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COLLEGE

What is Art?  
Kolmogorov Complexity  
Logic Programming  
All the Art

# Using Kolmogorov Complexity to Make All the Art

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Art!

$\text{Int} \times \text{Int} \rightarrow \text{Bool}$   
Example  
Visual complexity

Art!



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## $\text{Int} \times \text{Int} \rightarrow \text{Bool}$

- A restricted form of digital art
- black and white pixels on a grid
- black is “true”, white is “false”
- each pixel’s color is a function of its grid coordinates
- art is a function mapping  $(\mathbb{Z} \times \mathbb{Z})$  to  $\{true, false\}$



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Some art is more complex than other art



## Example

$$(x < y)$$

$$(((1 + (1 + 1)) < (x * y)) \text{ and } ((x + 1) < (y * (1 + 1))))$$





## Example

$(x < y)$

3 symbols

$((((1 + (1 + 1)) < (x * y)) \text{ and } ((x + 1) < (y * (1 + 1)))))$

19 symbols

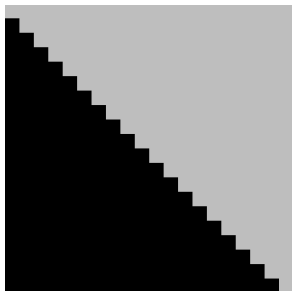


## Example

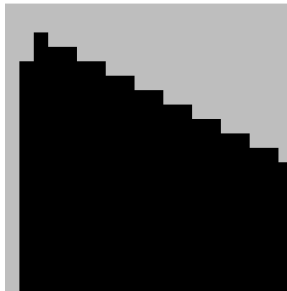
$(x < y)$

$((1 + (1 + 1)) < (x * y))$  and  
 $((x + 1) < (y * (1 + 1)))$

3 symbols



19 symbols



(+x is to the right, +y is down — it's a computer graphics thing)



## Visual complexity

Visual complexity fuzzy and hard to define, but intuitive

Computational complexity well defined, but complicated and  
(arguably) unintuitive

Perhaps visual complexity is correlated with  
computational complexity?



## Complexity, quantified

- The complexity of an object is the size of the smallest program (a.k.a. formula) which outputs that object.
- That's Kolmogorov Complexity! ( $KC$ )



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**Doesn't matter, they are all equivalent!**

(The  $KC$  of an object in one language is equivalent to the  $KC$  of that same object in another language, up to an additive constant.)



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**Doesn't matter, they are all equivalent!**  
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- What programming language?  
**Racket.**

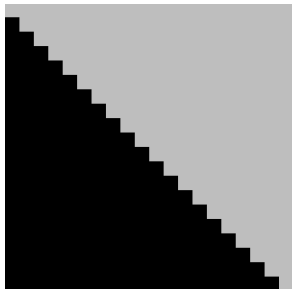




## Example

$(x < y)$

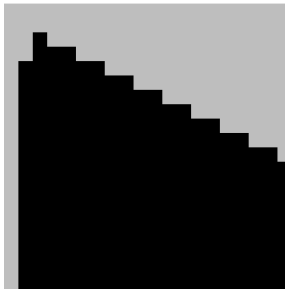
3 symbols



Kolmogorov complexity of 3

$((((1 + (1 + 1)) < (x * y)) \text{ and } ((x + 1) < (y * (1 + 1))))))$

19 symbols



Kolmogorov complexity of 19

(Remember: +x is to the right, +y is down)



## PROgramming with LOGic

- Specify relationships
- Computer generates objects which satisfy those relationships
- We used MiniKanren, a library for Racket<sup>1</sup> developed for this purpose

---

<sup>1</sup>Racket is a descendant of Scheme and LISP



## MiniKanren

- A logic programming language/library for Racket.
- Specify relationships, e.g.:

```
(def cousin
  (λ (p1 p2)
    (and (== (grandparent p1) (grandparent p2))
         (!= (parent p1) (parent p2)))))
```
- When asked appropriately, MiniKanren will generate objects which satisfy a relation. e.g.:

```
(run* (x) (cousin x 'JonathanLangke))
```



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Our Algorithm  
All the 2x2 Art  
Some Larger Art  
References  
What We Did



[http://hyperboleandahalf.blogspot.com/2010/06/  
this-is-why-ill-never-be-adult.html](http://hyperboleandahalf.blogspot.com/2010/06/this-is-why-ill-never-be-adult.html)



## Our Algorithm

- 1 Define what it means to be a “well-typed” (internally consistent, i.e. non-crashing) program of a particular size
- 2 Generate, using MiniKanren, all well-typed programs up to a particular size
- 3 Run each program to generate its corresponding image
- 4 Record the smallest program which generates each image



## Our Algorithm

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- 4 Record the smallest program which generates each image
- 5 PROFIT!



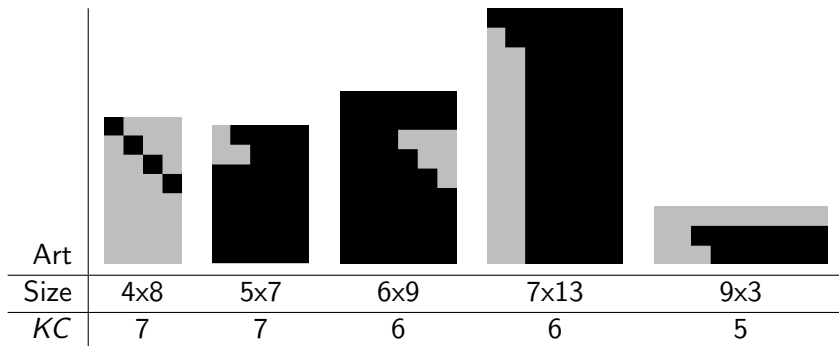
## All the 2x2 Art

Formulae	Level	Pictures
none	0	empty
(true), (false)	1	
none	2	empty
$(x < 1), (y < 1), (x < y), (0 < x), (0 < y), (y < x)$	3	
$(\text{not } (x < y)), (\text{not } (y < x))$	4	
$((y + x) < 1), ((y * x) < 1), (0 < (y + x)), (1 < (y + x))$	5	
none	6	empty
$((y < x) \text{ or } (x < y))$	7	
$(\text{not } ((y < x) \text{ or } (x < y)))$	8	

(Remember: +x is to the right, +y is down)



## Some Larger Art







## References



William E. Byrd and Daniel P. Friedman.

From variadic functions to variadic relations.

*In Proceedings of the 2006 Scheme and Functional Programming Workshop, 2006.*



Daniel P Friedman, William E. Byrd, and Oleg Kiselyov.

*The Reasoned Schemer.*

MIT Press, 2005.




Danny Yoo.

<http://lists.racket-lang.org/users/archive/2006-December/015837.html>.




## What We Did

- ① Defined what it meant to be an acceptable program
  - ① Built out of  $<$ , and, or, not, 0, 1, x, y, +, \*
  - ② Formula evaluates to true or false
- ② Defined art
  - ① Black and white pixel grid, corresponds to a boolean formula
  - ② 
- ③ Used MiniKanren to generate, from our constraints in step 1, all formulae of a given size
- ④ Evaluated each formula (i.e. executed each program) to find its pictorial output.
  - ① When an output was produced multiple times, we chose the smallest formula
- ⑤ Put it all together to discover the Kolmogorov Complexity of very small pieces of art.



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## Any questions?