

Hardness of Mastermind

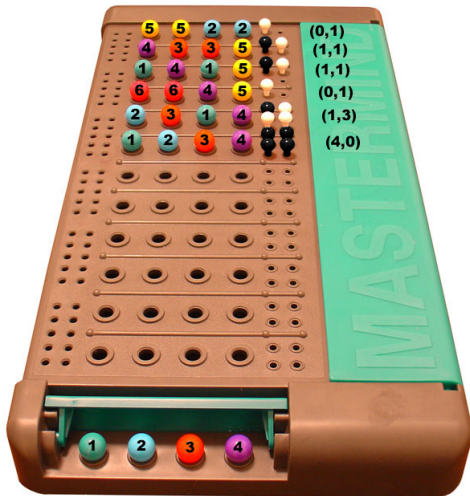
Giovanni Viglietta

Department of Computer Science, University of Pisa, Italy

Venice - June 5th, 2012

"Easy to learn. Easy to play. But not so easy to win."

Mastermind commercial, 1981

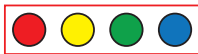


Mastermind is played on a board with colored pegs. A *codemaker* chooses a secret sequence of colors, and a *codebreaker* has to guess it in several attempts.

- After each guess, the codemaker responds with some black and white pegs.
 - Black pegs represent correct pegs in the codebreaker's guess that are also well-placed.
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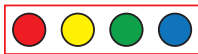
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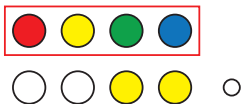
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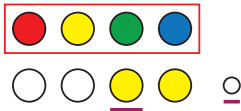
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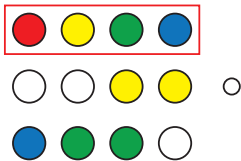
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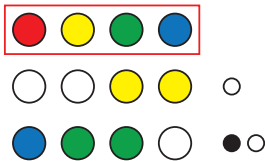
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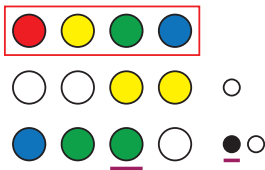
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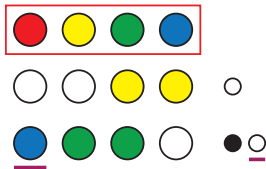
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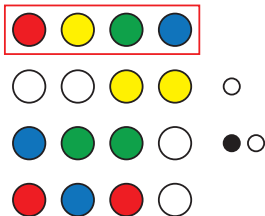
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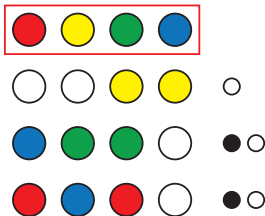
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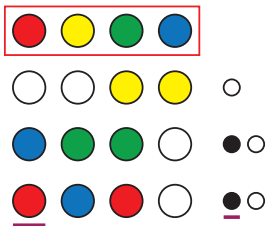
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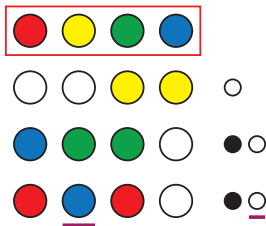
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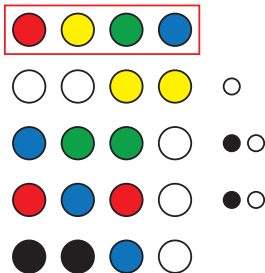
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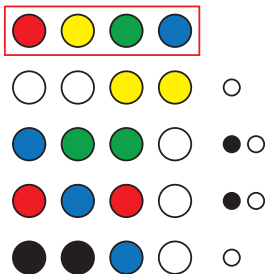
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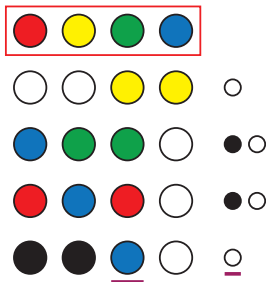
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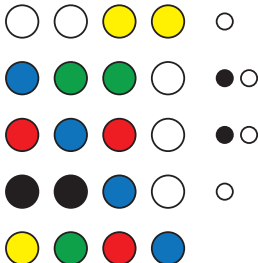
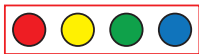
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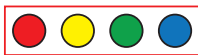
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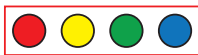
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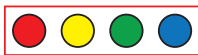
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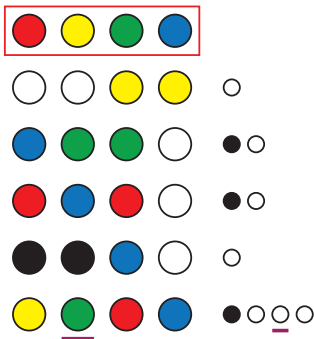
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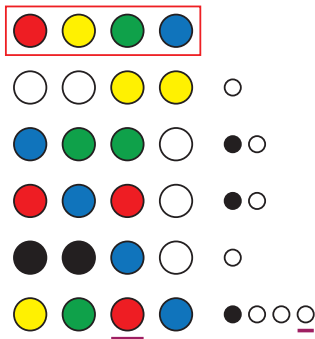
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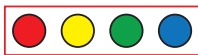
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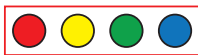
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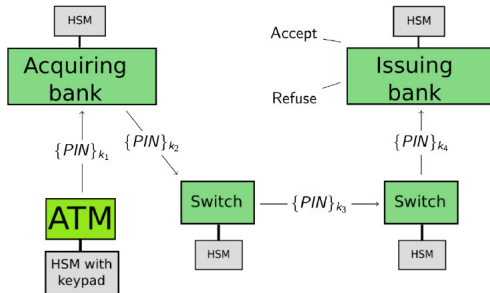
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Mastermind in bank frauds

- The relevance of Mastermind in real-life security issues was pointed out in 2010 by *Focardi* and *Luccio*.
- An insider of a bank who gains access to some switch is able to issue several PIN verification API calls, eventually deducing user PINs, digit by digit.
- This kind of attack is performed exactly as an extended Mastermind game played between the insider and the bank's computers.



A feasible heuristic



- A systematic study of Mastermind was carried out by *Chvátal*, in a 1983 paper dedicated to Erdős on his 70th birthday.
- Chvátal suggested a simple divide-and-conquer strategy for the codebreaker to guess the code in $2n \lceil \log c \rceil + 4n + \lceil \frac{c}{n} \rceil$ attempts. Each guess can be computed in polynomial time.
- This bound was subsequently lowered by a constant factor, with an improvement on the same basic idea.

Mastermind: a piece of cake?



- Does Chvátal's strategy trivialize the game?

Mastermind: a piece of cake?



- Does Chvátal's strategy trivialize the game?
- Not really, as long as the number of attempts is critical.
- The classic (4, 6)-Mastermind is solvable within 5 guesses, while Chvátal's algorithm guesses 18 times.
- Playing perfectly is still hard.

Exhaustive searches

- Another thread of heuristics was started in 1976 by *Knuth*, who devised a worst-case optimal (w.r.t. the number of guesses) greedy strategy to beat (4,6)-Mastermind.
- Every step of the strategy is a brute-force search among all possible guesses and all possible responses of the codemaker.
- The heuristic is based on choosing the guess that will minimize the number of eligible solutions, in the worst case.
- This is practical and optimal for (4,6)-Mastermind, but still infeasible and suboptimal in general.
- Several other approaches were adopted, most notably genetic algorithms, achieving different performance tradeoffs.



Mastermind Satisfiability Problem (MSP)

Input: (n, c, Q) , where Q is any sequence of guesses and responses in (n, c) -Mastermind.

Output: YES if there exists a code that is compatible with all the queries in Q , NO otherwise.

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Output: YES if there exists a code that is compatible with all the queries in Q , NO otherwise.

- In 2005 *Stuckman* and *Zhang* proved that MSP is NP-complete.
- In 2009 *Goodrich* proved the same result for a variant of Mastermind where the codemaker only responds with black pegs (with an application to genetics).

Solution uniqueness and Restricted Mastermind

Problem (Stuckman–Zhang, 2005)

Can we detect MSP instances with a unique solution?

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- Inspired by Goodrich, we define two variants of MSP.
 - In *MSP-BLACK* the codemaker responds only with black pegs.
 - In *MSP-WHITE* the codemaker responds with $(b + w)$ white pegs whenever in MSP he would have responded (b, w) . The codebreaker has to guess the code up to reordering of the pegs.

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- *c-MSP* is always played with c colors, while n is still a variable.
 - Similarly for *c-MSP-BLACK* and *c-MSP-WHITE*.

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- *c-MSP* is always played with c colors, while n is still a variable.
 - Similarly for *c-MSP-BLACK* and *c-MSP-WHITE*.
- We will determine which of these restrictions are #P-complete.

Preliminary results

Observation

In (n, c) -Mastermind restricted to white pegs, the codebreaker can guess the code after $c - 1$ attempts.

- He tries all possible colors... Although this is suboptimal.

Observation

$\#c\text{-MSP-WHITE} \in FP$.

- There are only $\binom{n+c-1}{c-1} = \Theta(n^{c-1})$ possible codes to check.

Observation

$\#(c - 1)\text{-MSP} \leq_{\text{pars}} \#c\text{-MSP}$.

- Add the guess $ccc \dots$ with response $(0, 0)$.
- This holds also for $\#c\text{-MSP-BLACK}$ and $\#c\text{-MSP-WHITE}$.

Theorem

$$\#1\text{-IN-3-SAT} \leq_{\text{pars}} \begin{cases} \#MSP\text{-WHITE} \\ \#2\text{-MSP-BLACK} \\ \#2\text{-MSP.} \end{cases}$$

- Hence all these variations are #P-complete.

#1-IN-3-SAT \leq_{pars} #MSP-WHITE

- Let $\varphi = (x \vee \neg y \vee z) \wedge (\neg x \vee y \vee w) \wedge (y \vee \neg z \vee \neg w)$.
- Colors: $x, \bar{x}, y, \bar{y}, z, \bar{z}, w, \bar{w}, *$.
- Code length: 4.

#1-IN-3-SAT \leq_{pars} #MSP-WHITE

- Let $\varphi = (x \vee \neg y \vee z) \wedge (\neg x \vee y \vee w) \wedge (y \vee \neg z \vee \neg w)$.
- Colors: $x, \bar{x}, y, \bar{y}, z, \bar{z}, w, \bar{w}, *$.
- Code length: 4.
- Queries:
 - $****$ with score (0)

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- Colors: $x, \bar{x}, y, \bar{y}, z, \bar{z}, w, \bar{w}, *$.
- Code length: 4.
- Queries:
 - $****$ with score (0)
 - $x x \bar{x} \bar{x}$ with score (1)
 - $y y \bar{y} \bar{y}$ with score (1)
 - $z z \bar{z} \bar{z}$ with score (1)
 - $ww \bar{w} \bar{w}$ with score (1)

#1-IN-3-SAT \leq_{pars} #MSP-WHITE

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 - $z z \bar{z} \bar{z}$ with score (1)
 - $ww \bar{w} \bar{w}$ with score (1)
 - $x \bar{y} z *$ with score (1)
 - $\bar{x} y w *$ with score (1)
 - $y \bar{z} \bar{w} *$ with score (1)

#1-IN-3-SAT \leq_{pars} #2-MSP-BLACK

- Let $\varphi = (x \vee \neg y \vee z) \wedge (\neg x \vee y \vee w) \wedge (y \vee \neg z \vee \neg w)$.
- Colors: ●, ○.
- Code length: 8.

#1-IN-3-SAT \leq_{pars} #2-MSP-BLACK

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- Colors: ●, ○.
- Code length: 8.
- Queries:

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
○	○	○	○	○	○	○	○	(4)

#1-IN-3-SAT \leq_{pars} #2-MSP-BLACK

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x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
○	○	○	○	○	○	○	○	(4)

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
●	●	○	○	○	○	○	○	(4)
○	○	●	●	○	○	○	○	(4)
○	○	○	○	●	●	○	○	(4)
○	○	○	○	○	○	●	●	(4)

#1-IN-3-SAT \leq_{pars} #2-MSP-BLACK

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x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
○	○	○	○	○	○	○	○	(4)

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
●	●	○	○	○	○	○	○	(4)
○	○	●	●	○	○	○	○	(4)
○	○	○	○	●	●	○	○	(4)
○	○	○	○	○	○	●	●	(4)

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
●	○	○	●	●	○	○	○	(3)
○	●	●	○	○	○	●	○	(3)
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#1-IN-3-SAT \leq_{pars} #2-MSP

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x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
○	○	○	○	○	○	○	○	(4, 0)

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
●	●	○	○	○	○	○	○	(4, 2)
○	○	●	●	○	○	○	○	(4, 2)
○	○	○	○	●	●	○	○	(4, 2)
○	○	○	○	○	○	●	●	(4, 2)

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}	Score
●	○	○	●	●	○	○	○	(3, 4)
○	●	●	○	○	○	●	○	(3, 4)
○	○	●	○	○	●	○	●	(3, 4)

Solutions

$$(x \vee \neg y \vee z) \wedge (\neg x \vee y \vee w) \wedge (y \vee \neg z \vee \neg w)$$

x	y	z	w
T	T	T	T
T	T	T	F
T	T	F	T
T	T	F	F
T	F	F	T
F	T	T	T
F	T	T	F
F	F	T	F
F	F	F	T
F	F	F	F

x	\bar{x}	y	\bar{y}	z	\bar{z}	w	\bar{w}
●	○	●	○	●	○	●	○
●	○	●	○	●	○	○	●
●	○	●	○	○	●	●	○
●	○	●	○	○	●	○	●
●	○	○	●	○	●	●	○
○	●	●	○	●	○	●	○
○	●	●	○	●	○	○	●
○	●	○	●	●	○	○	●
○	●	○	●	○	●	●	○
○	●	○	●	○	●	○	●

Corollaries

- In a real game of Mastermind we would *know* that our queries are satisfiable. Can we use this information to compute the size of the solution space?
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$\#MATCH$ is $\#P$ -complete under Turing reductions.

- Then $\#SAT \leq_T \#MATCH \leq_{pars} \#MSP$.
- The graphs with fewer than k edges are solved by hand; the others (which have at least k matchings) are mapped to $\#MSP$.

Corollary

$\#MSP$ restricted to instances with at least k solutions is $\#P$ -hard.

Problem (Stuckman–Zhang, 2005)

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Corollary

No, it is NP-hard under randomized Turing reductions.

- $\#c\text{-MSP-WHITE} \in \text{FP}$ when c is a constant.
- $\#\sqrt[k]{n}\text{-MSP-WHITE}$ is $\#P$ -complete for every $k \geq 1$.

Problem

What is the lowest order of growth of $c(n)$ such that $\#c(n)\text{-MSP-WHITE}$ is $\#P$ -complete?

- Solving MSP is a sub-step of several heuristics.
 - But is it really necessary?

MASTERMIND

Input: (n, c, Q, k) .

Output: YES if the codebreaker has a strategy to guess the code within k attempts, given the set of queries Q . NO otherwise.

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- MASTERMIND \in PSPACE, due to Chvátal's strategy.

Problem

Is MASTERMIND PSPACE-complete?