

Probabilités avec CAML

INFO1 - Semaine 22

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2 Loi binomiale

- Simulation
- Calcul des valeurs théoriques

3 Loi géométrique ?...

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```
val int : int -> int
```

Random.int bound returns a random integer between 0 (inclusive) **and** bound (exclusive). bound must be greater than 0 **and** less than 2^{30} .

```
val float : float -> float
```

Random.float bound returns a random floating-point number between 0 **and** bound (inclusive). If bound is negative, the result is negative or zero. If bound is 0, the result is 0.

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Random.int bound returns a random integer between 0 (inclusive) **and** bound (exclusive). bound must be greater than 0 **and** less than 2^{30} .

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val float : float -> float
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Random.float bound returns a random floating-point number between 0 **and** bound (inclusive). If bound is negative, the result is negative **or** zero. If bound is 0, the result is 0.

```
(* vecteur aléatoire de n entiers entre min et max *)  
let vec_alea (mini: int) (maxi: int) (taille: int): int list =  
  let rec aux_alea (size: int) (acc: int list): int list =  
    if size = 0 then acc  
    else aux_alea (size - 1) ((mini + Random.int (maxi - mini + 1)) :: acc)  
  in aux_alea taille [];
```

```
# vec_alea 1 6 15;;  
- : int list = [5; 3; 2; 4; 1; 2; 6; 6; 3; 5; 4; 1; 6; 1; 6]
```

```
(* vecteur aléatoire de n entiers entre min et max *)  
let vec_alea (mini: int) (maxi: int) (taille: int): int list =  
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  in aux_alea taille [];;
```

```
# vec_alea 1 6 15;;  
- : int list = [5; 3; 2; 4; 1; 2; 6; 6; 3; 5; 4; 1; 6; 1; 6]
```

```
(* sommes des éléments d'une liste d'entiers *)  
let som (liste : int list): int =  
  List.fold_left (+) 0 liste;;
```

```
(* simulations du lancer de trois dés *)  
let toscane ((): unit): int =  
  som (vec_alea 1 6 3);;
```

```
# toscane;;  
- : unit -> int = <fun>
```

```
# toscane ();;  
- : int = 10
```



```
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```

```
# toscane;;  
- : unit -> int = <fun>
```

```
# toscane ();;  
- : int = 10
```

```
(* une liste d'expériences aléatoires *)  
let simul_exp (exp: unit -> 'a) (occ: int): 'a list =  
  let rec aux_exp = fun n acc ->  
    if n = occ then acc  
    else aux_exp (n + 1) ((exp ()) :: acc)  
  in aux_exp 0 [];;
```

```
# simul_exp toscane 15;;  
- : int list = [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6; 15; 11; 6]
```

```
(* une liste d'expériences aléatoires *)  
let simul_exp (exp: unit -> 'a) (occ: int): 'a list =  
  let rec aux_exp = fun n acc ->  
    if n = occ then acc  
    else aux_exp (n + 1) ((exp ()) :: acc)  
  in aux_exp 0 [];;
```

```
# simul_exp toscane 15;;  
- : int list = [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6; 15; 11; 6]
```

```

(* renvoie la liste des couples (élément, nombre d'occurrences dans l'
   ensemble)
   avant réduction *)
let compte (liste: 'a list) : ('a * float) list =
  let occ = float_of_int (List.length liste) in
  let rec count = fun l accu ->
    match l with
    | [] -> accu
    | t :: q ->
      let c = List.partition (fun x -> x = t) l in
      count (snd c) ((t, (float_of_int (List.length (fst c)))) /. occ)::accu)
  in count liste [];;

```

```
# compte [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6; 15; 11; 6];;  
- : (int * float) list =  
[(11, 0.13333333333333331); (9, 0.13333333333333331);  
(15, 0.13333333333333331); (8, 0.13333333333333331);  
(14, 0.066666666666666657); (6, 0.2); (12, 0.2)]
```

```
# Printf.sprintf "%.3f" 0.123456789;;  
- : string = "0.123"
```

```
# compte [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6; 15; 11; 6];;  
- : (int * float) list =  
[(11, 0.13333333333333331); (9, 0.13333333333333331);  
(15, 0.13333333333333331); (8, 0.13333333333333331);  
(14, 0.066666666666666657); (6, 0.2); (12, 0.2)]
```

```
# Printf.sprintf "%.3f" 0.123456789;;  
- : string = "0.123"
```



```
let pretty_dic (ft: ('i -> 's, unit, string) format) (dic: ('a * float)
  list): ('a * string) list =
  List.map (fun cpl -> (fst cpl, Printf.sprintf ft (snd cpl))) dic;;
```

```
# pretty_dic "%.3f" (compte [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6;
  15; 11; 6]);;
- : (int * string) list =
[(11, "0.133"); (9, "0.133"); (15, "0.133"); (8, "0.133"); (14, "0.067");
 (6, "0.200"); (12, "0.200")]
```

```
let pretty_dic (ft: ('i -> 's, unit, string) format) (dic: ('a * float)
  list): ('a * string) list =
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```
# pretty_dic "%.3f" (compte [12; 6; 14; 12; 8; 15; 9; 11; 12; 9; 8; 6;
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- : (int * string) list =
[(11, "0.133"); (9, "0.133"); (15, "0.133"); (8, "0.133"); (14, "0.067");
 (6, "0.200"); (12, "0.200")]
```

```
val (>=) : 'a -> 'a -> bool
```

Structural ordering functions. These functions coincide **with** the usual orderings over integers, characters, strings **and** floating-point numbers, **and** extend them **to** a total ordering over all types. The ordering is compatible **with** (=). As **in** the case **of** (=), **mutable** structures are compared by **contents**. Comparison between functional values raises Invalid_argument. Comparison between cyclic structures may **not** terminate.

```
val compare : 'a -> 'a -> int
```

compare x y returns 0 **if** x is equal **to** y, a negative integer **if** x is less than y, **and** a positive integer **if** x is greater than y. The ordering implemented by **compare** is compatible **with** the comparison predicates =, < **and** > defined above, **with** one difference on the treatment **of** the **float value** nan. Namely, the comparison predicates treat nan **as** different from any other **float value**, including itself; **while compare** treats nan **as** equal **to** itself **and** less than any other **float value**. This treatment **of** nan ensures that **compare** defines a total ordering relation.

```
# type truc = Lego | Playmobil | Schtroumpf | Hobbit;;  
type truc = Lego | Playmobil | Schtroumpf | Hobbit  
# Lego < Playmobil;;  
- : bool = true  
# compare Lego Hobbit;;  
- : int = -1  
# compare Hobbit Lego;;  
- : int = 1  
# compare Lego Lego;;  
- : int = 0
```

```
let simul_dic (exp: unit -> 'a) (occ: int): ('a * float) list =  
  List.sort compare (compte (simul_exp exp occ));;
```

```
# pretty_dic "%.3f" (simul_dic toscane 100_000);;  
- : (int * string) list =  
[(3, "0.005"); (4, "0.015"); (5, "0.028"); (6, "0.045"); (7, "0.071"); (8,  
  "0.097"); (9, "0.114"); (10, "0.125"); (11, "0.126"); (12, "0.115");  
  (13, "0.098"); (14, "0.070"); (15, "0.047"); (16, "0.027"); (17, "  
  0.014"); (18, "0.005")]
```

```
let simul_dic (exp: unit -> 'a) (occ: int): ('a * float) list =  
  List.sort compare (compte (simul_exp exp occ));;
```

```
# pretty_dic "%.3f" (simul_dic toscane 100_000);;  
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  "0.097"); (9, "0.114"); (10, "0.125"); (11, "0.126"); (12, "0.115");  
  (13, "0.098"); (14, "0.070"); (15, "0.047"); (16, "0.027"); (17, "  
  0.014"); (18, "0.005")]
```

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2 **Loi binomiale**

- Simulation
- Calcul des valeurs théoriques

3 Loi géométrique ?...

4 Loi hypergéométrique ?...

5 Loi de Poisson

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```
(* renvoie 1 avec une probabilité p et 0 sinon *)  
let bernoulli (p: float) : unit -> int =  
  fun () -> if (Random.float 1. < p) then 1 else 0;;
```

```
# bernoulli 0.2;;  
- : unit -> int = <fun>  
# bernoulli 0.2 ();;  
- : int = 1  
  
# simul_dic (bernoulli 0.2) 100_000;;  
- : (int * float) list = [(0, 0.80121); (1, 0.19879)]
```

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(* renvoie 1 avec une probabilité p et 0 sinon *)  
let bernoulli (p: float) : unit -> int =  
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# bernoulli 0.2 ();;  
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# simul_dic (bernoulli 0.2) 100_000;;  
- : (int * float) list = [(0, 0.80121); (1, 0.19879)]
```

```
(* X ~ B(n,p) comme somme de var de Bernoulli B(1,p) *)  
let binomial (n: int) (p: float) : unit -> int =  
  fun () -> som (simul_exp (bernoulli p) n);;
```

5 jetons tirés successivement dans une urne avec 5 blancs et 9 noirs. X : nombre de blancs tirés.

```
# pretty_dic "%.3f" (simul_dic (binomial 5 (5. /. 14.)) 100_000);;  
- : (int * string) list =  
[(0, "0.110"); (1, "0.304"); (2, "0.339"); (3, "0.188"); (4, "0.052"); (5,  
  "0.006")]
```

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```
(* on utilise  $C(n,p) = (n-p+1)/p * C(n,p-1)$  *)  
let binom = fun n p ->  
  if p > n || n < 0 || p < 0 then  
    0  
  else  
    let rec aux = fun acc num den ->  
      if den <= p then  
        aux ((acc * num) / den) (num - 1) (den + 1)  
      else  
        acc  
    in aux 1 n 1;;
```

```
# ( ** );;  
- : float -> float -> float = <fun>  
# 2. ** 10. ;;  
- : float = 1024.
```

```
(* calcul de  $P_X(k)$  quand  $X \sim B(n,p)$  *)  
let proba_bin (n: int) (p: float) (k: int) : float =  
  (float_of_int (binom n k)) *. (p ** (float_of_int k)) *. ((1. -. p)**(  
    float_of_int (n - k)));;
```



```
# ( ** );;  
- : float -> float -> float = <fun>  
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```

```
(* calcul de  $P_X(k)$  quand  $X \sim B(n,p)$  *)  
let proba_bin (n: int) (p: float) (k: int) : float =  
  (float_of_int (binom n k)) *. (p ** (float_of_int k)) *. ((1. -. p)**(  
    float_of_int (n - k)));;
```

```
(* renvoie le dictionnaire des (k, PX(k)) quand  $X \sim B(n,p)$  *)  
let dic_bin (n: int) (p: float) : (int * float) list =  
  let rec aux = fun i acc ->  
    if i > n then  
      List.sort compare acc  
    else  
      let pr = proba_bin n p i in  
      aux (i + 1) ((i,pr) :: acc)  
  in aux 0 [];
```

```
# pretty_dic "%.3f" (simul_dic (binomial 5 (5. /. 14.)) 100_000);;  
- : (int * string) list =  
[(0, "0.108"); (1, "0.305"); (2, "0.340"); (3, "0.187"); (4, "0.054"); (5,  
  "0.006")]
```

```
# pretty_dic "%.3f" (dic_bin 5 (5. /. 14.));;  
- : (int * string) list =  
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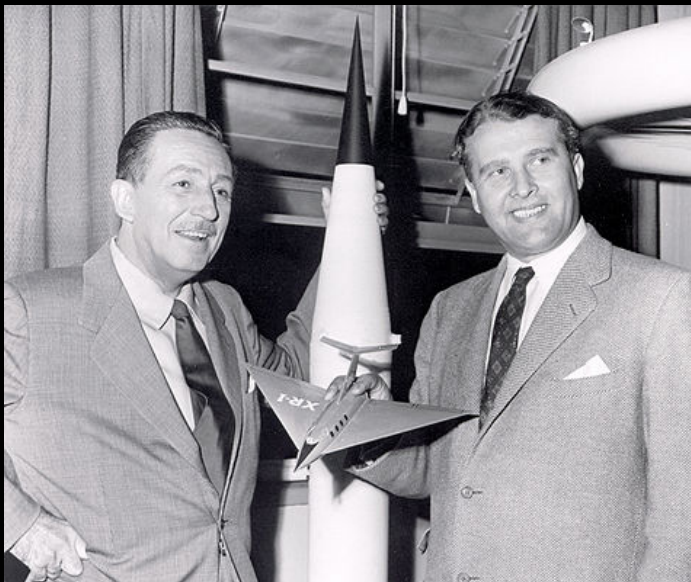
WWII



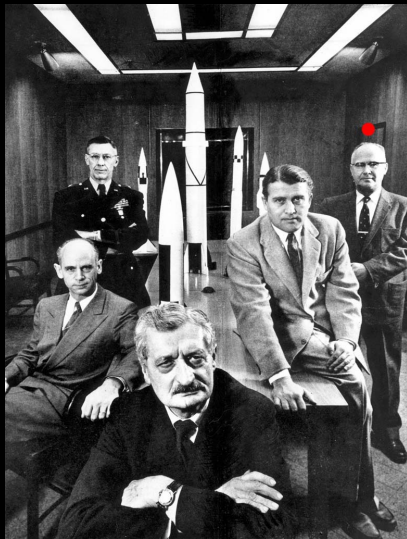
Von Braun et ses vieux amis



Von Braun et son nouvel ami



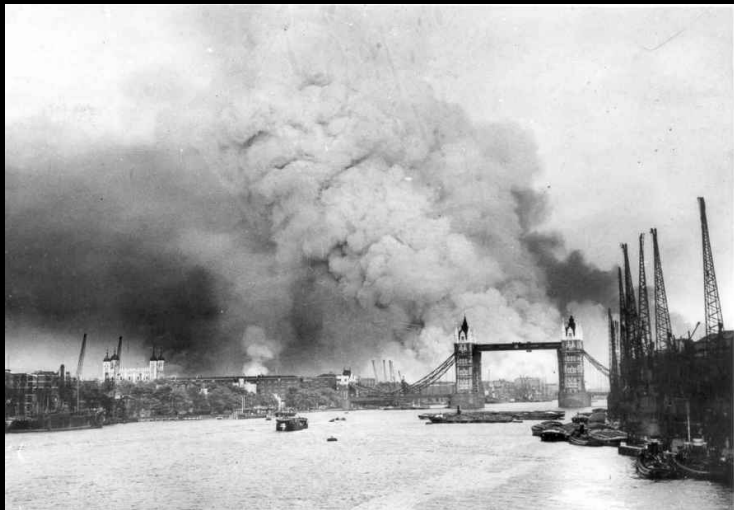
Lusser, père du V1 et Von Braun aux États-Unis...



Le V1



Le V1 de passage à Londres



| | | | | | | |
|--------------------------------|-----|-----|----|----|---|------------|
| No. of flying bombs per square | 0 | 1 | 2 | 3 | 4 | 5 and over |
| No. of squares | 229 | 211 | 93 | 35 | 7 | 1 |

Source :

<http://www.actuaries.org.uk/sites/all/files/documents/pdf/0481.pdf>

576 carrés de 0,25 km^2 .

537 impacts de bombe.

$\lambda = 537/576$

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537 impacts de bombe.

$\lambda = 537/576$

$$\mathbb{P}(\{X = k + 1\}) = \frac{\lambda}{k+1} \mathbb{P}(\{X = k\})$$

```

let poisson (lambda: float) (n: int) : float =
  let rec aux = fun k acc ->
    if k = n then acc
    else aux (k + 1) ((lambda /. (float_of_int (k + 1))) *. acc)
  in aux 0 (exp (-. lambda));;

```

$$\mathbb{P}(\{X = k + 1\}) = \frac{\lambda}{k+1} \mathbb{P}(\{X = k\})$$

```

let poisson (lambda: float) (n: int) : float =
  let rec aux = fun k acc ->
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    else aux (k + 1) ((lambda /. (float_of_int (k + 1))) *. acc)
  in aux 0 (exp (-. lambda));;

```

```

let lambda = 537. /. 576. ;;

# List.map (fun k -> 576. *. (poisson lambda k)) [0;1;2;3;4];;
- : float list =
[226.742722583239527; 211.390350741666; 98.5387312050995092;
 30.6222793154736301; 7.13722395503877571]

```

| | | | | | | |
|--------------------------------|-----|-----|----|----|---|------------|
| No. of flying bombs per square | 0 | 1 | 2 | 3 | 4 | 5 and over |
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|--------------------------------|-----|-----|----|----|---|------------|
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Flying Bombs on London

