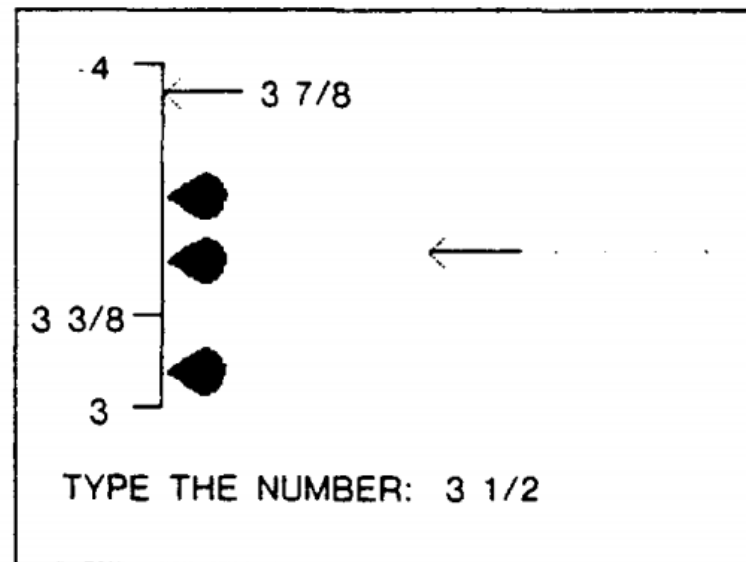
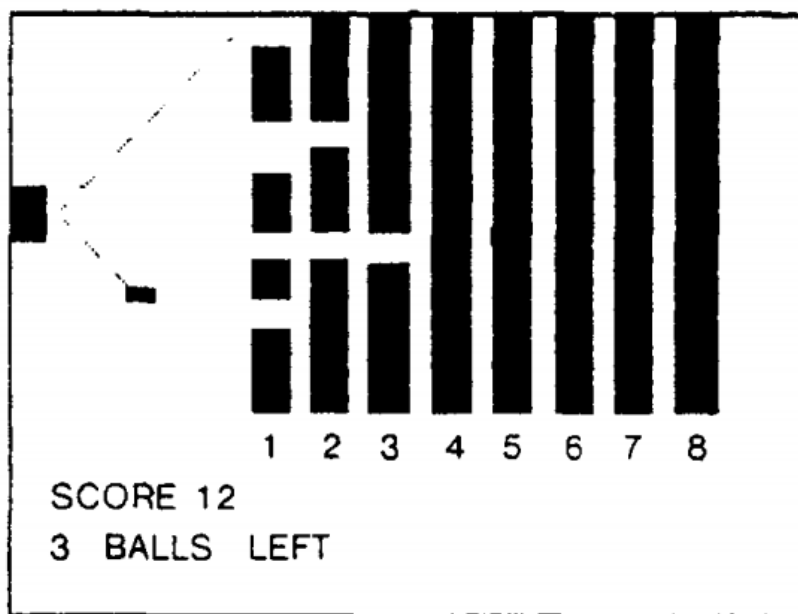


Difficulty

# Why focus on difficulty ?

Challenge is one of the core aspect of  
fun in video games

# Thomas Malone [80-82]



# Challenge

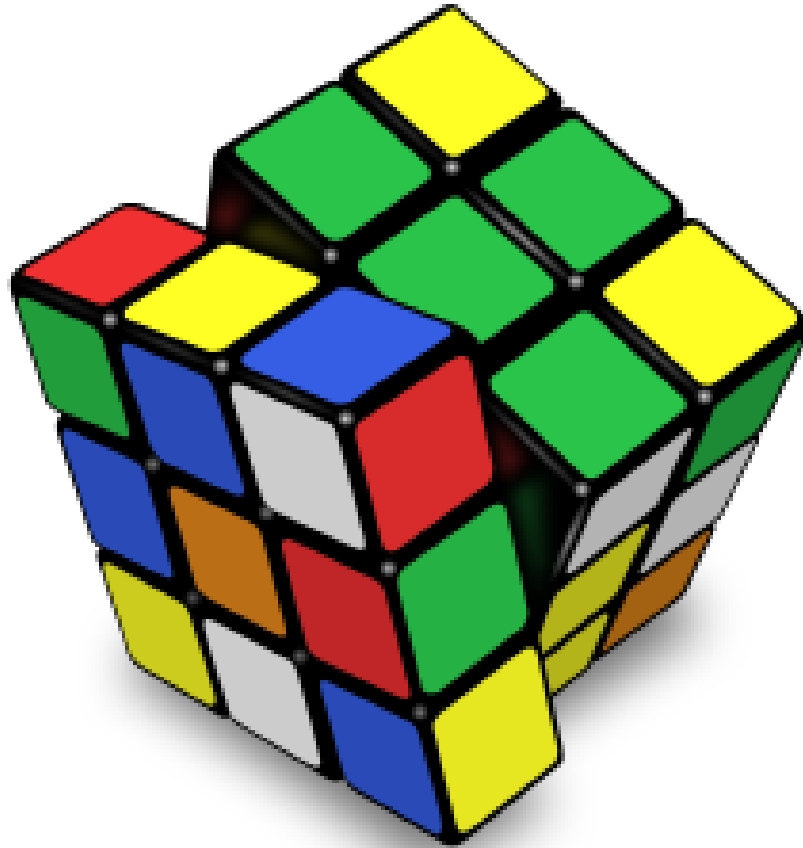




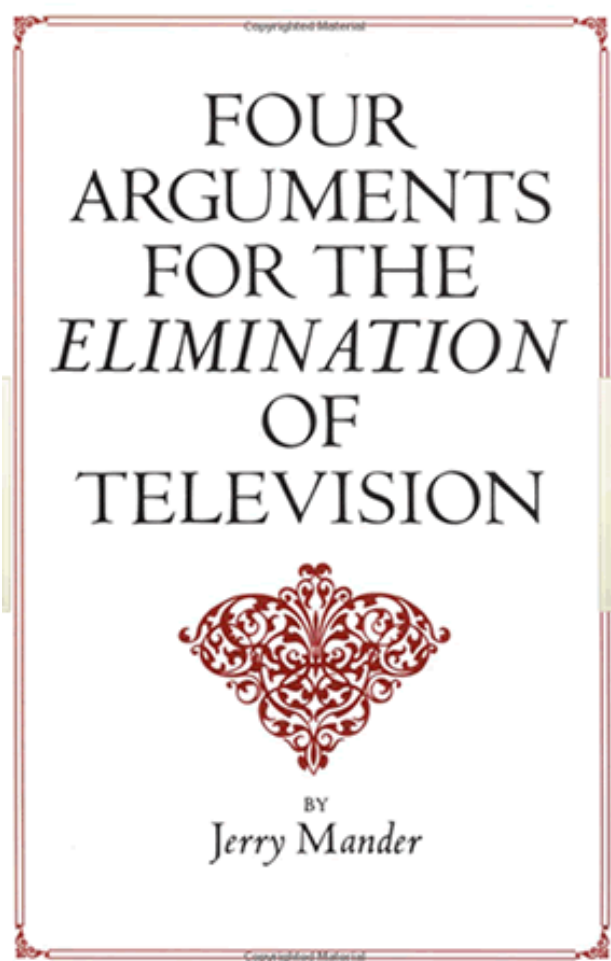


Curiosity

# Cognitive Curiosity



# Sensitive Curiosity





# Fantasy





NATIONAL BESTSELLER

# FLOW

THE PSYCHOLOGY OF  
OPTIMAL EXPERIENCE

STEPS TOWARD ENHANCING

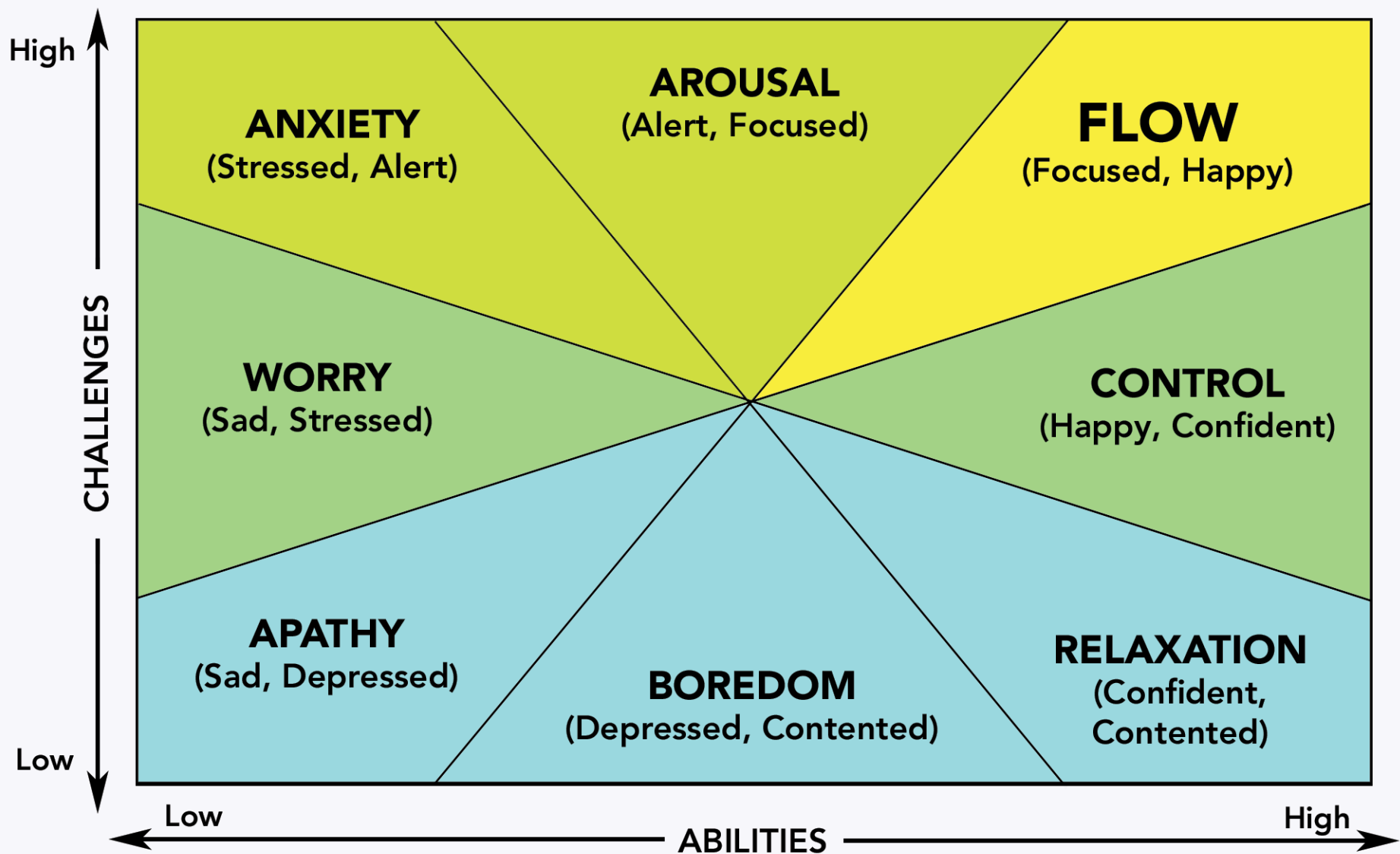


THE QUALITY OF LIFE

**MIHALY CSIKSZENTMIHALYI**

*"Flow couldn't come at a better time for us. An inspiring, worthwhile read."*

—Chicago Sun-Times

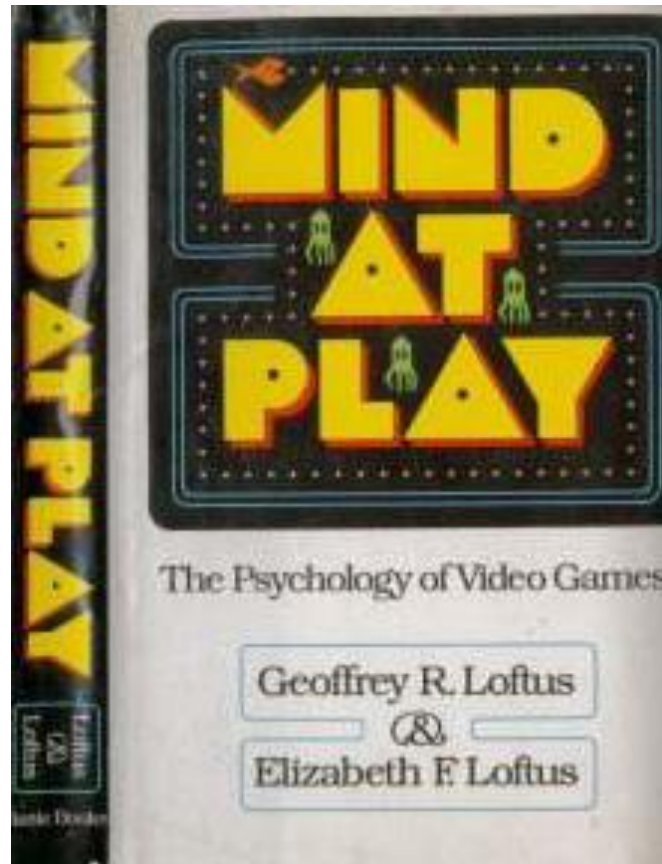


Mihály Csíkszentmihályi's model of flow  
as related to challenge and ability.

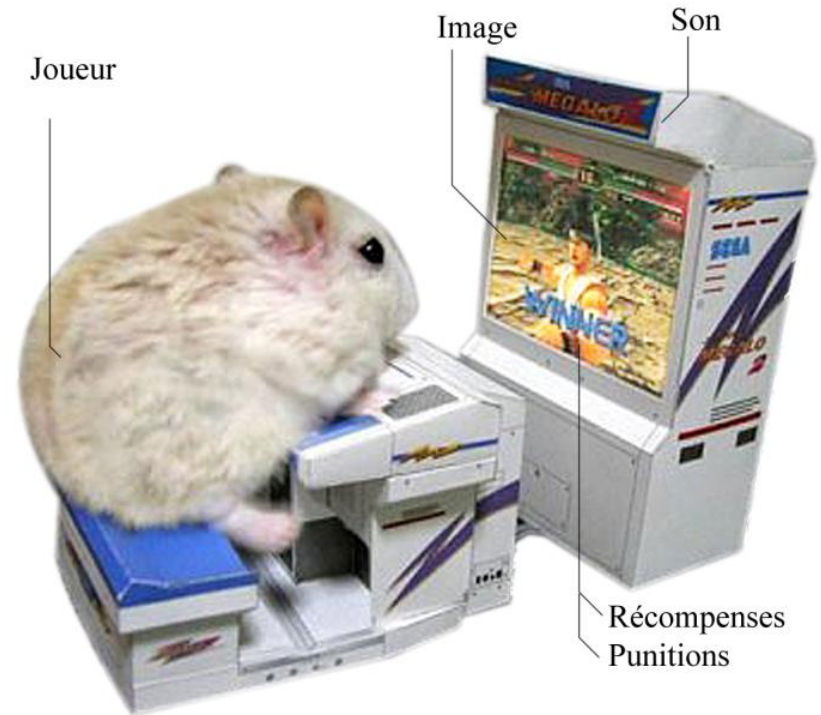
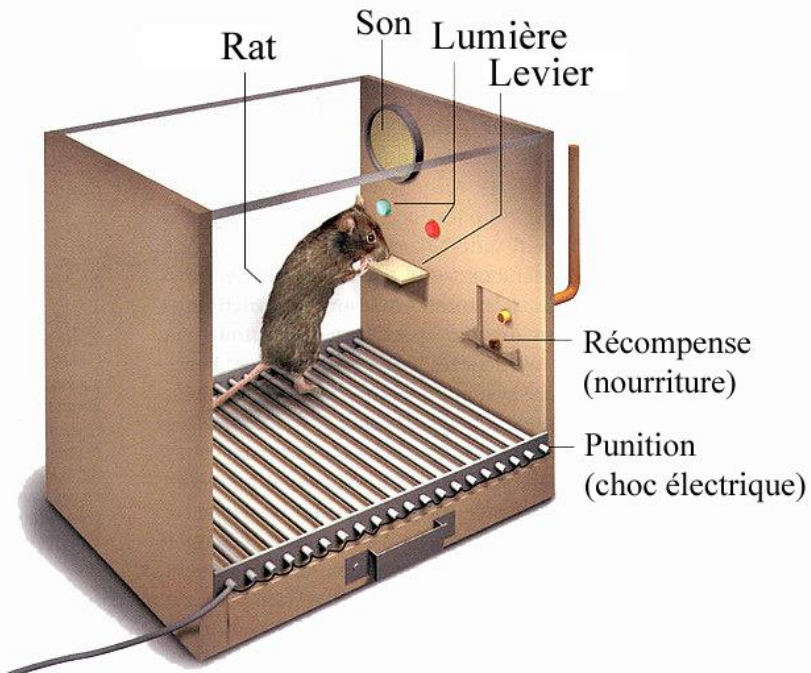


Autotelic activities

# Loftus et al [83]

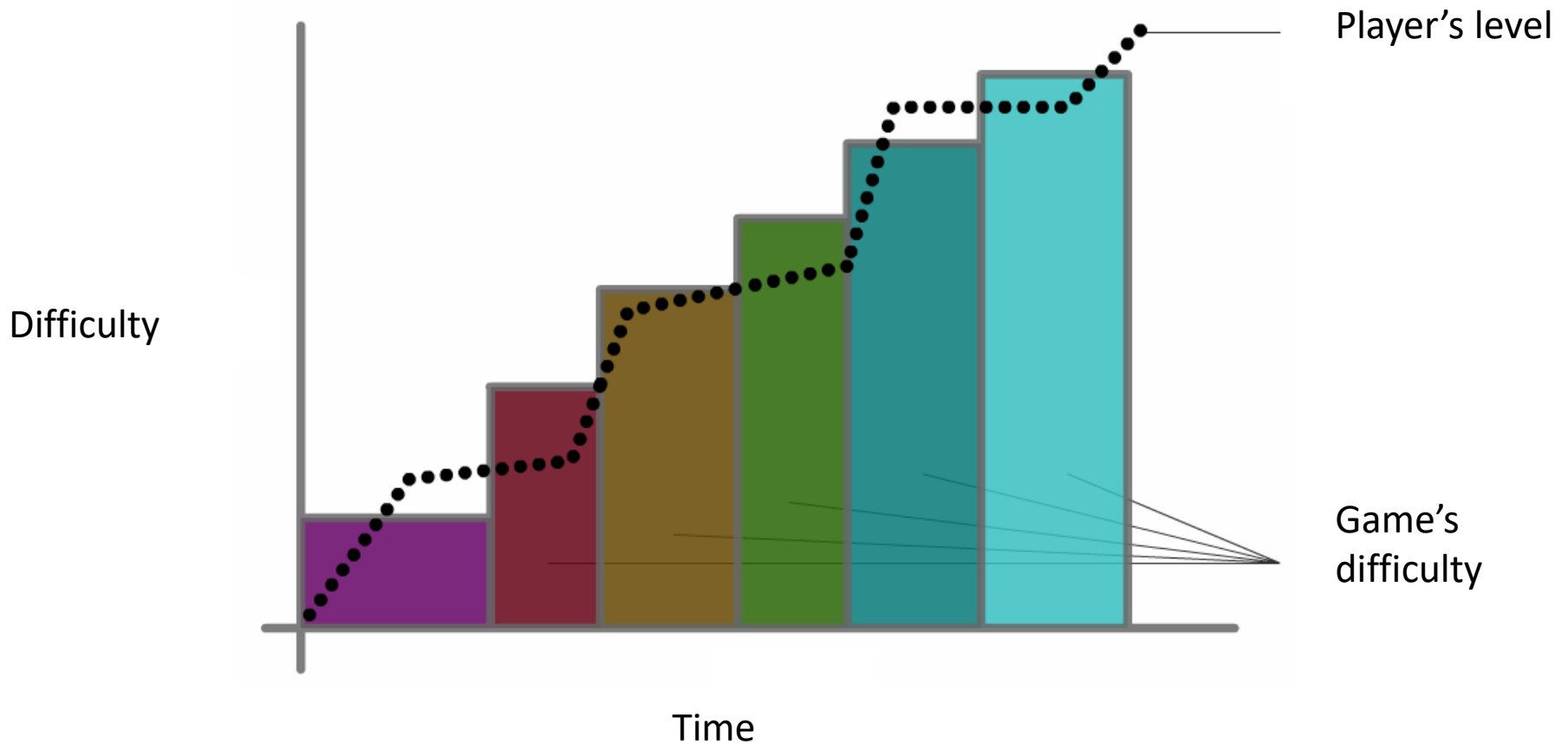






Partial reinforcement  
(you never know when you're going to win)

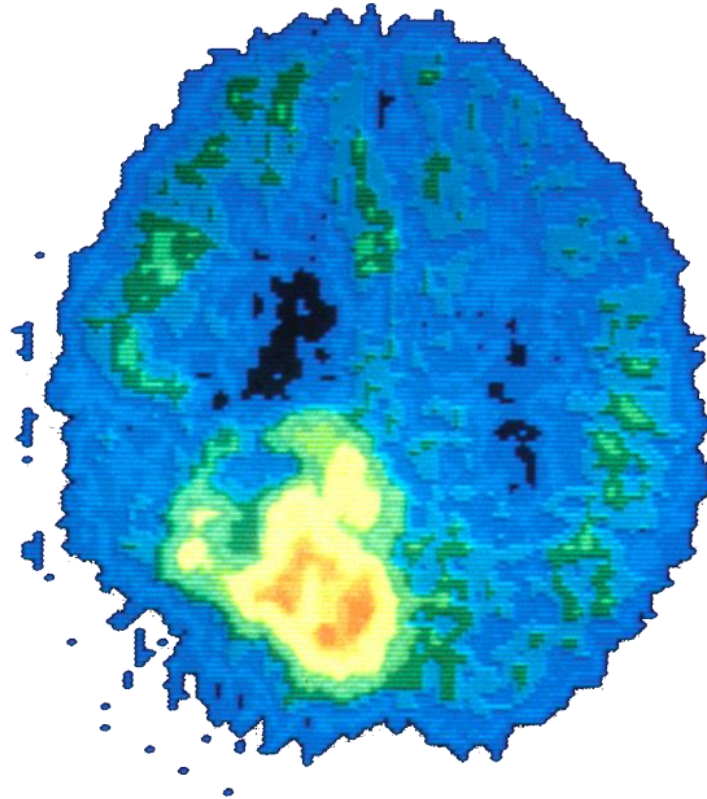
# Difficulty curve



# Definition

- **Difficulty of a game:** « Evaluation of the player's **effort** needed to attain the **goals** provided by the game » (gl)

# We cannot measure it



Neither cheap nor convenient



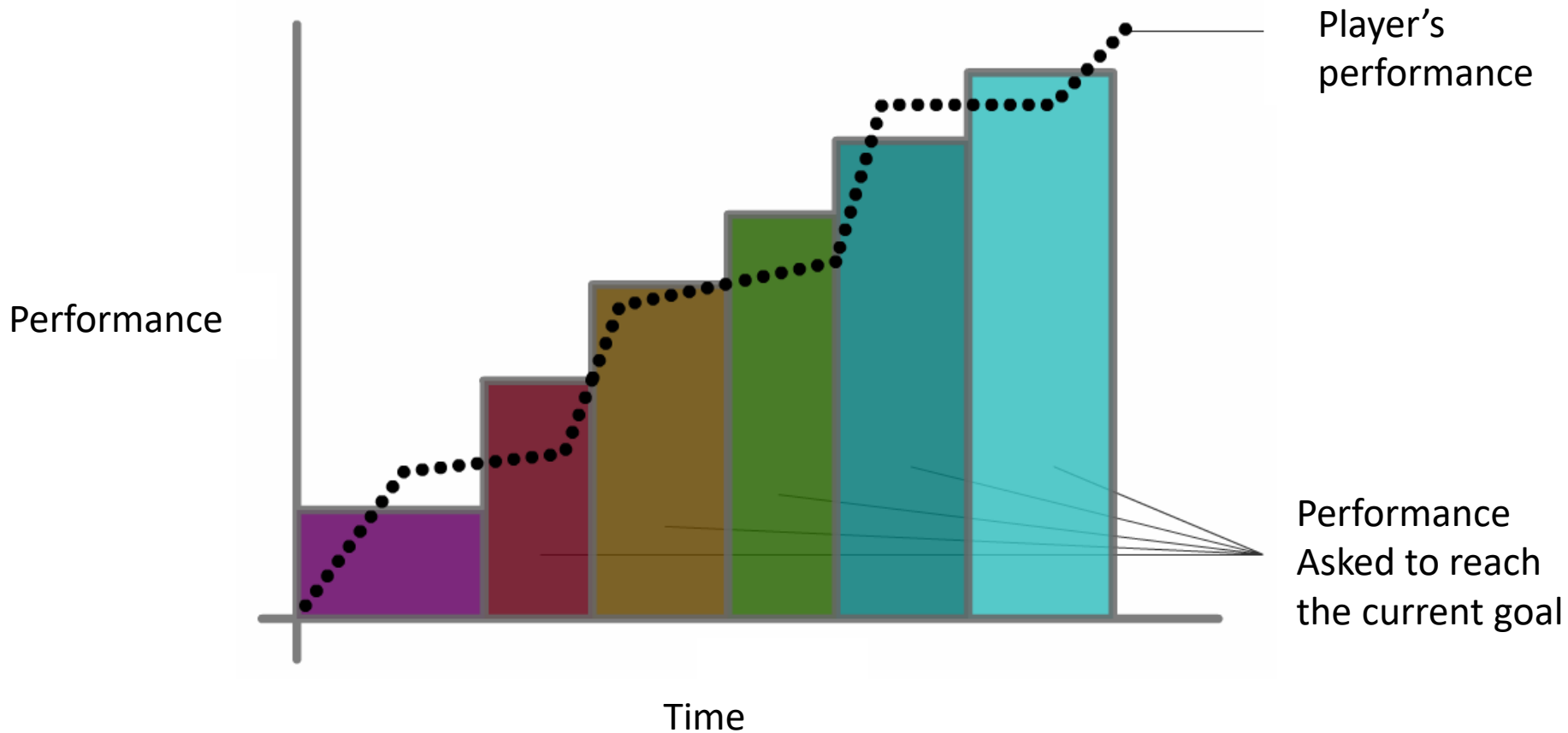
# Definition's Implications

- We need to define these **goals**
- Difficulty is a function of both **goal and player**, it depends on their level.
  - A game's difficulty means nothing (or we think about a generic player)
- Player's level is **changing** :
  - difficulty changes over time for a specific player
- We cannot directly evaluate effort . We will use a **variable related** to this effort, and thus make assumptions.

# Performance

- Let's use **player's performance**
- It's linked to the **amount of effort** they are putting in the game.
- It's also very often **part of the design** (we already evaluate it in one way or another)

# Difficulty curve

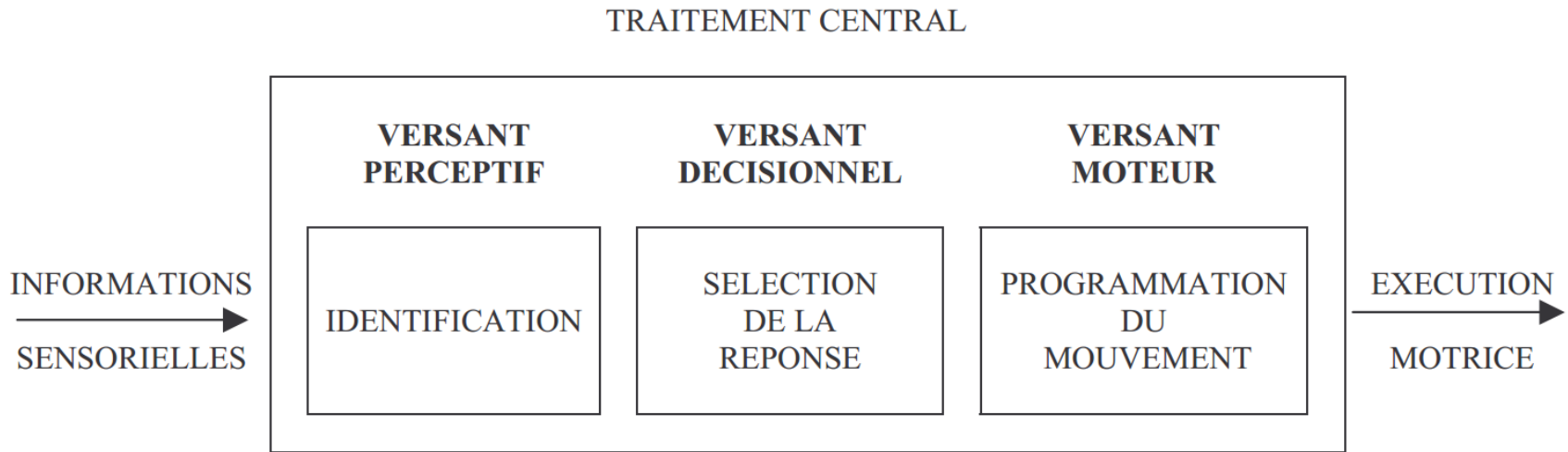


# Types of difficulty

Perceptive / Logical / Motor



# Three phases of information processing



Temprado 93 (EPS)

# Perceptive difficulty



Indiana Jones et le secret de l'Atlantis

# Perceptive difficulty

- Definition:
  - Player's **effort** to find **new** and **relevant information** about the game's state.
  - **New** information is both something they do not **know**, and something they **cannot deduce** from what they already know.

# Perceptive difficulty



Aces of the galaxy



# Perceptive difficulty

- Metrics:
  - Screen readability:
    - Amount of occluding / distracting objects
    - Light / contrast...
  - Mean distance between player and useful objects
    - In number of actions/playtime

# Logical difficulty



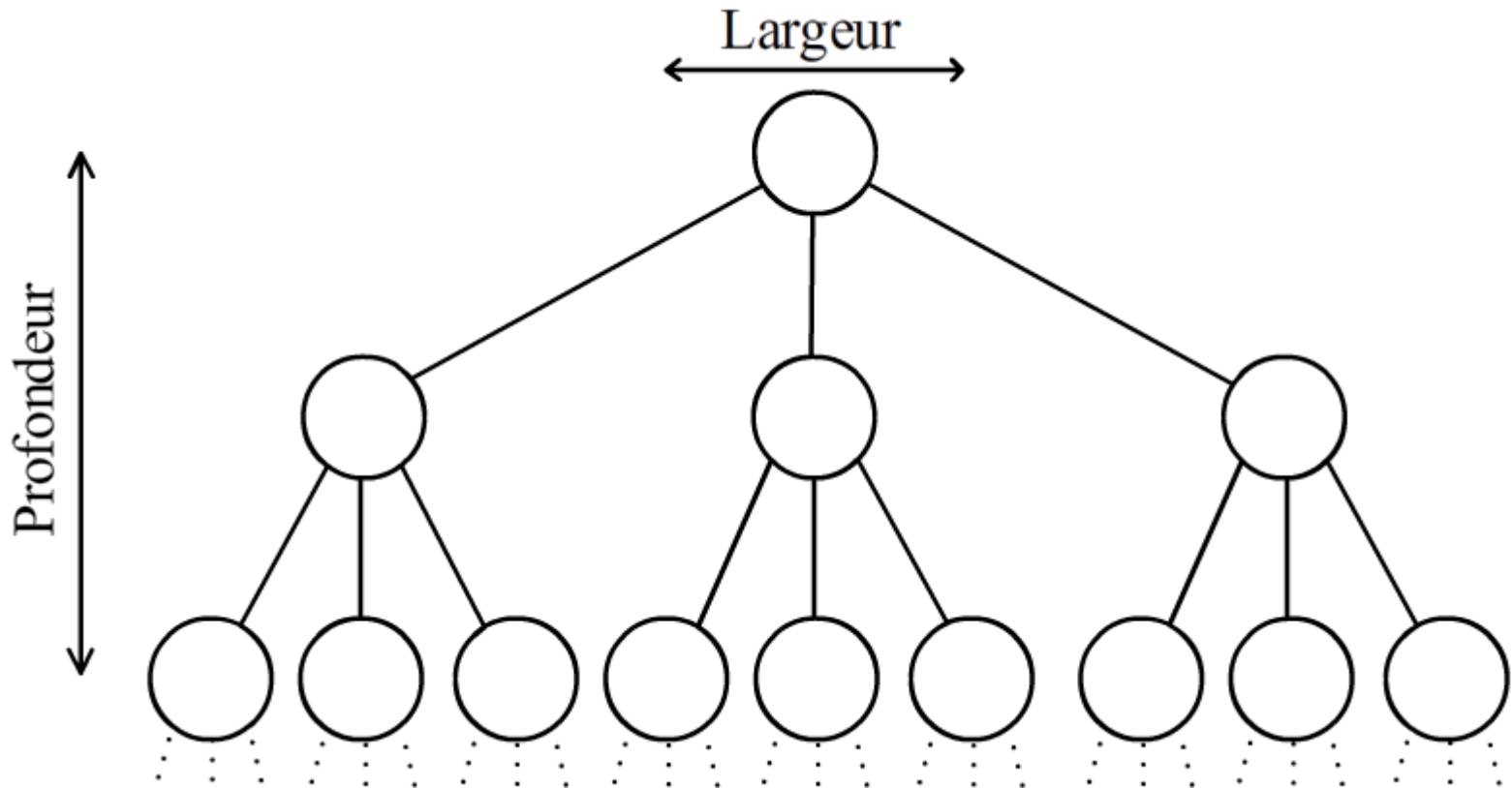
Heroes of Might and Magic

# Logical difficulty

- Definition:
  - **Player's effort to use the information they already have.**
    - Understand the game's behavior by induction
    - Select the next move by deduction

# Logical difficulty

- Deduction metric



# Motor Difficulty



Doom

# Motor difficulty

- Definition:
  - **Spatial** and **temporal** accuracy needed to perform an action.
  - Metrics are then related to temporal and spatial accuracy



# Summary

- Perceptive:
  - Explorer the game's world to find new relevant information.
- Logical:
  - Heuristics induction, facts and actions deduction.
- Motor:
  - Spatio-temporal constraints on execution

# Measuring difficulty

Bananas and health points

# How can we measure difficulty?

- Create a heuristic

$$\text{Nb}(\text{Goomba}) + \text{PV}(\text{Bowser}) + \text{H}(\text{Mario}, \text{Piranha Plant}) =$$



# Shortcomings

- Not generic: units are related to a specific gameplay
- Complex Meaning: hard to interpret, may be biased

# Proposed Measure

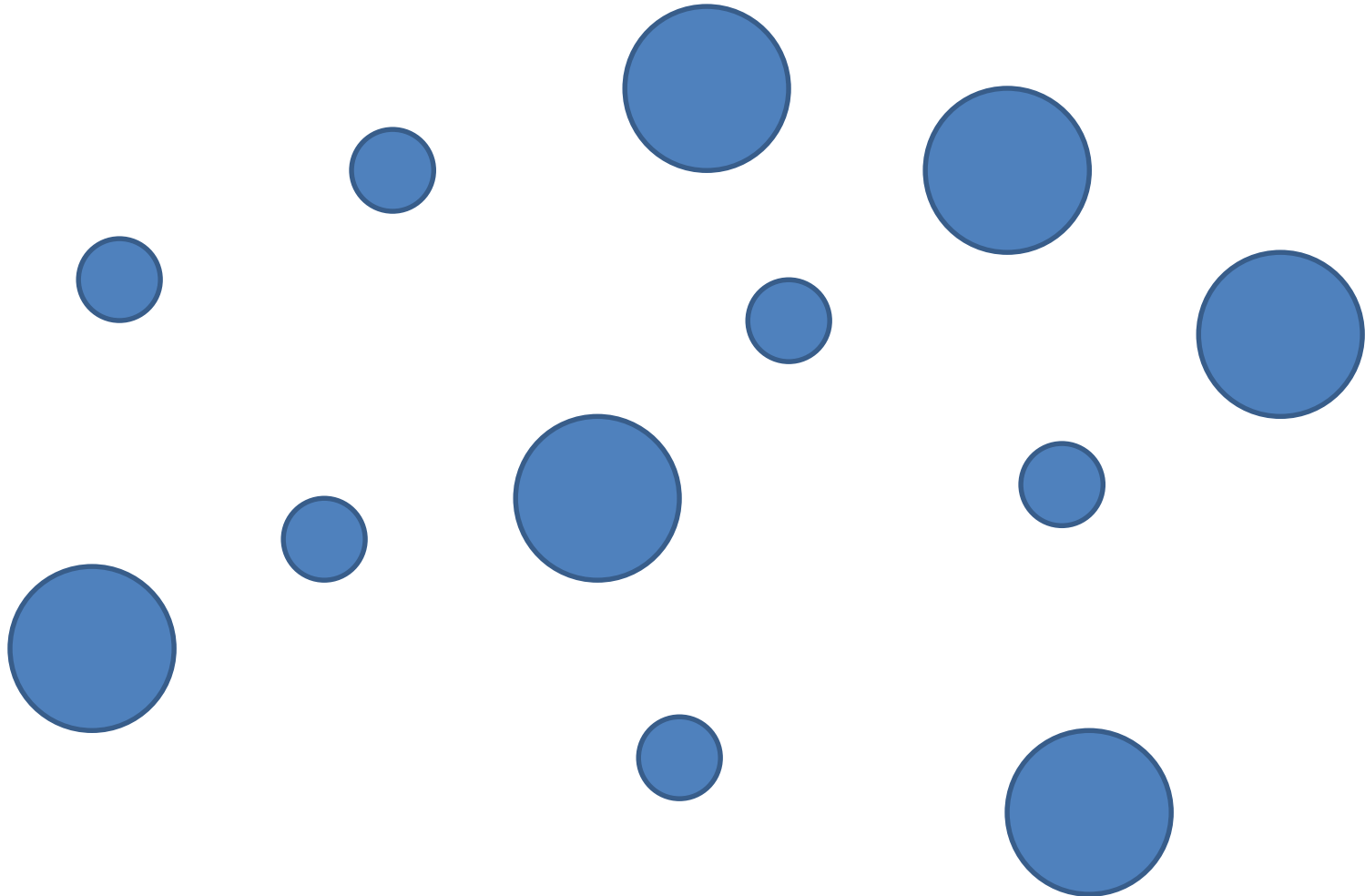
Challenges & Skills

# Use the probability to lose

- It is **generic** :
  - We can make comparison between games. Only need to find binary goals.
- Simple **meaning** :
  - 0.5 chances to lose actually means something.



# Step 1: split the game into challenges



# Step 1: split the game into challenges

- Clear goal, with binary outcome
- No parallel goals: make a new one if it happens
  - Challenge A
  - Challenge B
  - Challenge (A & B)
- Find some parameter for this goal
- Make it as simple as possible: the more complex the model is, the more data you'll need to train it.

# Example : a shooter

- Kill a specific group of enemies
  - Find the best way to abstract a group of enemies
  - That's when we still use heuristics and design intuitions
  - E.g. 1: number of enemies?
  - E.g. 2: number of snipers, number of melee?
  - E.g. 3: total of hit points divided by current's gun damage per second ?

# Example : a shooter

- Keep moving
  - Do not stay still for x seconds

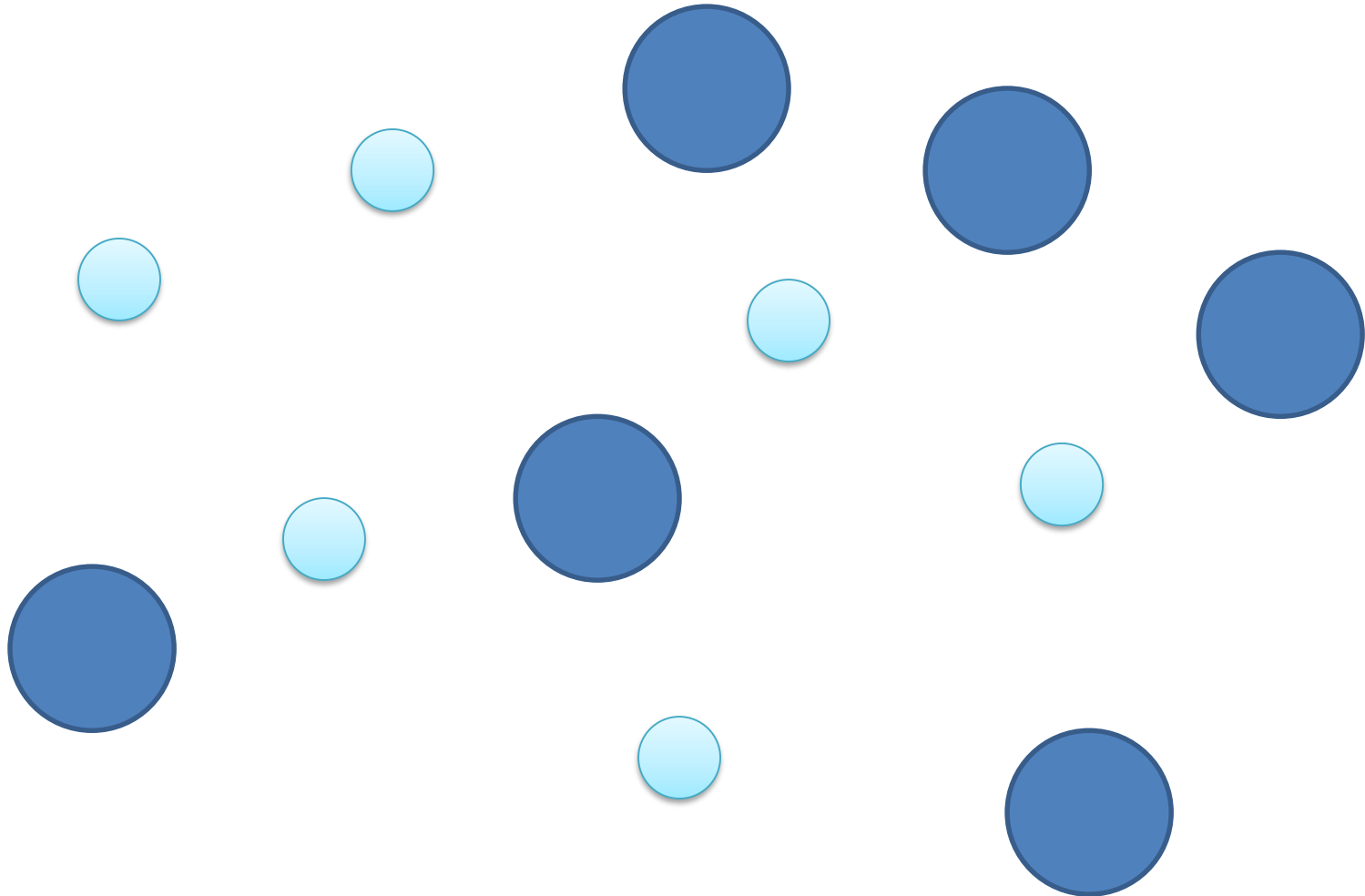
# Example : a shooter

- Make a good shot
  - Shoot and hit (hit = win, not hit = fail)

# Example : a shooter

- Defeat boss #3
  - You kill it : win
  - You die : fail

## Step 2 : Find the core challenges





# Core and other challenges

- Some challenges will be :
  - Generic
  - Short in time
  - These are the core challenges:
    - We have win / fail events very often for one player
    - We can evaluate  $p(\text{lose})$  waiting for too long, and thus with the assumption that the player's level is somehow constant
    - They are spread all over the game

# Core and other challenges

- Others will be :
  - Specific
  - Long in time
  - We cannot easily evaluate the probability to lose
    - We cannot wait for the player to try and kill 10 times the boss

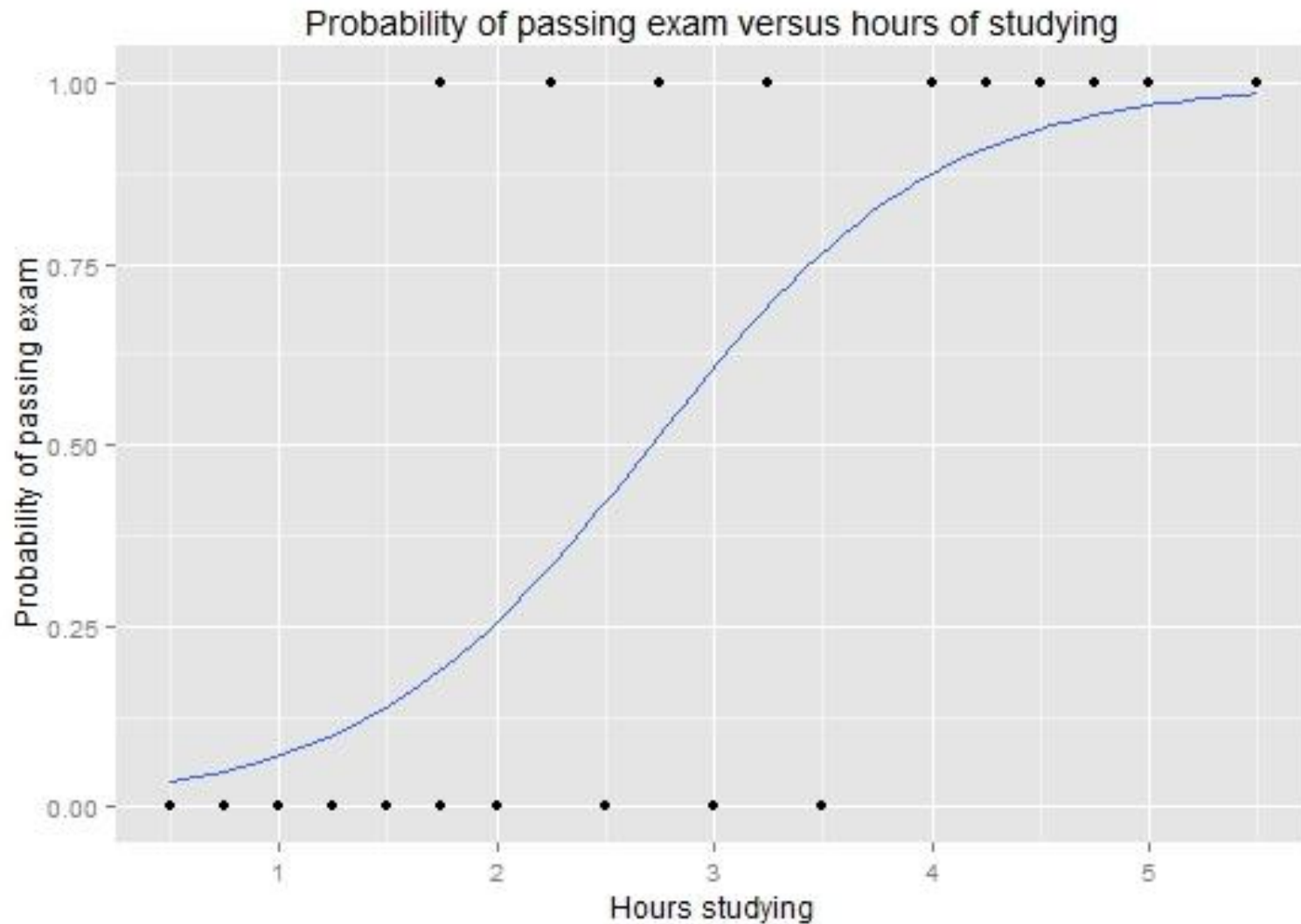
# Evaluating core challenges

- Detect when it starts (player shoots)
- Log player result (shot missed)
- Compute average of last  $n$ th results and you have an evaluation of  $p(\text{lose})$ , and thus player's level for this skill

# For other challenges

- We need the data of all the players
- We can use core challenges to group players with similar skills
  - Then, within each group, we can compute the challenge's difficulty
  - Or we can use a logistic regression to find  $p(\text{lose} \mid \text{skills})$

# Logistic regression



# What if my challenge is neither « core », nore « one shot »

- You make a procedural game
- You instantiate a challenge multiple times
- Your challenge is parametric
  - You have the data of only one player (game is not online) :
    - logistic regression to compute  $p(\text{lose} \mid \text{param})$
    - You need to keep param as small as possible
    - You need to explore first using another algorithm to adapt difficulty
  - You have all players data :
    - Use core challenges and all data to compute  $p(\text{lose} \mid \text{params}, \text{skills})$
    - Can be logisitc regression as well as many other models...