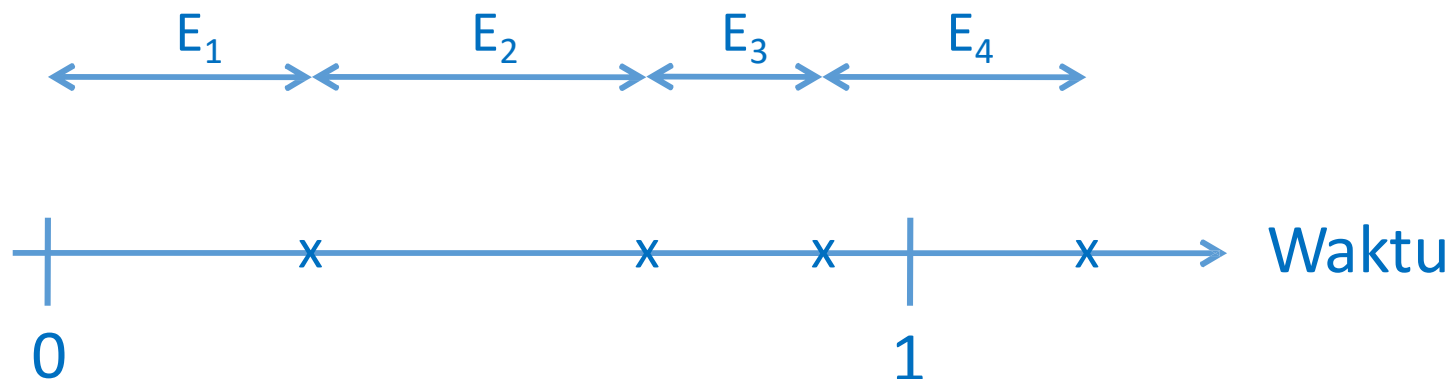
- Kesulitan utama: memperoleh kebalikan dari fungsi sebaran kumulatif
- Keunggulan: bisa digunakan untuk berbagai sebaran (termasuk sebaran diskret)

Memfaatkan pengetahuan mengenai transformasi dan sifat sebaran peubah acak

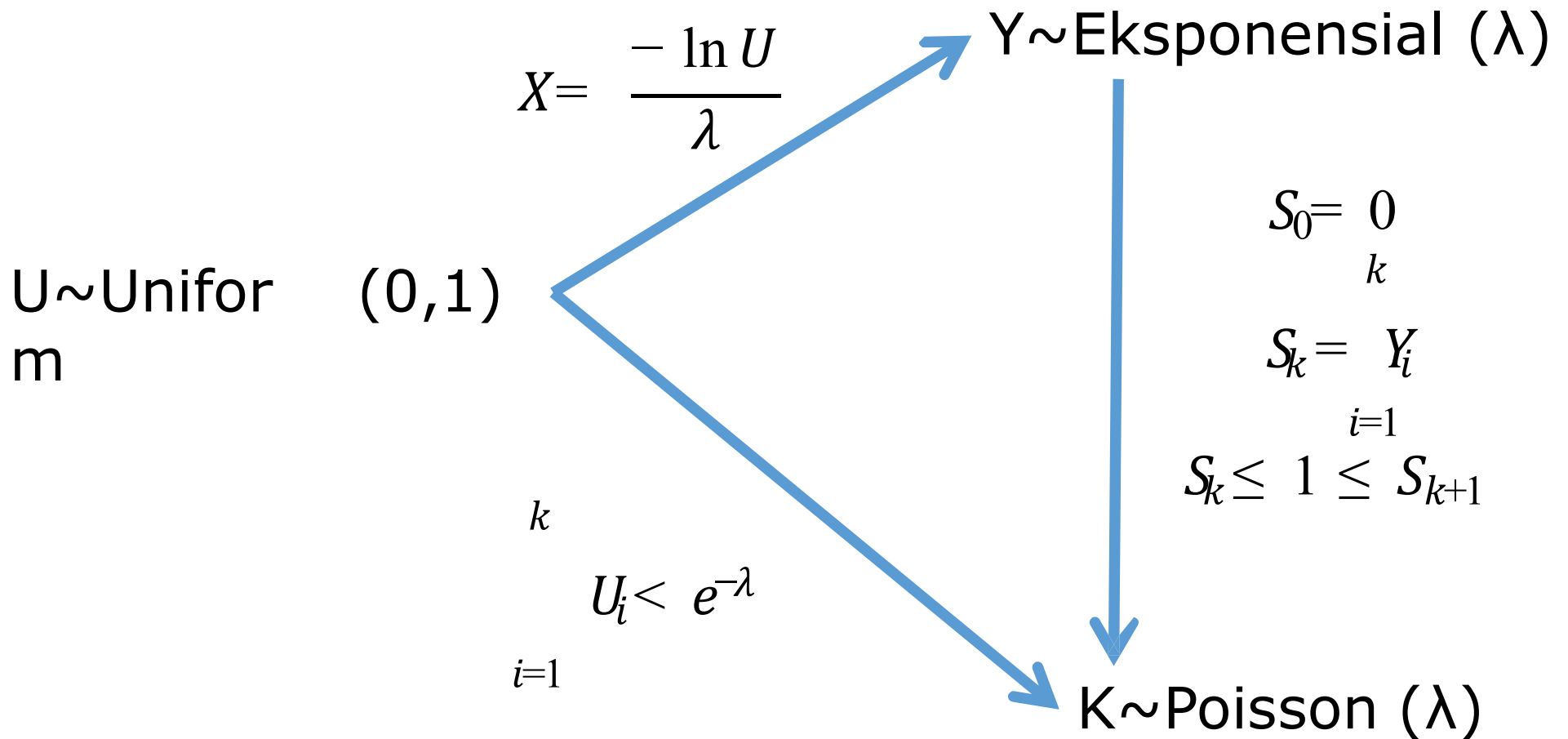
- $Y_i \sim \text{Eksponensial}(\lambda) \rightarrow G = \sum_{i=1}^n Y_i \sim \text{Gamma}(n, \lambda)$
- $\text{Gamma}(m/2, 2) = \text{Chi-square}(m)$
- $\text{Chi-square}(db = 1) = \text{Kuadrat dari Normal}(0, 1)$
- Jika $X_1 \sim \text{Chi-square}(m)$, $X_2 \sim \text{Chi-square}(n)$, maka $X_3 = X_1 + X_2 \sim \text{Chi-square}(m+n)$
- dsb

Poisson(λ)

- Proses Poisson dengan laju sebesar λ
 - Waktu antar kejadian \rightarrow saling bebas \rightarrow Eksponensial (λ)
 - Banyaknya kejadian pada setiap selang waktu t menyebar Poisson(λt)



Poisson (λ)



Application in R

```
#Poisson(1) melalui ekponensial
i<-1000
lambda<-1
K<-NULL
for (z in 1:i){
  sk<-0
  k<-0
  while (sk<=1){
    u<-runif(1)
    y<- -log(u)/lambda
    sk<-y+sk
    k<-k+1
  }
  K[z]<-k-1
}
(tabel<-table(K)/length(K))
barplot(tabel)
```

Application in R

```
#Poisson(1) melalui seragam
i<-1000
lambda<-1
K<-NULL
for (z in 1:i){
  k<-0
  sk<-1
  while(sk>=exp(-lambda)) {
    u<-runif(1)
    sk<-sk*u
    k<-k+1
  }
  K[z]<-k
}
(tabel<-table(K)/length(K))
barplot(tabel)
```

thank you!