

DES ALLIGATORS AUX FONDEMENTS DE L'INFORMATIQUE

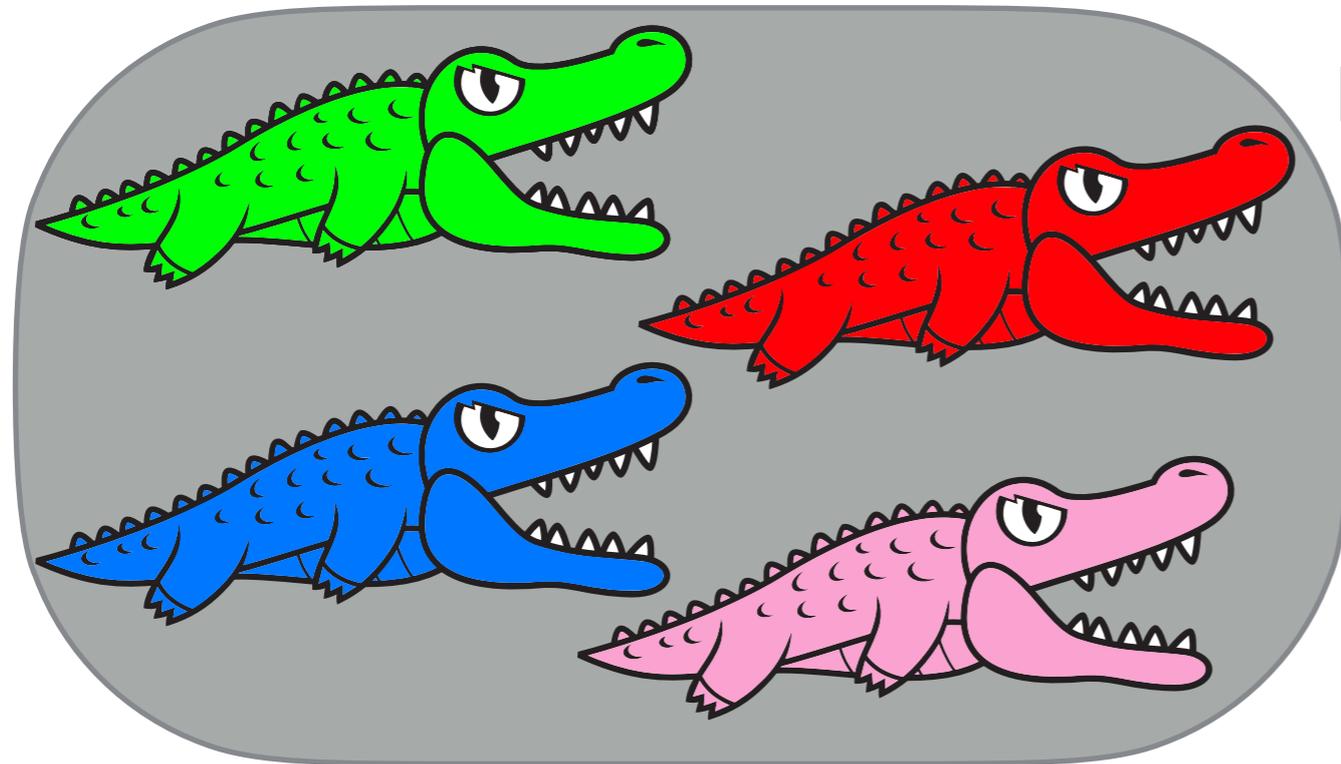
Benjamin Monmege

Journée pour l'enseignement de l'informatique

Marseille - 17 mai 2023

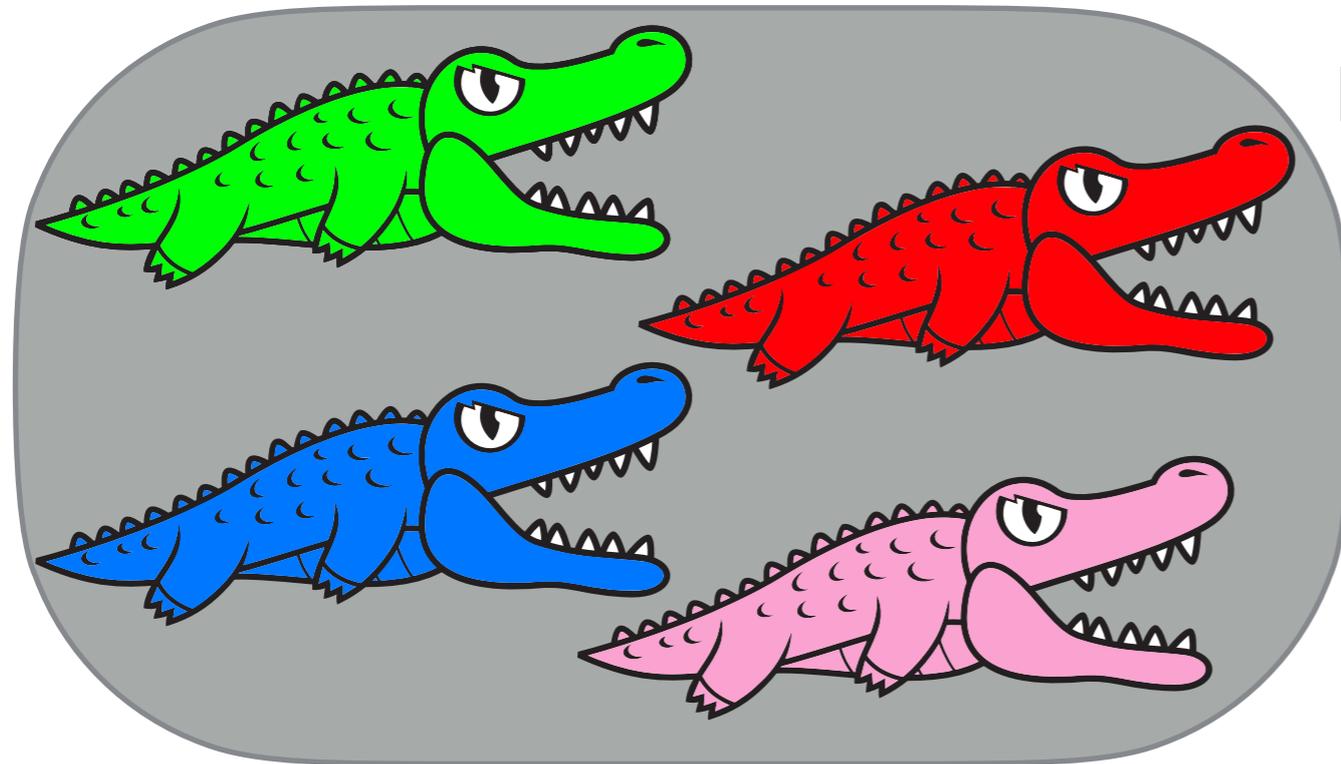
Sur une idée originale de Bret Victor : <http://worrydream.com/AlligatorEggs/>

La dure vie des alligators

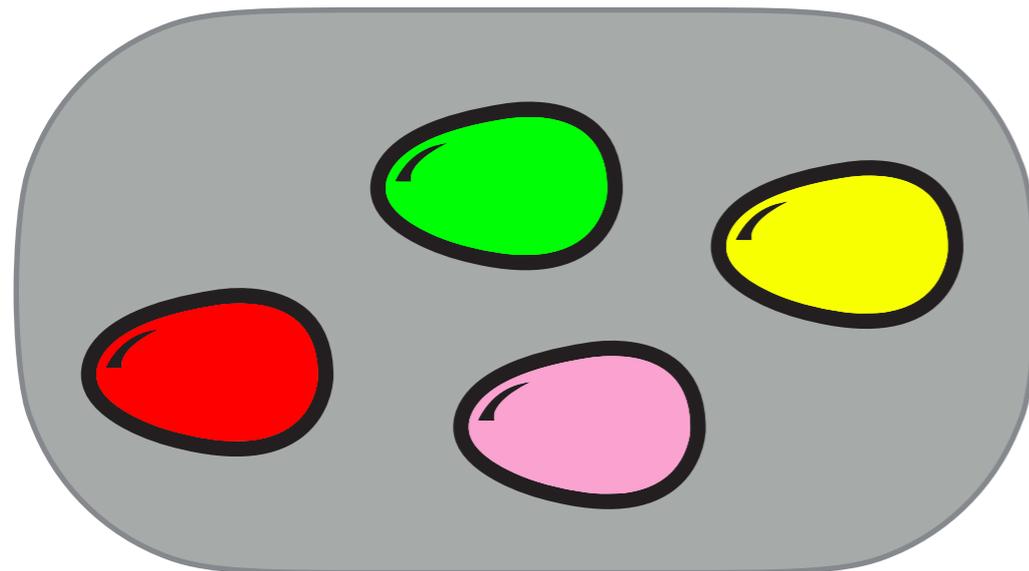


Les alligators

La dure vie des alligators

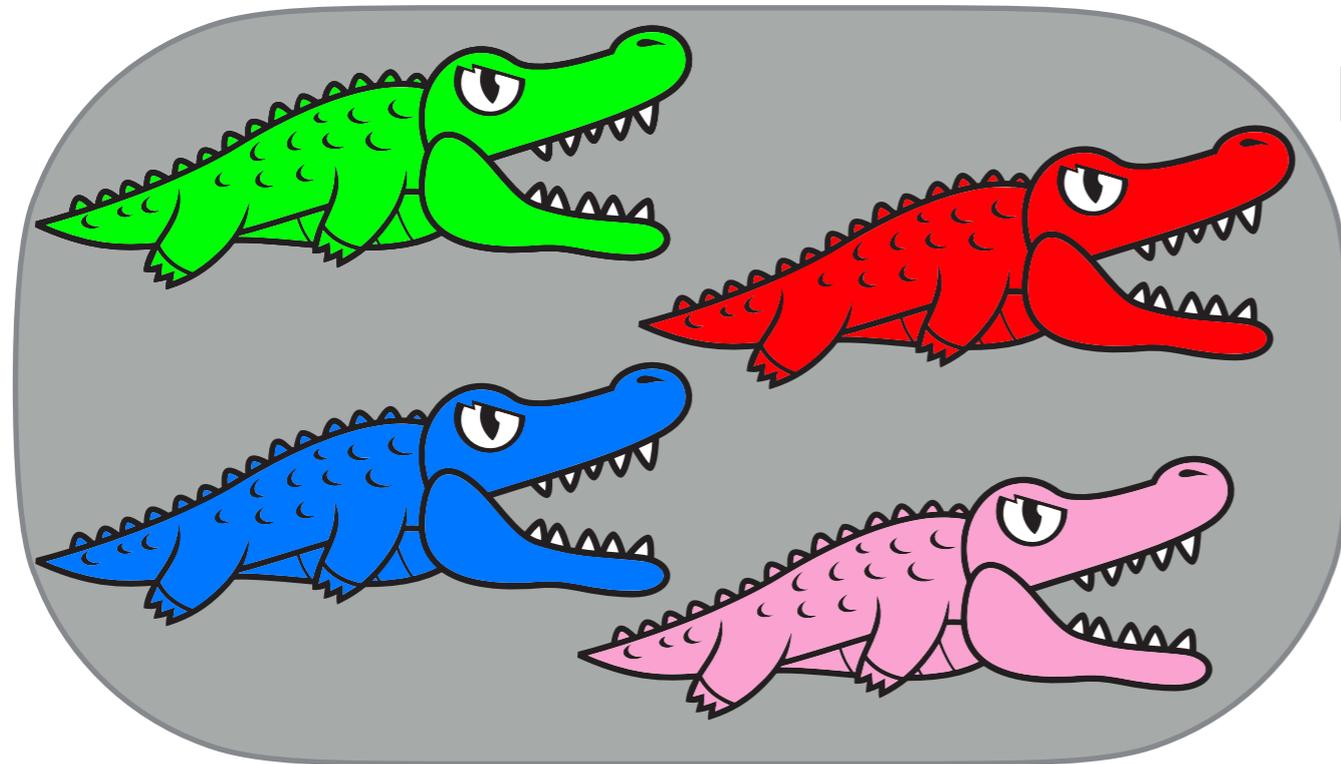


Les alligators

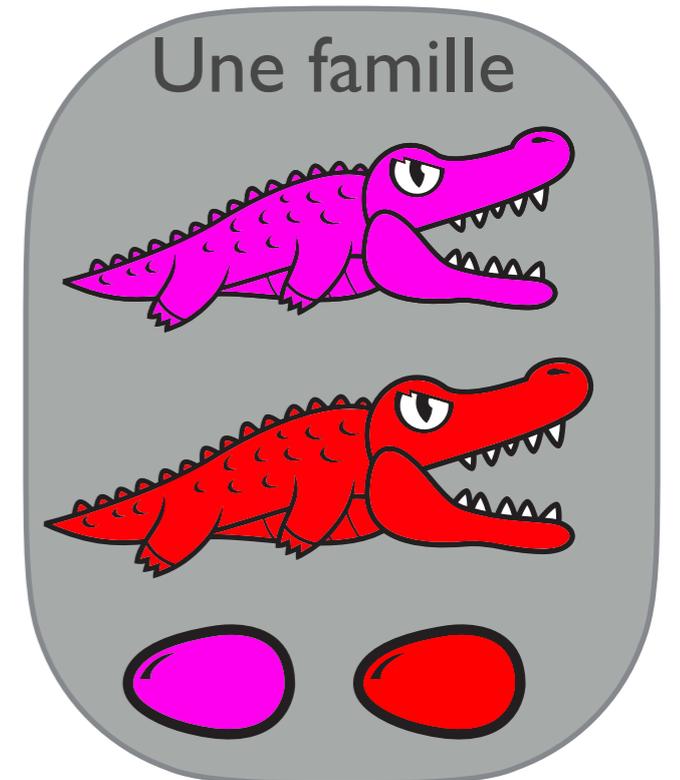


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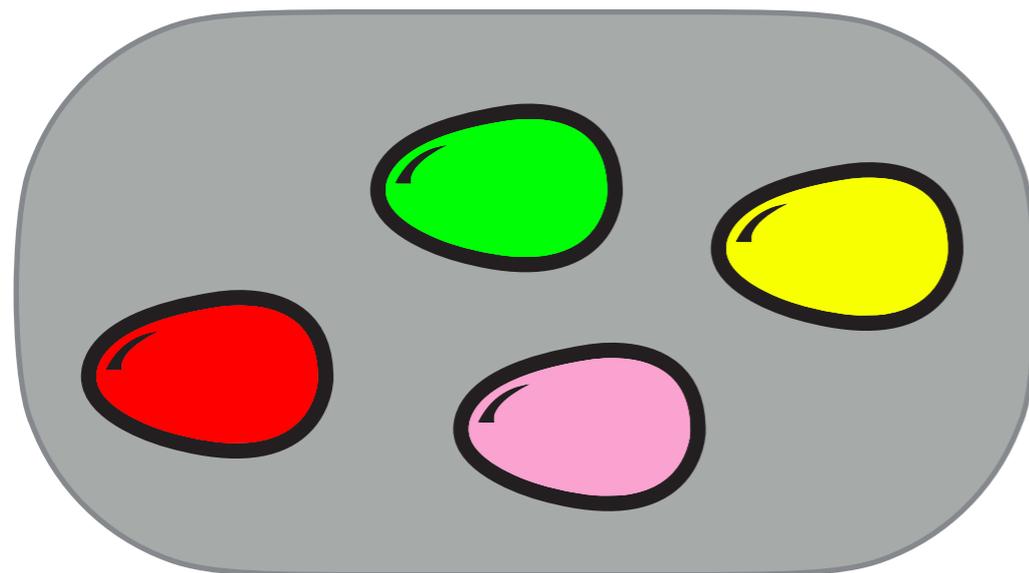
La dure vie des alligators



Les alligators

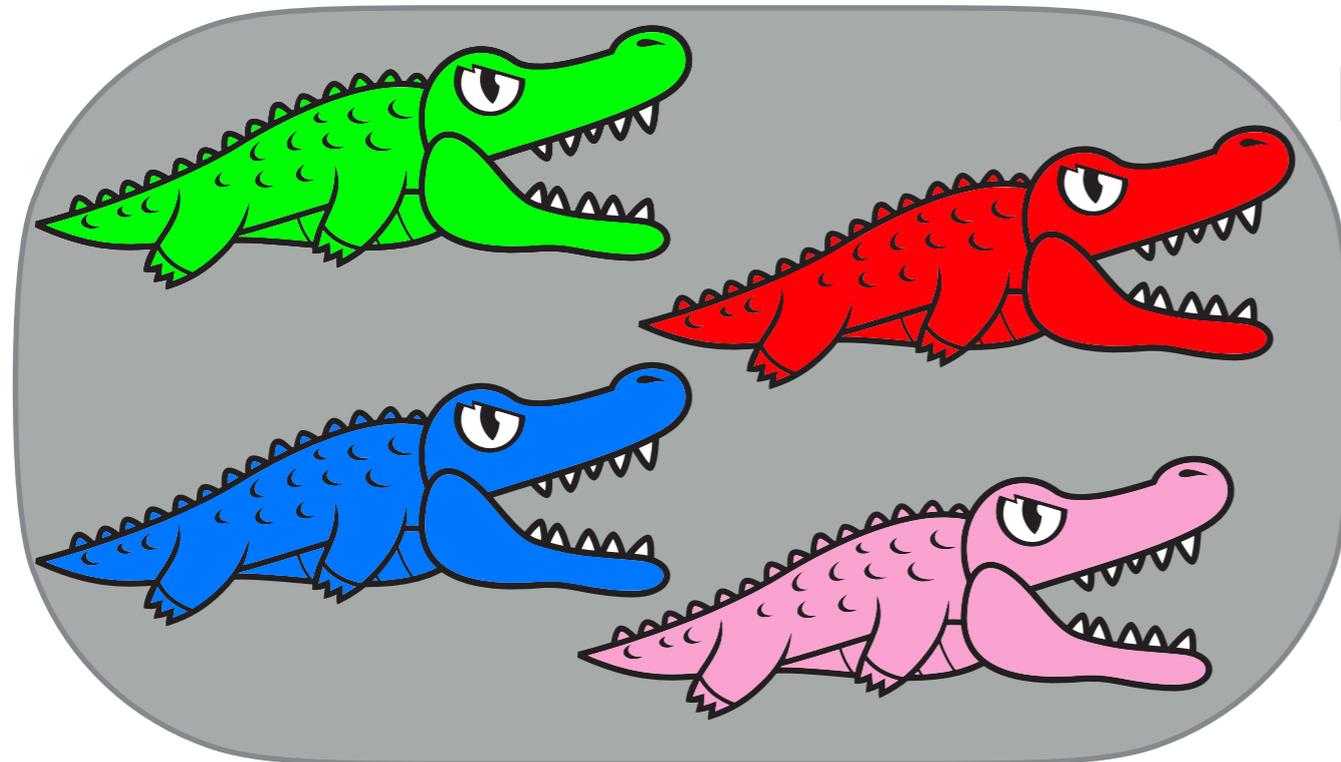


Une famille

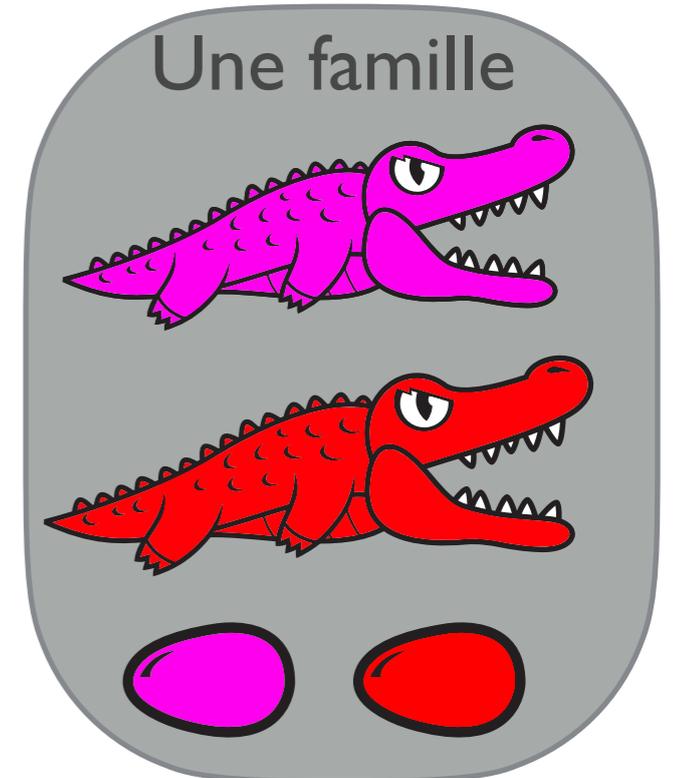


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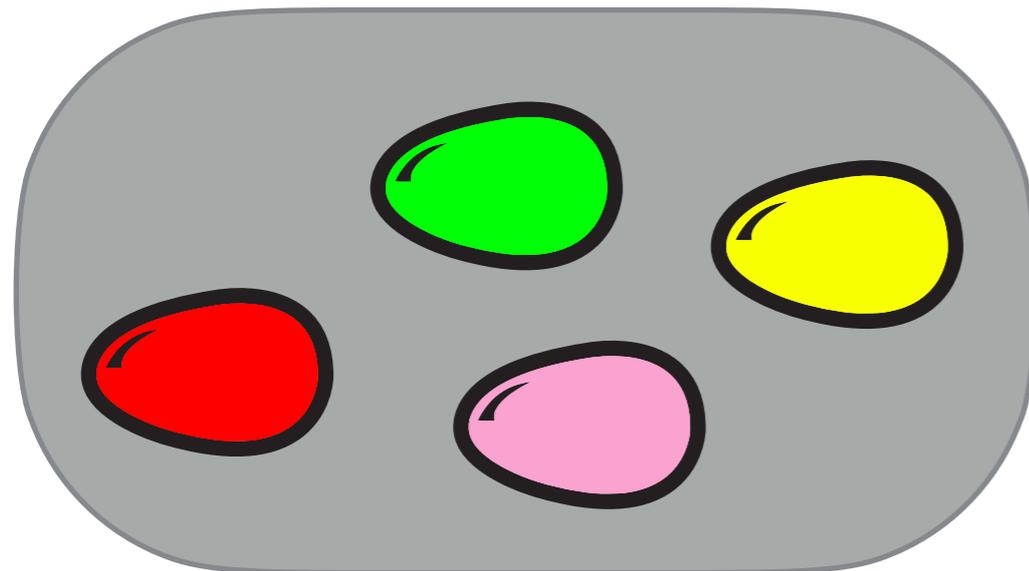
La dure vie des alligators



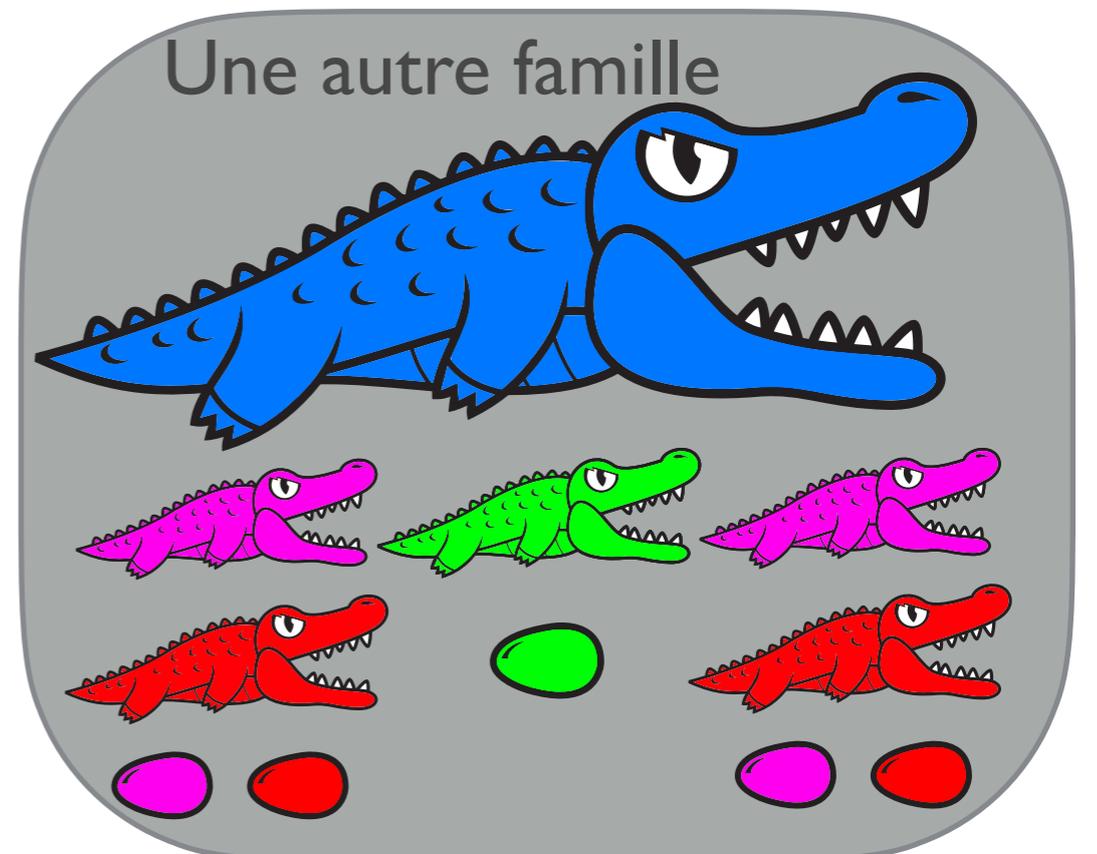
Les alligators



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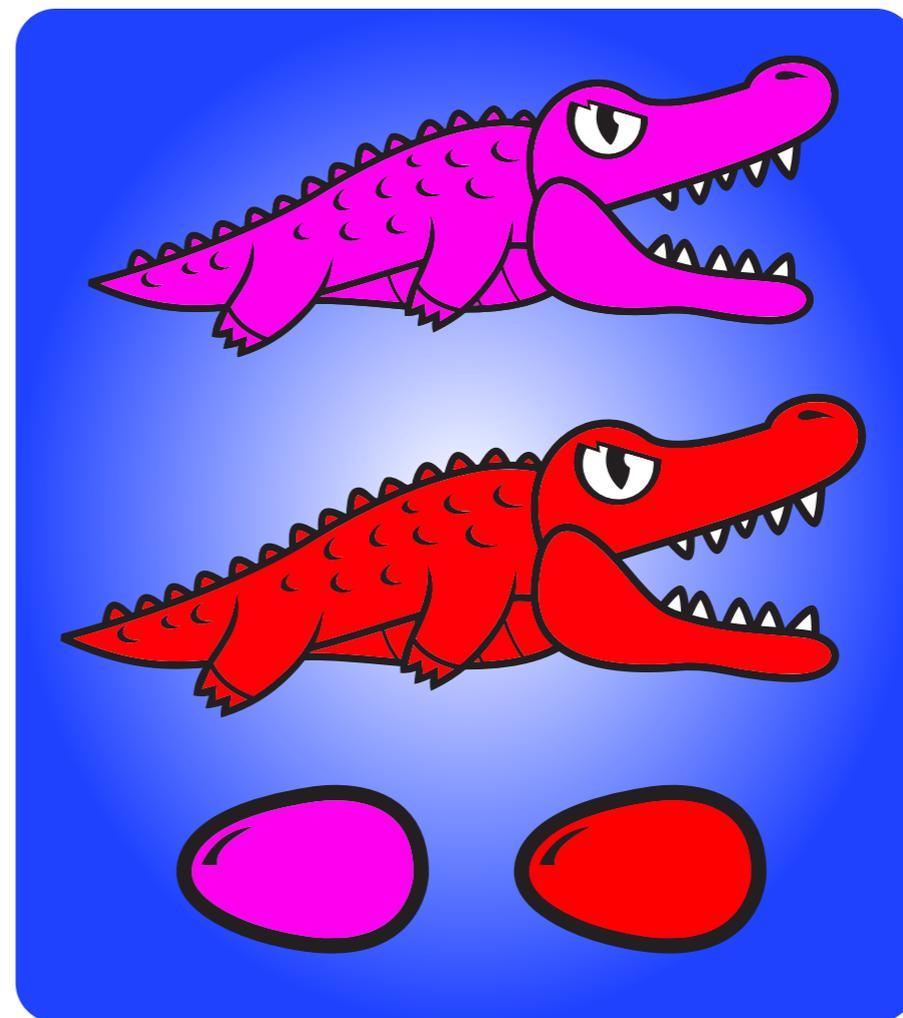
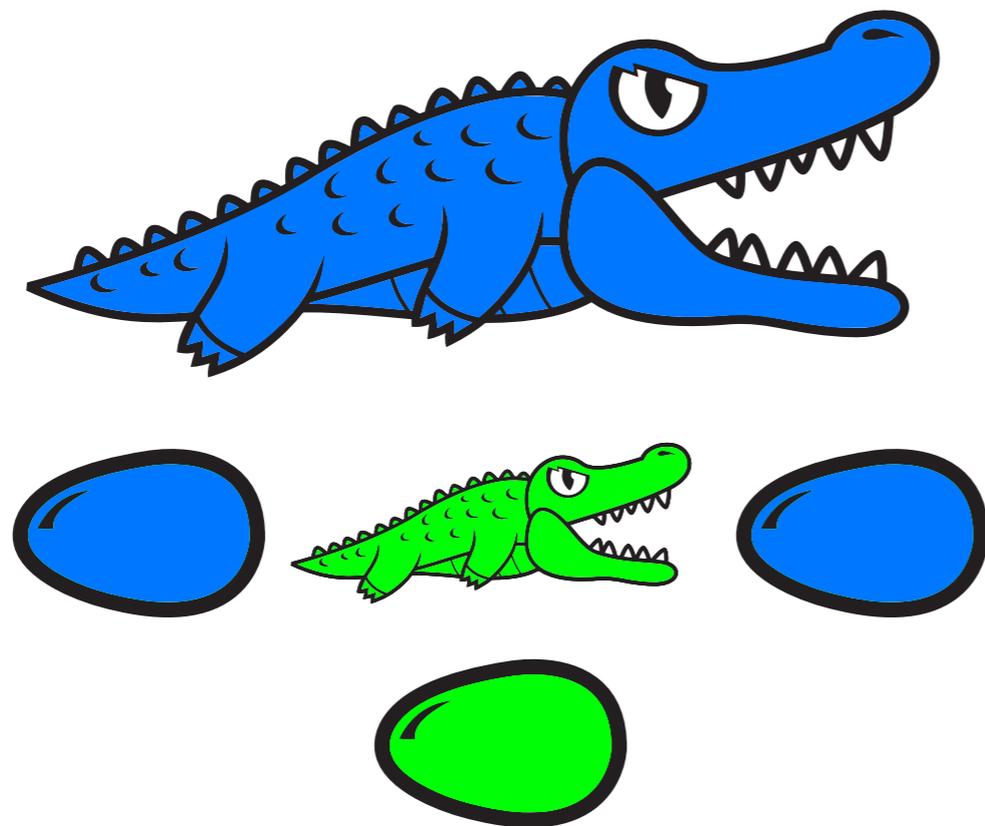


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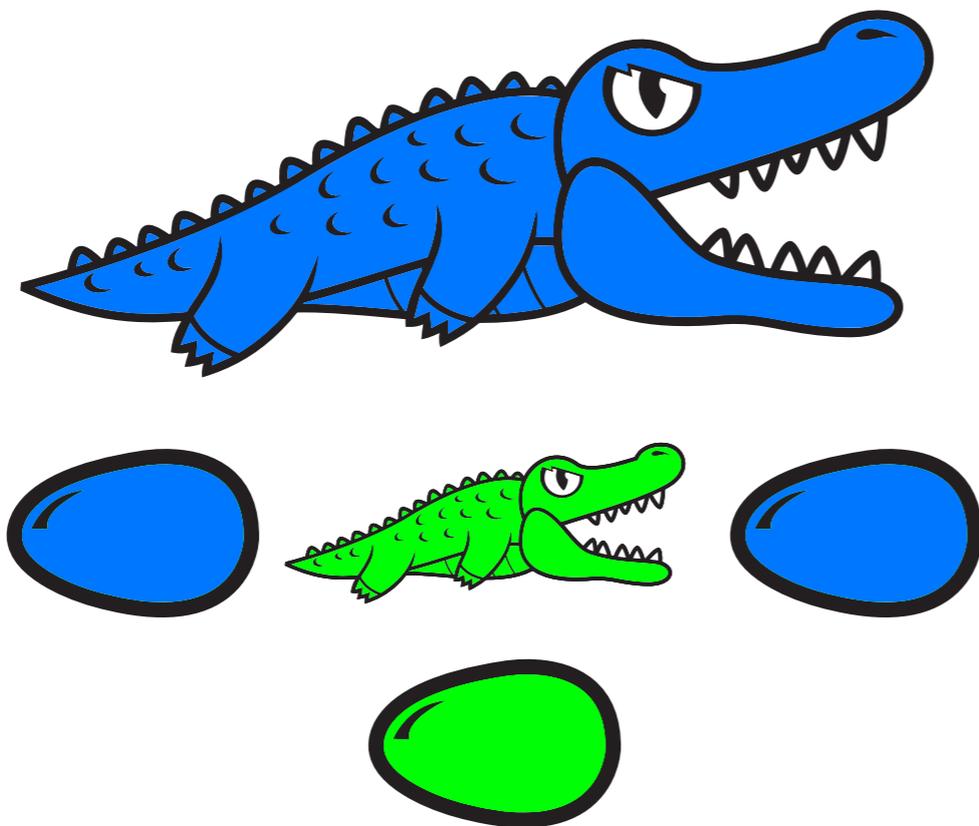


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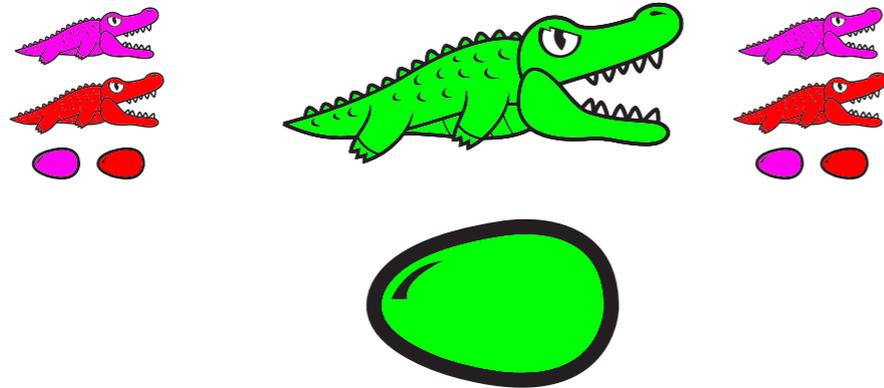
Règle 1 : le repas

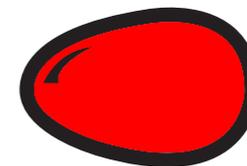
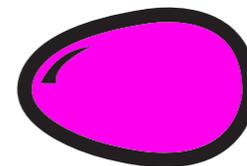
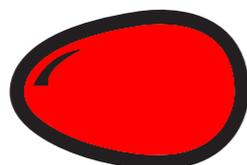
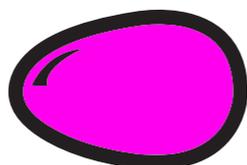
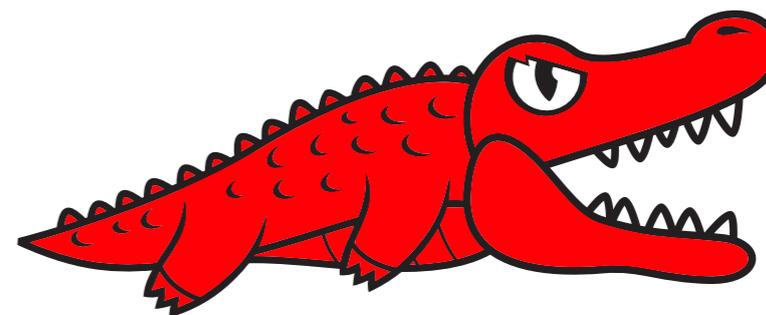
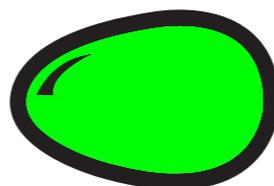
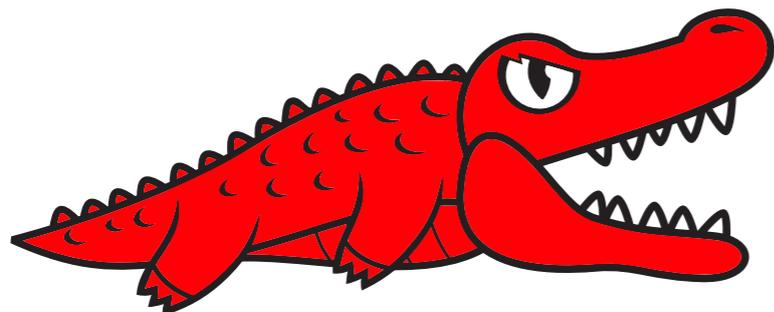
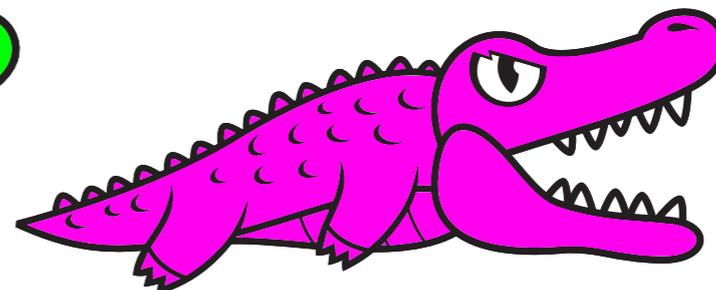
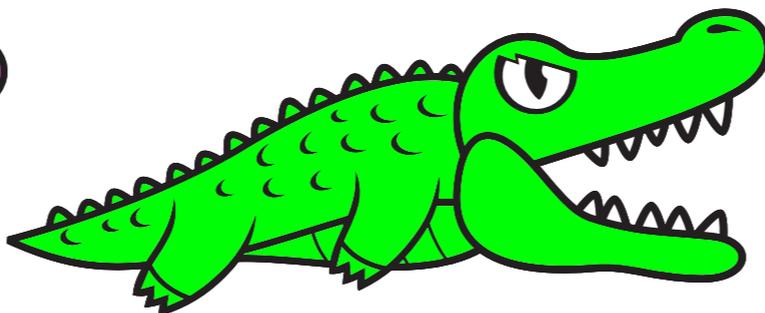
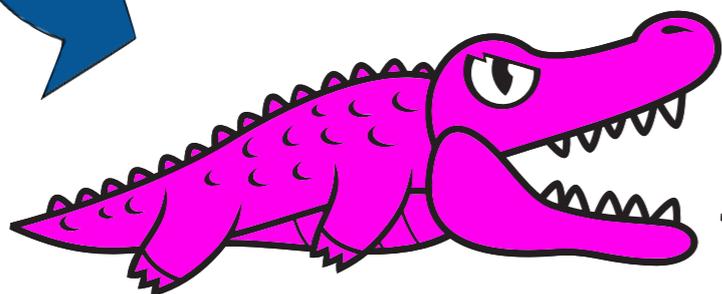
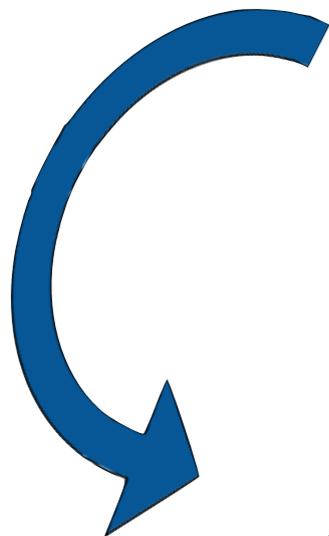
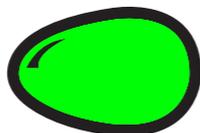
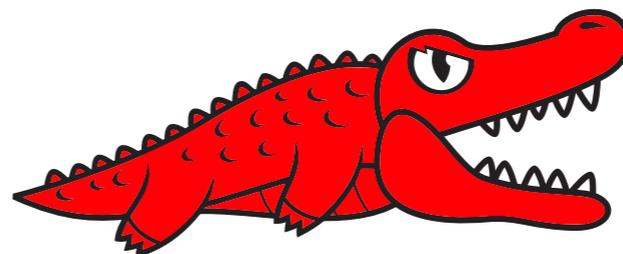
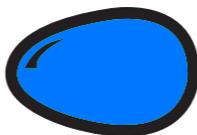
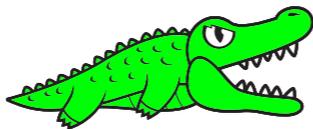
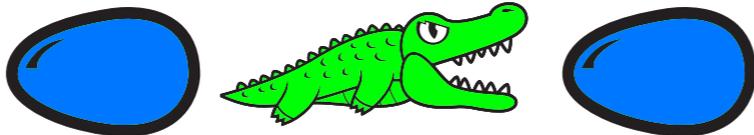
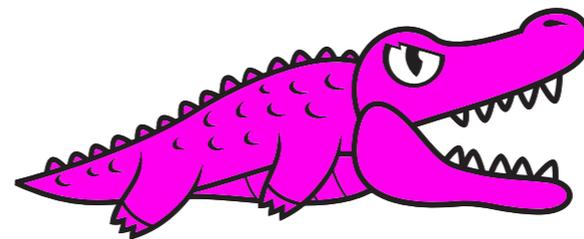
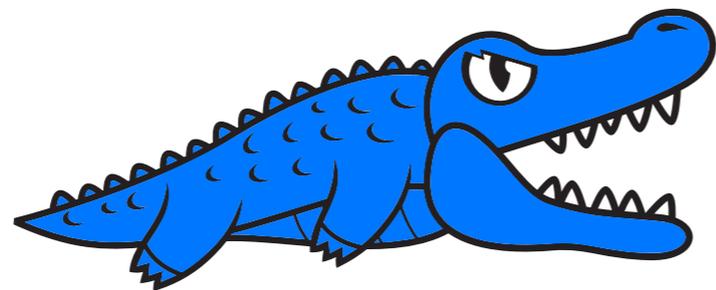


Règle 1 : le repas

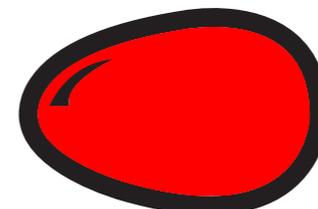
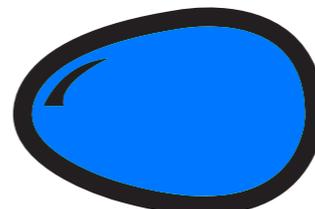
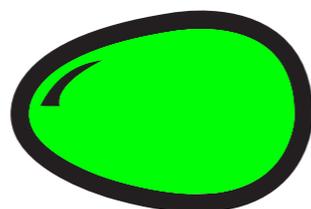
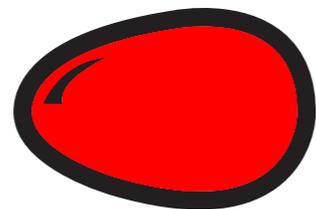
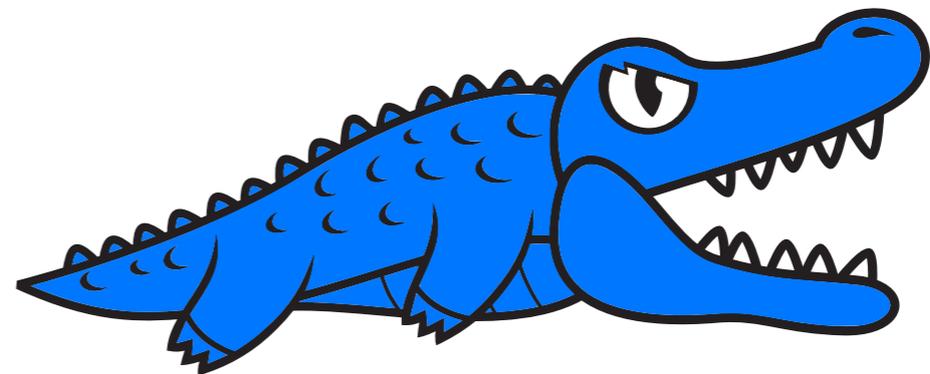
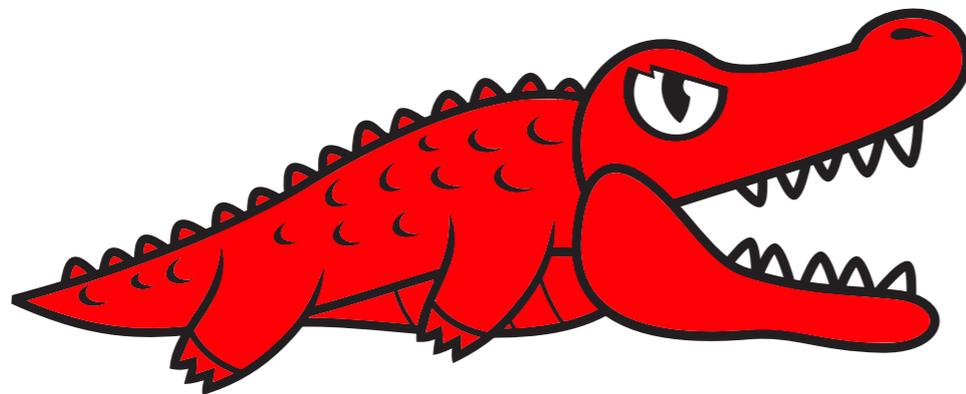
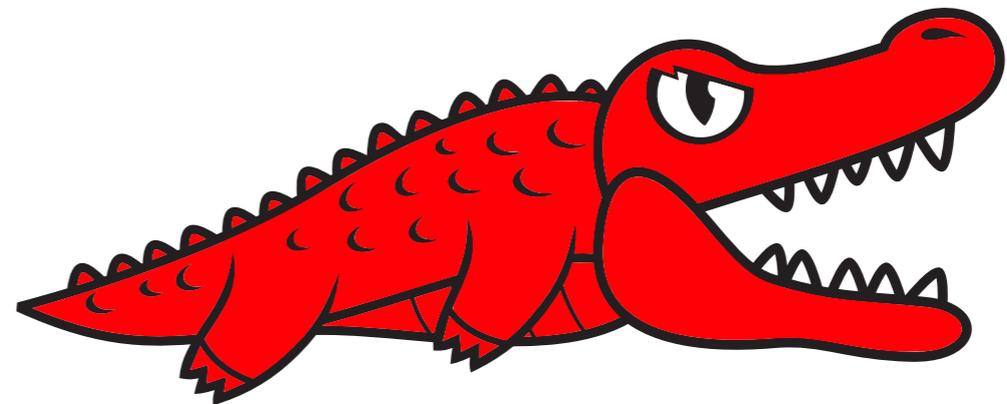
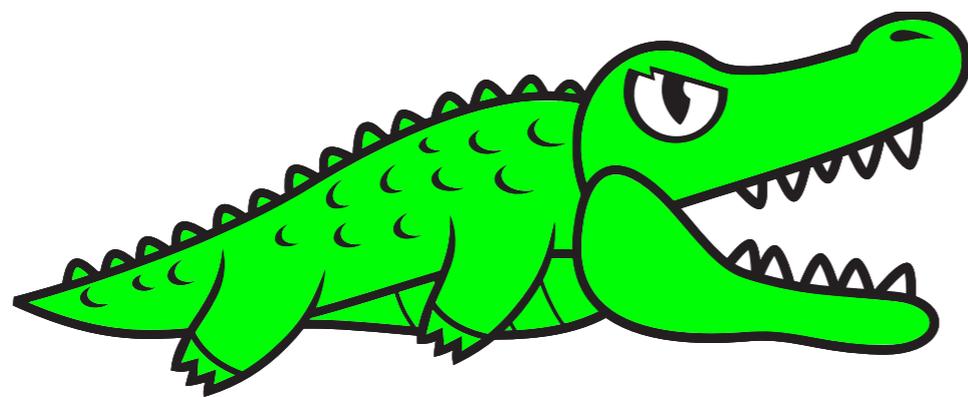


Règle 1 : le repas

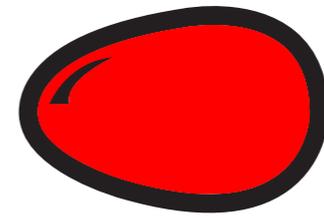
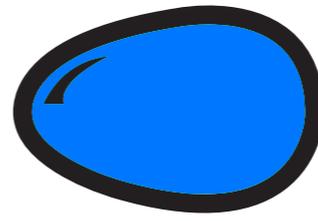
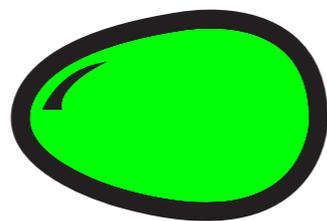
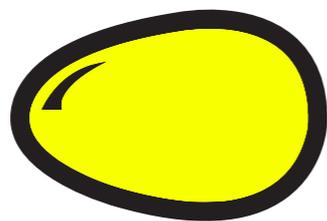
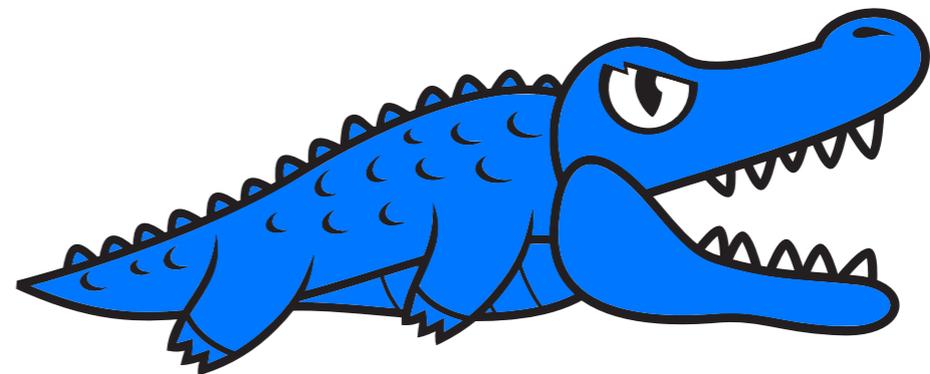
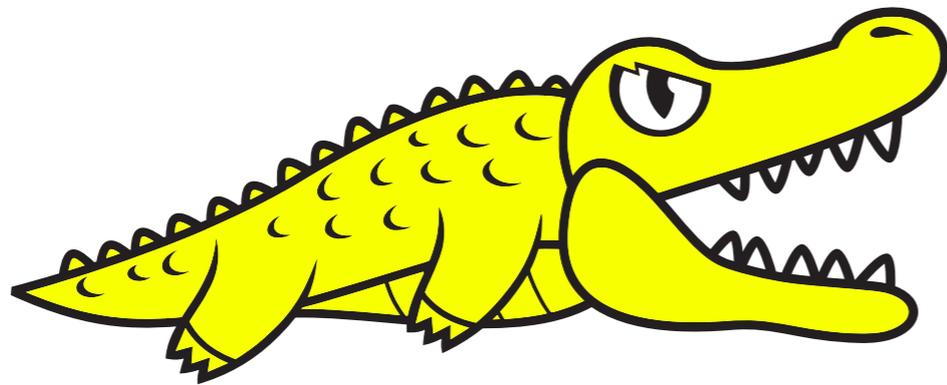
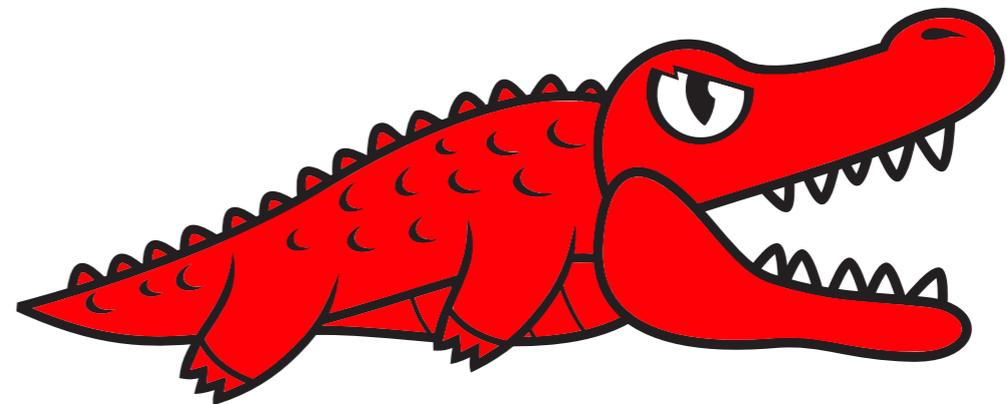
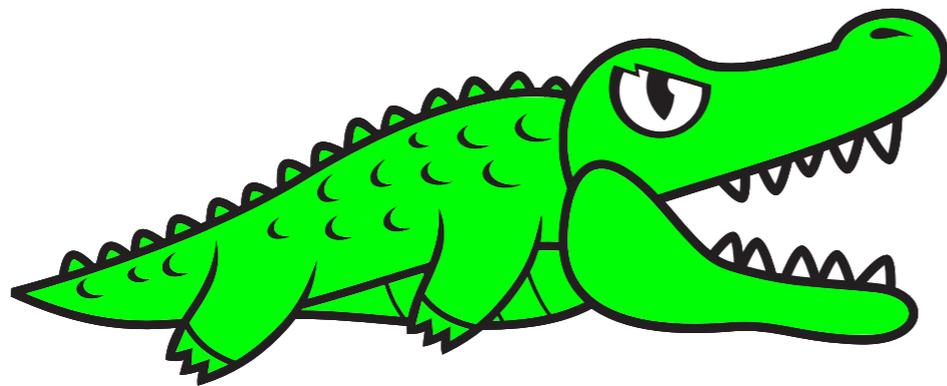




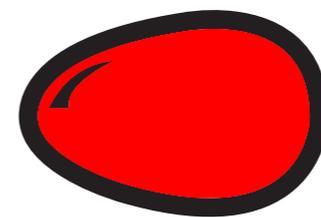
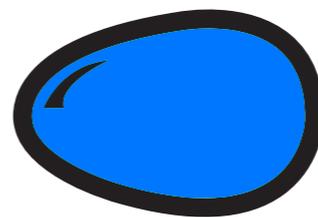
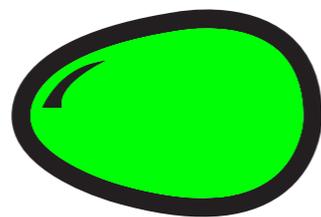
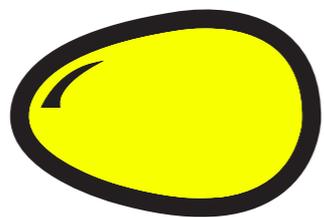
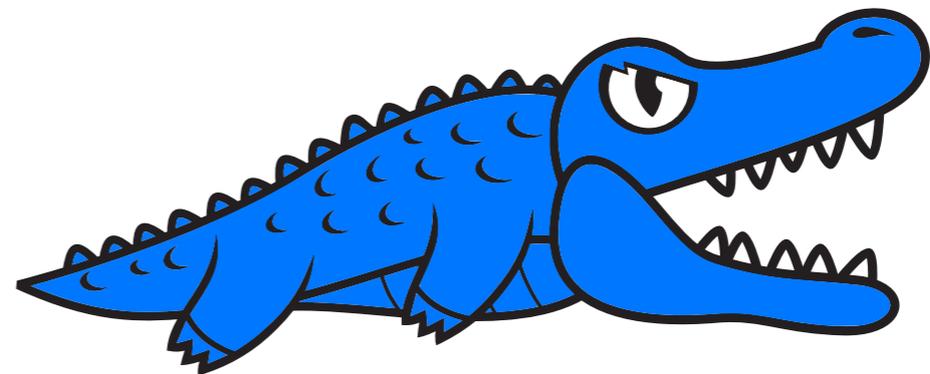
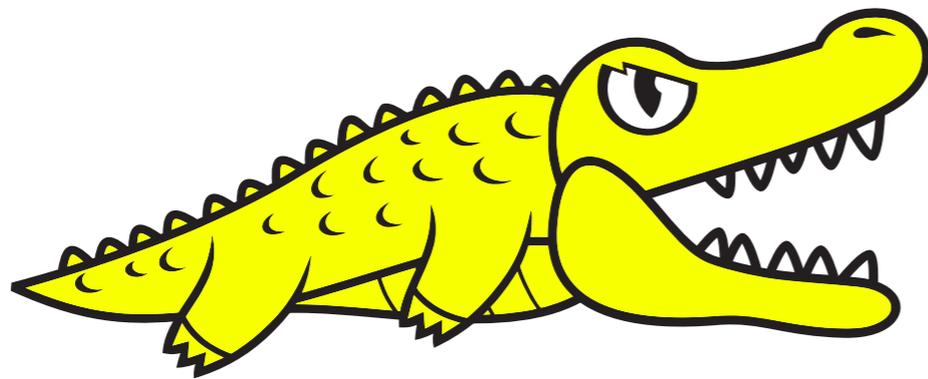
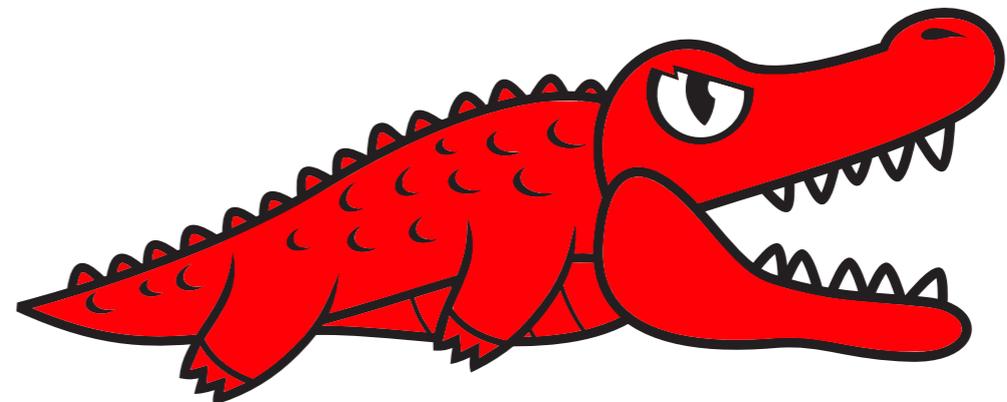
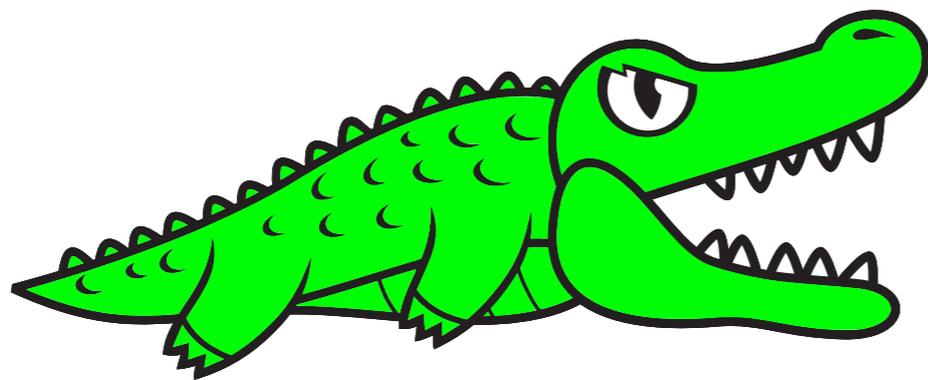
Règle 2 : la couleur



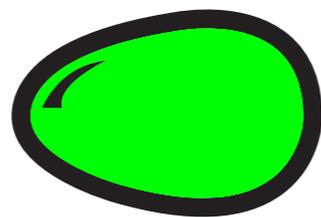
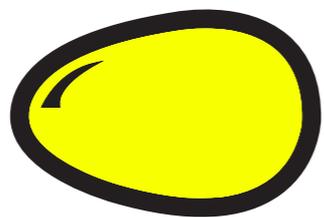
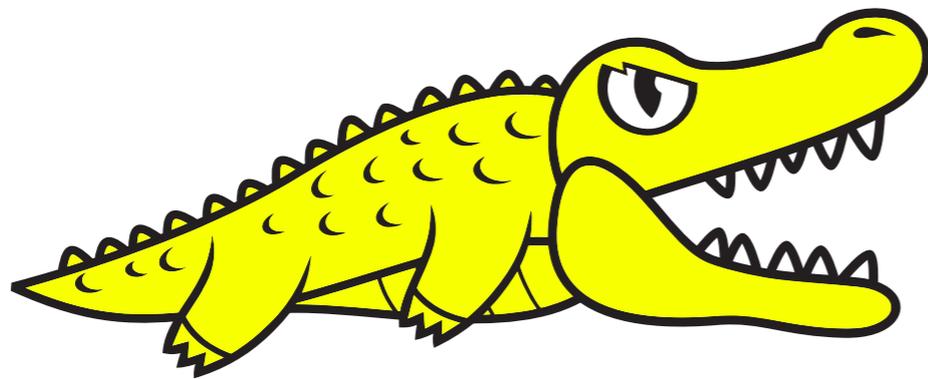
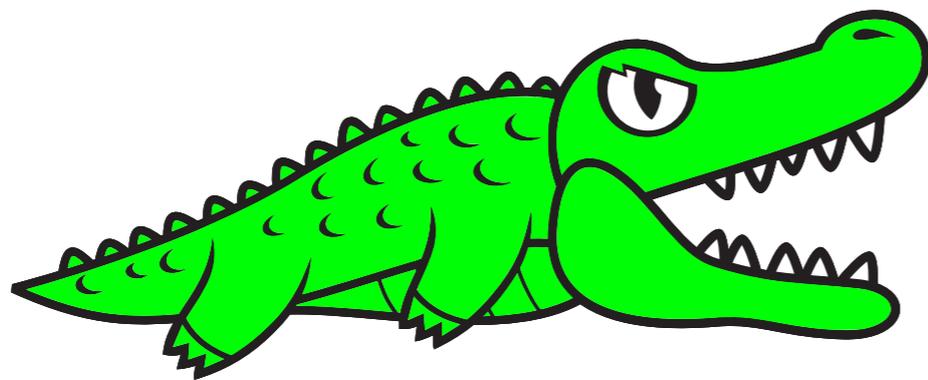
Règle 2 : la couleur



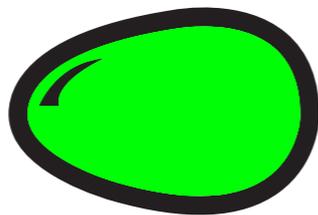
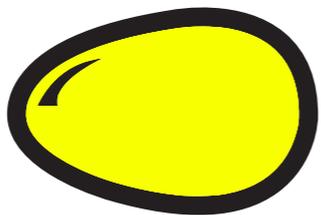
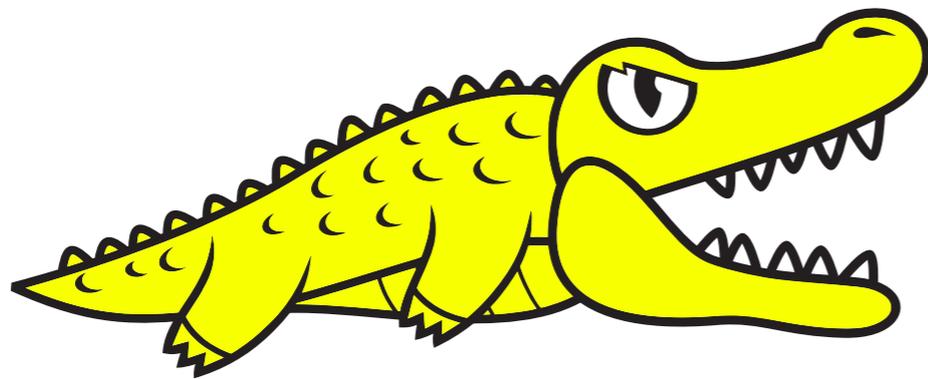
Règle 2 : la couleur



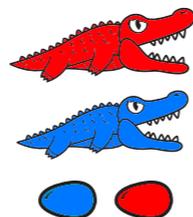
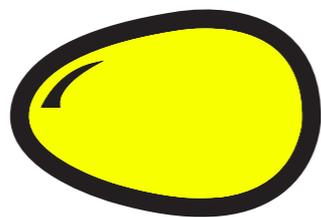
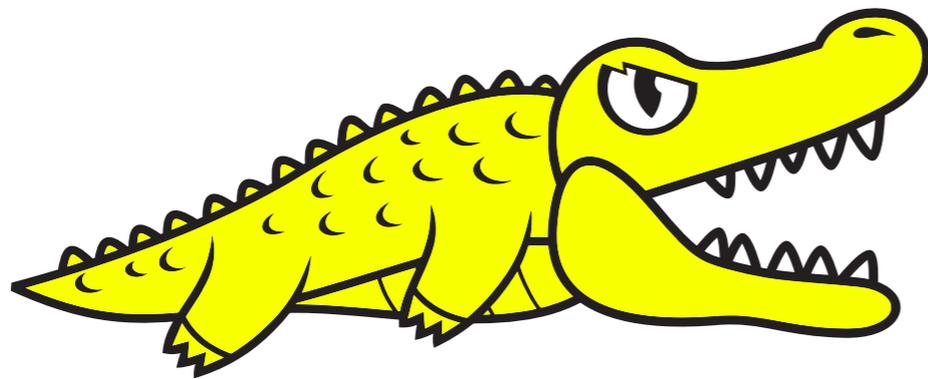
Règle 2 : la couleur

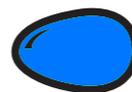
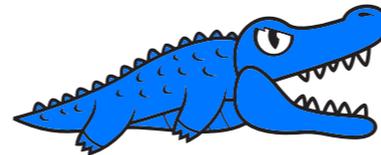
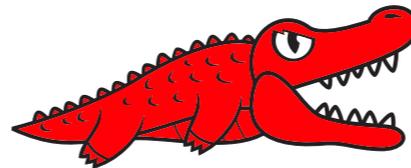
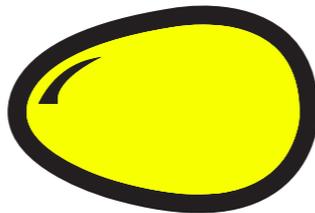
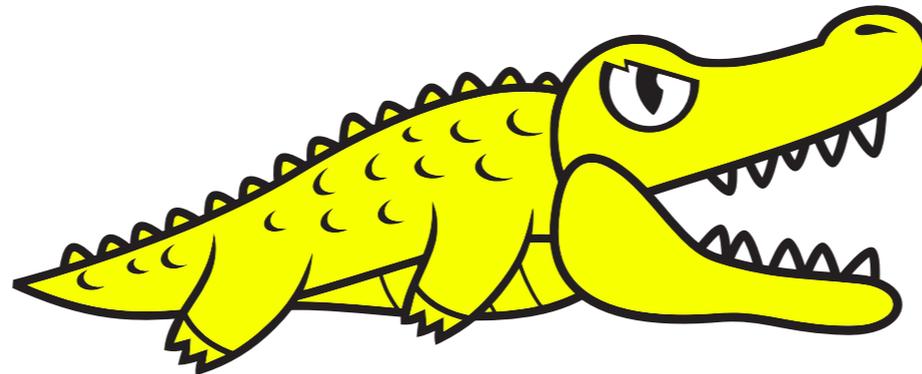
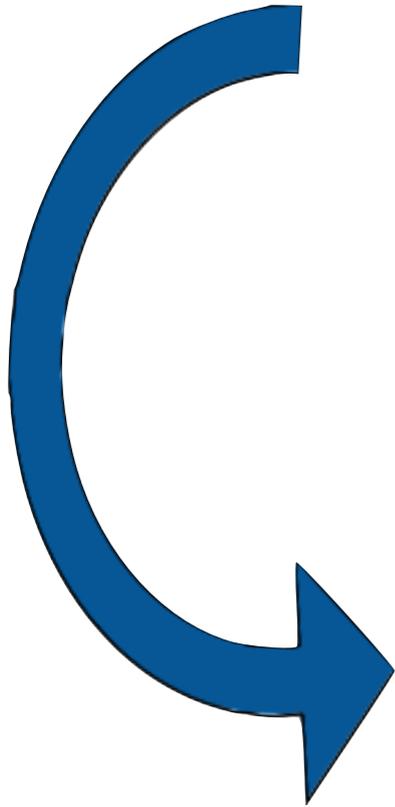
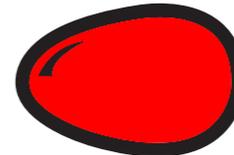
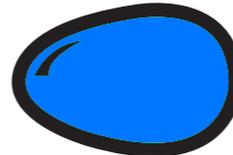
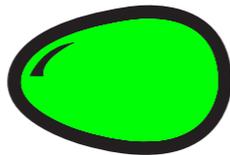
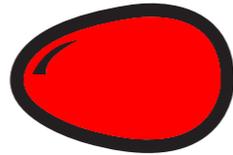
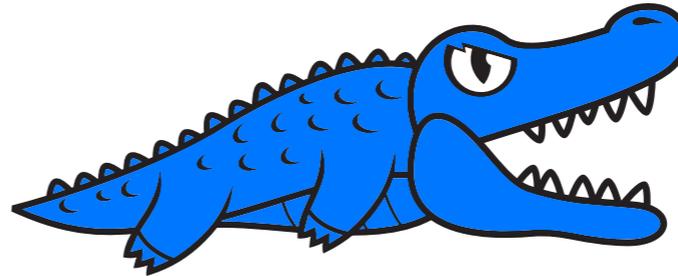
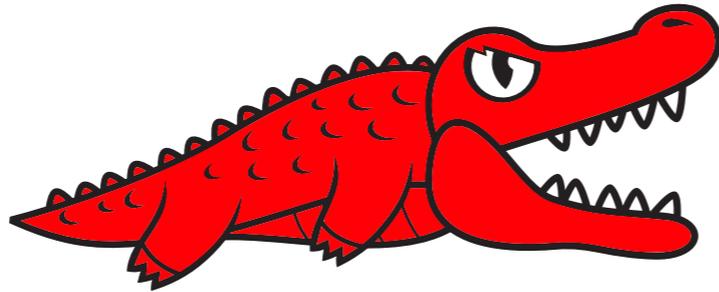
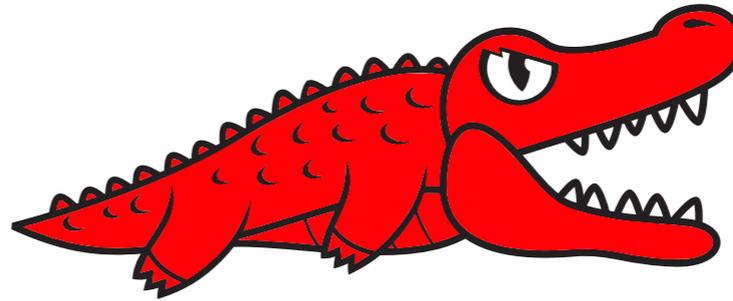
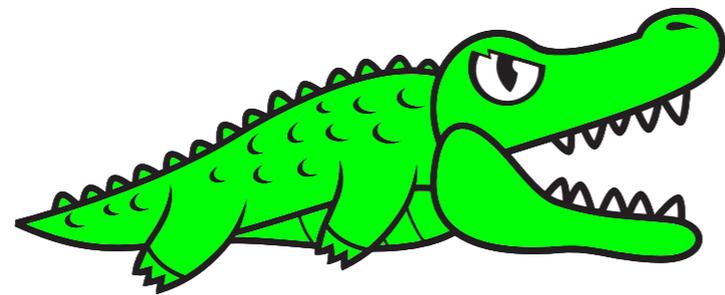


Règle 2 : la couleur



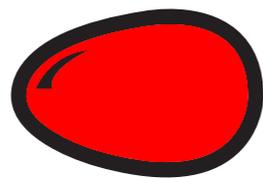
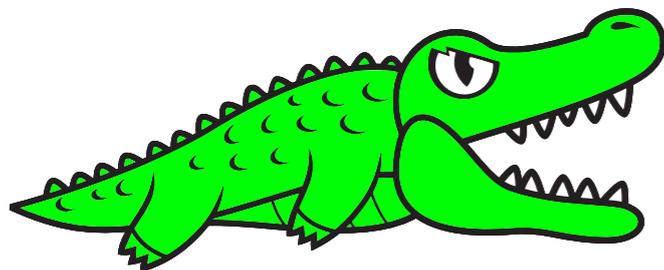
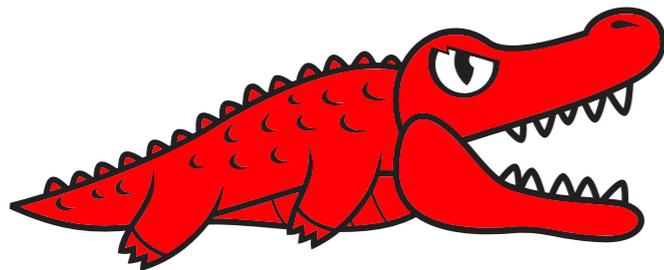
Règle 2 : la couleur



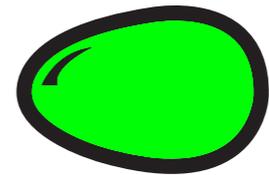
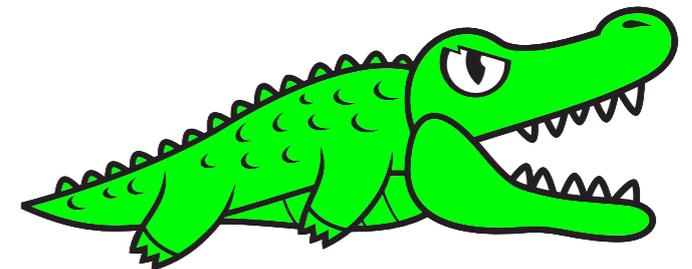
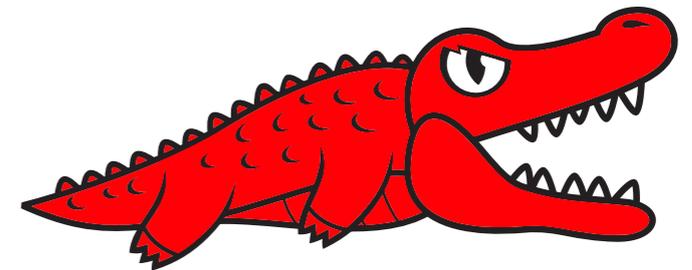


Les familles Thompson et Foster

Thompson

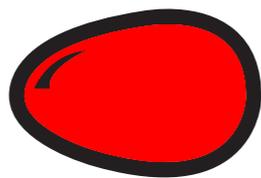
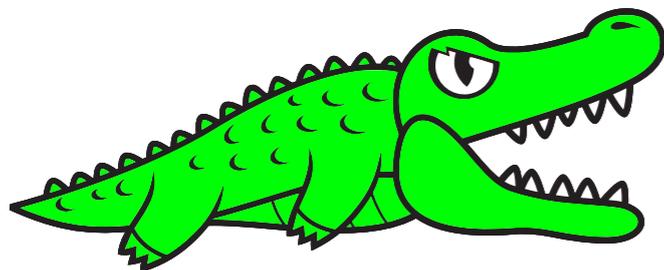
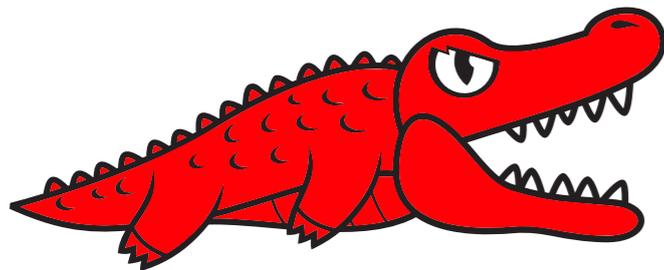


Foster

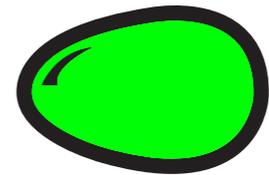
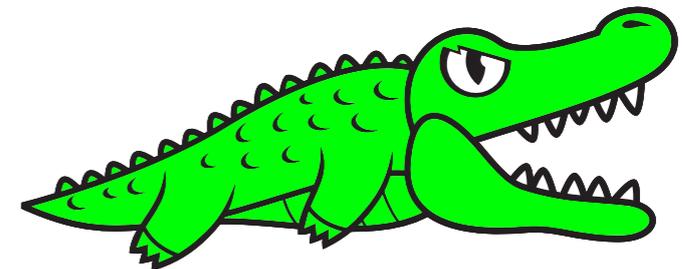
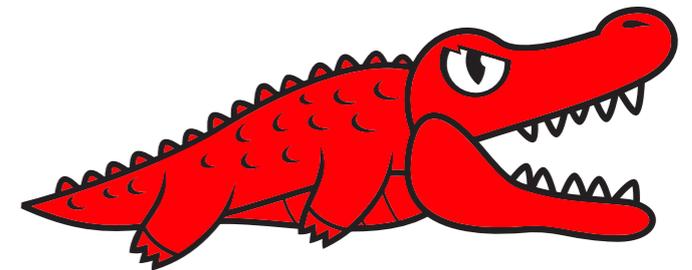


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Thompson



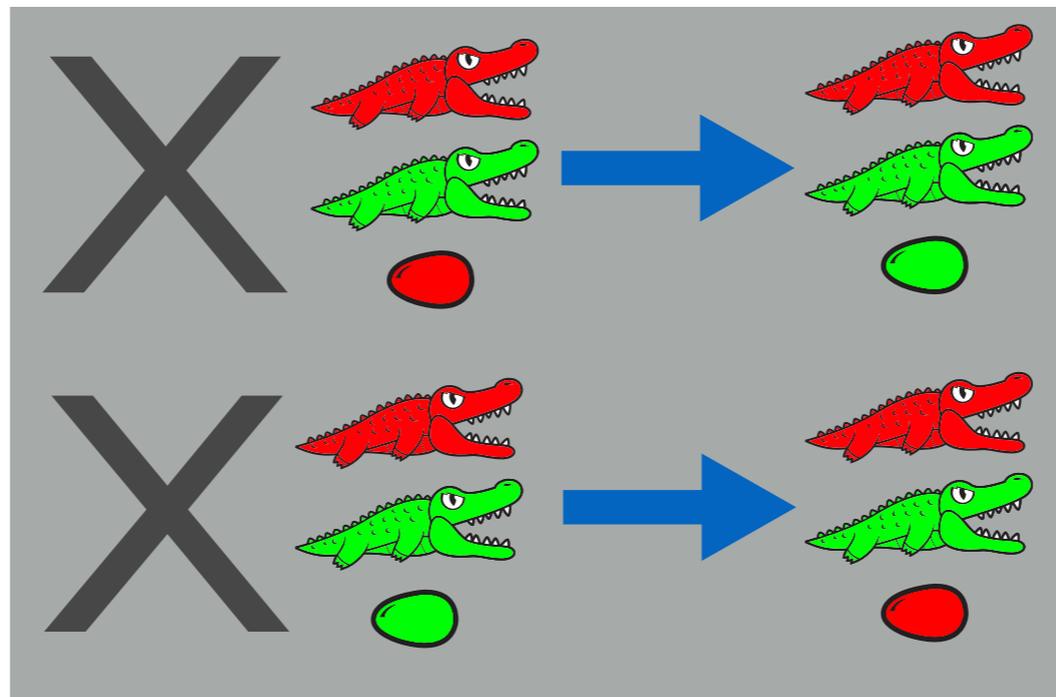
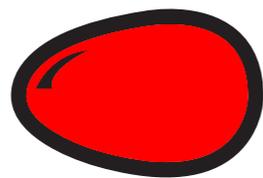
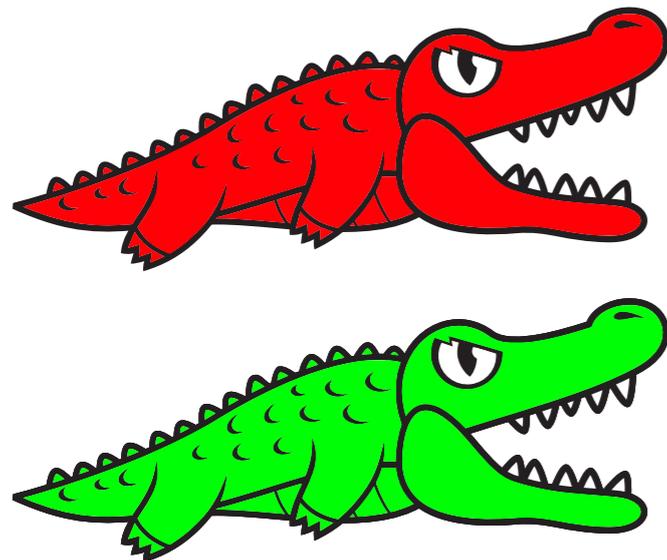
Foster



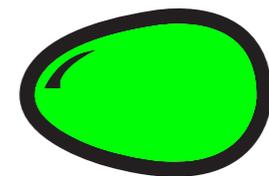
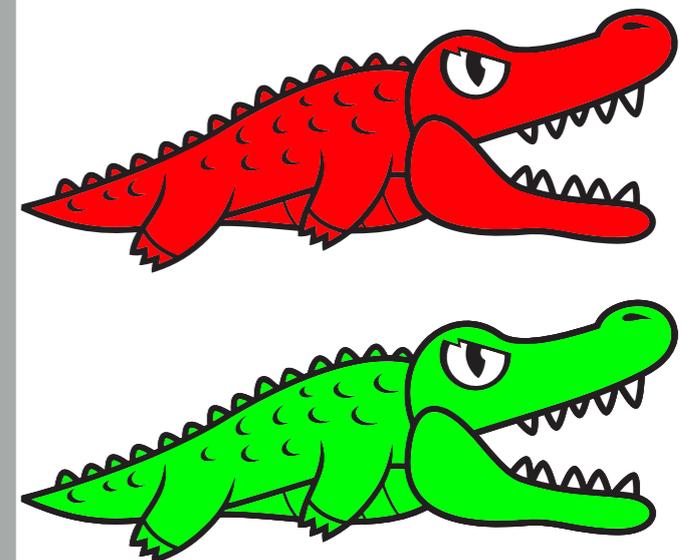
Pouvez-vous trouver une famille qui, après application des règles, résulte en l'inversion des familles Thompson et Foster ?

Les familles Thompson et Foster

Thompson



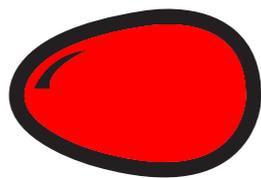
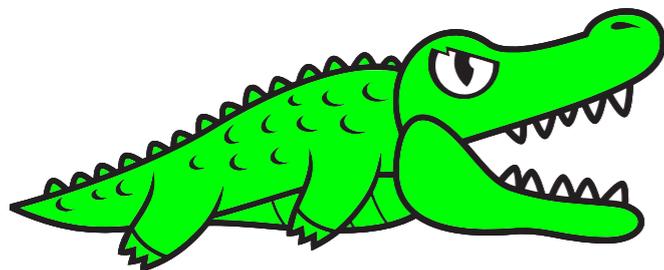
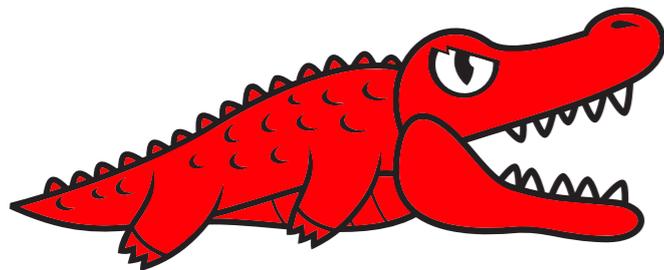
Foster



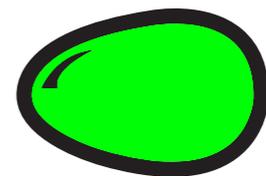
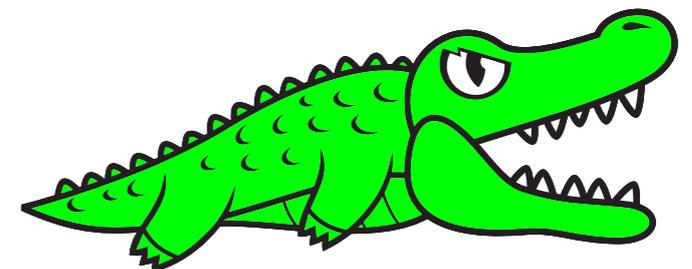
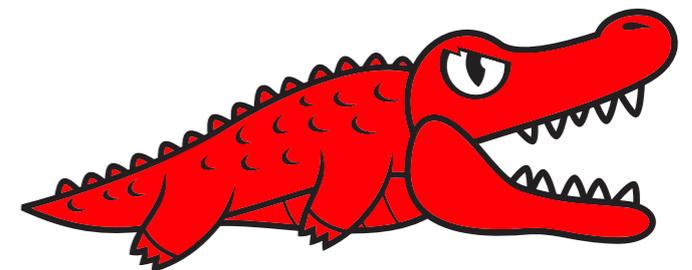
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Les familles Thompson et Foster

Thompson



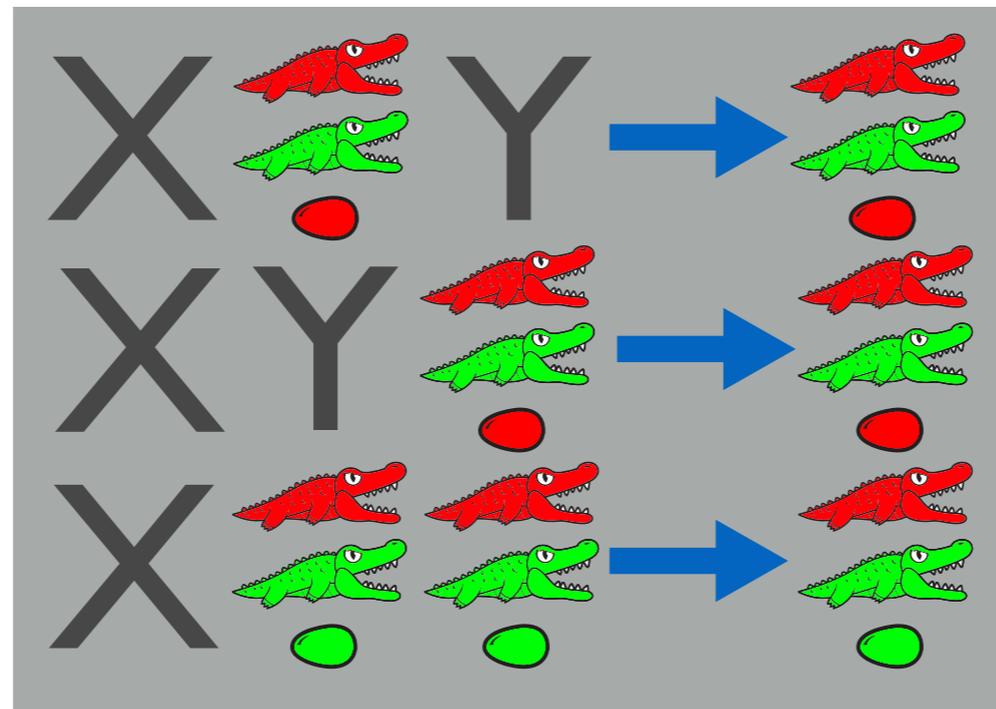
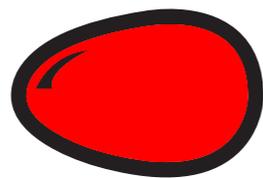
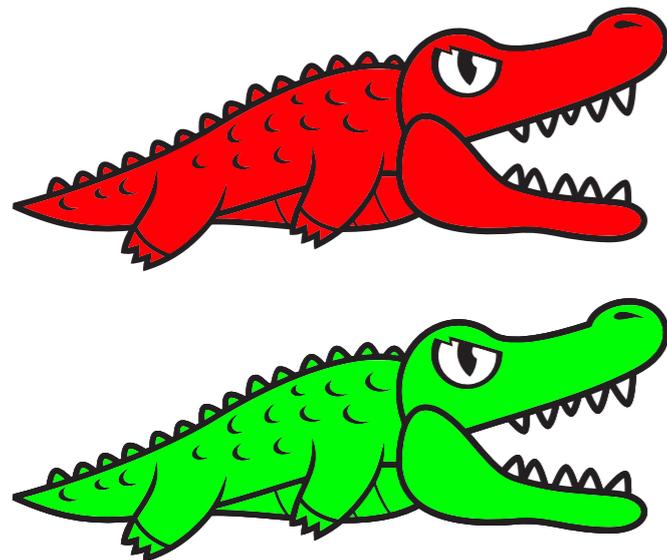
Foster



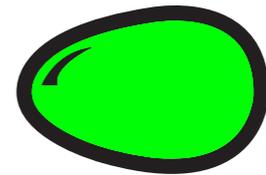
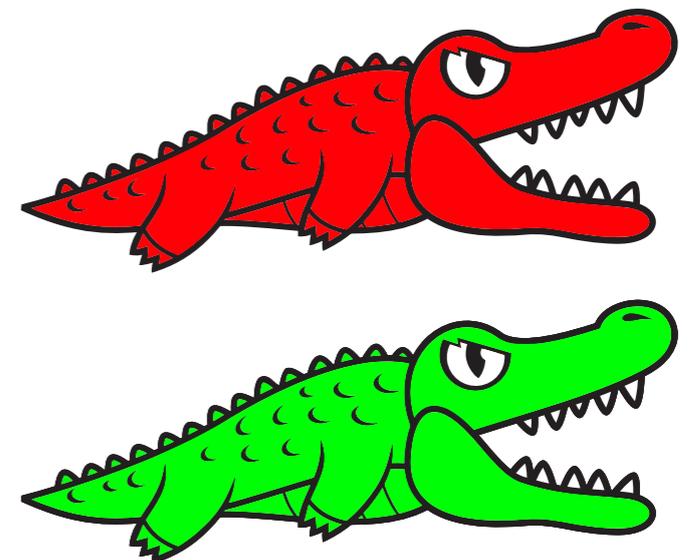
Pouvez-vous trouver une famille qui, après application des règles, détecte la présence de la famille Thompson parmi les deux familles devant, en produisant la famille Thompson, et sinon produit la famille Foster ?

Les familles Thompson et Foster

Thompson



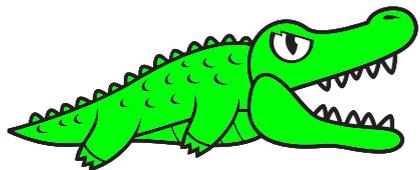
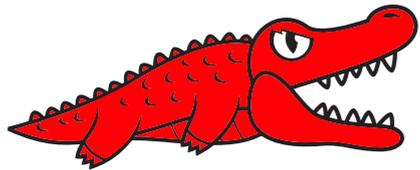
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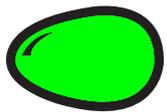
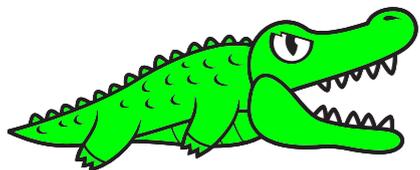
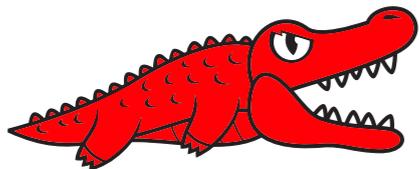
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Qu'avons-nous fait ?

Thompson

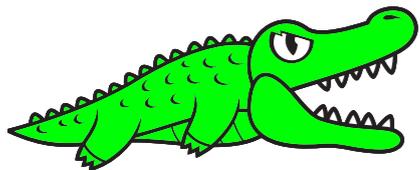
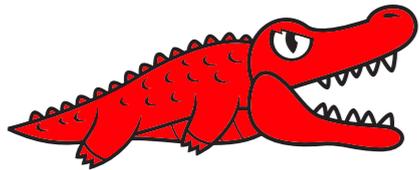


Foster

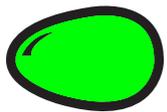
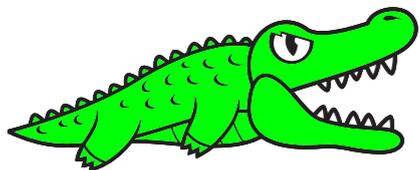
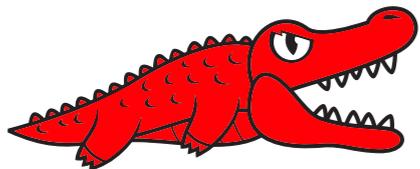


Qu'avons-nous fait ?

Thompson



Foster

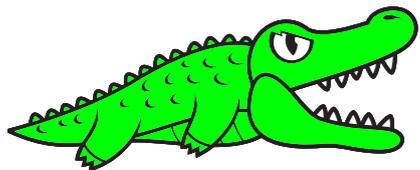
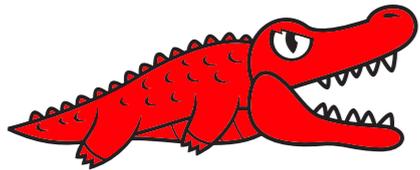


Famille Nelson

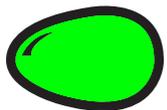
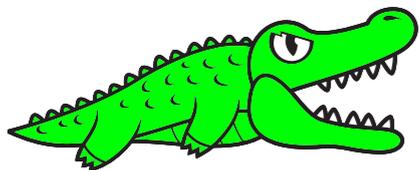
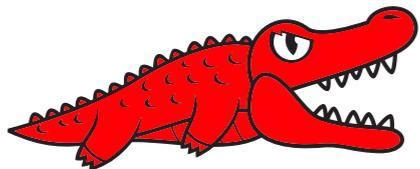
Thompson	Foster
Foster	Thompson

Qu'avons-nous fait ?

Thompson



Foster



Famille Nelson

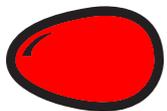
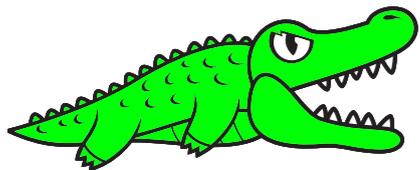
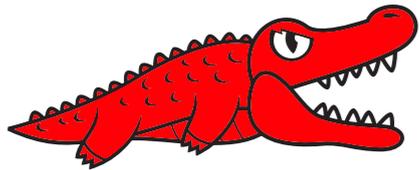
Thompson	Foster
Foster	Thompson

Famille Ortiz

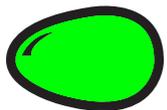
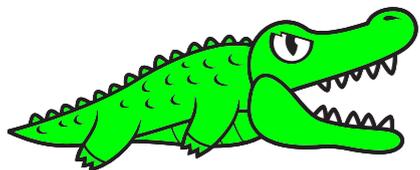
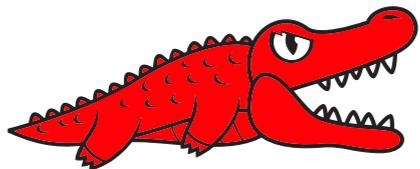
	Thompson	Foster
Thompson	Thompson	Thompson
Foster	Thompson	Foster

Qu'avons-nous fait ?

Thompson



Foster



Famille Nelson

Thompson	Foster
Foster	Thompson

Famille Ortiz

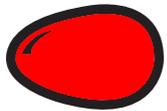
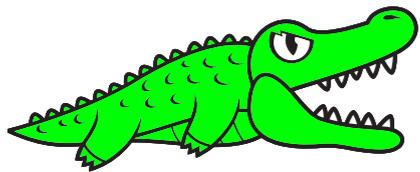
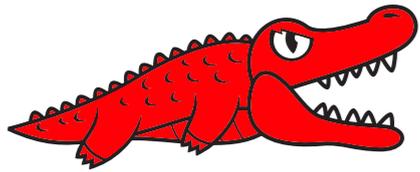
	Thompson	Foster
Thompson	Thompson	Thompson
Foster	Thompson	Foster

Famille Anderson

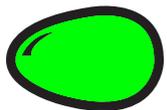
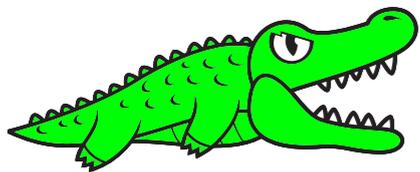
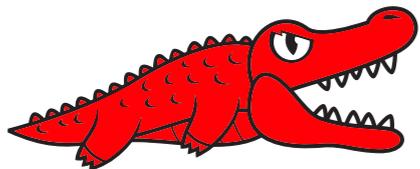
	Thompson	Foster
Thompson	Thompson	Foster
Foster	Foster	Foster

Qu'avons-nous fait ?

Thompson



Foster



Famille Nelson

T	F
F	T

Famille Ortiz

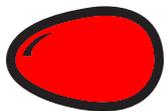
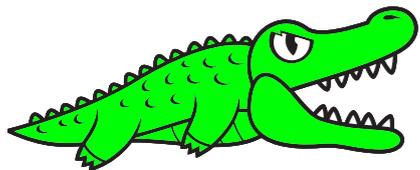
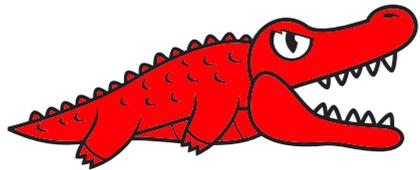
	T	F
T	T	T
F	T	F

Famille Anderson

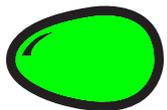
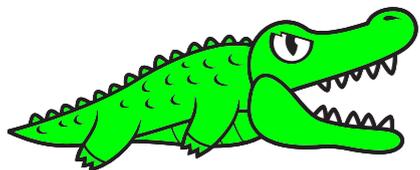
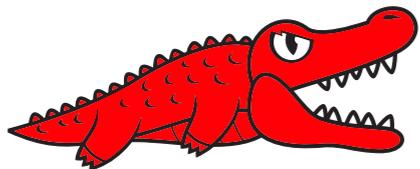
	T	F
T	T	F
F	F	F

Des alligators à la logique booléenne

Thompson



Foster



N : negation \neg

T	F
F	T

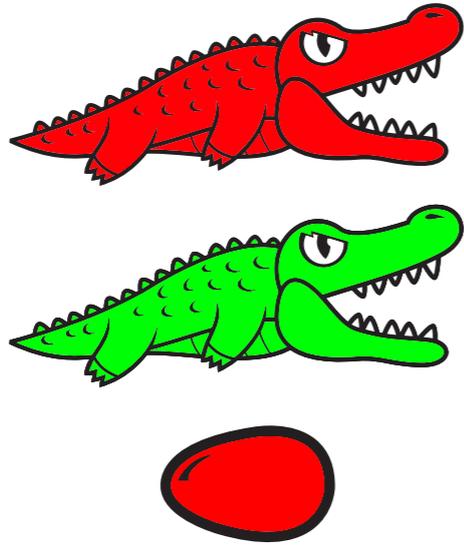
Or : disjonction

\vee	T	F
T	T	T
F	T	F

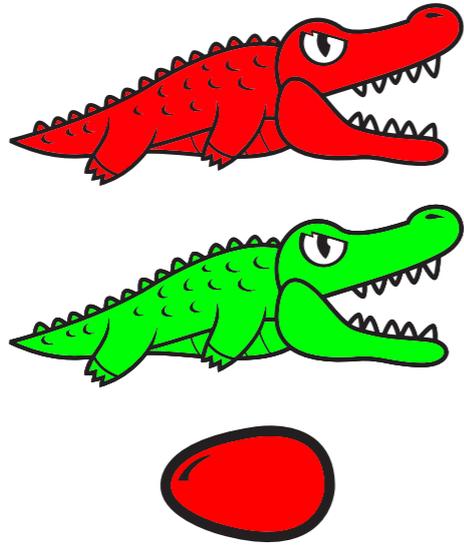
And : conjonction

\wedge	T	F
T	T	F
F	F	F

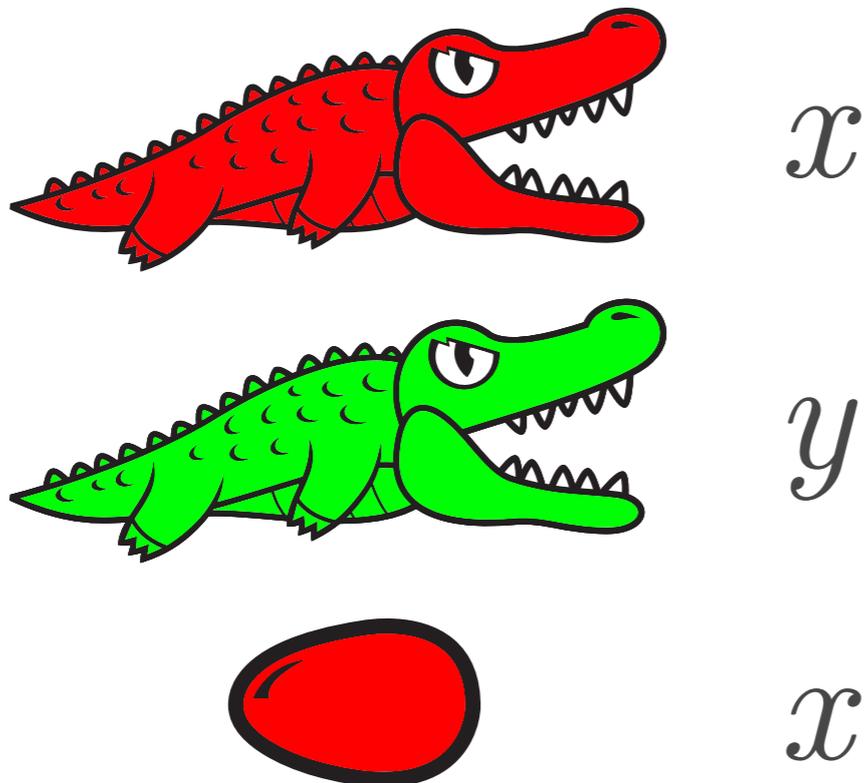
Comment écrire plus aisément les familles d'alligators ?



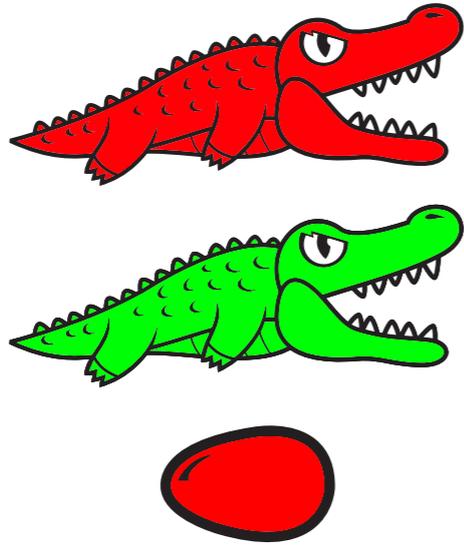
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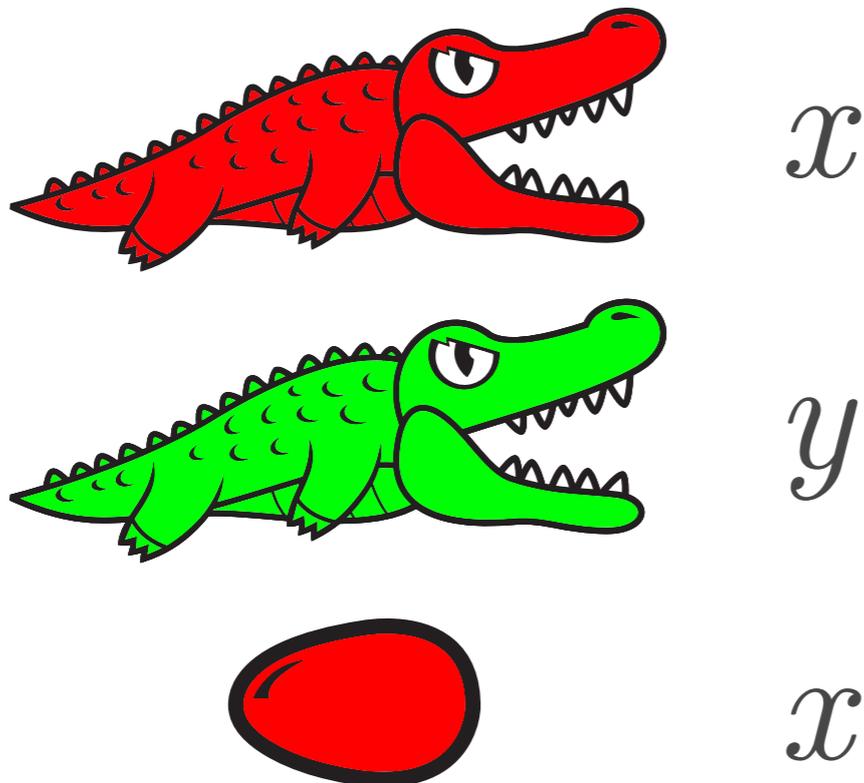
Problème n°1 : les couleurs



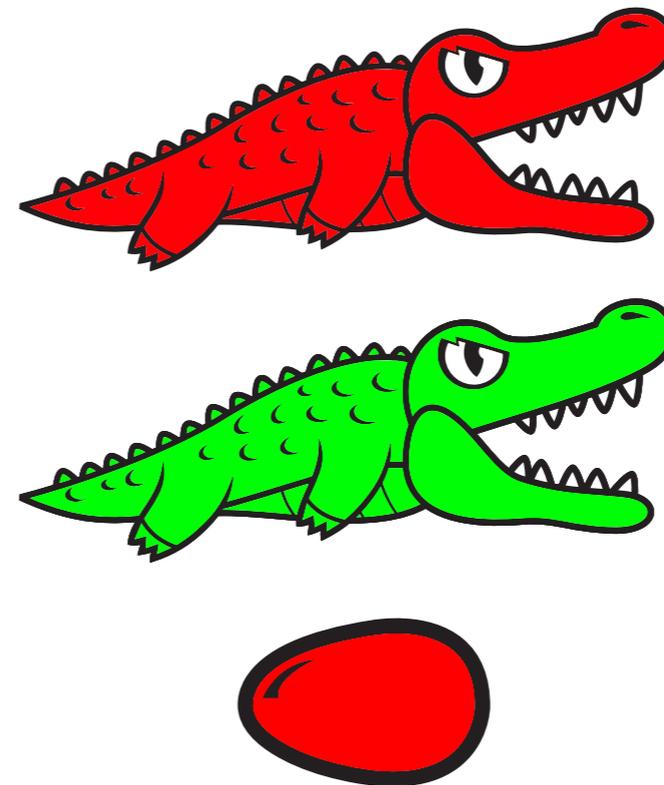
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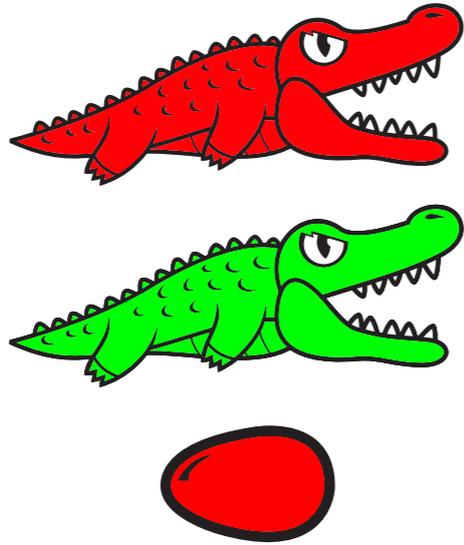
Problème n°1 : les couleurs



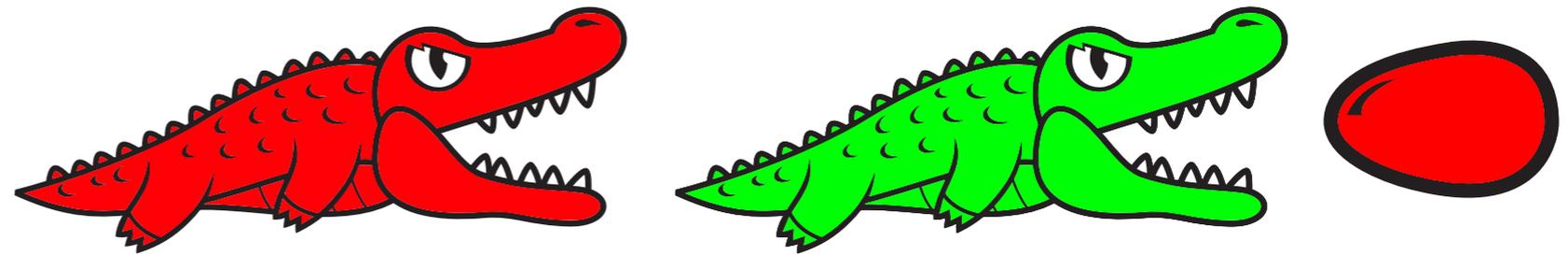
Problème n°2 : les dessins



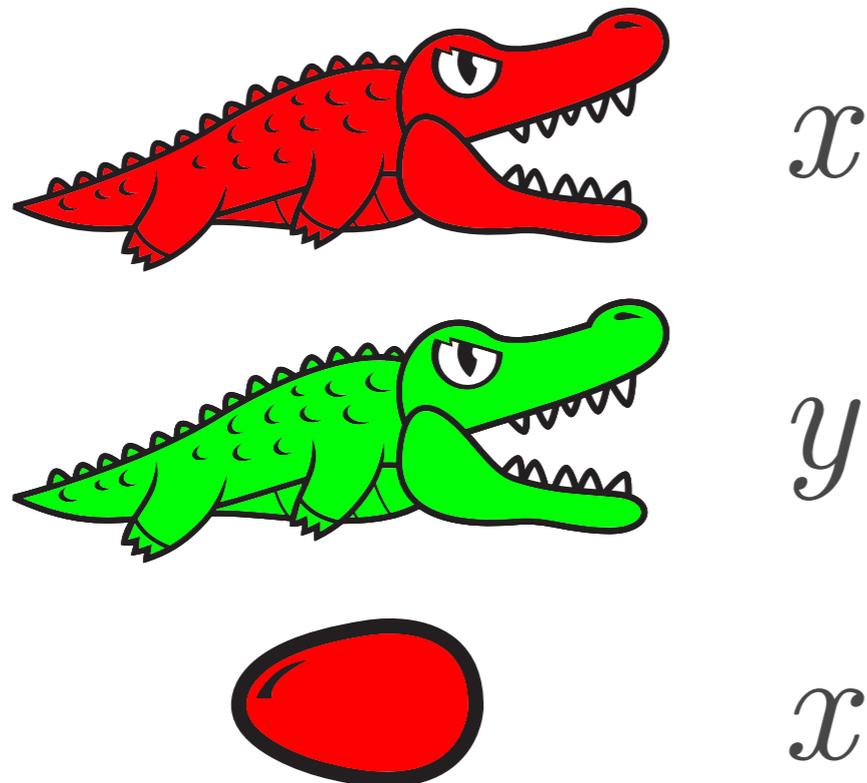
Comment écrire plus aisément les familles d'alligators ?



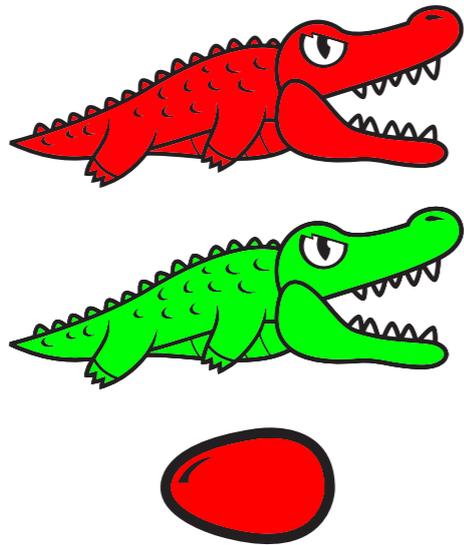
Problème n°2 : les dessins



Problème n°1 : les couleurs



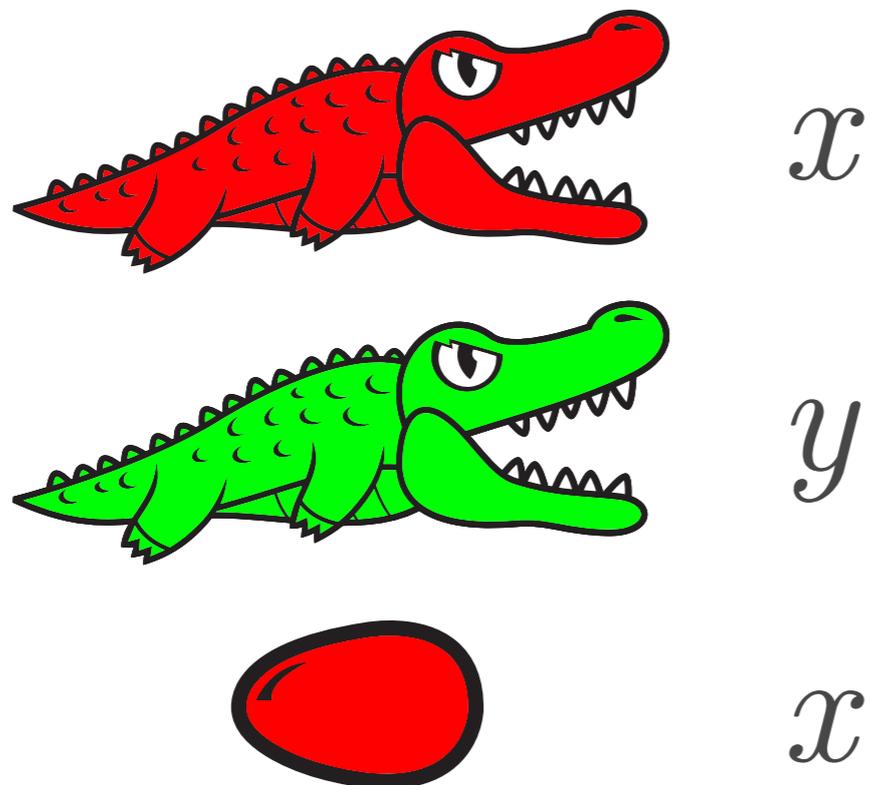
Comment écrire plus aisément les familles d'alligators ?



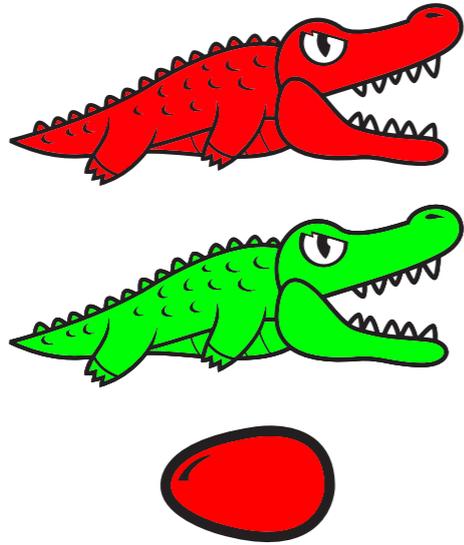
Problème n°2 : les dessins



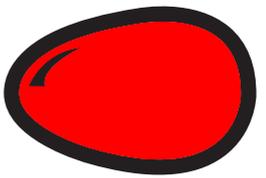
Problème n°1 : les couleurs



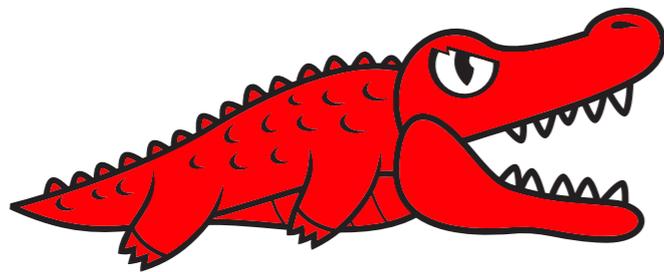
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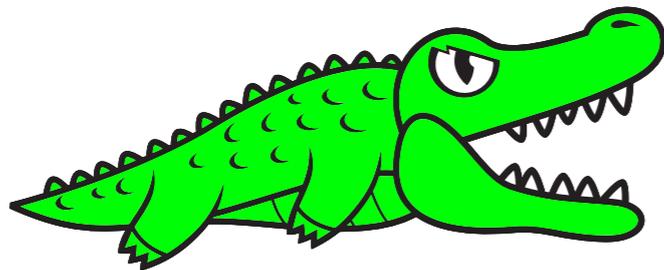
Problème n°2 : les dessins



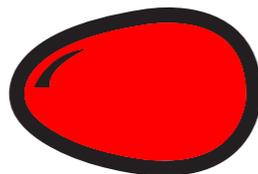
Problème n°1 : les couleurs



x

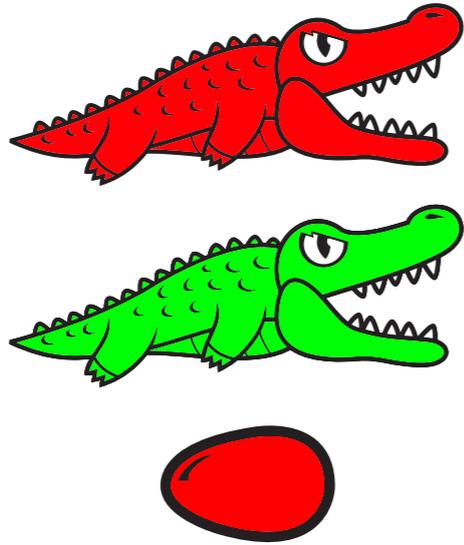


y

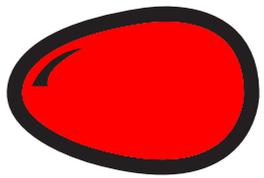


x

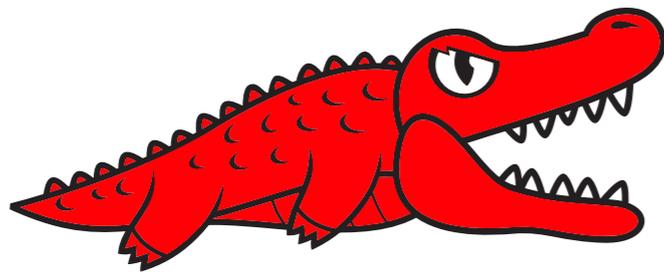
Comment écrire plus aisément les familles d'alligators ?



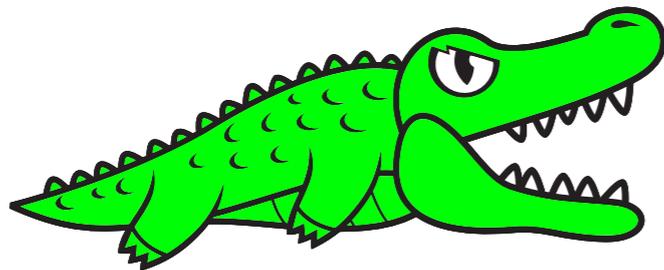
Problème n°2 : les dessins



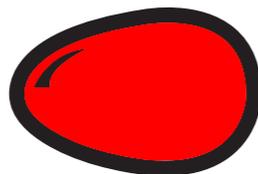
Problème n°1 : les couleurs



x



y



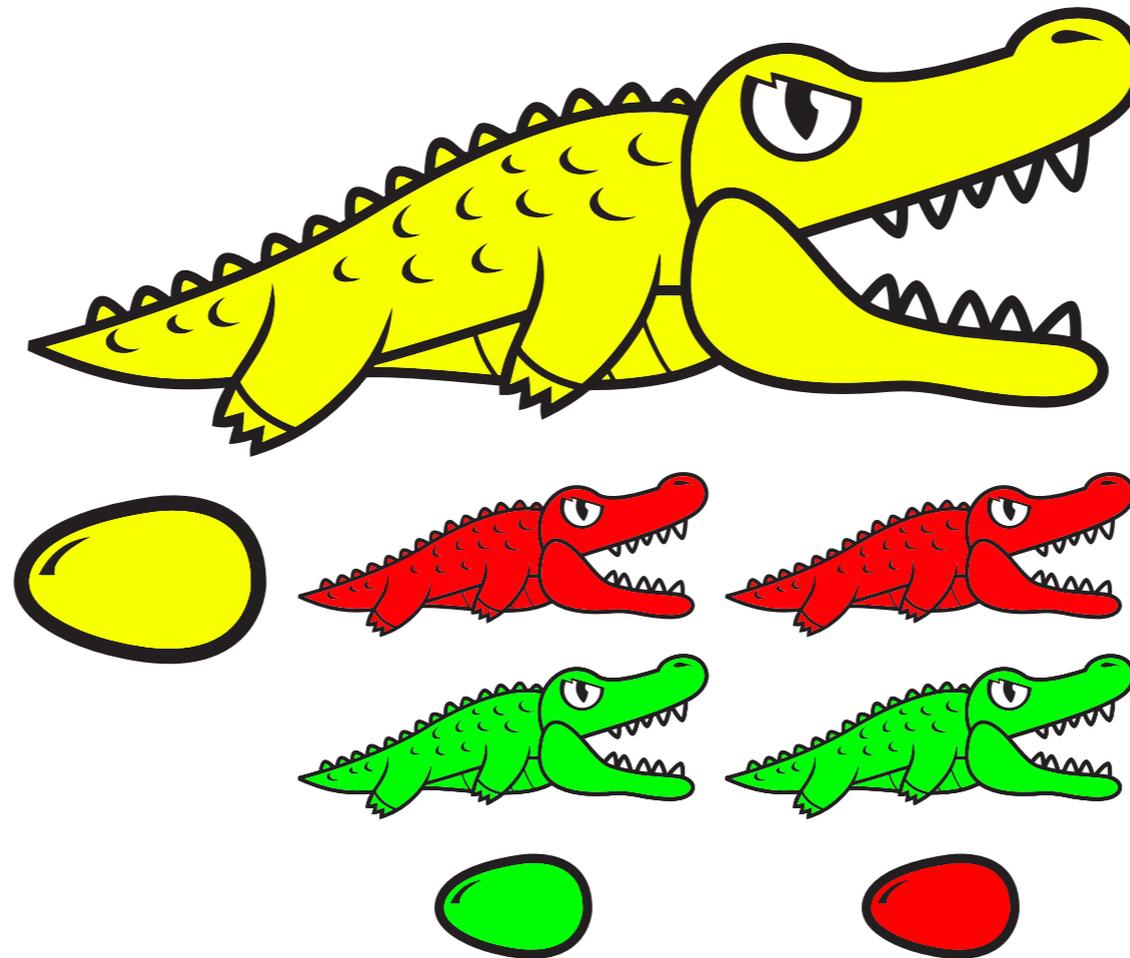
x

Solution :

$\lambda x \lambda y x$

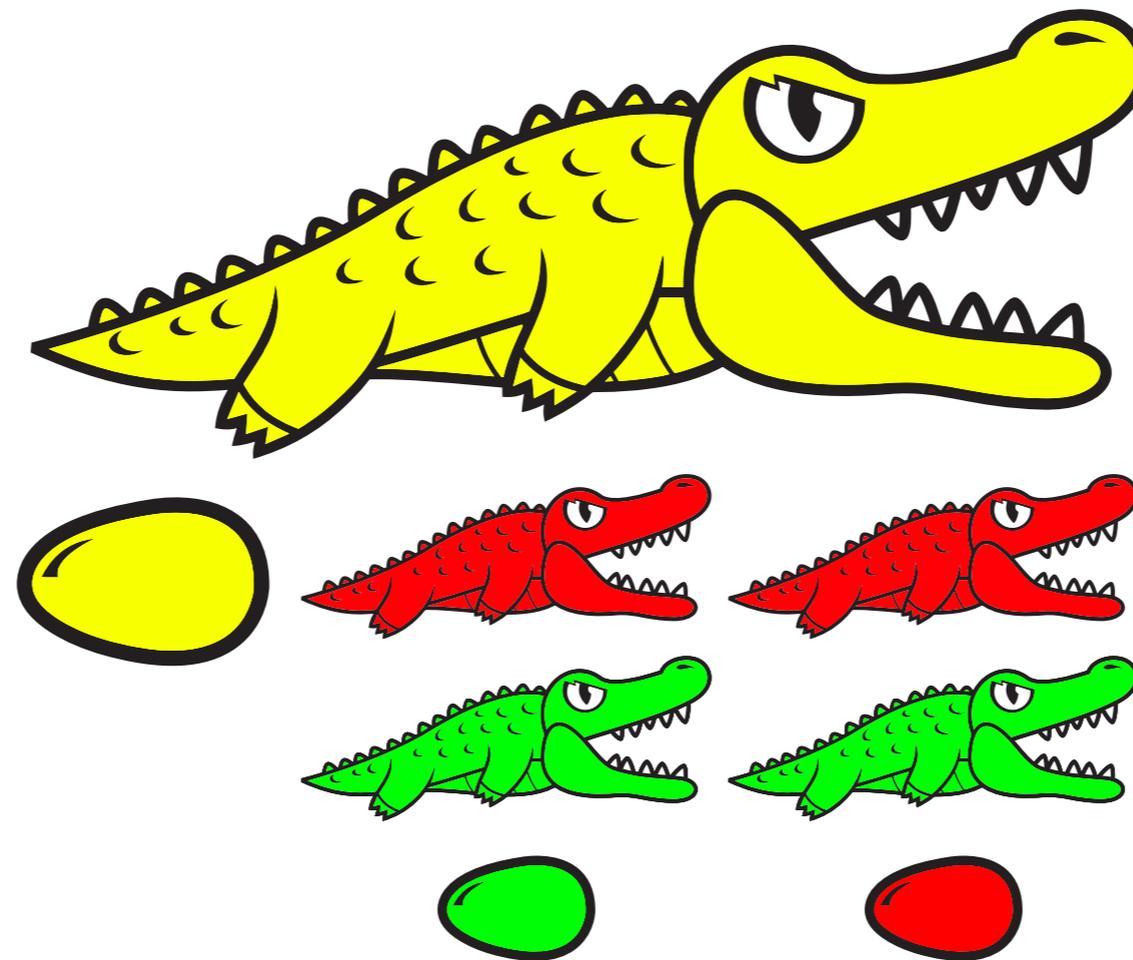
Comment écrire plus aisément les familles d'alligators ?

Famille Nelson



Comment écrire plus aisément les familles d'alligators ?

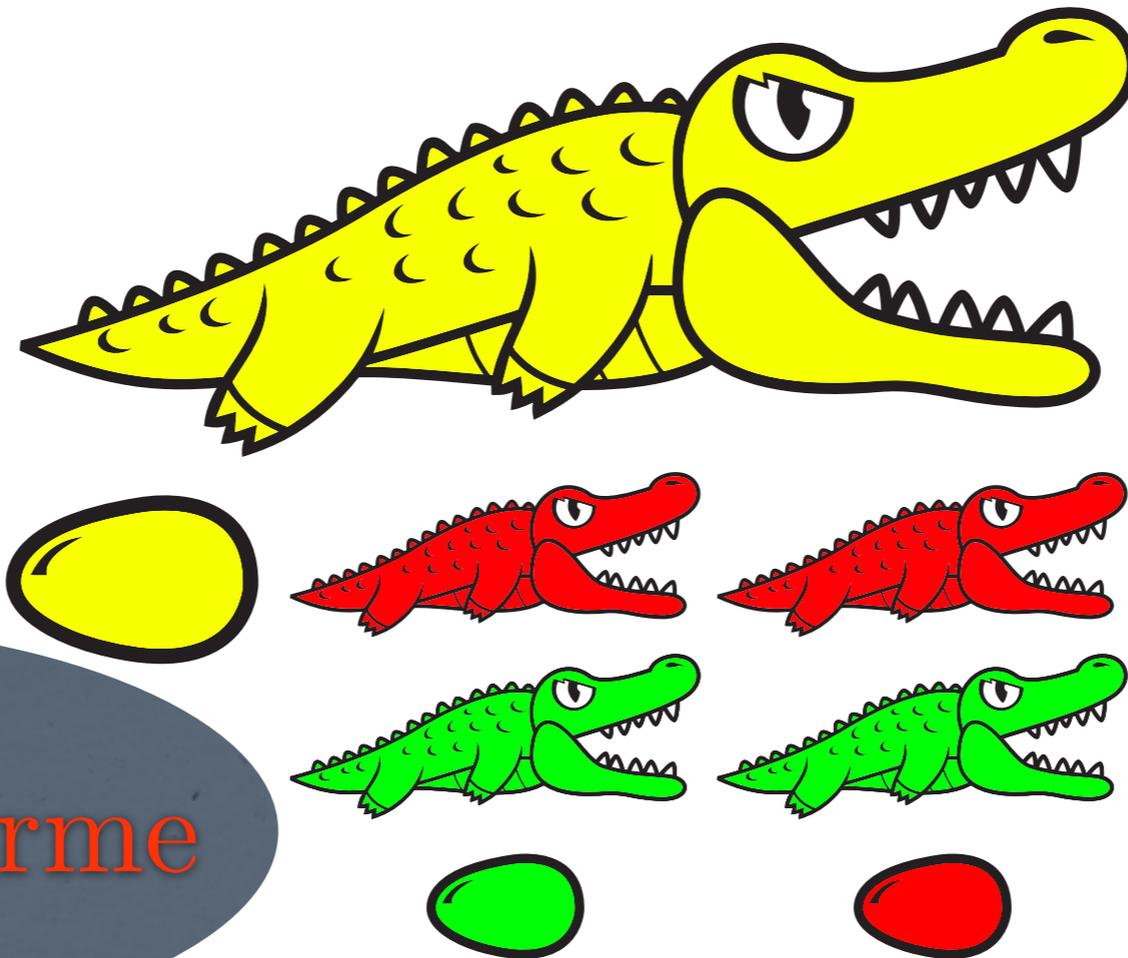
Famille Nelson



λz z $(\lambda x \lambda y y)$ $(\lambda x \lambda y x)$

Comment écrire plus aisément les familles d'alligators ?

Famille Nelson

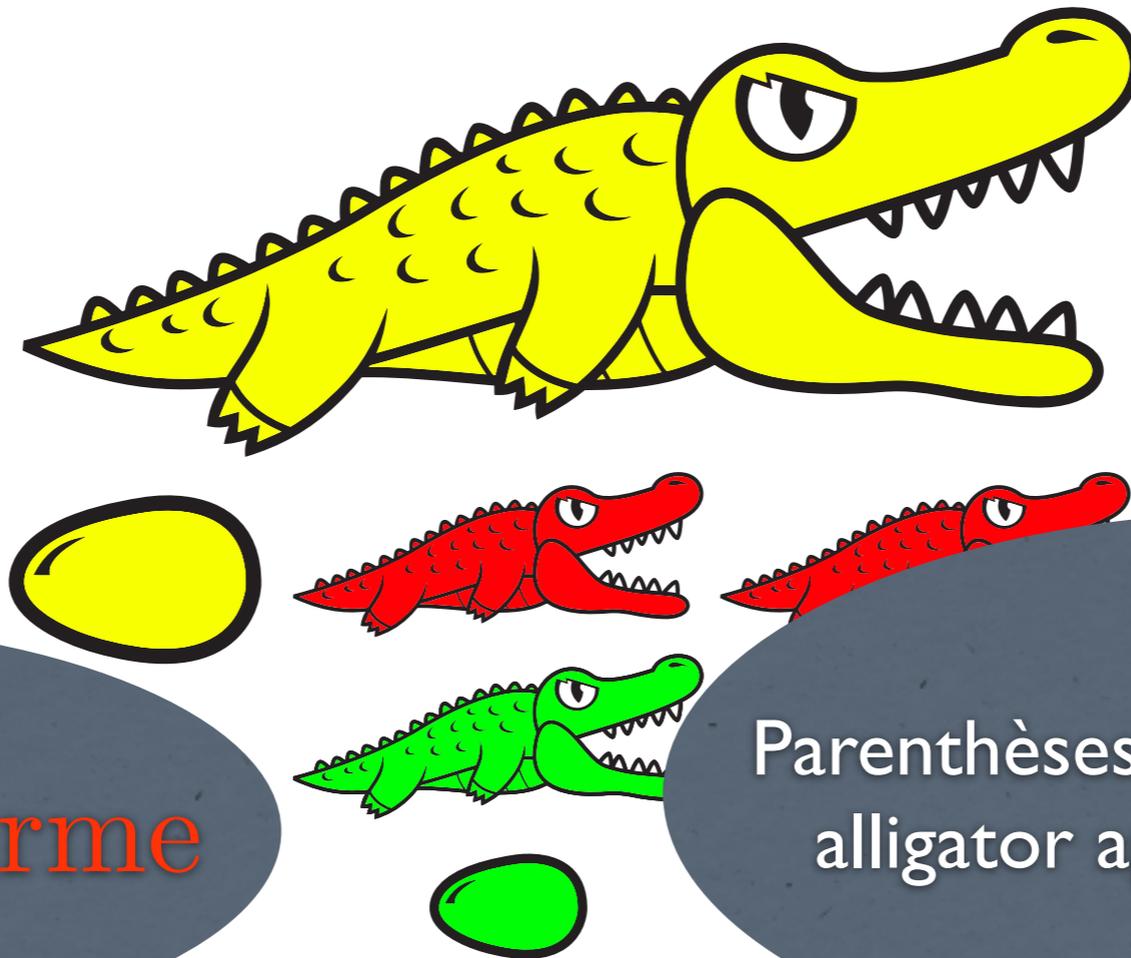


On m'appelle λ -terme

$\lambda z \quad z \quad (\lambda x \lambda y y) \quad (\lambda x \lambda y x)$

Comment écrire plus aisément les familles d'alligators ?

Famille Nelson

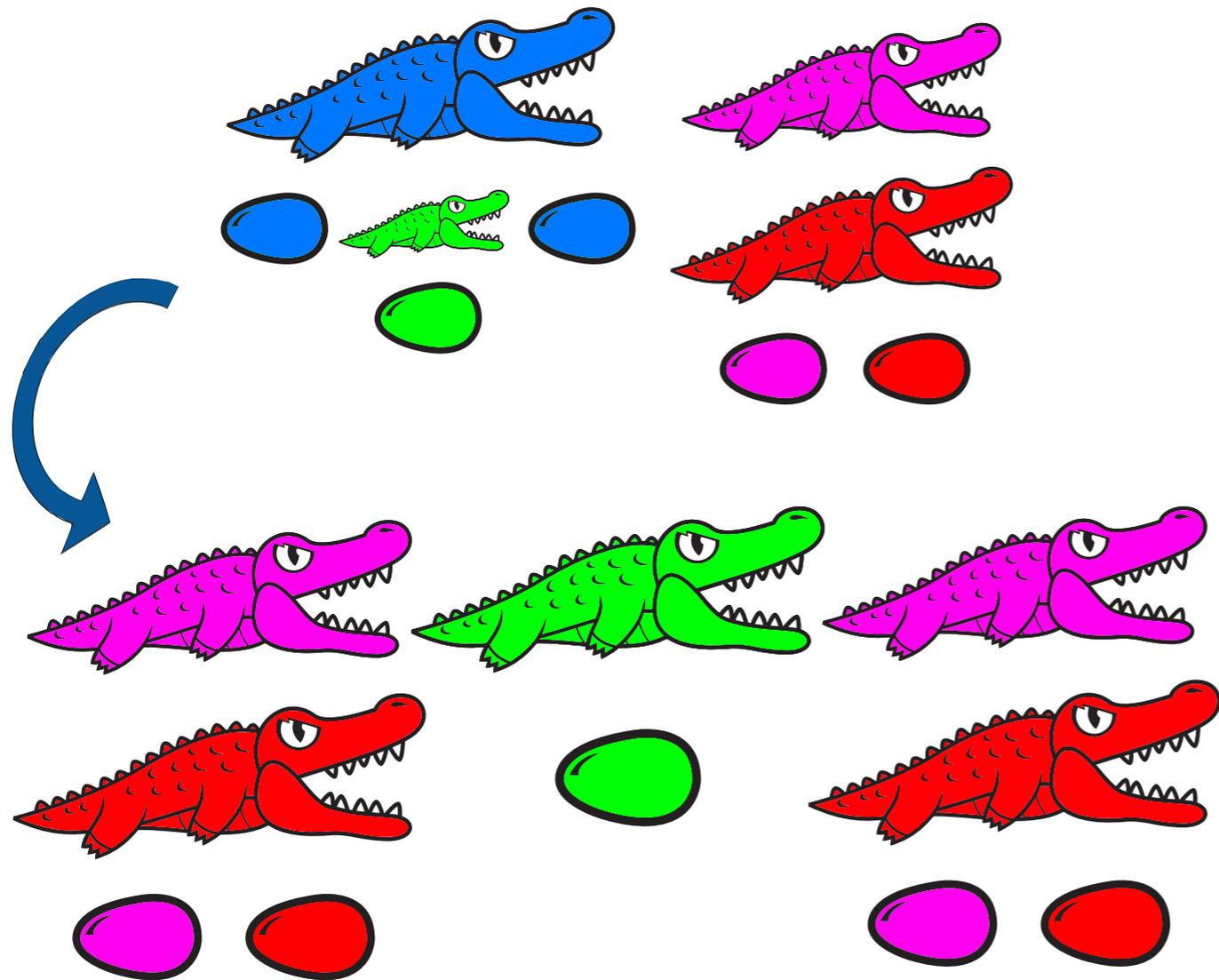


On m'appelle λ -terme

Parenthèses supplémentaires : un alligator apeuré n'a pas faim !

$$\lambda z \left(z \left(\lambda x \lambda y y \right) \right) \left(\lambda x \lambda y x \right)$$

Règle de repas : β -réduction

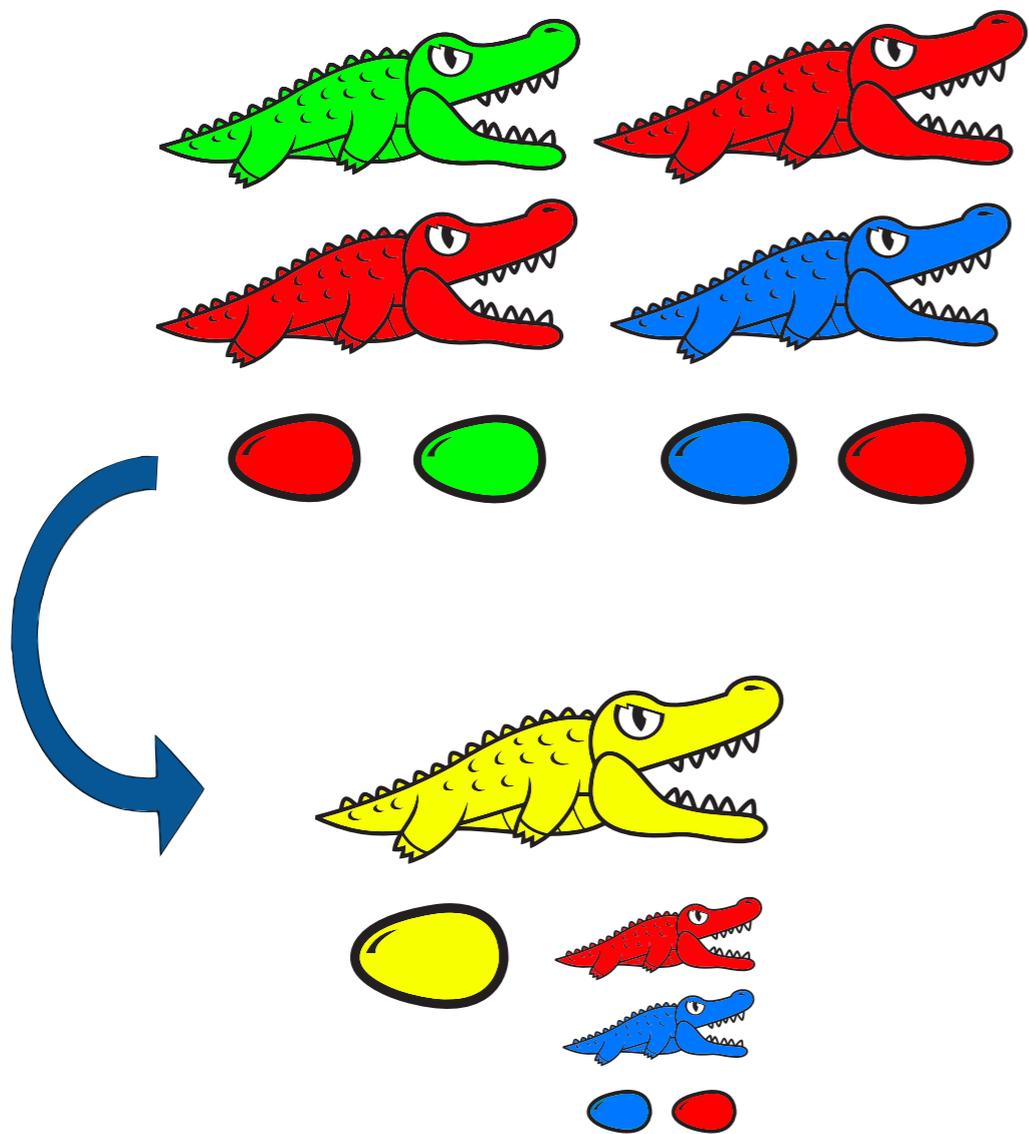


$(\lambda x t) u$

\downarrow
 $t[x := u]$

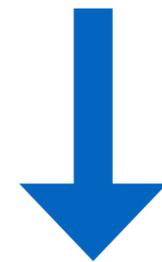
λ -terme t où toute occurrence de x est remplacée par le λ -terme u

Règle de couleur : α -conversion



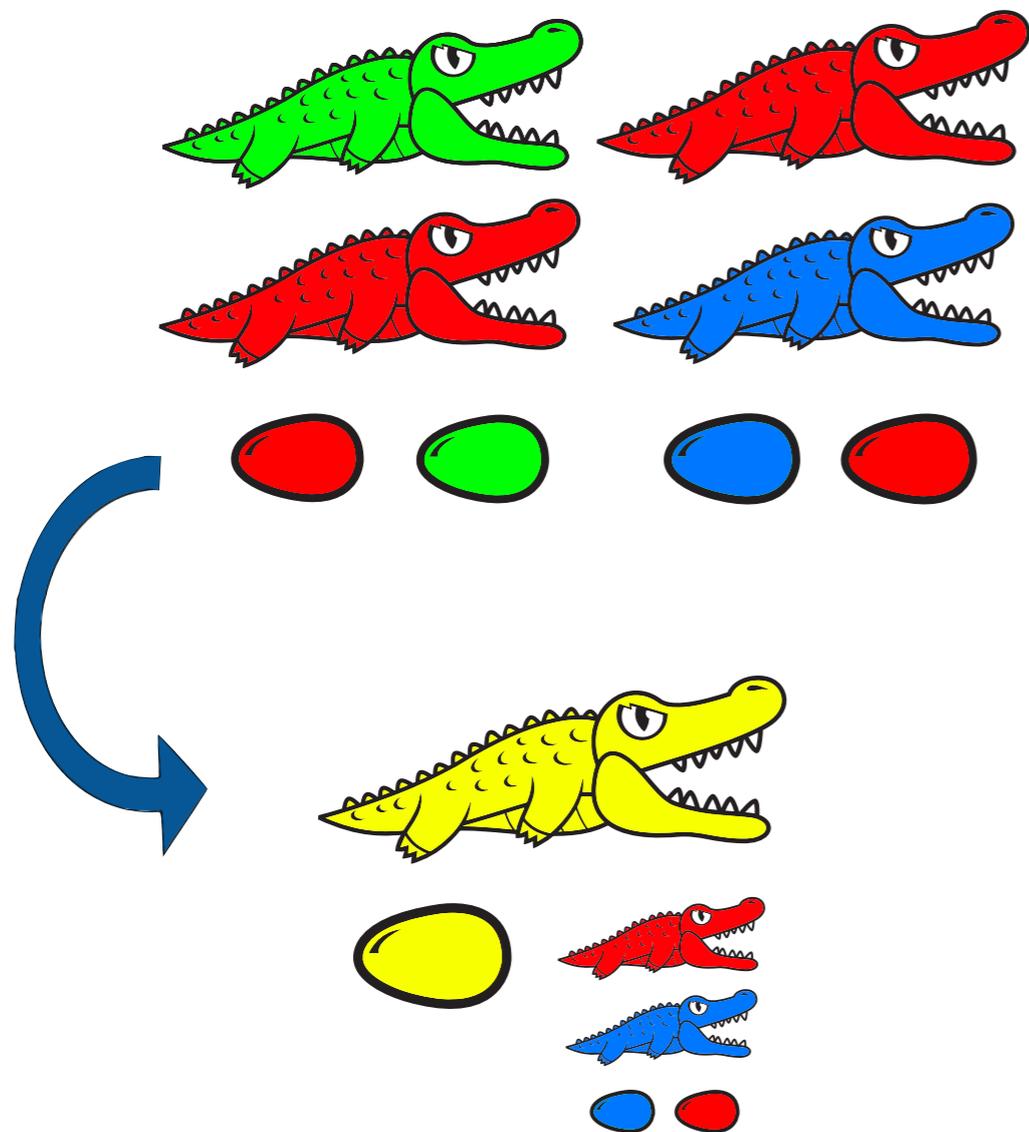
λ -terme t sans la variable y

$\lambda x t$



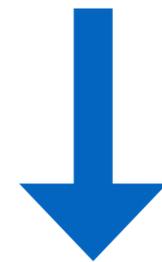
$\lambda y t[x := y]$

Règle de couleur : α -conversion



λ -terme t sans la variable y

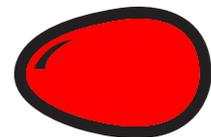
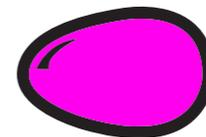
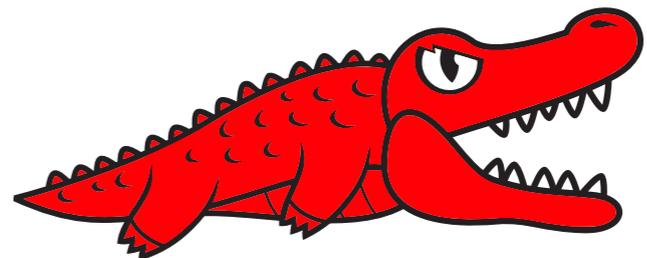
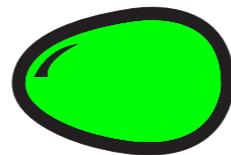
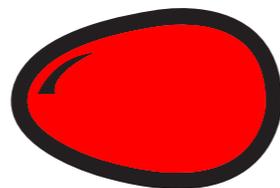
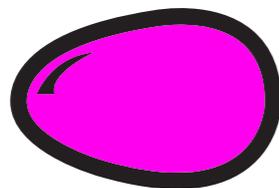
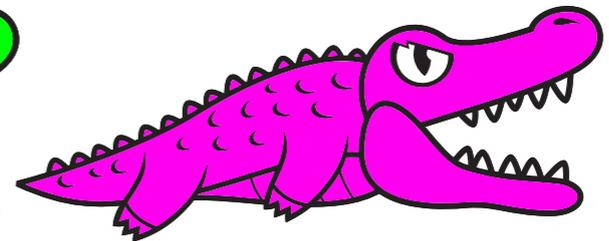
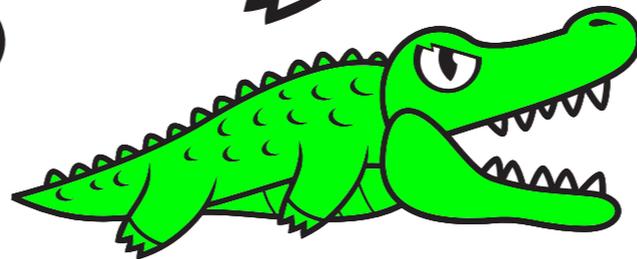
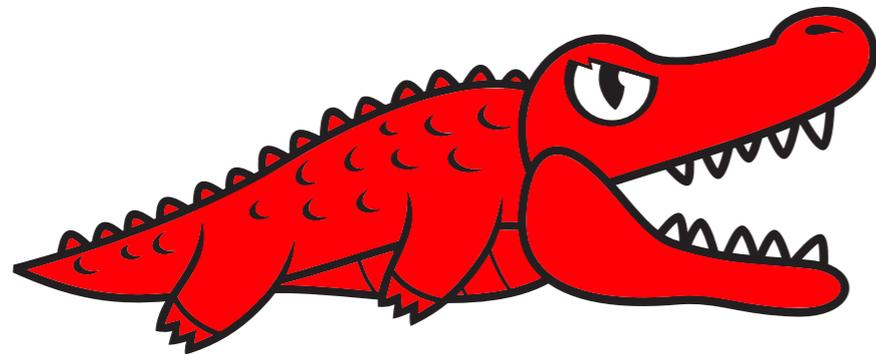
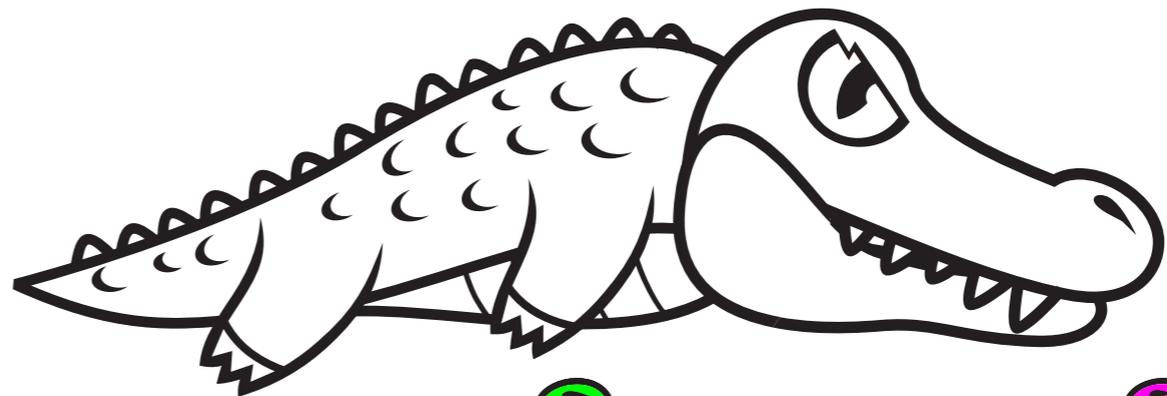
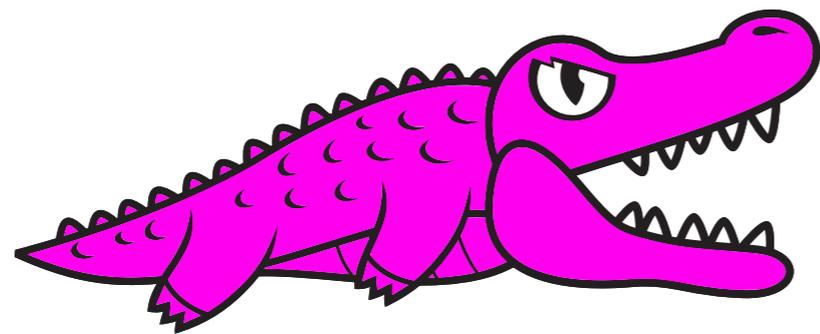
$\lambda x t$



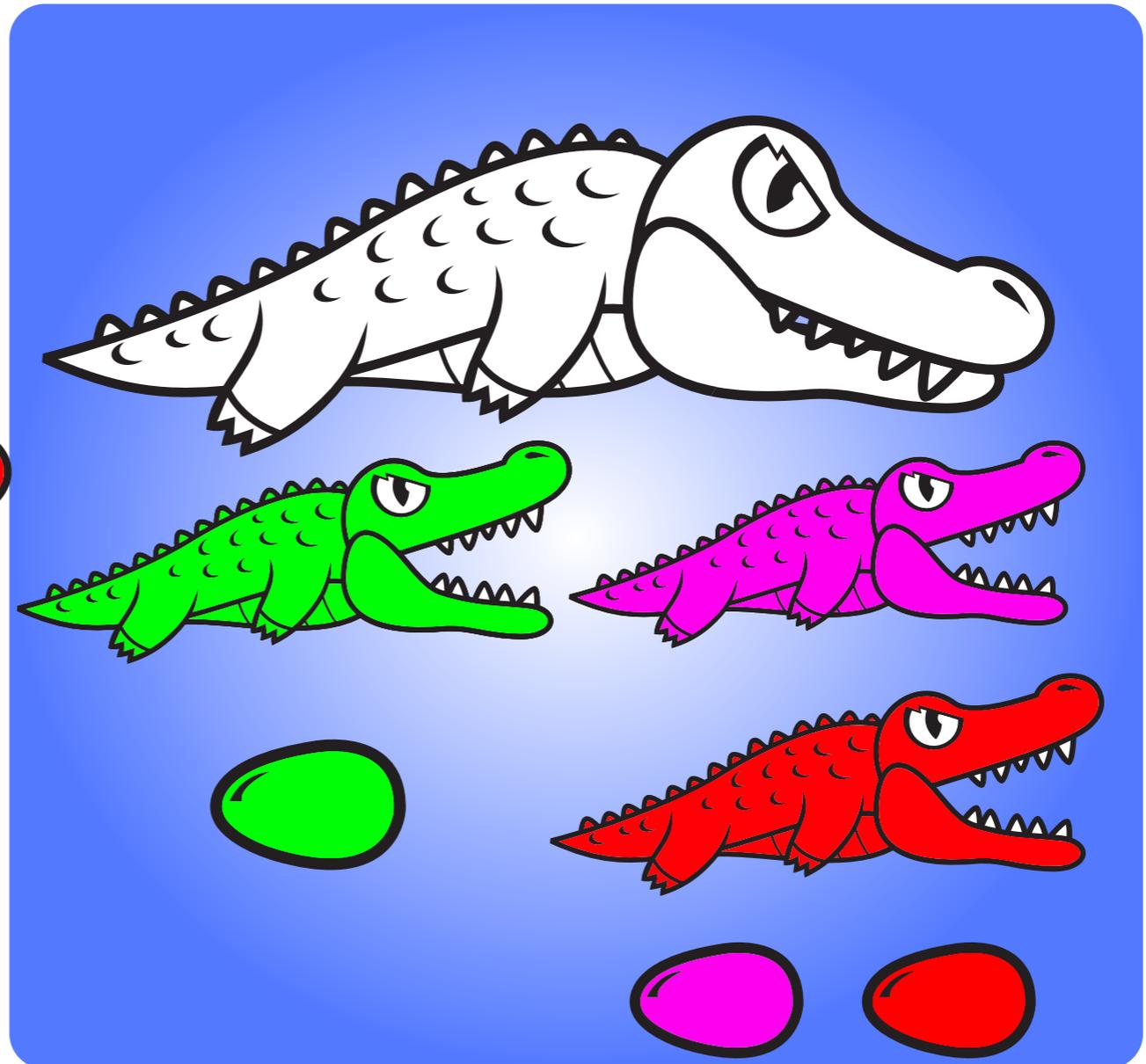
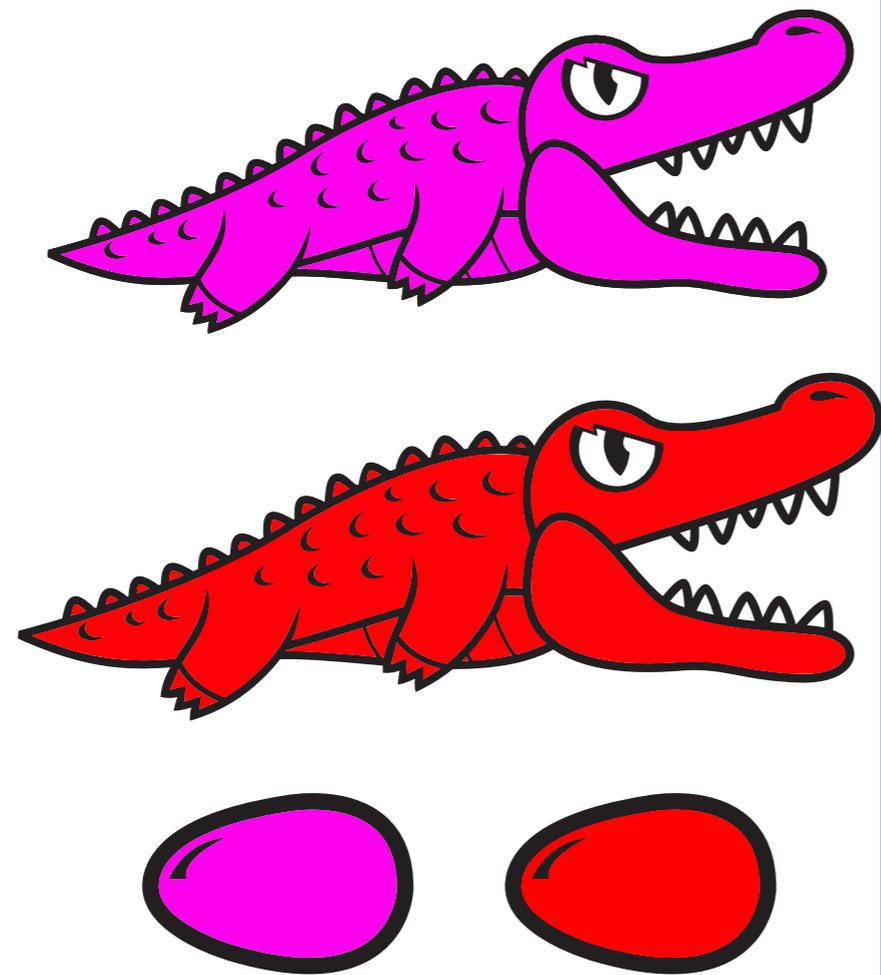
$\lambda y t[x := y]$

On peut appliquer une règle à tout endroit !

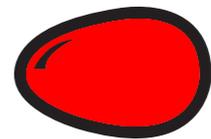
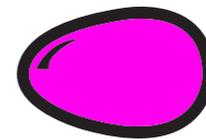
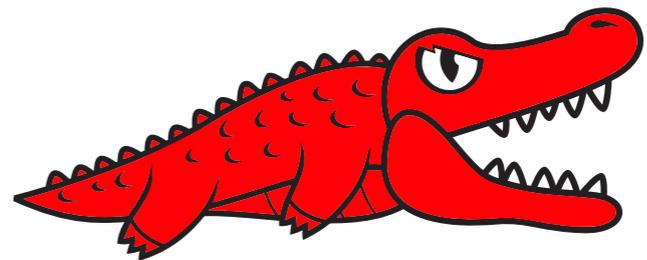
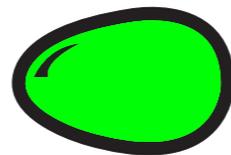
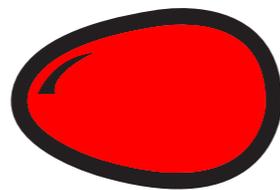
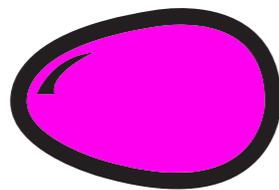
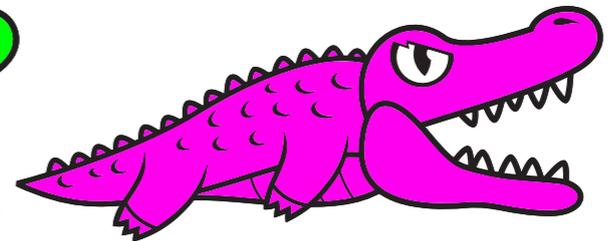
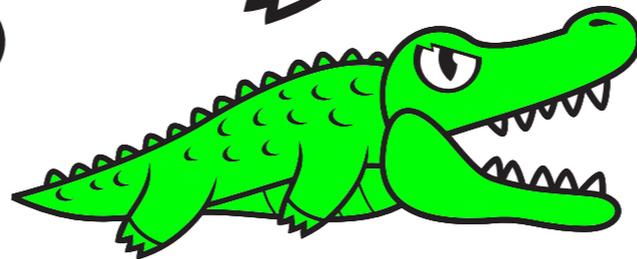
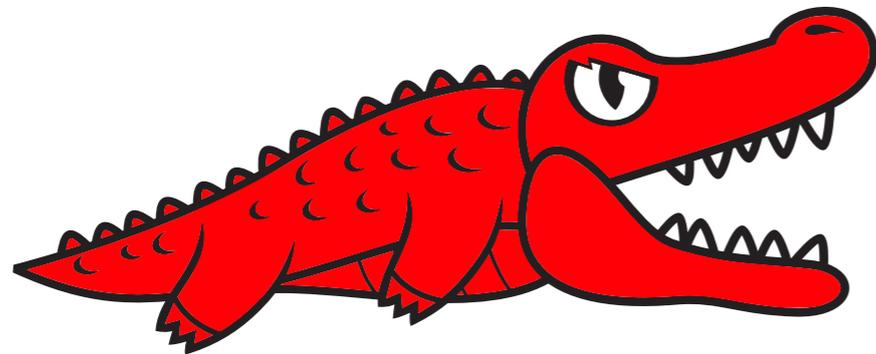
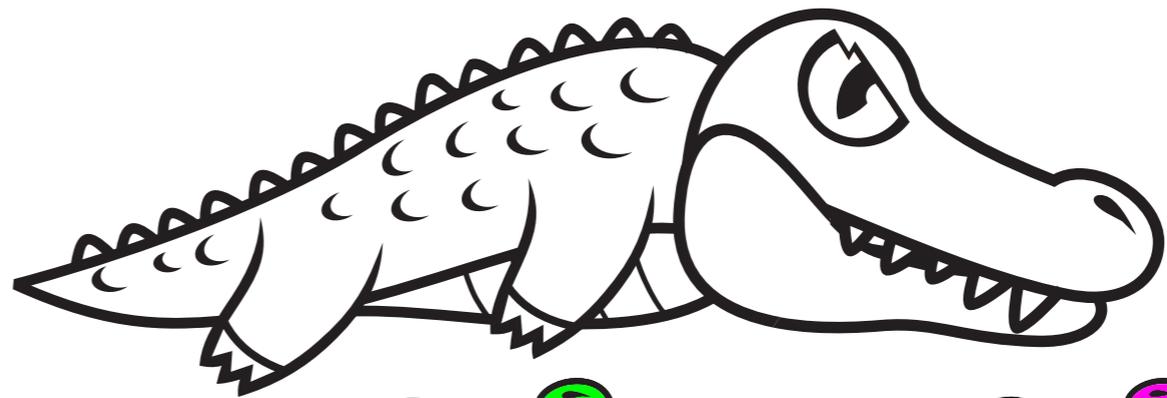
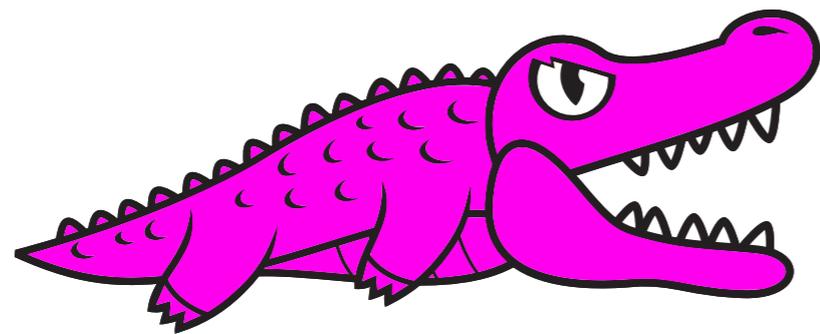
Alligators âgés : des parenthèses en plus



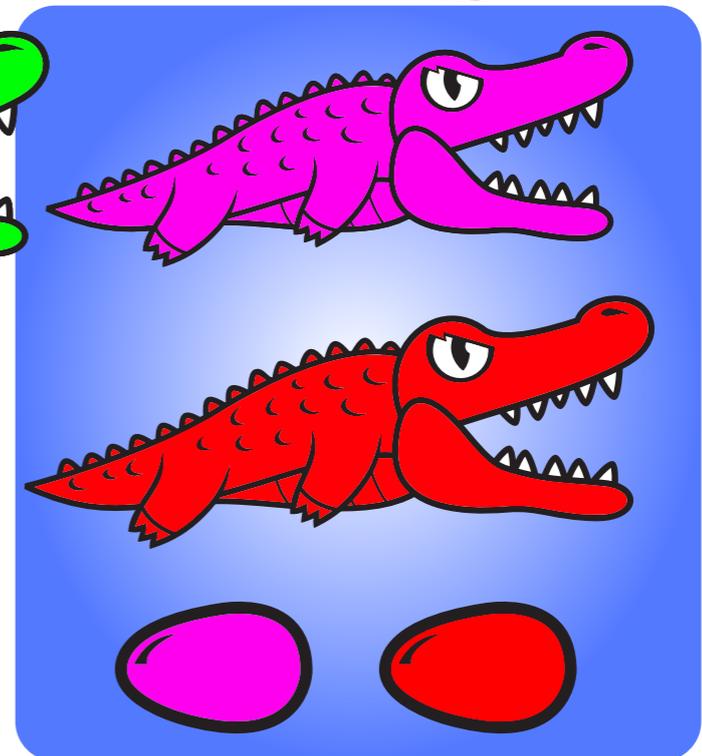
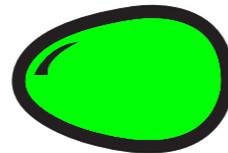
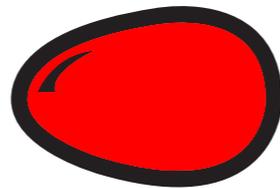
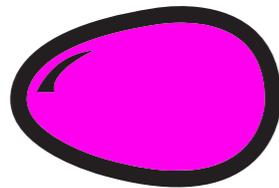
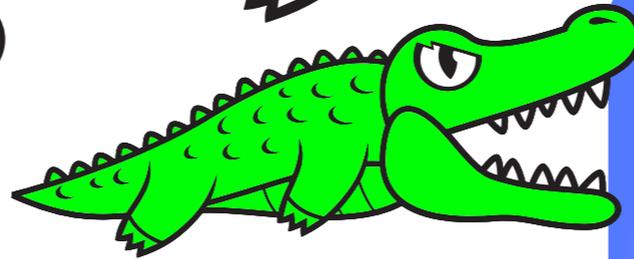
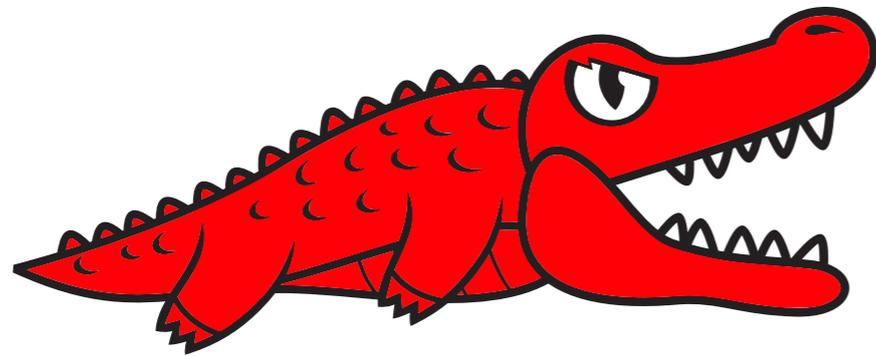
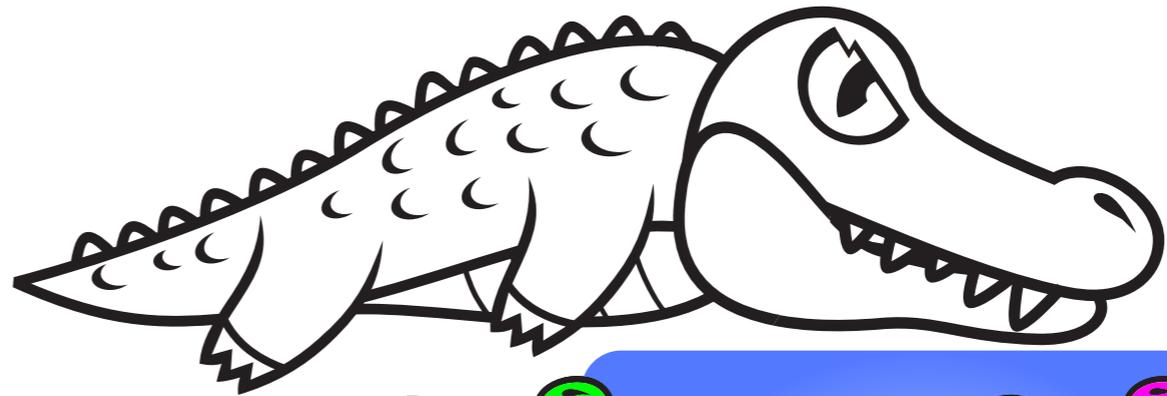
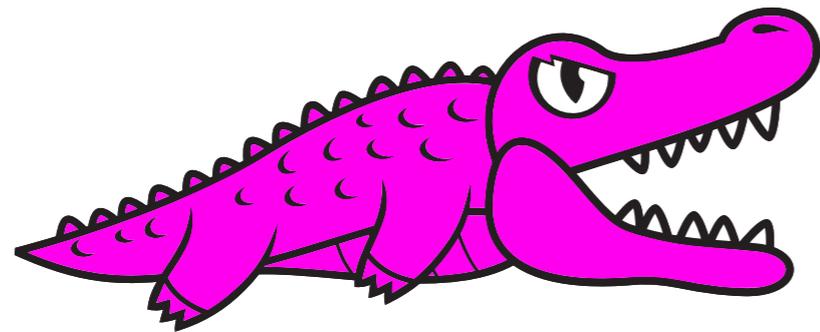
Alligators âgés : des parenthèses en plus



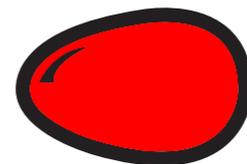
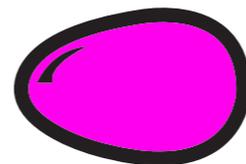
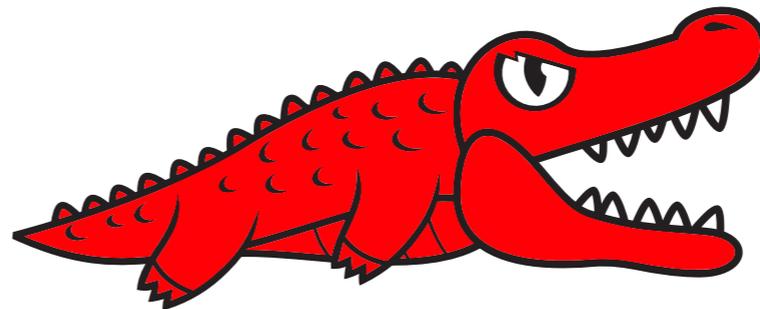
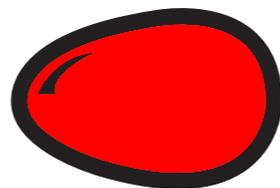
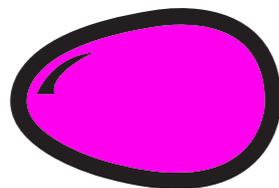
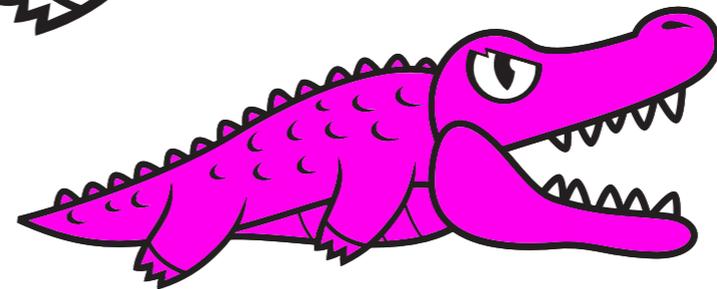
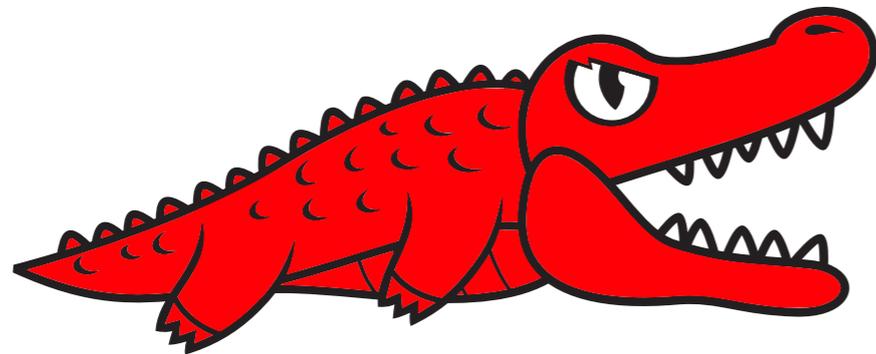
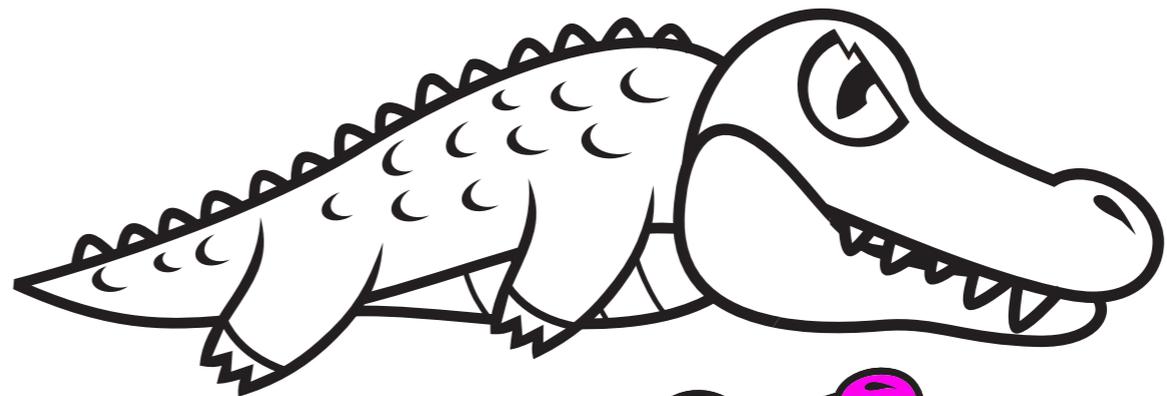
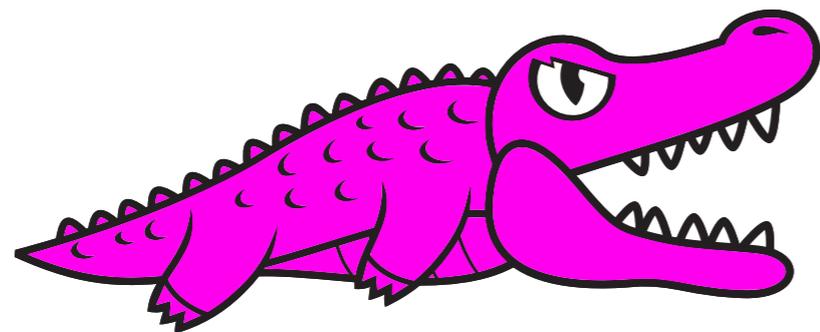
Alligators âgés : des parenthèses en plus



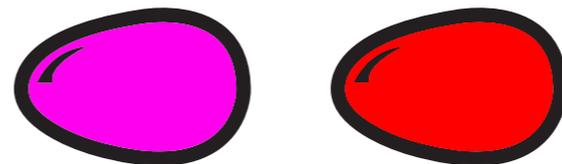
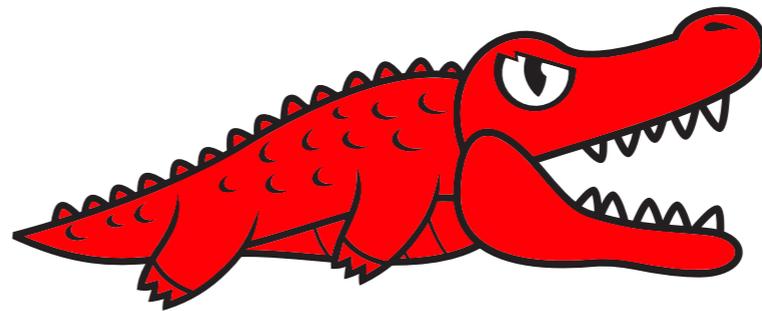
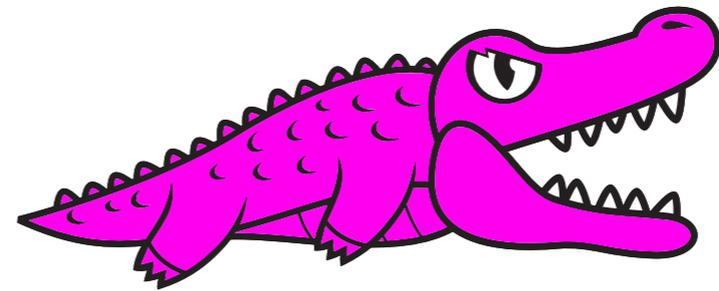
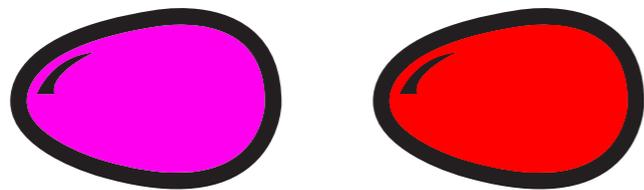
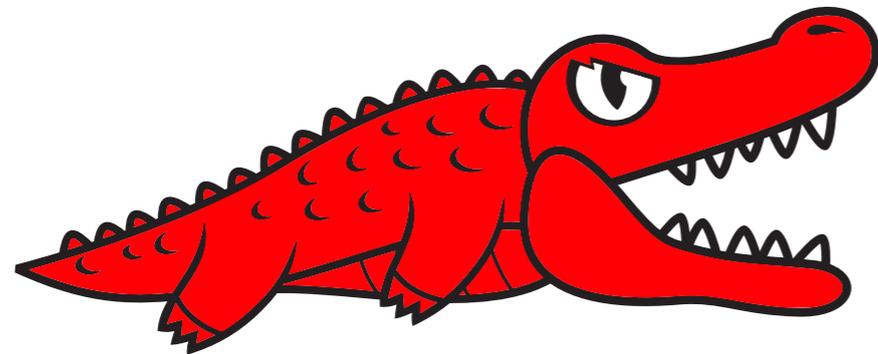
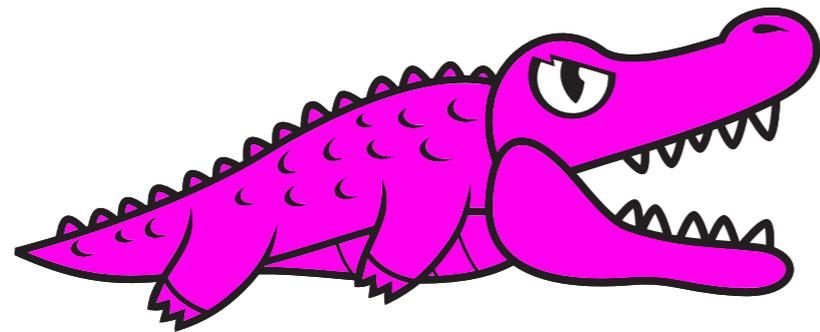
Alligators âgés : des parenthèses en plus



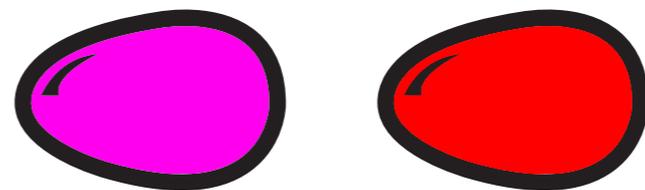
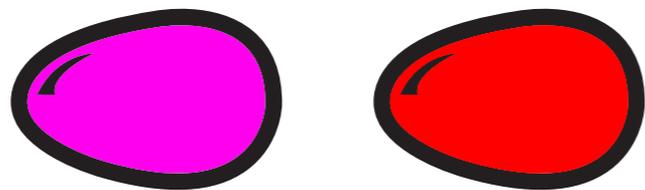
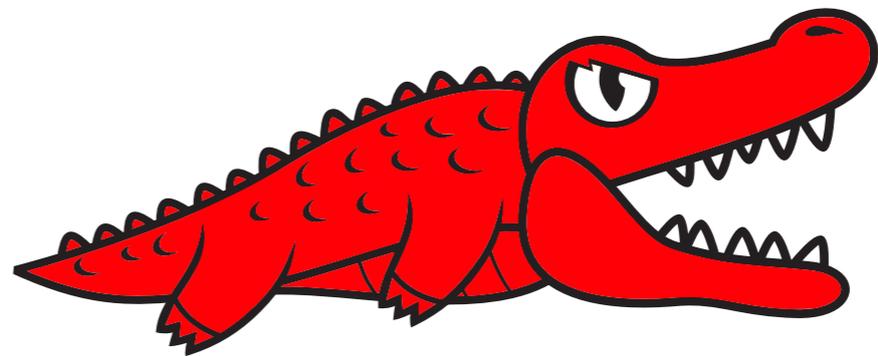
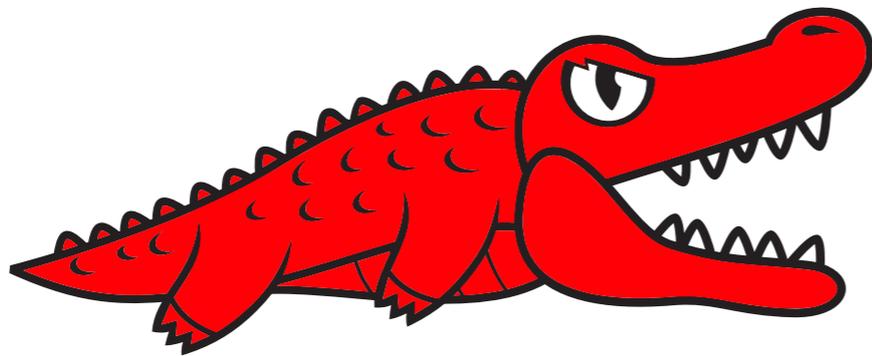
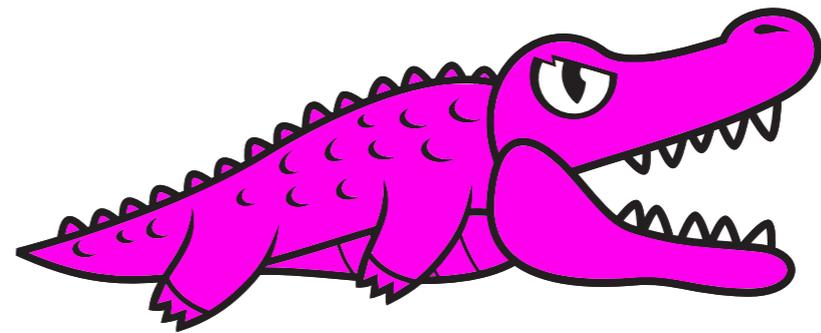
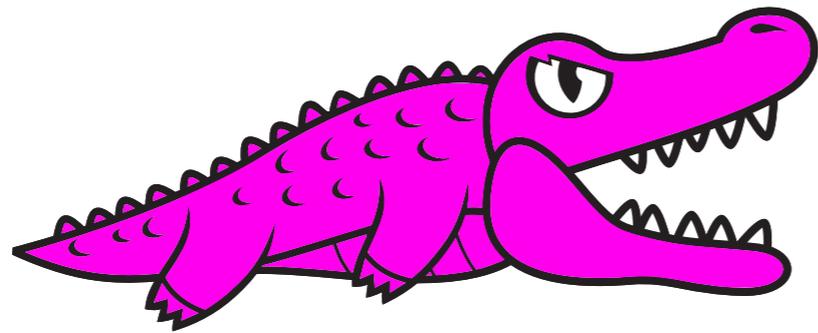
Alligators âgés : des parenthèses en plus



Alligators âgés : des parenthèses en plus

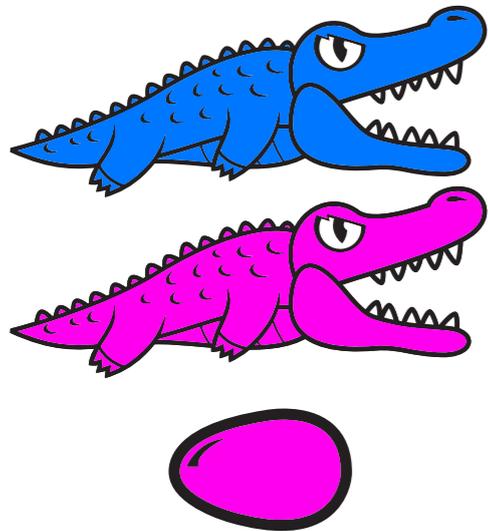


Alligators âgés : des parenthèses en plus



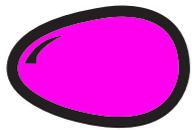
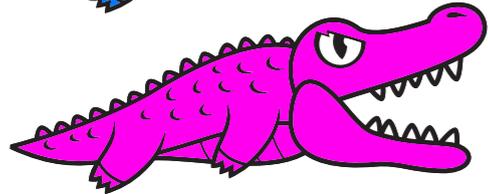
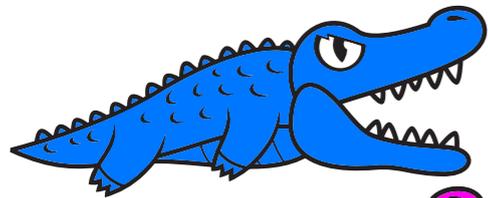
Trop de familles : numérotons-les

Famille 0



Trop de familles : numérotons-les

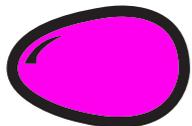
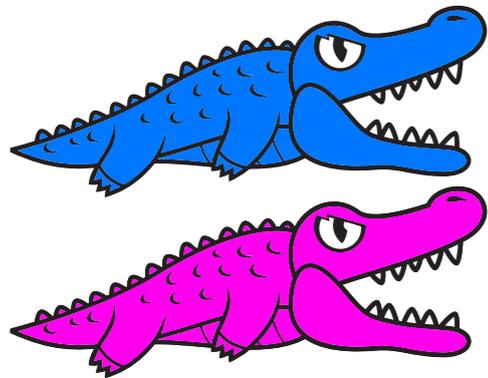
Famille 0



$$0 = \lambda x \lambda y y$$

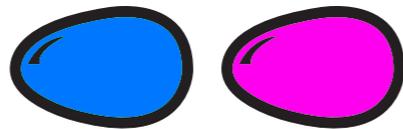
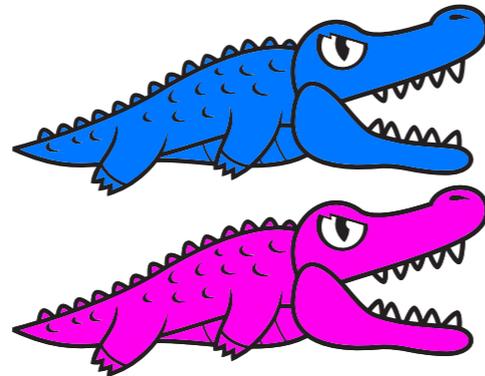
Trop de familles : numérotons-les

Famille 0



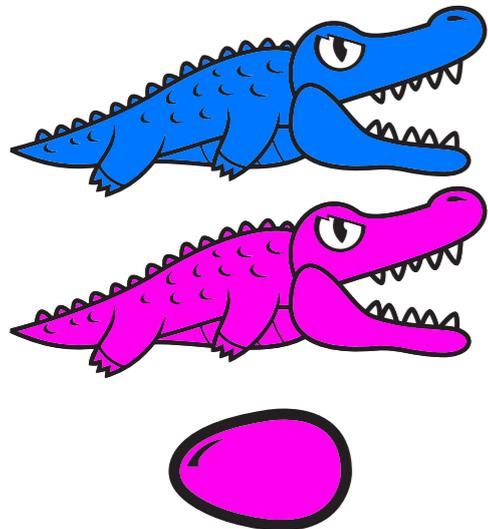
$$0 = \lambda x \lambda y y$$

Famille 1



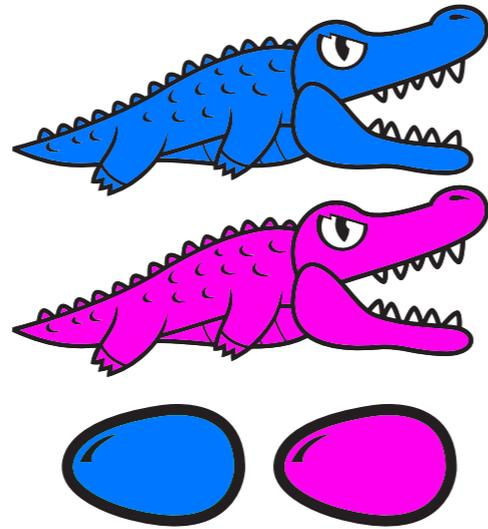
Trop de familles : numérotons-les

Famille 0



$$0 = \lambda x \lambda y y$$

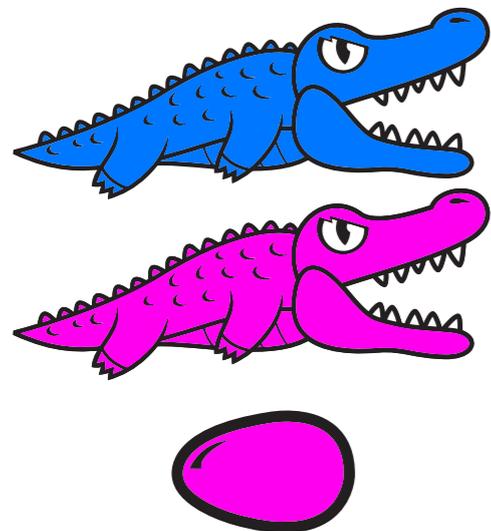
Famille 1



$$1 = \lambda x \lambda y x y$$

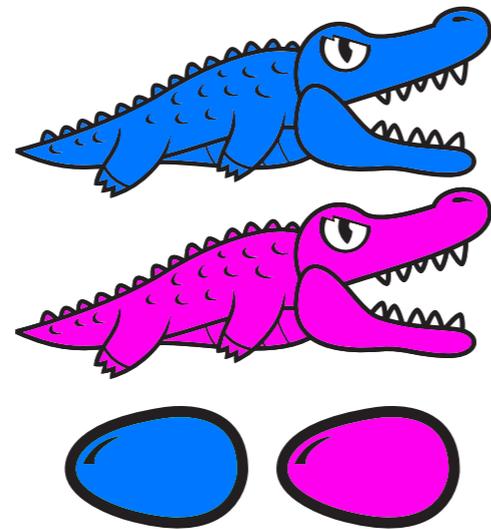
Trop de familles : numérotons-les

Famille 0



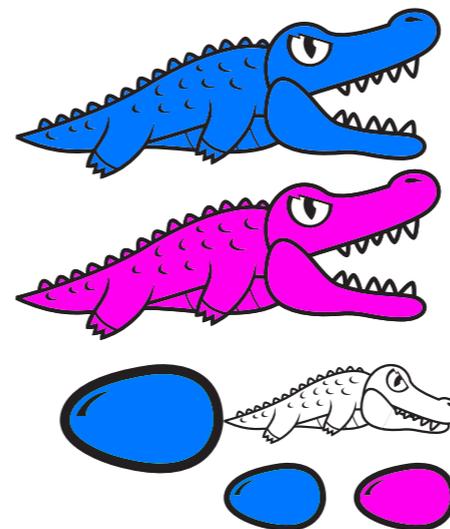
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Famille 1



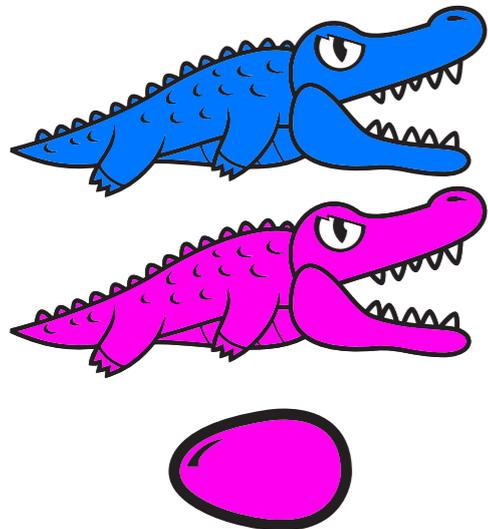
$$1 = \lambda x \lambda y x y$$

Famille 2



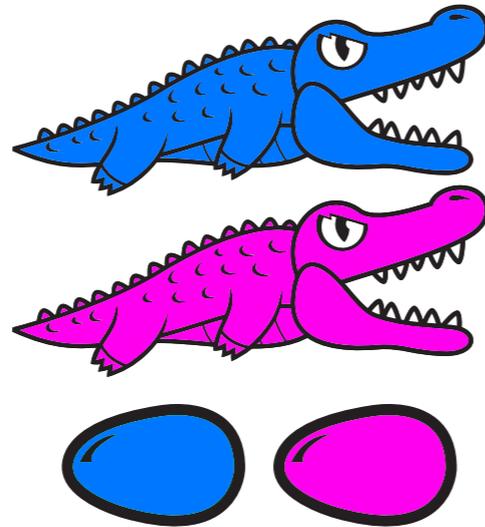
Trop de familles : numérotons-les

Famille 0



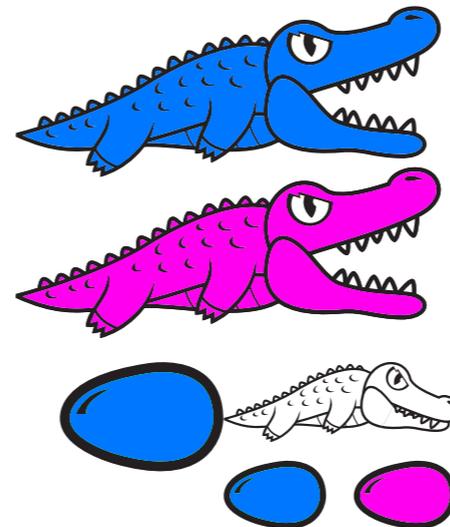
$$0 = \lambda x \lambda y y$$

Famille 1



$$1 = \lambda x \lambda y x y$$

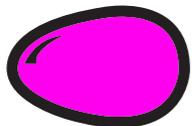
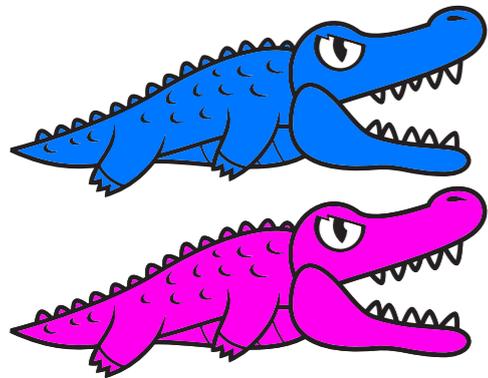
Famille 2



$$2 = \lambda x \lambda y x (x y)$$

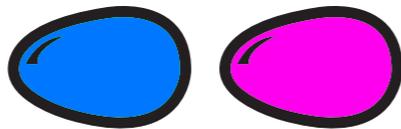
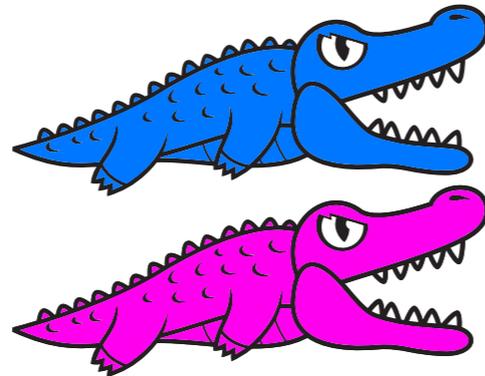
Trop de familles : numérotons-les

Famille 0



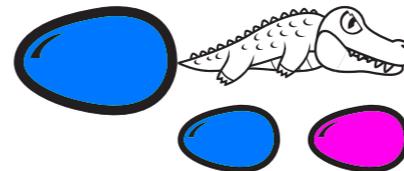
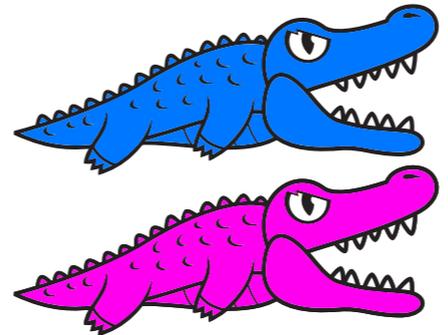
$$0 = \lambda x \lambda y y$$

Famille 1



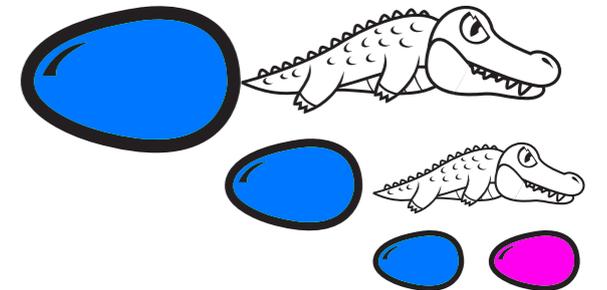
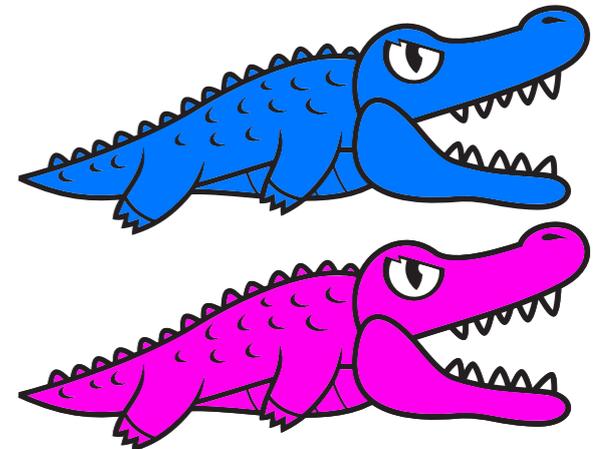
$$1 = \lambda x \lambda y x y$$

Famille 2



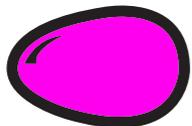
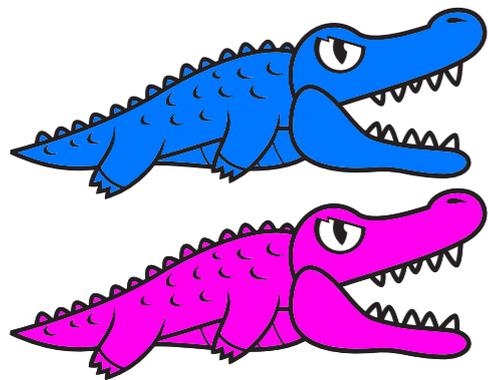
$$2 = \lambda x \lambda y x (x y)$$

Famille 3



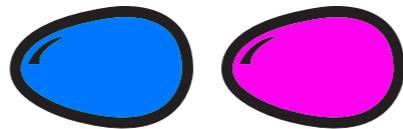
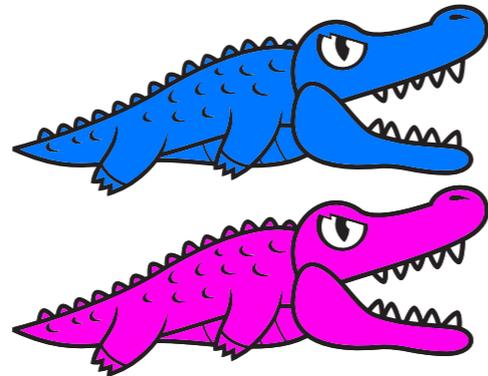
Trop de familles : numérotons-les

Famille 0



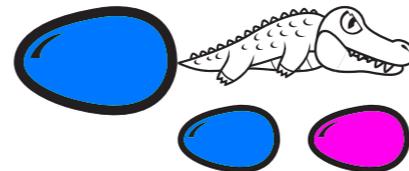
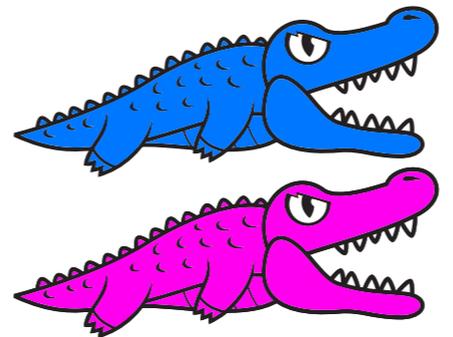
$$0 = \lambda x \lambda y y$$

Famille 1



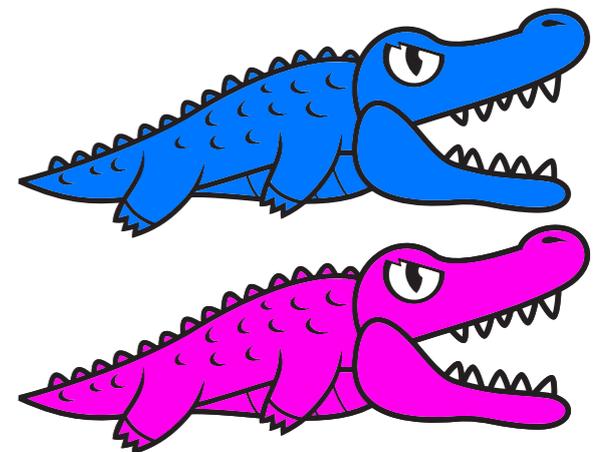
$$1 = \lambda x \lambda y x y$$

Famille 2

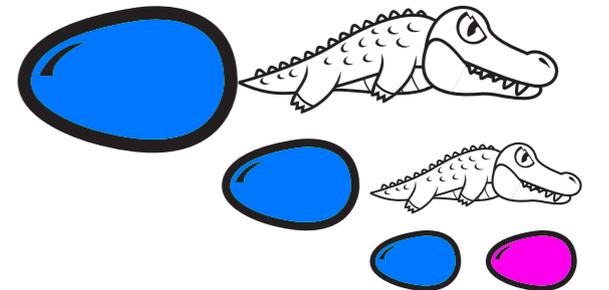


$$2 = \lambda x \lambda y x (x y)$$

Famille 3



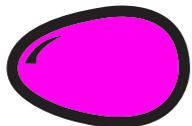
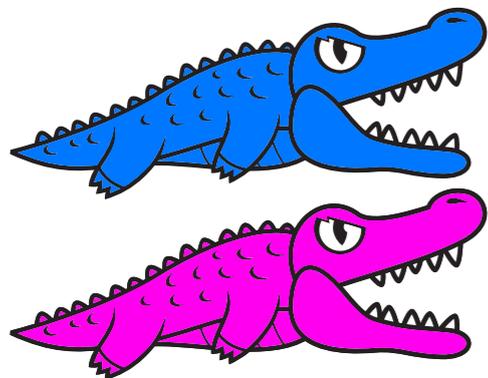
...



$$3 = \lambda x \lambda y x (x (x y))$$

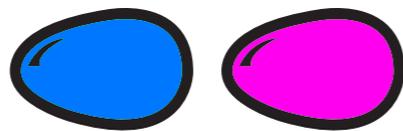
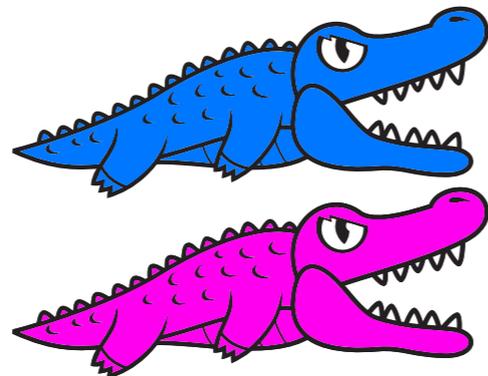
Trop de familles : numérotons-les

Famille 0



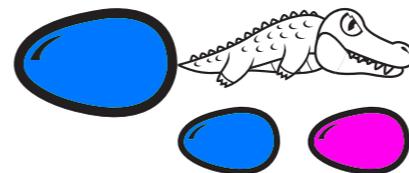
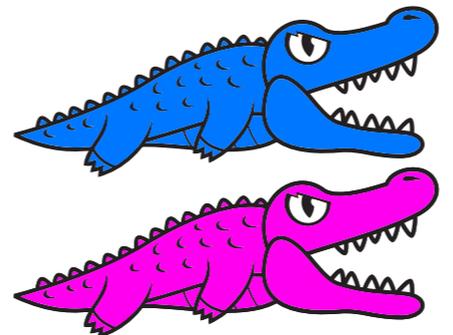
$$0 = \lambda x \lambda y y$$

Famille 1



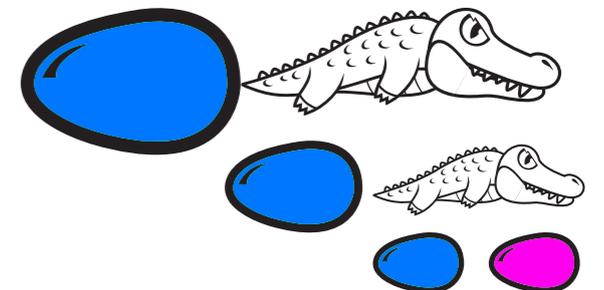
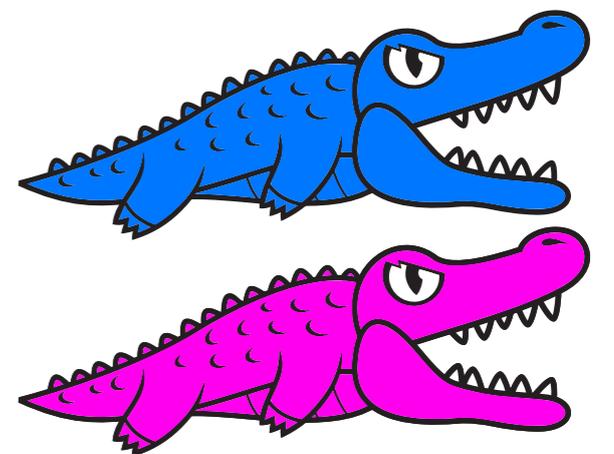
$$1 = \lambda x \lambda y x y$$

Famille 2



$$2 = \lambda x \lambda y x (x y)$$

Famille 3

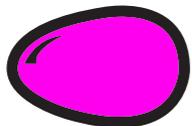
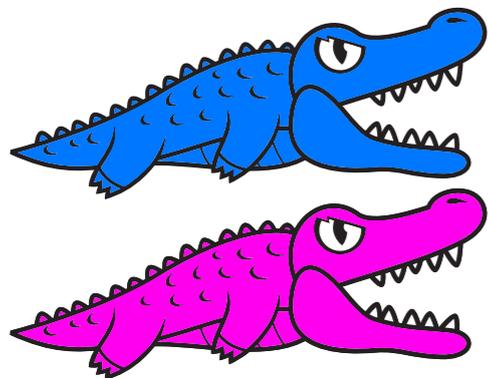


$$3 = \lambda x \lambda y x (x (x y))$$

Pouvez-vous trouver une famille qui, après application des règles, transforme la famille n en la famille $n+1$?

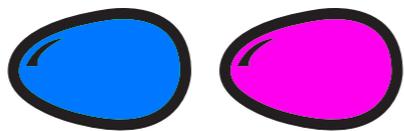
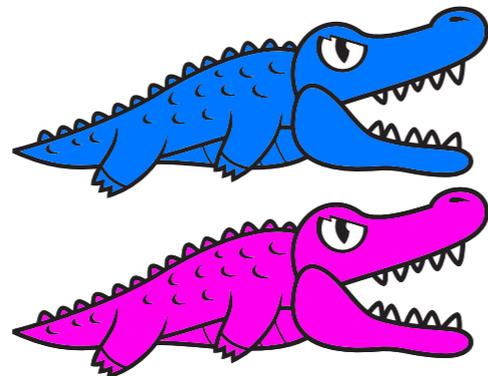
Trop de familles : numérotons-les

Famille 0



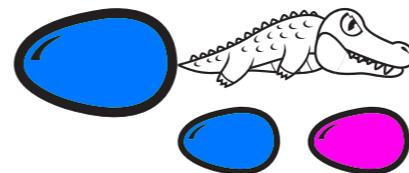
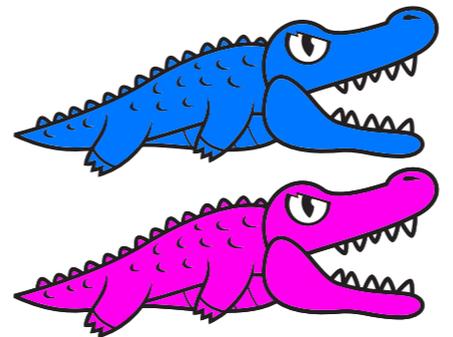
$$0 = \lambda x \lambda y y$$

Famille 1



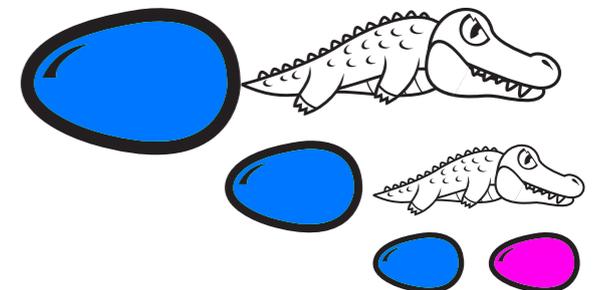
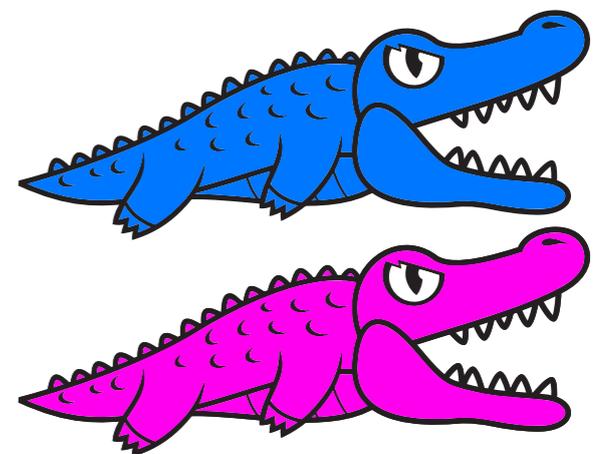
$$1 = \lambda x \lambda y x y$$

Famille 2



$$2 = \lambda x \lambda y x (x y)$$

Famille 3



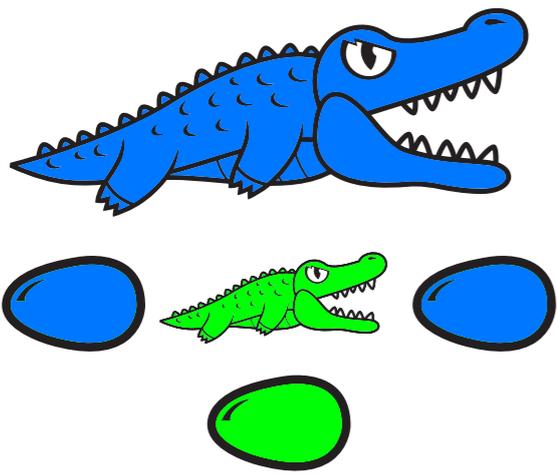
$$3 = \lambda x \lambda y x (x (x y))$$

Pouvez-vous trouver une famille qui, après application des règles, transforme la famille n en la famille $n+1$?

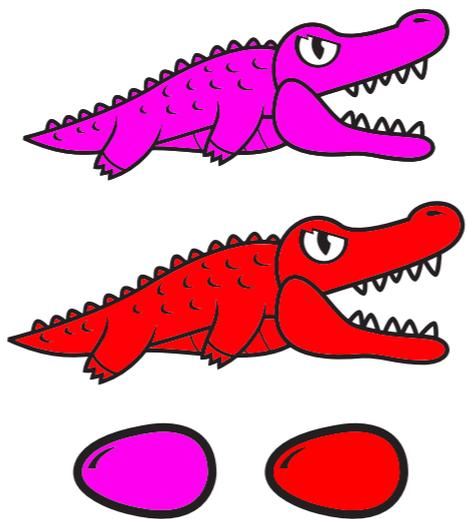
c'est-à-dire un λ -terme t tel que pour tout n , $t n$ se réduit en $(n+1)$

Outil en ligne pour produire des familles d'alligator et les faire évoluer...

<https://gitlab.lis-lab.fr/benjamin.monmege/alligators-python>

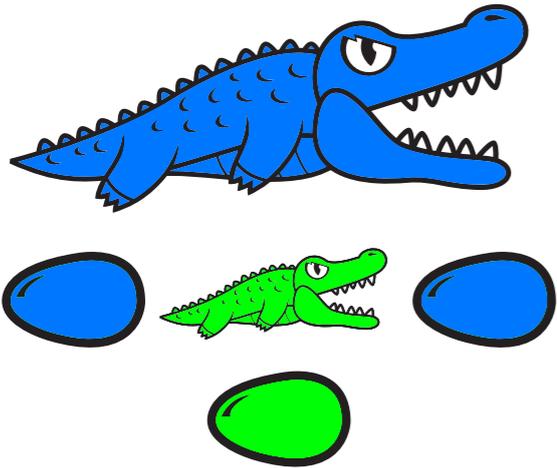


λ -calcul

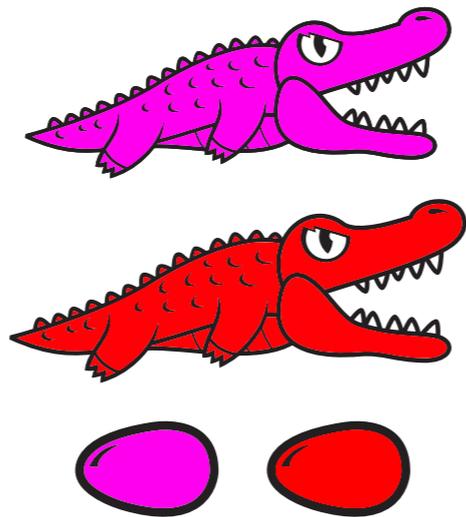




Alonzo Church
(1903-1995)

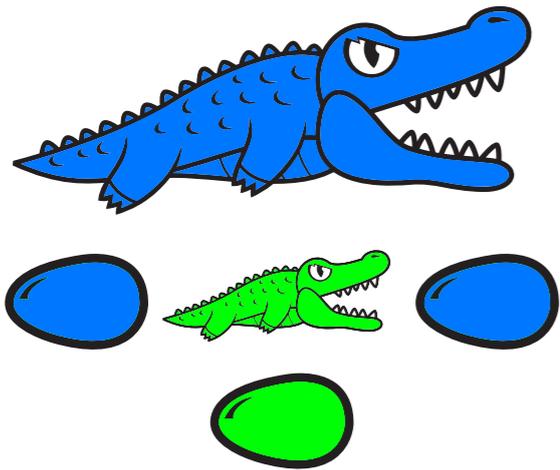


λ -calcul

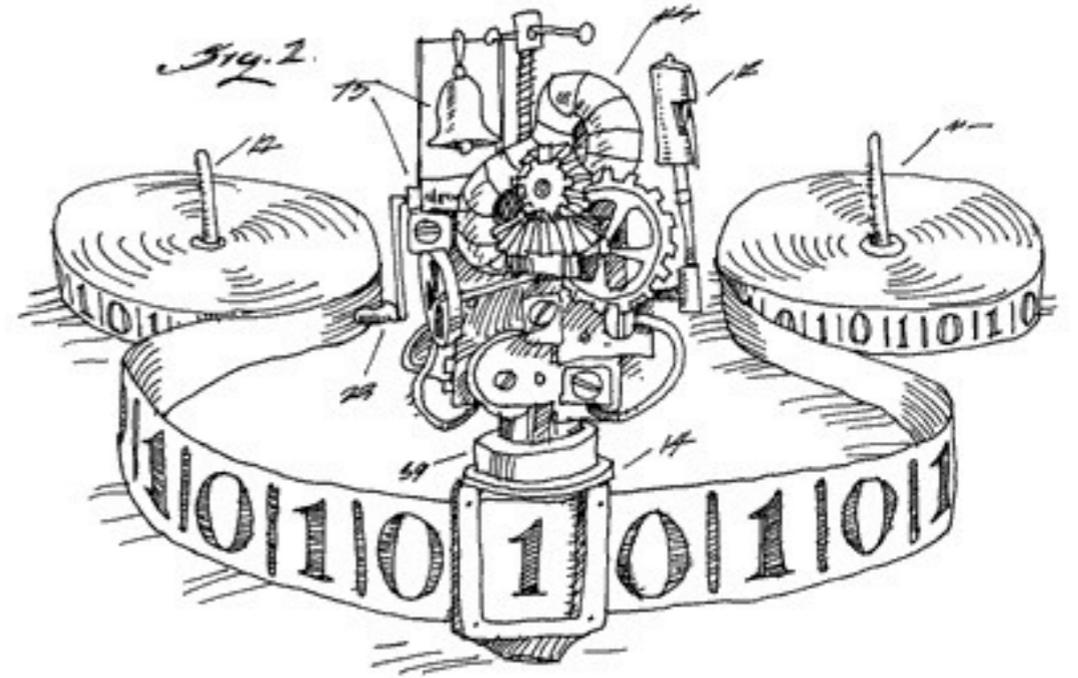
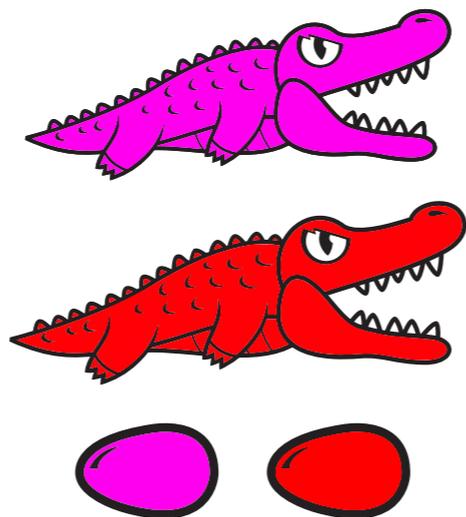




Alonzo Church
(1903-1995)



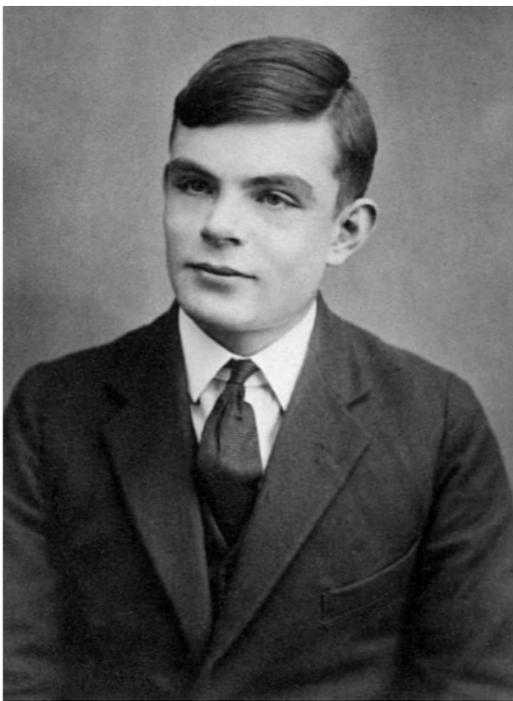
λ -calcul



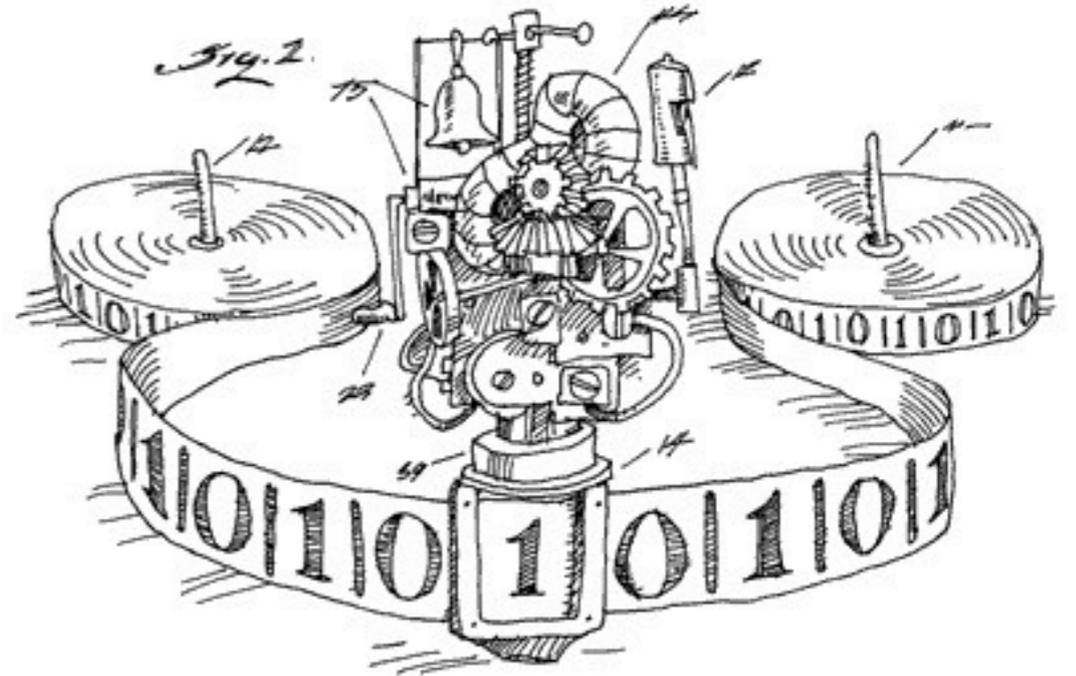
Machines de Turing



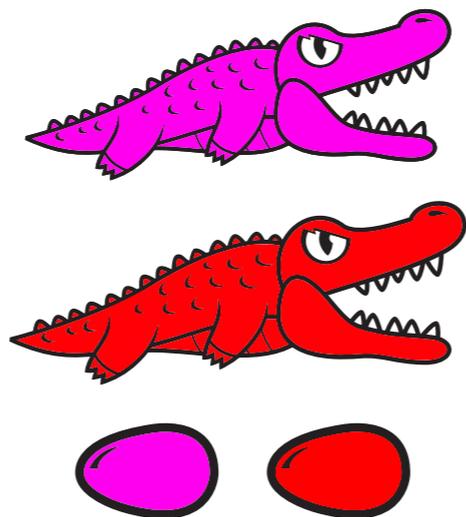
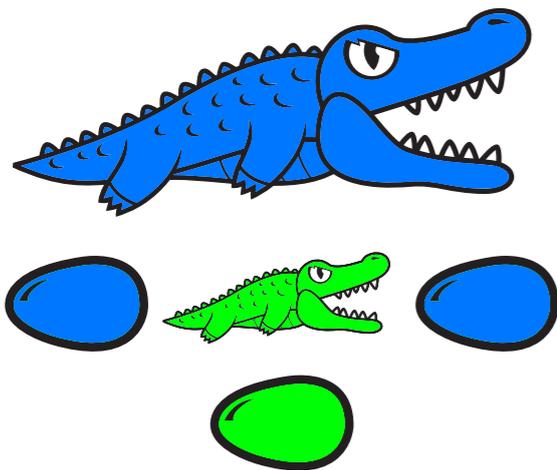
Alonzo Church
(1903-1995)



Alan Turing
(1912-1954)



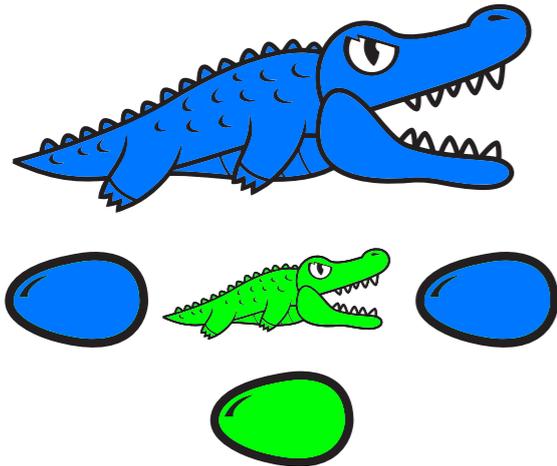
Machines de Turing



λ -calcul



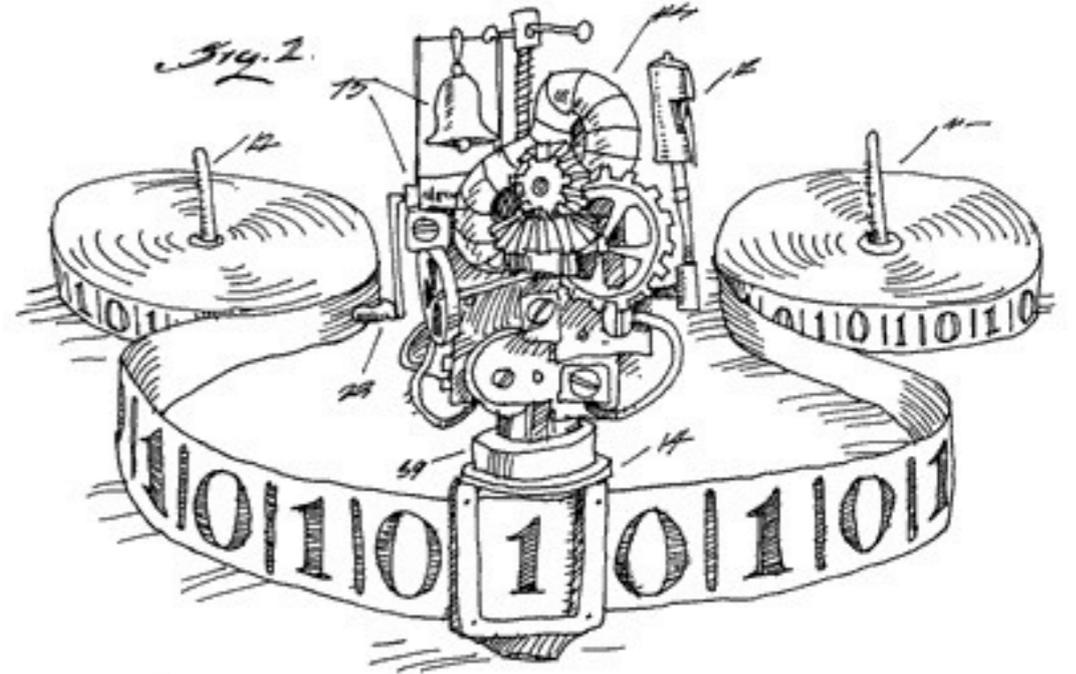
Alonzo Church
(1903-1995)



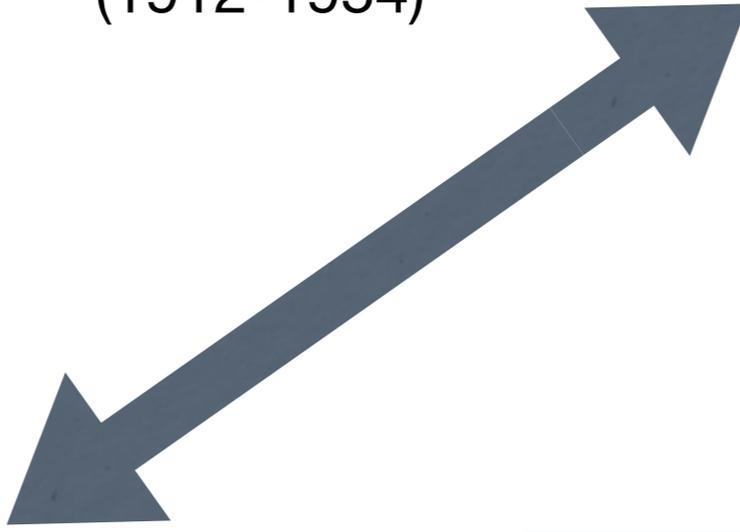
λ -calcul



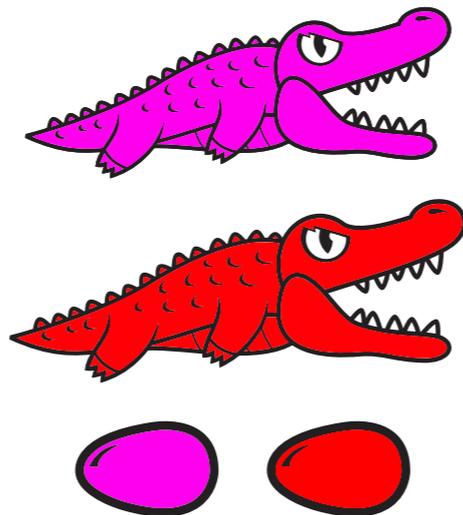
Alan Turing
(1912-1954)



Machines de Turing



Thèse de Church-Turing



Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

```
def carré(x):  
    return x**2
```

Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

```
def carré(x):  
    return x**2
```

```
>>> appliquer(carré, 2)
```

Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

```
def carré(x):  
    return x**2
```

```
>>> appliquer(carré, 2)  
4
```

Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

```
def carré(x):  
    return x**2
```

```
>>> appliquer(carré, 2)
```

```
4
```

```
>>> appliquer(carré, 3)
```

Lien avec la programmation (en Python)

```
def appliquer(f, x):  
    return f(x)
```

```
def carré(x):  
    return x**2
```

```
>>> appliquer(carré, 2)
```

```
4
```

```
>>> appliquer(carré, 3)
```

```
9
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h
```

```
def carré(x):  
    return x**2
```

```
def successeur(x):  
    return x + 1
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1  
  
>>> appliquer(composer(carré, successeur), 2)
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1  
  
>>> appliquer(composer(carré, successeur), 2)  
9
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1  
  
>>> appliquer(composer(carré, successeur), 2)  
9  
>>> appliquer(composer(successeur, carré), 2)
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1  
  
>>> appliquer(composer(carré, successeur), 2)  
9  
>>> appliquer(composer(successeur, carré), 2)  
5
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1
```

```
>>> composer(carré, successeur)(2)
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1
```

```
>>> composer(carré, successeur)(2)  
9
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1
```

```
>>> composer(carré, successeur)(2)  
9  
>>> composer(successeur, carré)(2)
```

Programmes en sortie

```
def composer(f, g):  
    def h(x):  
        return f(g(x))  
    return h  
  
def carré(x):  
    return x**2  
  
def successeur(x):  
    return x + 1
```

```
>>> composer(carré, successeur)(2)
```

```
9
```

```
>>> composer(successeur, carré)(2)
```

```
5
```

Un exemple plus intéressant : la fonction dérivée

$$f'(x) = \lim_{h \rightarrow 0} \frac{f(x+h) - f(x)}{h}$$

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime  
  
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001  
1
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001  
1 2.0009999999999996975
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001  
1 2.000999999999996975  
2
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001  
1 2.0009999999999996975  
2 4.000999999999999699
```

Approximation de la dérivée

```
def dérivée(f):  
    h = 0.001 # petit  
    def f_prime(x):  
        return (f(x+h) - f(x)) / h  
    return f_prime
```

```
>>> g = dérivée(carré)  
>>> for x in range(5): print(x, g(x))  
0 0.001  
1 2.000999999999996975  
2 4.00099999999999699  
3 6.00099999999999479  
4 8.001000000000037
```

Programmation fonctionnelle en Python :

lambda expressions, map, filter

à voir sur le Jupyter Notebook