

# Formally Verified Endgame Tables

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# Talk Plan

- 1 Endgame Tables
- 2 Software Errors
- 3 Formal Verification
- 4 Verified Endgame Tables
- 5 Summary

# Endgame Tables

- Hardy (1940) estimated the number of possible **games of chess** to be  $\approx 10^{10^{50}}$ .
- Shannon (1950) estimated the number of possible **chess positions** to be  $\approx 10^{43}$ .
- But the number of possible chess positions with  $n$  **fixed pieces** is  $< 2 \times 16 \times 64^n$ .
- Endgame tables (EGTs) **solve chess** for small values of  $n$ .

# Categorize and Conquer

- Divide all possible chess positions into **classes** (e.g., KQKR).
  - **Warning:** It should never be possible for a chess game to leave a class and enter it again later.
- For each class  $C$  of positions define an **enumeration**  $f : C \rightarrow [0..N)$ .
  - Can often reduce  $N$  by using symmetry and eliminating illegal positions (e.g., touching kings).
- Compute an array  $\text{DTM}[N]$  of **depth-to-mate** values.
  - $\text{DTM}[f(p)] = n$  means that starting from position  $p$  White can checkmate Black within  $n$  moves.
  - Use **symmetry** to find Black's depth-to-mate and draws.

# Computing DTM Endgame Tables

## Code (Initialize DTM)

```
initialize() {  
  for each (p in C) {  
    if Black to move and checkmated then  
      DTM[f(p)] := 0  
    else  
      DTM[f(p)] :=  $+\infty$   
  }  
}
```

# Computing DTM Endgame Tables (II)

## Code (Propagate DTM values)

```
iterate() {  
  for each (p in C) {  
    Q := the set of possible next positions from p  
    if White to move then  
      DTM[f(p)] := 1 + minimum DTM of positions in Q  
    else if not in checkmate then  
      DTM[f(p)] := maximum DTM of positions in Q  
  }  
}
```

**Note:**  $Q$  might include positions outside  $C$

# Computing DTM Endgame Tables (III)

## Code (Converge to a fixed point)

```
compute() {  
  DTM := new Integer[N]  
  initialize()  
  while (DTM changes) {  
    iterate()  
  }  
}
```

What can go wrong?

# The First Actual Computer Bug

- On 9 September 1945 the Harvard Mark II Machine broke down because a moth got caught between the points of Relay #70 in Panel F.
- At 3:45pm Grace Murray Hopper extracted it and taped it into the log book.
- In fact the term *bug* to mean a snag or defect was used by Edison as early as 1878.



The Harvard Mark II Machine, an early computer boasting magnetic drum storage.

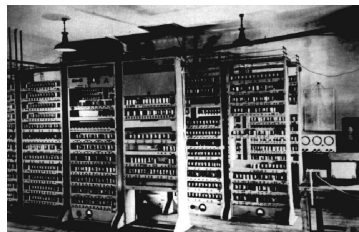


"First actual case of bug being found"

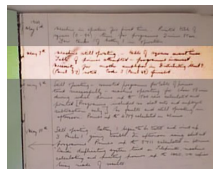


# The First Software Bug

- The EDSAC I became operational on 6 May 1949, printing a table of square numbers.
- The **very next day** the log entry reports a software error.
- Maurice Wilkes recalls the experience of debugging a program in June 1949:  
*"[T]he realization came over me with full force that a good part of the remainder of my life was going to be spent in finding errors in my own programs."*



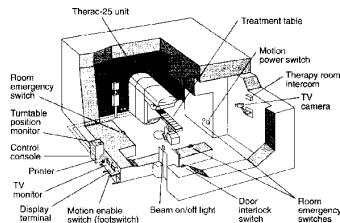
The EDSAC I, the first stored program computer.



"Machine still operating - table of squares several times. Table of primes attempted - programme incorrect"

# Serious Software Bugs

- **1985–1987:** A particular combination of operator key presses on the Therac 25 radiation treatment machine blasted the patient with X-rays at 125 times the recommended dose, resulting in the **death of 3 people**.
- **4 June 1996:** The \$2B Ariane 5 rocket **exploded on its maiden flight** because an assignment of a 64 bit number to a 16 bit buffer overflowed. The Inertial Reference System crashed and output a test pattern. The rocket controller interpreted this as real flight data, changed direction, disintegrated and self-destructed.



The Therac 25 radiation treatment machine.



The launch of the Ariane 5 rocket.

# Endgame Table Software Bugs

Endgame tables have occasionally been found to contain errors:

- **1986:** Thompson's KQPKQ EGT was caveated as correct only in the absence of underpromotion.
- **1987:** Van Den Herik's KRP(a2)KbBP(a3) EGT replaced unavailable subgame EGTs with faulty chessic logic.
- **1999:** RetroEngine's EGTs assumed that the loser would never make a capture.
- **2002:** FEG's KNNK EGT assumed that White could never win, and in other EGTs sliding pieces could jump over pawns.

# What About Testing?

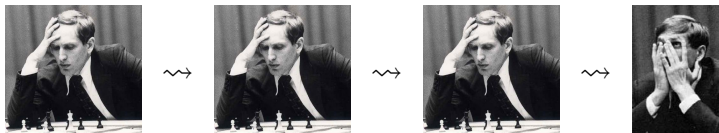
- Testing is an effective technique for finding software bugs that **appear frequently**.
- **Example:** If you have a bug in your software that crashes the computer every 1,000,000 hours on average, then:
  - you need 1,000,000 hours of testing to spot the bug;
  - but every day it will crash one of your 50,000 users.
- **Question:** How do you know when to stop testing?
  - *“Program testing can be used to show the presence of bugs, but never to show their absence!”* [Dijkstra]

# Static Analysis

- Static analysis is a program verification technique that is complementary to testing.
  - Testing works by [executing](#) the program and checking its run-time behavior.
  - Static analysis works by examining the [text](#) of the program.
- Driven by new techniques, static analysis tools have recently made great improvements in scope.
  - **Example 1:** Modern type systems can check [data integrity](#) properties of programs at compile time.
  - **Example 2:** Abstract interpretation techniques can find memory problems such as [buffer overflows](#) or [dangling pointers](#).
  - **Example 3:** The TERMINATOR tool developed by Microsoft Research can find [infinite loops](#) in Windows device drivers that would cause the OS to hang.

# Higher Order Logic Theorem Proving

- Interactive theorem proving is a static analysis method.
  - The user makes **logical definitions** and applies tactics to formally **prove properties** of them.
- Higher order logic is expressive enough to naturally formalize mathematics and verify software.
  - **Example 1:** Formalization of probability theory.
  - **Example 2:** Verification of the seL4 operating system kernel.
- The main challenge is **proof automation**:



# Theorem Provers in the LCF Design

- A theorem  $\Gamma \vdash \phi$  states “if all of the hypotheses  $\Gamma$  are true, then so is the conclusion  $\phi$ ”.
- The novelty of Milner’s **Edinburgh LCF** theorem prover was to make theorem an abstract ML type.
- Values of type theorem can only be created by a small **logical kernel** which implements the primitive inference rules of the logic.
- **Soundness** of the whole ML theorem prover thus reduces to soundness of the logical kernel.

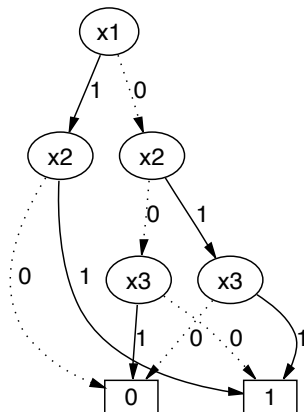


HOL theorem prover  $\sim$  the elephant  
higher order logic  $\sim$  the ball

# Binary Decision Diagrams

- Binary decision diagrams (BDDs) are a representation of **propositional logic formulas**.
- Every path from root to leaf respects a variable ordering, and there is maximal sharing of subterms.
- Gordon created a set of inference rules relating **higher order logic formulas** and **BDDs**:

$$\frac{\Gamma \vdash t_1 = t_2 \quad \Delta \vdash t_1 \mapsto B}{\Gamma \cup \Delta \vdash t_2 \mapsto B}$$

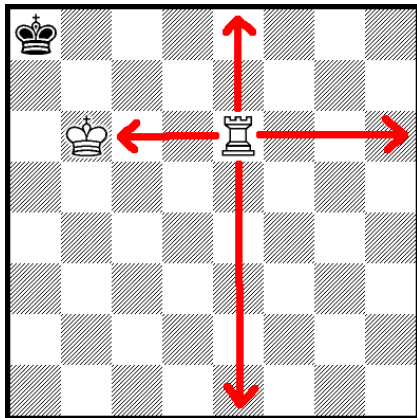


A binary decision diagram representation of  $(x1 \wedge x2) \vee (\neg x1 \wedge (x2 \equiv x3))$ .



# Formalizing the Laws of Chess

**Example:** Define the [set of squares](#) that a rook attacks.



# Formalizing the Laws of Chess (II)

- Define the required **types**:

- $\text{square} \equiv \mathbb{N} \times \mathbb{N}$
- $\text{position} \equiv$   
 $\text{side} \times (\text{square} \rightarrow (\text{side} \times \text{piece}) \text{ option})$

- Define the **logical relation**:

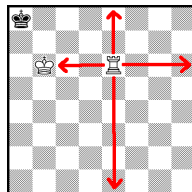
$\text{rookAttacks} : \text{position} \rightarrow \text{square} \rightarrow \text{square} \rightarrow \text{bool}$

$\text{rookAttacks } p \ a \ b \equiv$

$a \neq b \wedge (\text{file } a = \text{file } b \vee \text{rank } a = \text{rank } b) \wedge$

$\forall c. \text{betweenSquare } a \ c \ b \implies \text{emptySquare } p \ c$

- Continue in this way to formalize a logical definition of  
 $\text{DTM} : \mathbb{N} \rightarrow \text{position set}$



# Computing Verified Endgame Tables

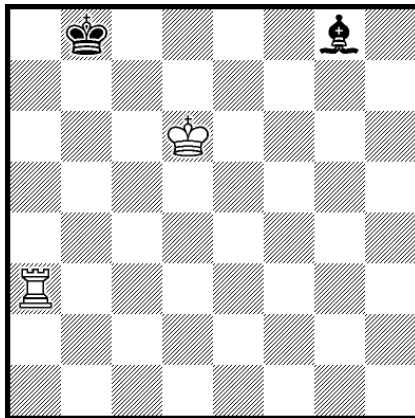
We build our verified endgame database in the usual way by working backwards from checkmates, but [symbolically using BDDs](#).

$$\begin{aligned} &\vdash \text{decodePosition} \\ &\quad (\text{Black}, [(\text{White}, \text{King}), (\text{White}, \text{Rook}), \\ &\quad \quad (\text{Black}, \text{King}), (\text{Black}, \text{Bishop})]) \\ &\quad [x_0, x_1, x_2, x_3, x_4, x_5, x_6, x_7, x_8, x_9, x_{10}, x_{11}, \\ &\quad \quad x_{12}, x_{13}, x_{14}, x_{15}, x_{16}, x_{17}, x_{18}, x_{19}, x_{20}, x_{21}, x_{22}, x_{23}]) \\ &\quad \in \text{DTM } 28 \\ &\mapsto < 29,907 > \end{aligned}$$

Performance is sufficient to cover all [4 piece pawnless endgames](#).

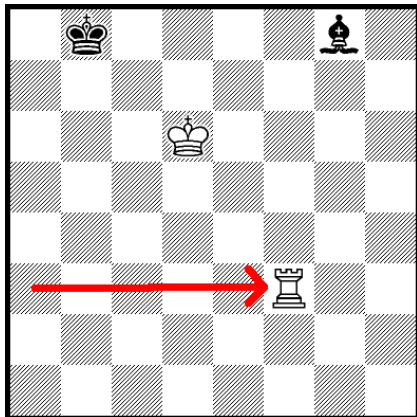
# Querying the Endgame Tables

**Quiz:** Find the only **winning White move**.

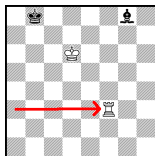


# Querying the Endgame Tables (II)

**Solution:** Rf3 is **checkmate in 29** (all other moves draw).



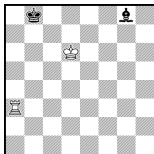
# Querying the Endgame Tables (III)



Check the after-position by [proving a theorem](#) using our verified endgame table:

$\vdash$  (Black,  
     $\lambda sq.$   
    if  $sq = (3, 5)$  then Some (White, King)  
    else if  $sq = (5, 2)$  then Some (White, Rook)  
    else if  $sq = (1, 7)$  then Some (Black, King)  
    else if  $sq = (6, 7)$  then Some (Black, Bishop)  
    else None)  $\in$  DTM 28

# Querying the Endgame Tables (IV)



In fact, we can prove that checkmate in 29 is the **longest possible win** in the King and Rook versus King and Bishop endgame:

$\vdash \forall p, n.$

$\text{toMove } p = \text{White} \wedge$

$\text{hasPieces } p \text{ White } [\text{King}, \text{Rook}] \wedge$

$\text{hasPieces } p \text{ Black } [\text{King}, \text{Bishop}] \wedge$

$\text{allPiecesOnBoard } p \wedge$

$p \in \text{DTM } n \implies$

$p \in \text{DTM } 29$

# Summary

- The [world's first verified endgame table](#).
- Can prove that [position classification](#) logically follows from the [laws of chess](#).
- Constructed as a [fully automatic algorithm](#) implemented in the HOL4 theorem prover.
- Please [get in touch](#) if you are interested in finding out more:

`joe@gilith.com`

`http://gilith.com/chess/endgames`