

# The Hardness of “Lemmings”

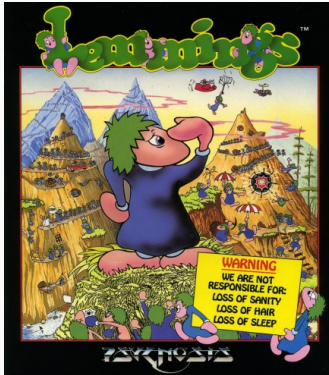
Another NP-complete Game

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Philip Geißler

May 14, 2018

# Lemmings - an Overview



**Figure 1:** the game cover<sup>1</sup>

- released in 1991
- published by Psygnosis
- developed by DMA Design
- single player
- puzzle genre
- real time strategy

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<sup>1</sup><https://goo.gl/1fnsdu> [2]

# Lemmings - the Basics



**Figure 2:** an exemplary level<sup>2</sup>

<sup>2</sup> <https://classicreload.com/lemmings.html>

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# Formalization

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# Formalization

- time and space is discrete in “Lemmings”
- all other parameters are also discrete

→ level and solution can be formalized

level:  $L = (\text{limit}^3, \text{save}, \text{lems}, \text{start}, \text{wdt}, \text{hgt}, \text{grid}, \text{exit}, \text{skills})$

level size:  $|L| \approx |\text{grid}| = \text{constant} \cdot \text{wdt} \cdot \text{hgt}$

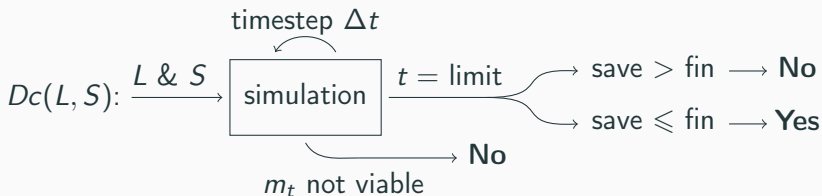
solution:  $S = \{m_1, m_2, m_3, \dots\}$

move:  $m_j = (\text{time}, x, y, \# \text{lemming}, \# \text{skill})$

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<sup>3</sup>Assumption: bounded by polynomial time in the size of the level

# The Decision Problem



- $\forall (L \in \text{LEMMINGS}) \exists S_x$  with  $Dc(L, S_x) = \text{Yes}$
- $\rightarrow$  LEMMINGS comprises all solvable levels
- $\hookrightarrow$  1-LEMMINGS comprises all solvable levels with 1 Lemming
- only LEMMINGS & 1-LEMMINGS will be investigated further

### 3 SAT

$$\text{3SAT: } F = (\overline{x_1} \vee x_2 \vee x_4) \wedge (\overline{x_3} \vee x_3 \vee \overline{x_4}) \wedge (\overline{x_1} \vee \overline{x_3}) \wedge \dots$$

$$\text{exact 3SAT: } F = (\overline{x_1} \vee x_2 \vee x_4) \wedge (\overline{x_4} \vee \overline{x_2} \vee x_3) \wedge \dots$$

- 3SAT is NP-hard<sup>4</sup>

$$(x_i) \rightarrow (x_i \vee x_i \vee x_i) \quad () \rightarrow (x_i \vee x_i \vee x_i) \wedge (\overline{x_i} \vee \overline{x_i} \vee \overline{x_i})$$

$$(x_i \vee x_j) \rightarrow (x_i \vee x_j \vee x_i)$$

$\hookrightarrow$  exact 3SAT is also NP-hard

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<sup>4</sup> <https://dl.acm.org/citation.cfm?coll=GUIDE&dl=GUIDE&id=805047> [3]



# Complexity Proofs

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“[An input that returns ‘yes’ must] be verifiable by deterministic computations that can be performed in polynomial time<sup>5</sup>”

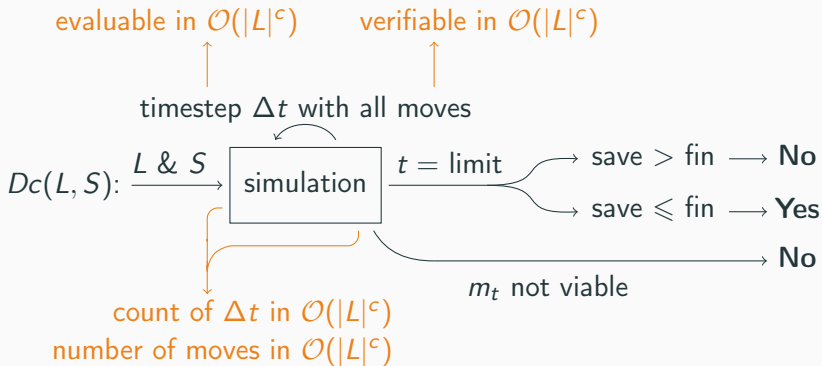
→ LEMMINGS be verified in polynomial time iff:

- timesteps are evaluatable in time polynomial in the input size
- moves are verifiable in time polynomial in the input size
- timesteps are polynomial in the input size<sup>6</sup>
- moves are polynomial in the input size

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<sup>5</sup> <https://goo.gl/5BZjRf> about problems in NP

<sup>6</sup> see assumptions



**Figure 3:**  $S$  is verifiable for  $L$  in  $\mathcal{O}(|L|^{c'})$

goal: reduce LEMMINGS to 3SAT

- for each exact 3SAT problem, one can construct an equivalent problem in LEMMINGS
    - clause conjunction  $\rightarrow$  level  $L_x$
    - literals & clauses  $\rightarrow$  gadgets
    - assignment of values to literals  $\rightarrow$  strategy  $S_x$  (1st part)
    - evaluation of the attempt for specific literals in each clause  $\rightarrow$  strategy  $S_x$  (2nd part)
  - for every satisfiable 3SAT, a strategy  $S_x$  solving  $L_x$  exists
  - for every solution of  $L_x$ , solution of 1 specific clause is found
- $\hookrightarrow$  if reduction is possible:  $L_x \in \text{LEMMINGS}$

## reduction example

$$\text{level: } (\overline{x_1} \vee x_2 \vee x_4) \wedge (\overline{x_4} \vee \overline{x_2} \vee x_3) \wedge (\overline{x_3} \vee x_3 \vee \overline{x_4})$$

$$\text{strategy pt.1: } x_1 = \textit{false} \quad x_2 = \textit{true}$$

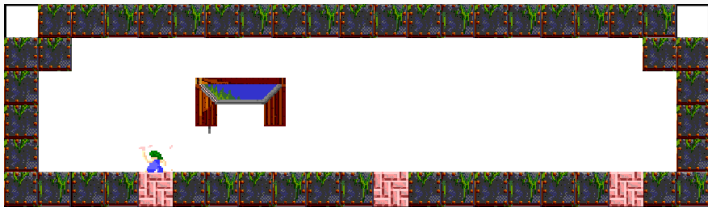
$$x_3 = \textit{false} \quad x_4 = \textit{false}$$

$$\text{strategy pt.2: } (\underline{\underline{\overline{x_1}}} \vee x_2 \vee x_4) \wedge (\underline{\underline{\overline{x_4}}} \vee \overline{x_2} \vee x_3) \wedge (\overline{x_3} \vee \underline{\underline{x_3}} \vee \overline{x_4})$$

$$\Rightarrow \overline{x_1} \wedge \overline{x_4} \wedge x_3$$

$$= \textit{true} \wedge \textit{true} \wedge \textit{false}$$

$$= \underline{\underline{\textit{false}}}$$



**Figure 4:** the clause gadget [1]

- the lemming can escape through digging a hole
  - each hole represents a check for the *truthness* of the corresponding literal in the clause
- $\hookrightarrow$  if the literal is true, the entire clause evaluates to true

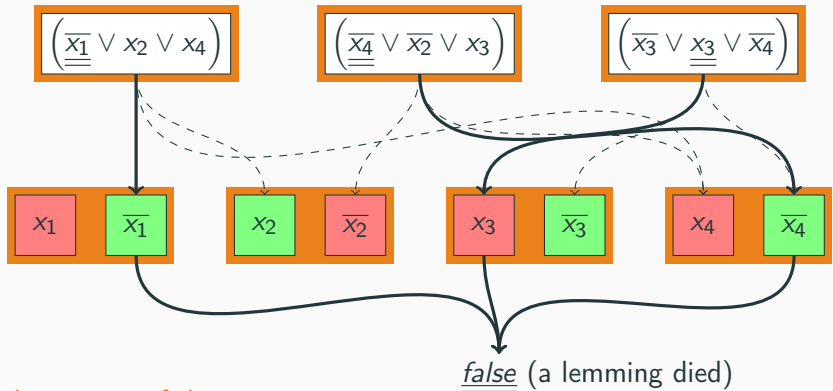


**Figure 5:** the variable gadget [1]

- the lemming can escape through bashing and building a bridge
  - one side corresponds to  $x_j = \text{true}$ , the other to  $x_j = \text{false}$
  - the clause lemming falls through the chosen hole and dies if he chose wrong
- $\hookrightarrow$  if all clause lemmings can choose right, the variables satisfy the clause

# LEMMINGS $\in NP\text{-Hard}$

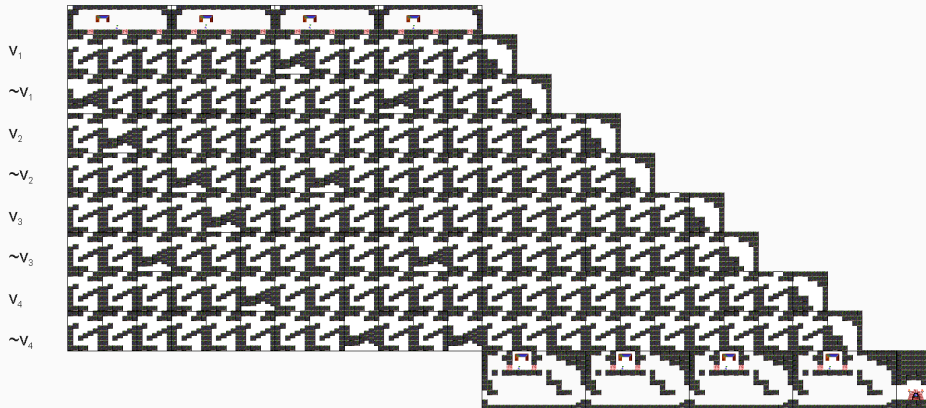
algorithm example



choose one of the options

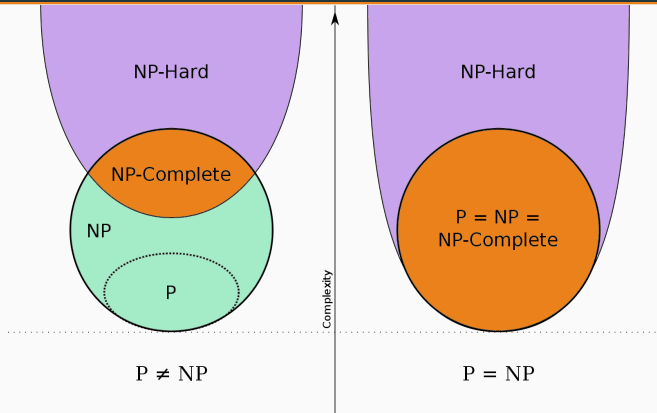
one combination of options leads to "true" if the problem is satisfiable





$$(\overline{v_1} \vee v_2 \vee \overline{v_3}) \wedge (\overline{v_2} \vee v_3 \vee v_4) \wedge (v_1 \vee \overline{v_2} \vee \overline{v_4}) \wedge (\overline{v_1} \vee \overline{v_3} \vee \overline{v_4}) \quad [1]$$

# LEMMINGS $\in NP$ -Complete



**Figure 6:**  $NP$ -Complete as intersection of  $NP$  and  $NP$ -Hard

- $LEMMINGS \in NP \wedge LEMMINGS \in NP$ -Hard
- $\rightarrow LEMMINGS \in NP$ -Complete

## Sources

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# 1-LEMMINGS $\in NP\text{-Complete}$

- also in NP-Complete
- much harder construction:

