



# Performance Modeling of Computer Systems and Networks

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## Generating Continuous Random Variates

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### Prerequisite

We assume the knowledge of continuous random variables (sect.7.1).

In particular:

- $Uniform(a,b)$
- $Exponential(\mu)$
- $Normal(\mu,\sigma)$
- $Lognormal(n,b)$
- $Erlang(n,b)$
- $Student(n)$

Nel caso continuo è tutto più facile, perchè c'è corrispondenza 1-1

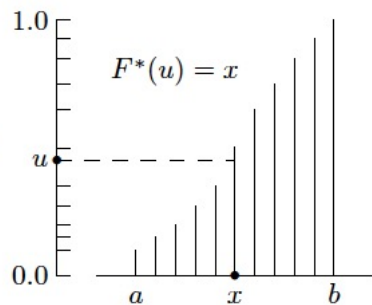
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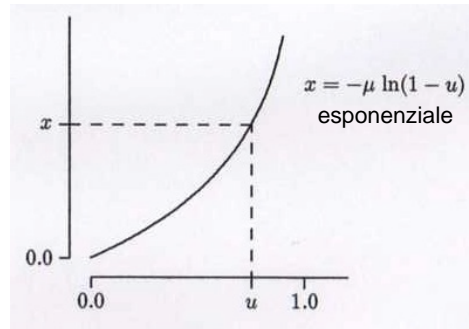
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## Discrete Random Variates

$$F^*(u) = \min_x \{x : u < F(x)\}$$



## Continuous Random Variates



per un dato 'u' ho esattamente  
un unico e solo 'x'.  
L'inversa è vera.

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In alcuni casi inversione facile, in altri casi esistono sempre dei metodi!

## Preliminary Definitions

The *inverse distribution function* (idf) of  $X$  is the function

$$F^{-1} : (0, 1) \rightarrow \mathcal{X}, \forall u \in (0, 1) \text{ as}$$

supporto,  
da cui  
estraggo 'u'

$$F^{-1}(u) = x$$

stesse definizioni,  
qui essendo inversa vera  
posso scrivere  $F^{-1}$ .

where  $x \in \mathcal{X}$  is the unique possible value for  $F(x) = u$

There is a one-to-one correspondence between possible  
values  $x \in \mathcal{X}$  and cdf values  $u = F(x) \in (0, 1)$

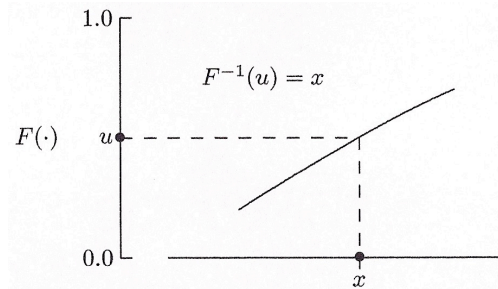
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## Continuous Random Variable idfs

- Unlike the a discrete random variable, the idf for a continuous random variable is a true inverse



- Can sometimes determine the idf in “closed form” by solving  $F(x) = u$  for  $x$

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## Examples

- if  $X$  is *Uniform*( $a, b$ ),  $F(x) = (x-a)/(b-a)$  for  $a < x < b$

$$x = F^{-1}(u) = a + (b-a)u \quad 0 < u < 1$$

- if  $X$  is *Exponential*( $\mu$ ),  $F(x) = 1 - \exp(-x/\mu)$  for  $x > 0$

$$x = F^{-1}(u) = -\mu \ln(1-u) \quad 0 < u < 1$$

- if  $X$  is a continuous variable with possible value  $0 < x < b$  and pdf  $f(x) = 2x/b^2$ , cdf  $F(x) = (x/b)^2$

$$x = F^{-1}(u) = b\sqrt{u} \quad 0 < u < 1$$

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## Random Variate Generation By Inversion

- $X$  is a continuous random variable with idf  $F^{-1}(\cdot)$
- Continuous random variable  $U$  is *Uniform*(0,1)
- $Z$  is the continuous random variable defined by  $Z = F^{-1}(U)$

### Theorem

$Z$  and  $X$  are identically distributed

### Algorithm 1

```
u = Random();
return F-1(u);
```

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## Inversion examples

- *Uniform*(a,b) Random Variate

```
u = Random();
return a + (b - a) * u;
```

- *Exponential*( $\mu$ ) Random Variate

```
u = Random();
return -  $\mu$  log(1-u);
```

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## Inversion algorithms

- Algorithms in the previous two examples are:
  - portable, exact, robust, efficient, clear, **synchronized and monotone**  
una chiamata alla random == una generazione di variata
- It is not always possible to solve for a continuous random variable idf explicitly by algebraic techniques
- Two other options may be available:
  - Use a function that accurately *approximates*  $F^{-1}(\cdot)$
  - Determine the idf by solving  $u = F(x)$  *numerically*  
(see section 7.2.2)

Se inversa difficile, o approssimo funzione inversa, oppure risolvendola numericamente.

## Testing for correctness

per vedere se generazione è ok!

- generate a sample of  $n$  random variates where  $n$  is large
- evaluate sample mean and standard deviation
- compare them with the theoretical values,  
they should be *reasonably* close !!

This is not enough!! Different distributions can have  
the same mean and standard deviation !!!

dovrei anche costruire istogramma e confrontarlo con la  
distribuzione che sto approssimando (non lo vediamo).

- generate a sample of  $n$  random variates and construct a  $k$ -  
bin continuous-data histogram with bin width  $\delta$
- $f^*$  is the histogram density and  $f(x)$  is the pdf

$$f^* \rightarrow f(x) \text{ as } n \rightarrow \infty \text{ and } \delta \rightarrow 0$$

- In practice, using a large but finite value of  $n$  and a small  
but non-zero value of  $\delta$ , perfect agreement between  $f^*$  and  $f$   
will not be achieved

Discrete case: natural sampling variability !  
Continuous case: variability+binning !!

## Truncation ovviamente esiste anche nel continuo!

- Let  $X$  be a continuous random variable with possible values  $\mathcal{X}$  and cdf  $F(x) = \Pr(X \leq x)$
- Suppose we wish to restrict the possible values of  $X$  to  $(a, b) \subset \mathcal{X}$

*It is similar to, but simpler than truncation in the discrete-variable context*

- $X$  is  $\leq a$  with probability  $\Pr(X \leq a) = F(a)$
- $X$  is  $\geq b$  with probability  $\Pr(X \geq b) = 1 - \Pr(X < b) = 1 - F(b)$
- $X$  is between  $a$  and  $b$  with probability

$$\Pr(a < X < b) = \Pr(X < b) - \Pr(X \leq a) = F(b) - F(a)$$

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## 2 cases for truncation

Case 1 se conosco i "due punti"

if  $a$  and  $b$  are specified, the cdf of  $X$  can be used to determine the left-tail  $\alpha$ , right-tail  $\beta$  truncation probabilities

$$\alpha = \Pr(X \leq a) = F(a) \quad \text{and} \quad \beta = \Pr(X > b) = 1 - F(b)$$

Case 2 parto dalle "masse di probabilità da escludere" e trovando i due punti associati.

if  $\alpha$  and  $\beta$  are specified, the idf of  $X$  can be used to determine left and right truncation points

$$a = F^{-1}(\alpha) \quad \text{and} \quad b = F^{-1}(1 - \beta)$$

$$F(b) = 1 - \beta$$

**Both transformations are exact !**

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## Library `rvgs`

- Contains 7 continuous random variate generators
  - `double Chisquare(long n)`
  - `double Erlang(long n, double b)`
  - `double Exponential(double  $\mu$ )`
  - `double Lognormal(double a, double b)`
  - `double Normal(double  $\mu$ , double  $\sigma$ )`
  - `double Student(long n)`
  - `double Uniform(double a, double b)`