

# COMP 102A, Lecture 12



# Computability and Complexity

COMP 102A, Lecture 12





# Paris, 1900

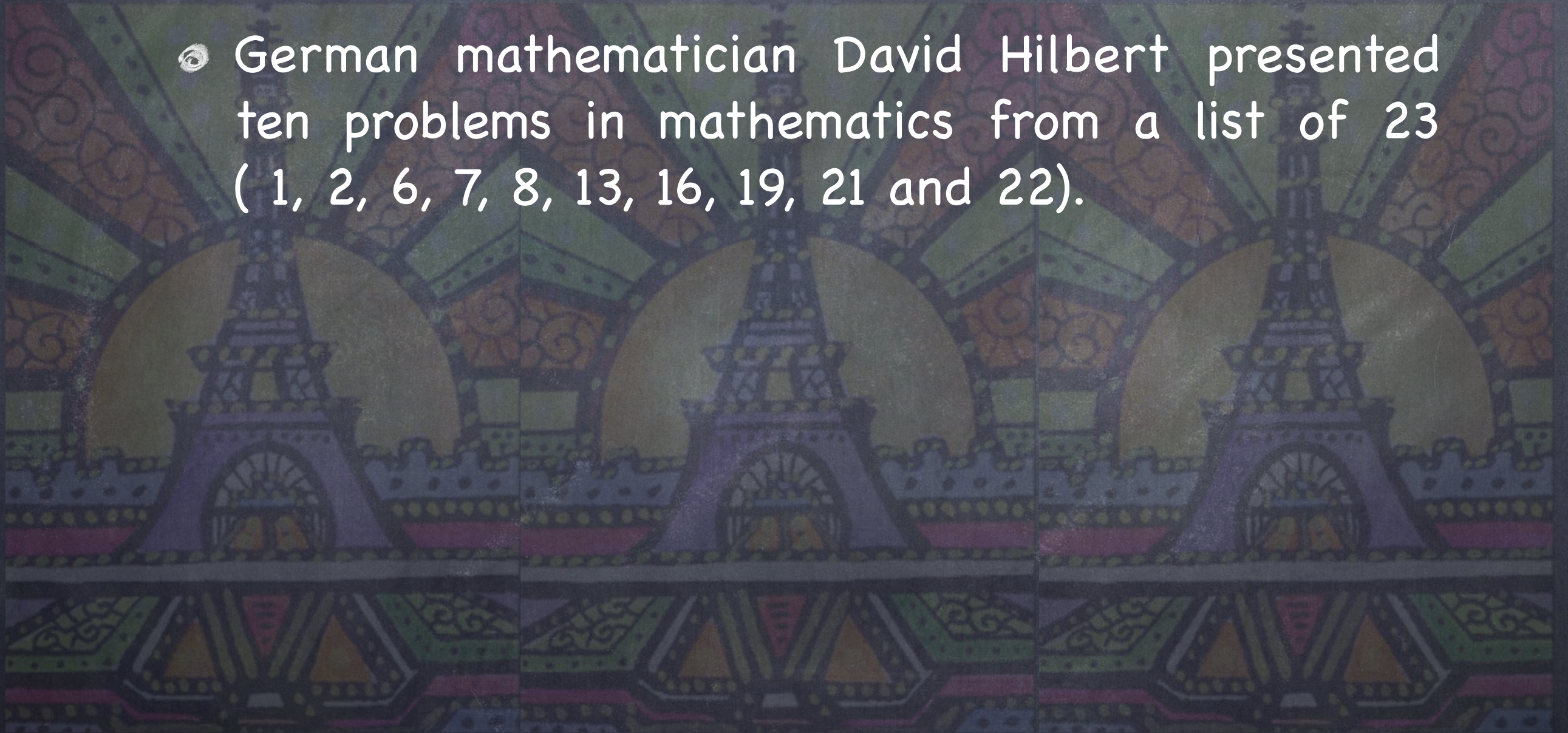






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- Speaking on 8 August 1900, at the Paris 2<sup>nd</sup> International Congress of Mathematicians, at La Sorbonne. The full list was published later.
- The problems were all unsolved at the time, and several of them turned out to be very influential for 20<sup>th</sup> century mathematics.



Fundamental question ?



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(Hilbert's 2<sup>nd</sup> problem)



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# Fundamental question ?

- Can we prove all the mathematical statements that we can formulate ?  
(Hilbert's 2<sup>nd</sup> problem)
- Certainly, there are many mathematical problems that we do not know how to solve.
- Is this just because we are not smart enough to find a solution ?
- Or, is there something deeper going on ?



computer science version  
of these questions



# computer science version of these questions

- If my boss / supervisor / teacher formulates a problem to be solved urgently, can I write a program to solve this problem in an efficient manner ???



# computer science version of these questions

- If my boss / supervisor / teacher formulates a problem to be solved urgently, can I write a program to solve this problem in an efficient manner ???
- Are there some problems that cannot be solved at all ? and, are there problems that cannot be solved efficiently ??  
(related to Hilbert's 10<sup>th</sup> problem)





Kurt Gödel





# Kurt Gödel

- In 1931, he proved that any formalization of mathematics contains some statements that cannot be proved or disproved.





Alan Turing





# Alan Turing

- In 1934, he formalized the notion of decidability of a language by a computer.



A Language



# A Language

- Let  $\Sigma$  be a finite alphabet. (ex:  $\{0,1\}$ )



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- A language  $L$  is any subset of  $\Sigma^*$ .
- An algorithm decides a language if it answers Yes when  $x$  is in  $L$  and No otherwise



# Comparing Cardinalities



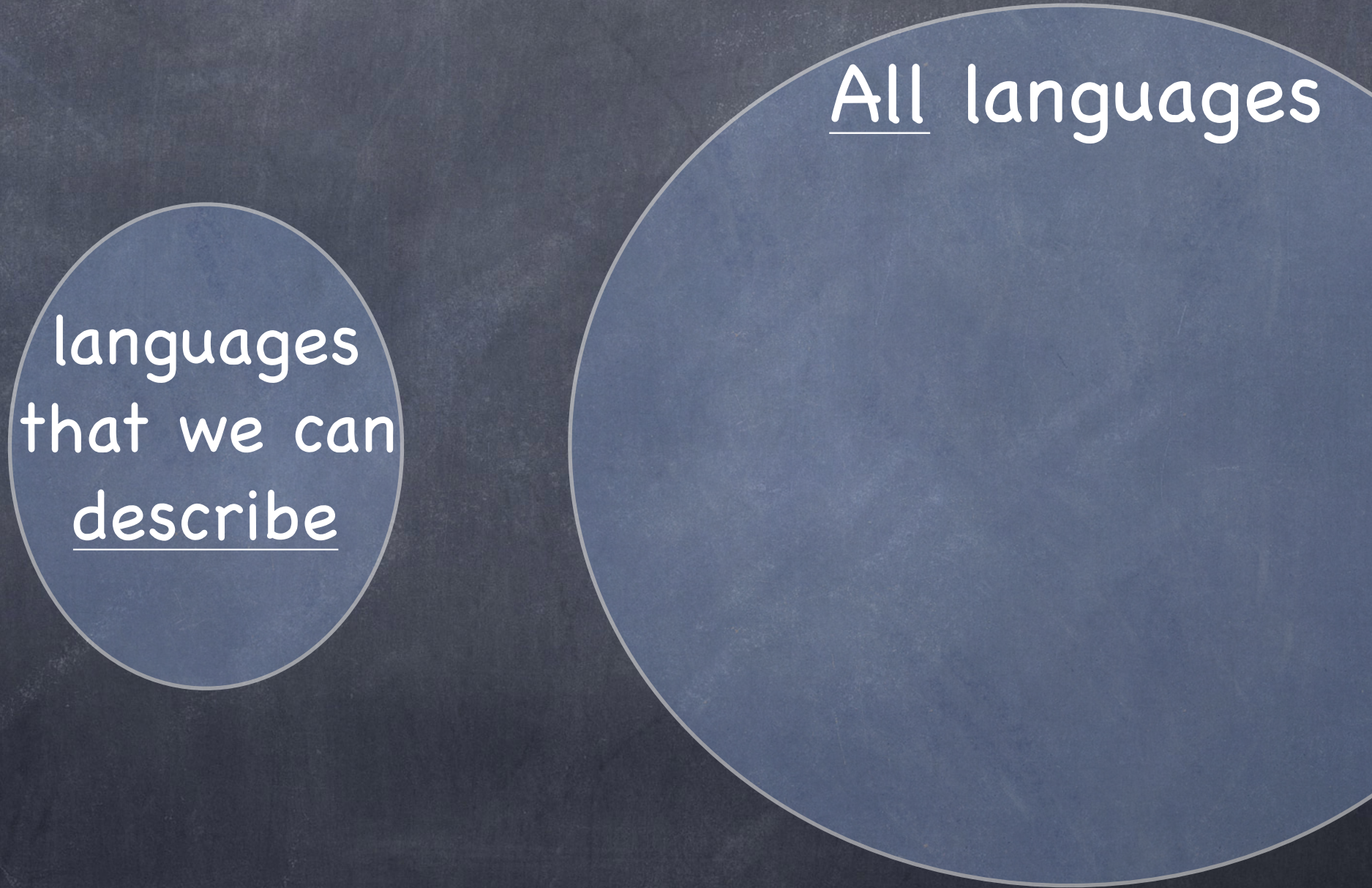
# Comparing Cardinalities

All languages

A large, solid blue circle is positioned on the right side of the slide, partially overlapping the dark background. It is empty except for the text 'All languages' at its top edge.



# Comparing Cardinalities

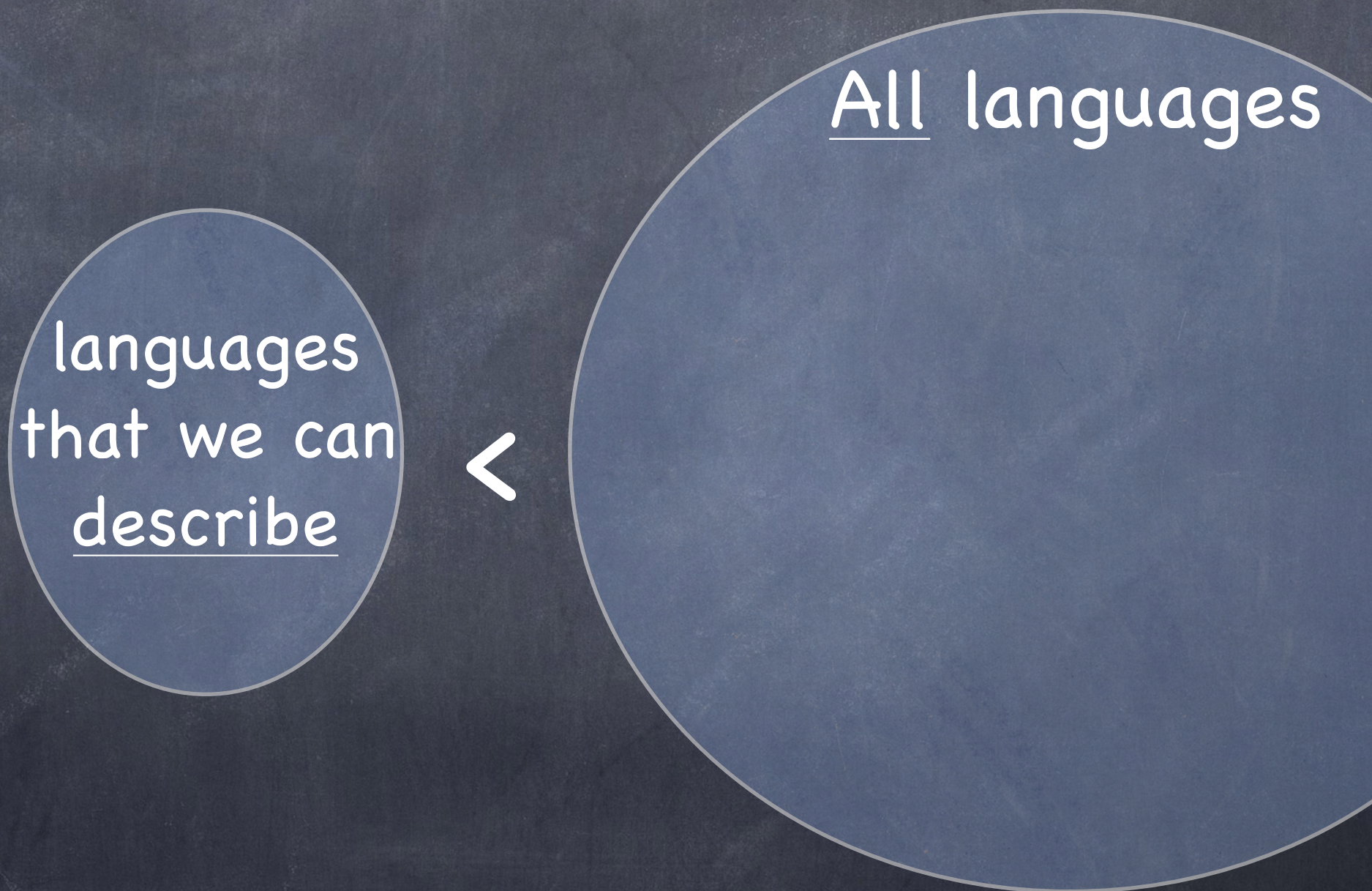


languages  
that we can  
describe

All languages

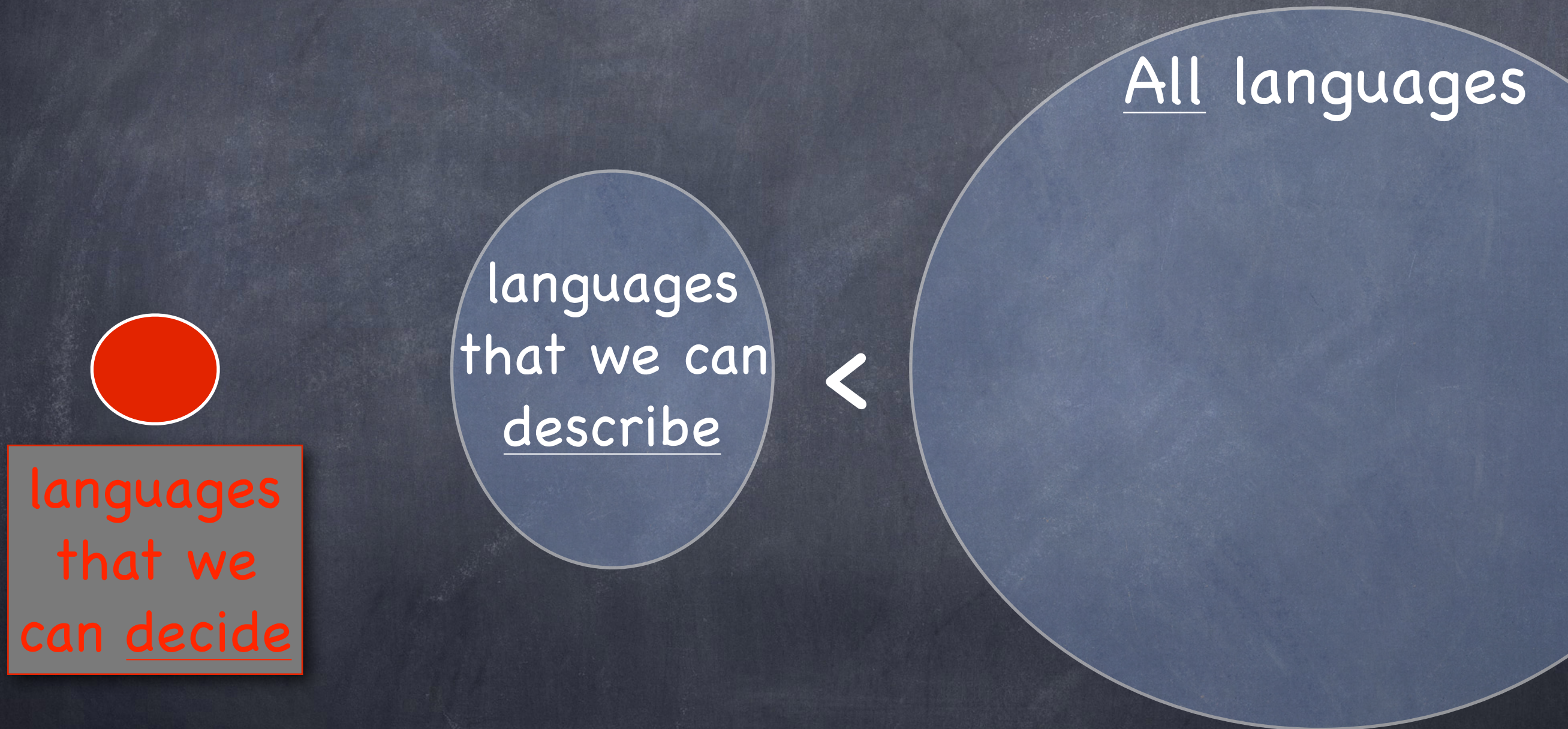


# Comparing Cardinalities



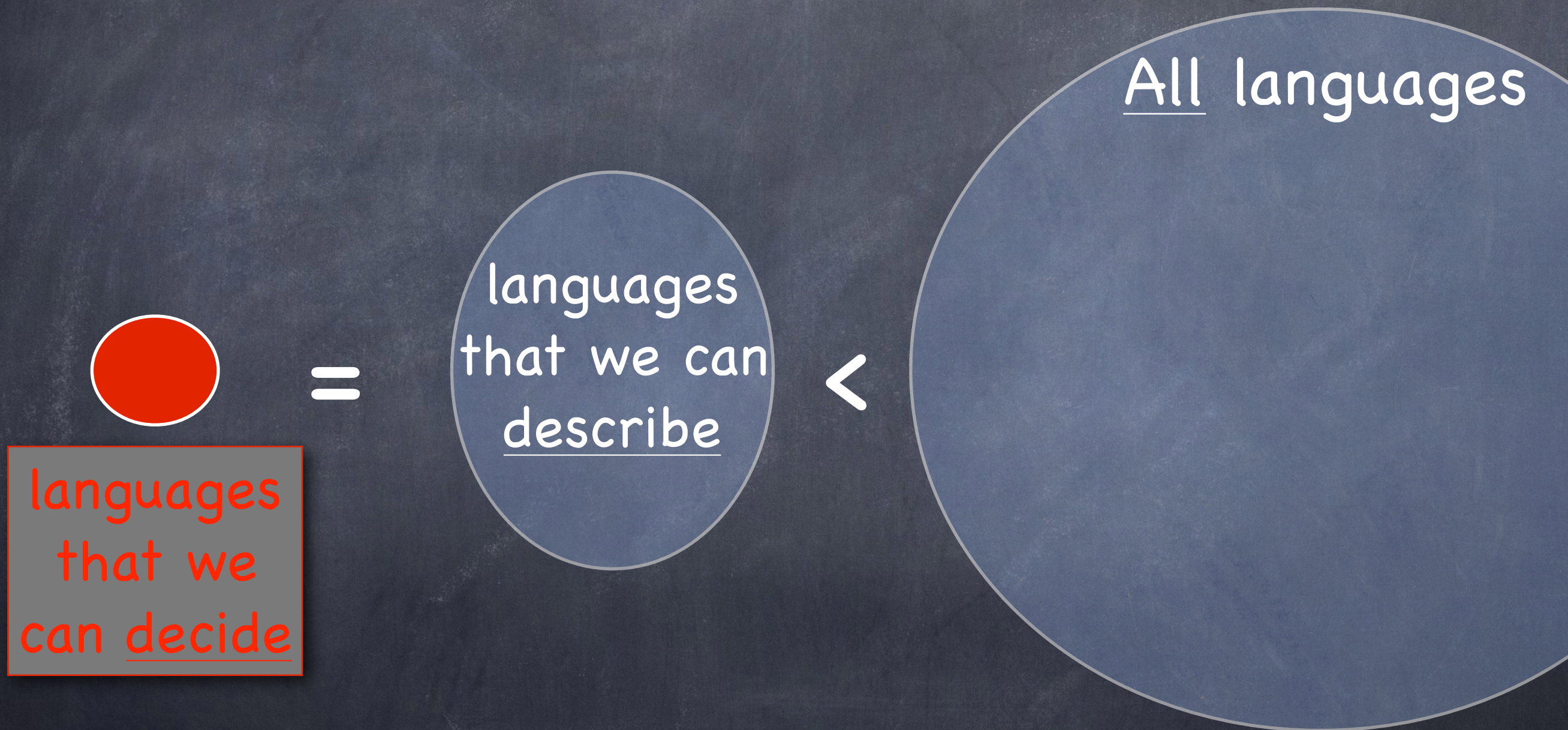


# Comparing Cardinalities





# Comparing Cardinalities







# Alonzo Church





# Alonzo Church

- In 1936, he proved that certain languages cannot be decided by any algorithm whatsoever...





# Emil Post





# Emil Post

- In 1946, he gave a very natural example of an undecidable language...



# (PCP) Post Correspondence Problem



# (PCP) Post Correspondence Problem

aaa	a	bbb	aa		b
bb	bb	a	a	bb	

- An instance of PCP with 6 tiles.



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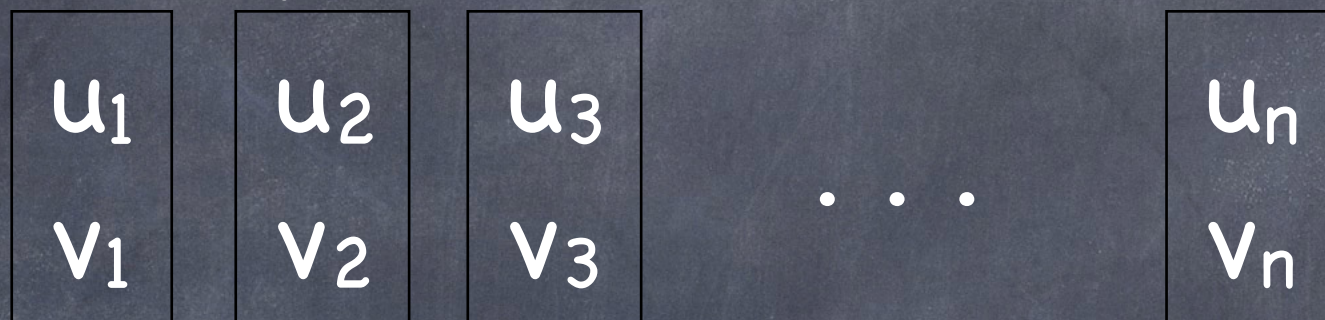
Post

Correspondence Problem



# Post

## Correspondence Problem

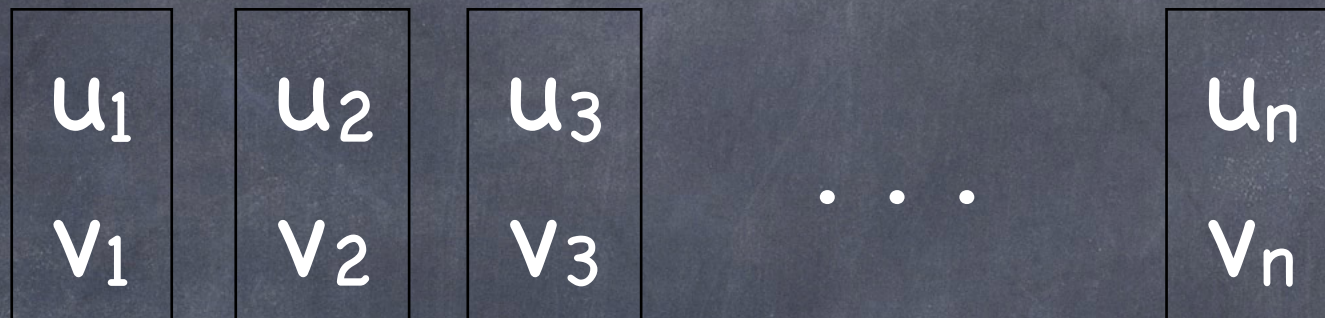


- Given  $n$  tiles,  $u_1/v_1 \dots u_n/v_n$   
where each  $u_i$  or  $v_i$  is a sequence of letters.



# Post

## Correspondence Problem



- Given  $n$  tiles,  $u_1/v_1 \dots u_n/v_n$   
where each  $u_i$  or  $v_i$  is a sequence of letters.
- Is there a  $k$  and a sequence  $\langle i_1, i_2, i_3, \dots, i_k \rangle$   
( with each  $1 \leq i_j \leq n$  ) such that

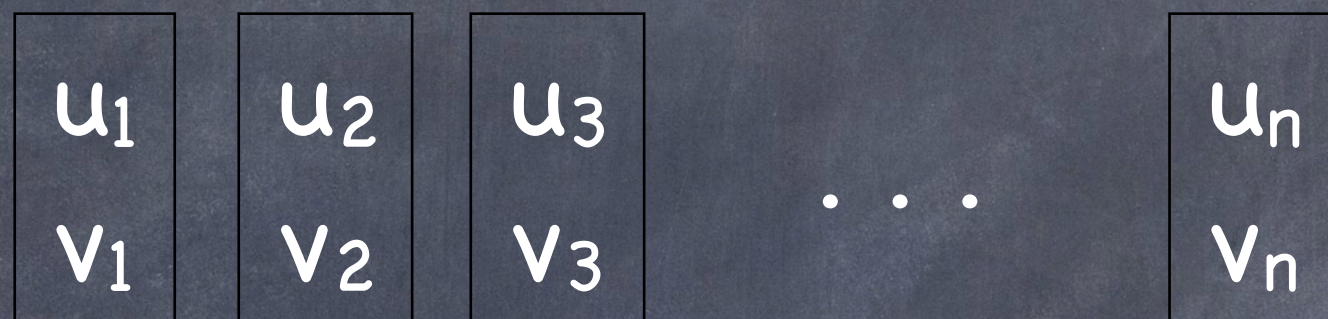
$$u_{i_1} \mid u_{i_2} \mid u_{i_3} \mid \dots \mid u_{i_k} = v_{i_1} \mid v_{i_2} \mid v_{i_3} \mid \dots \mid v_{i_k} ?$$



# A Solution to Post Correspondence Problem



# A Solution to Post Correspondence Problem





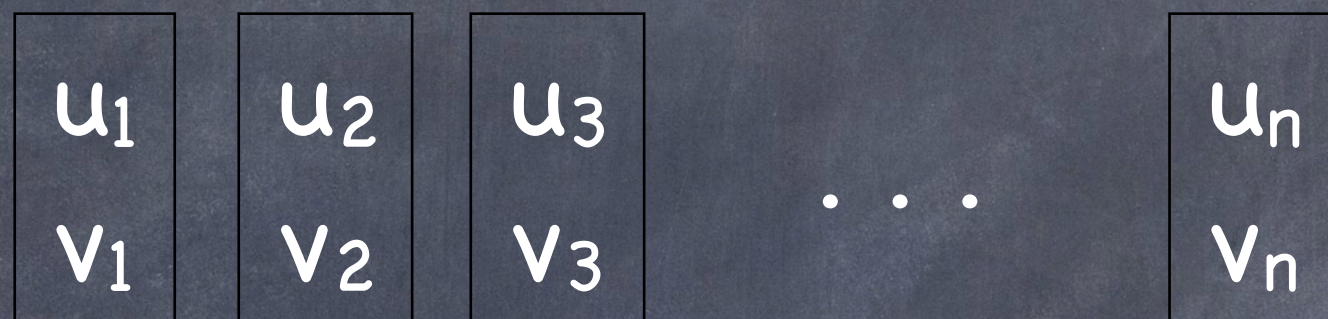
# A Solution to Post Correspondence Problem

$u_1$	$u_2$	$u_3$	$\dots$	$u_n$
$v_1$	$v_2$	$v_3$		$v_n$

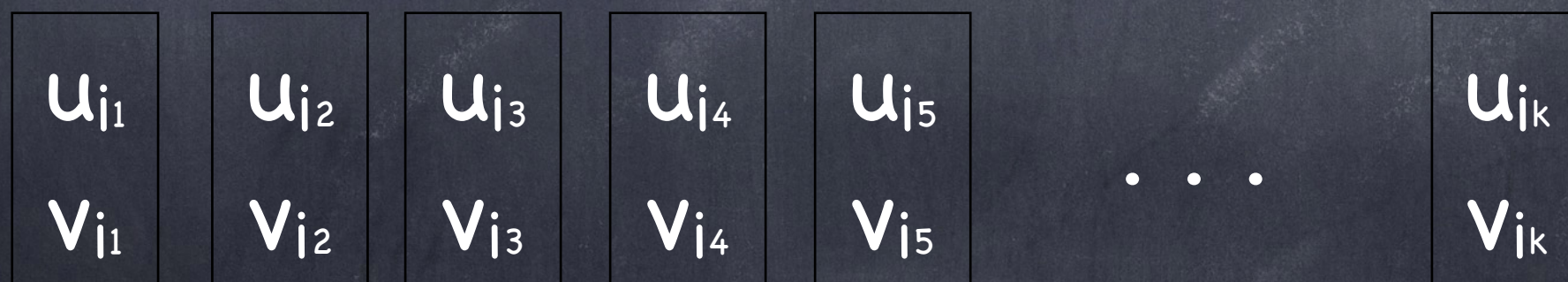
- A solution is of this form:  
with the top and bottom strings identical.



# A Solution to Post Correspondence Problem



- A solution is of this form:  
with the top and bottom strings identical.





Post

Correspondence Problem



# Post Correspondence Problem

## • Theorem:

The Post Correspondence Problem cannot be **decided** by any algorithm (or computer program). In particular, no algorithm can identify in a finite amount of time the instances that have a negative outcome. However, if a solution exists, we can find it.



Post

Correspondence Problem



# Post Correspondence Problem

## • Proof:

Reduction technique – if PCP was decidable then another undecidable problem would be decidable.



# The Halting Problem



# The Halting Problem

- Notice that an algorithm is a piece of text.



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- Notice that an algorithm is a piece of text.
- An algorithm can receive text as input.



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- The Halting Problem:

Given two texts  $A, B$ , consider  $A$  as an algorithm and  $B$  as an input. Will algorithm  $A$  halt (as opposed to loop forever) on input  $B$ ?



# The Halting Problem



# The Halting Problem

- Theorem: no algorithm can decide the Halting Problem.



# The Halting Problem

- Theorem: no algorithm can decide the Halting Problem.
- Proof: Assume for a contradiction that an algorithm  $\text{Halt}(A,B)$  exists to decide the Halting Problem.



# The Halting Problem



# The Halting Problem

- Consider the Algorithm:

**Bug(A)**

if Halt(A,A) then While True do

{ when Halt(A,A) is true then Bug(A) loops }

{ when Halt(A,A) is false then Bug(A) halts }



# The Halting Problem

- Consider the Algorithm:

**Bug(A)**

if Halt(A,A) then While True do

{ when Halt(A,A) is true then Bug(A) loops }

{ when Halt(A,A) is false then Bug(A) halts }

- Question: What is the outcome of Bug(Bug)?



# The Halting Problem



# The Halting Problem

- If  $\text{Bug}(\text{Bug})$  does not loop forever it is because  $\text{Halt}(\text{Bug}, \text{Bug}) = \text{False}$  which means  $\text{Bug}(\text{Bug})$  loops forever. (contradiction)



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- Conclusion:  $\text{Halt}$  cannot exist.



# The Halting Problem and PCP



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- Any algorithm to decide PCP can be converted to an algorithm to decide the Halting Problem.



# The Halting Problem and PCP

- Any algorithm to decide PCP can be converted to an algorithm to decide the Halting Problem.
- Conclusion: PCP cannot be decided either.



# Computability Theory



# Computability Theory

All languages

A large, empty blue circle is positioned in the lower half of the slide, centered horizontally. It has a thin white outline and a solid blue fill.



# Computability Theory

All languages

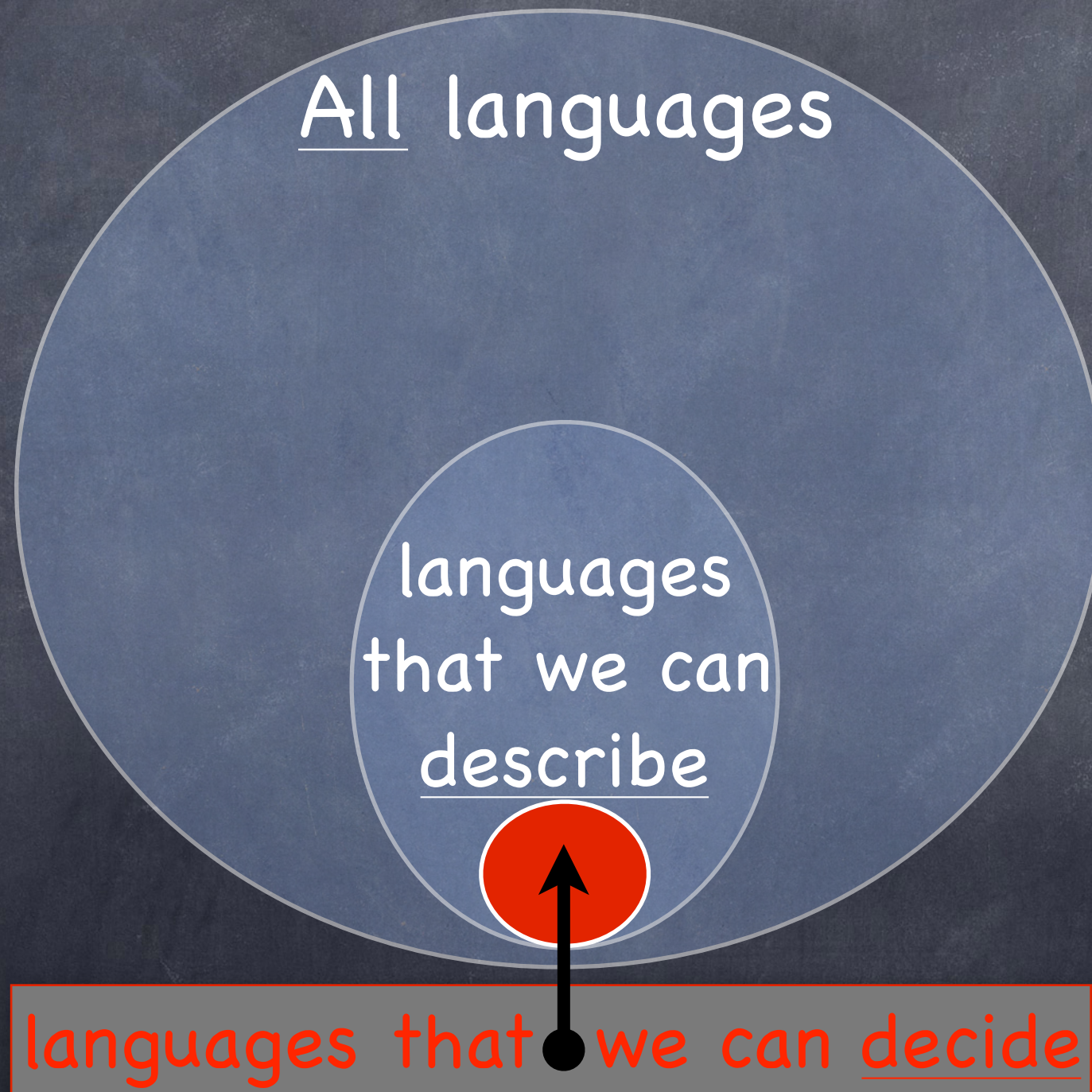


A Venn diagram consisting of two concentric circles. The outer circle is a light blue color and contains the text 'All languages'. The inner circle is a darker blue color and contains the text 'languages that we can describe'. The inner circle is centered within the outer circle, illustrating that the set of languages we can describe is a subset of all languages.

languages  
that we can  
describe



# Computability Theory





COMP 102A 2013



Decidable ? Some times  
we just don't know...

COMP 102A 2013



# Syracuse Conjecture



# Syracuse Conjecture

{



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- For any integer  $n > 0$  define the following sequence:

$$S_1 = n, S_{i+1} = \begin{cases} S_i/2 & \text{if } S_i \text{ is even,} \\ 3S_i + 1 & \text{if } S_i \text{ is odd.} \end{cases}$$



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- $\text{Syracuse}(n) =$  least  $i$  s.t.  $S_1 = n, \dots, S_i = 1$   
0 if  $S_i \neq 1$  for all  $i$ .



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# Syracuse Conjecture

• Example:  $\text{Syracuse}(9) = 20$



# Syracuse Conjecture

- Example:  $\text{Syracuse}(9) = 20$
- $S_1=9, S_2=28, S_3=14, S_4=7, S_5=22, S_6=11, S_7=34,$   
 $S_8=17, S_9=52, S_{10}=26, S_{11}=13, S_{12}=40, S_{13}=20,$   
 $S_{14}=10, S_{15}=5, S_{16}=16, S_{17}=8, S_{18}=4, S_{19}=2, S_{20}=1$







# Syracuse Conjecture



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- For all  $n$  that we have computed so far,  
 $\text{Syracuse}(n) > 0$ .



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# Syracuse Conjecture

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- Conjecture

for all  $n > 0$ ,  $\text{Syracuse}(n) > 0$

- If there exists  $N$  such that  $\text{Syracuse}(N) = 0$   
we might not be able to prove it.



# Syracuse Conjecture



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- The Syracuse conjecture is believed to be true but no proof of that statement was discovered so far. It is an **open** problem.



# Syracuse Conjecture

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- Even worse, it might be decidable but there might be no proof that it is !!!



# Complexity and Tractability

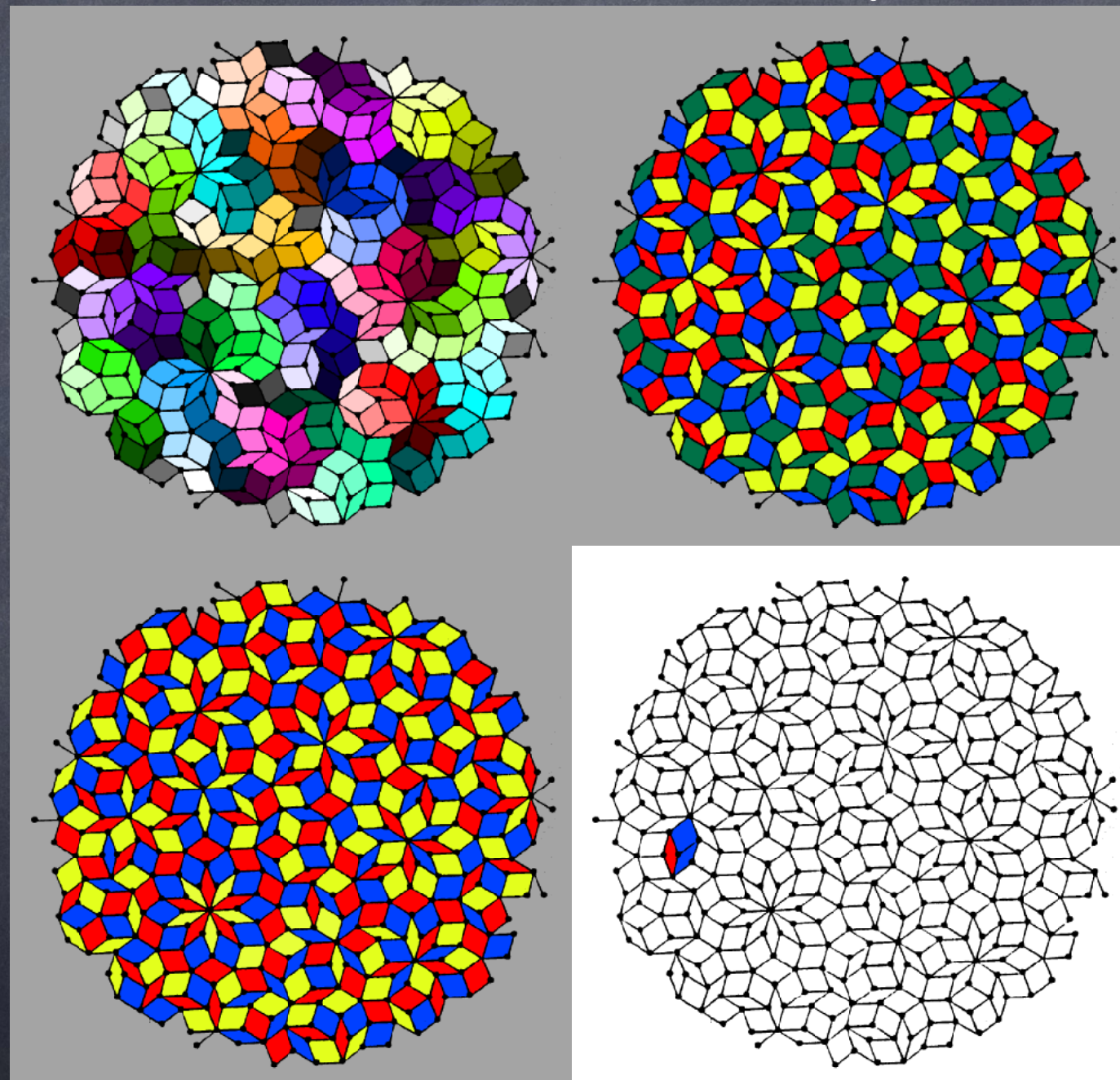
COMP 102A, Lecture 13



Not all problems  
were born equal...

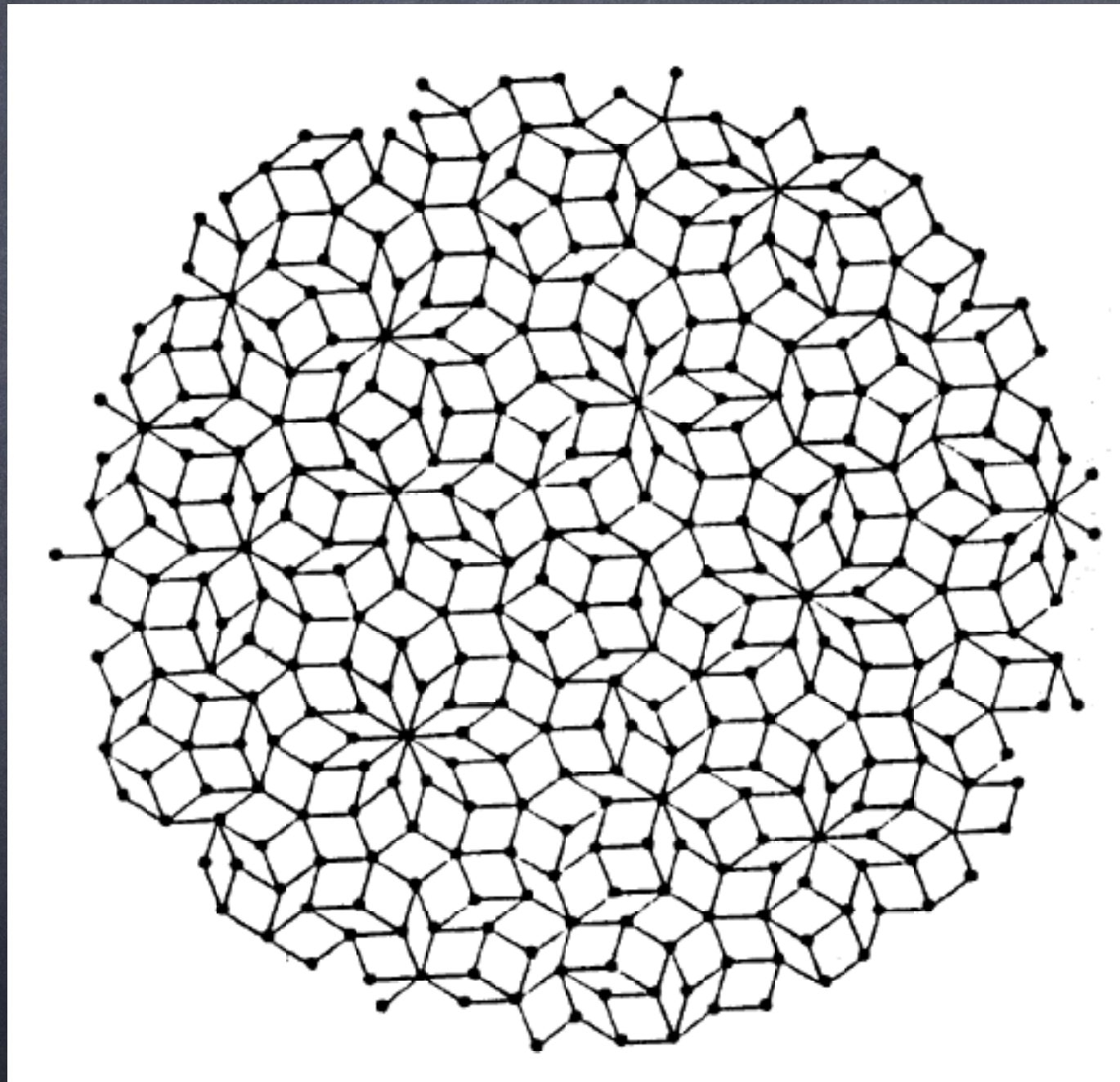


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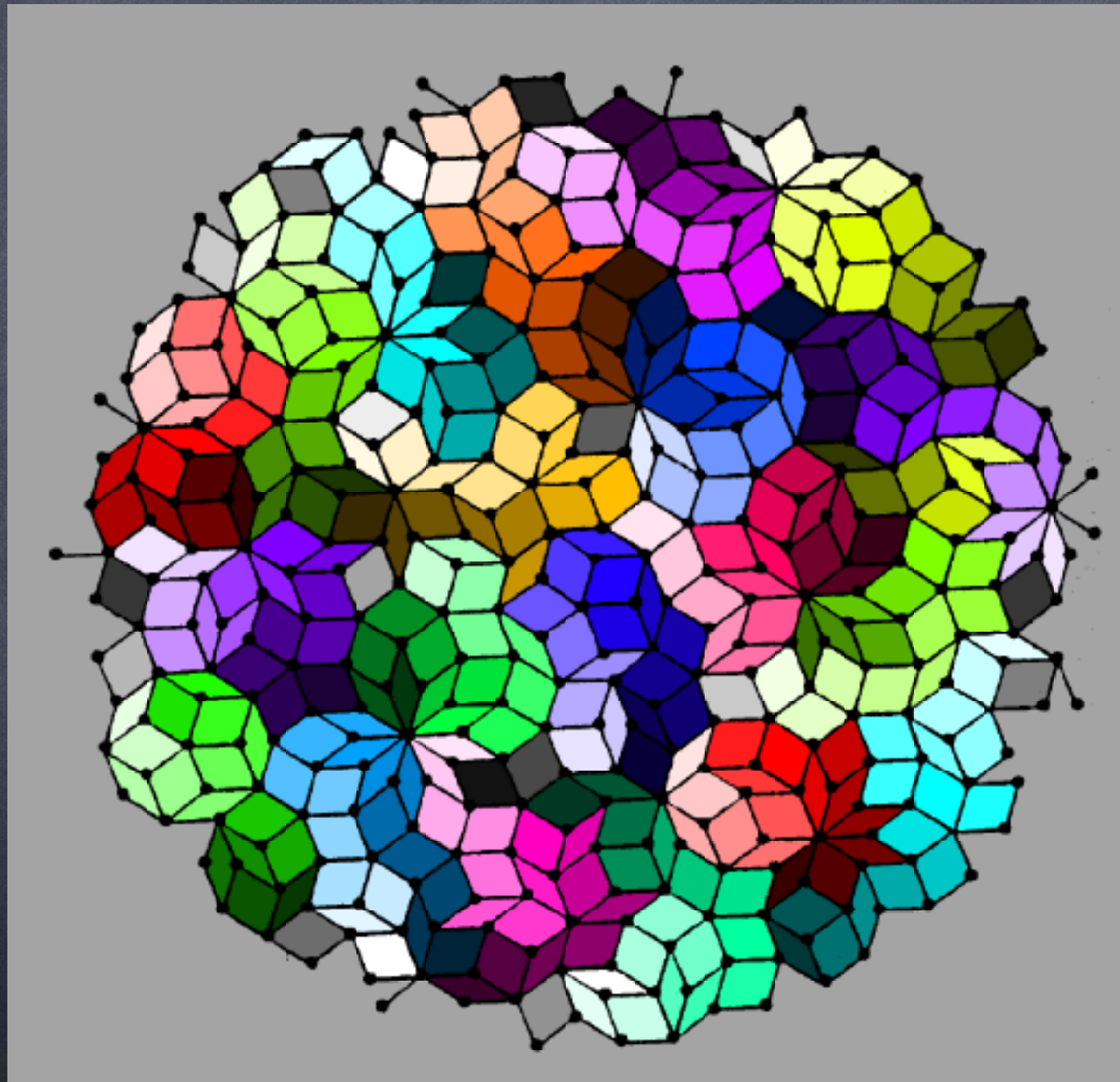


Is it possible to paint a colour on each region of a map so that no neighbours are of the same colour ?



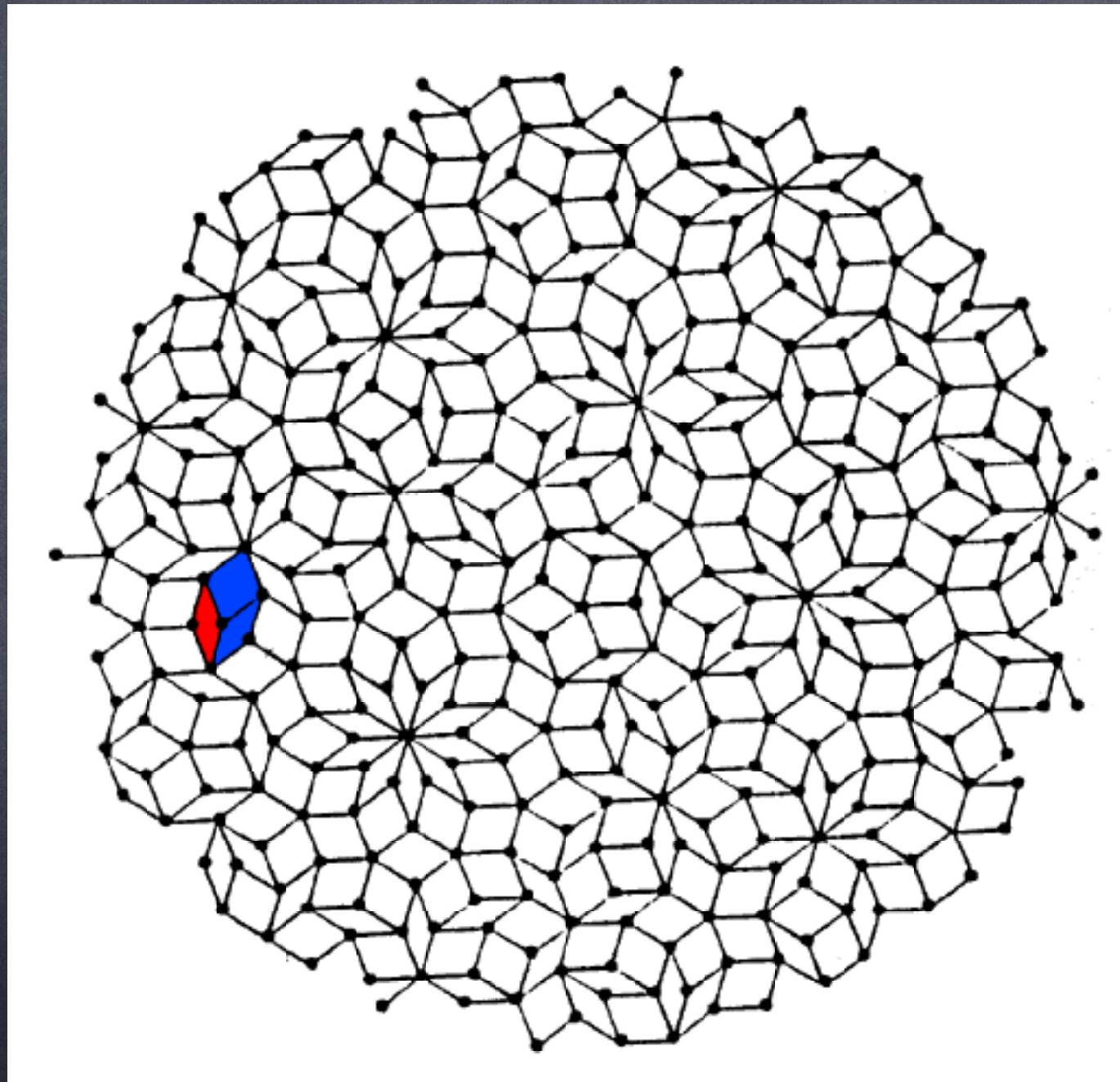


Obviously, yes, if you can use as many colours as you like...



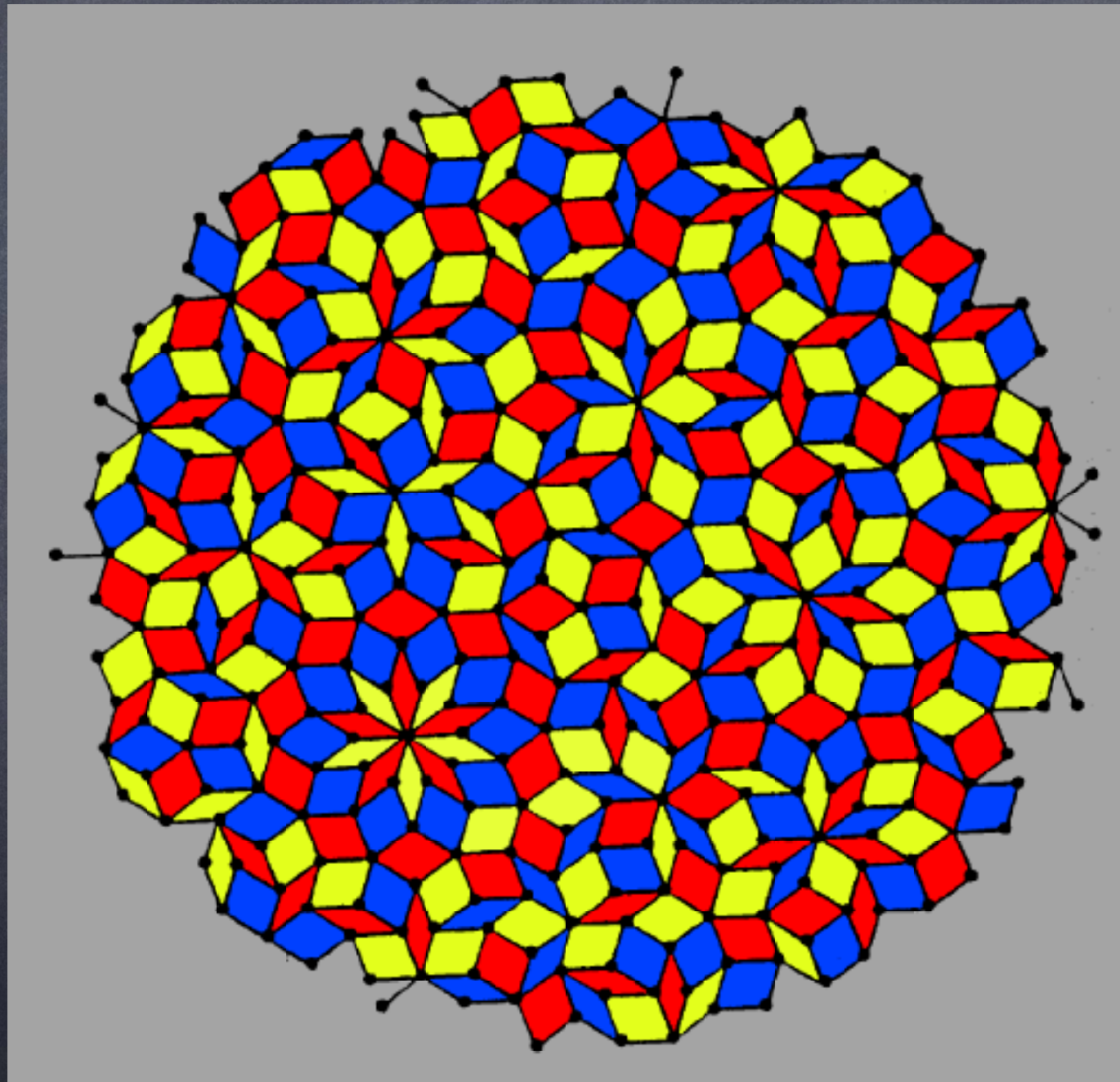


# 2 colouring problem



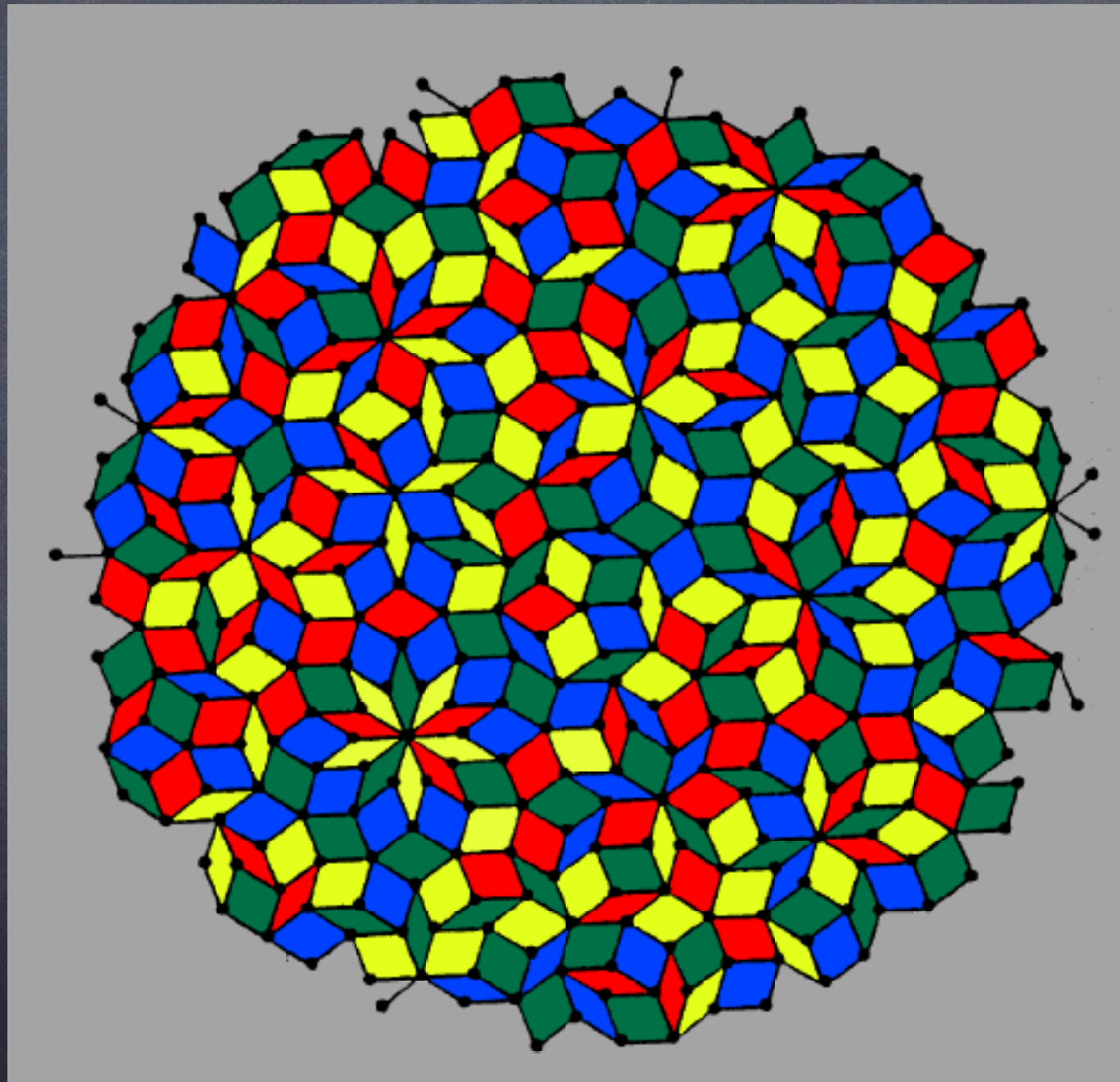


# 3 colouring problem





# 4 colouring problem





# K-colouring of Maps (planar graphs)



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- $K=1$ , only the map with zero or one region are 1-colourable.



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- $K=3$ , No known efficient algorithm to decide. However it is easy to verify a solution.
- $K \geq 4$ , all maps are  $K$ -colourable. (hard proof)  
Does not imply easy to find a  $K$ -colouring.



# 3-colouring of Maps





# 3-colouring of Maps

- Seems hard to solve in general,



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- Is easy to verify when a solution is given,



# 3-colouring of Maps

- Seems hard to solve in general,
- Is easy to verify when a solution is given,
- Is a special type of problem (NP-complete) because an efficient solution to it would yield efficient solutions to MANY similar problems !



# Examples of NP-Complete Problems



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- SAT: given a boolean formula, is there an assignment of the variables making the formula evaluate to true ?



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- Travelling Salesman: given a set of cities and distances between them, what is the shortest route to visit each city once.



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- SAT: given a boolean formula, is there an assignment of the variables making the formula evaluate to true ?
- Travelling Salesman: given a set of cities and distances between them, what is the shortest route to visit each city once.
- KnapSack: given items with various weights, is there a subset of them of total weight  $K$ .



# NP-Complete Problems



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- Some books list hundreds of such problems.



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- If any of them is easy, they are all easy.
- In practice, some of them may be solved efficiently in some special cases.



# Tractable Problems (P)



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- 2-colorability of maps.



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- Primality testing.



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- 2-colorability of maps.
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- Solving  $N \times N \times N$  Rubik's cube.



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- Sorting elements.



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- Fortunately, many practical problems are tractable. The name P stands for Polynomial-Time computable.



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- Fortunately, many practical problems are tractable. The name P stands for Polynomial-Time computable.
- Computer Science studies mostly techniques to approach and find efficient solutions to tractable problems.
- Some problems may be efficiently solvable but we might not be able to **prove** that...



# Tractable Problems (P)



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- 2-colorability of maps.  $O(n)$  time



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- 2-colorability of maps.  $O(n)$  time
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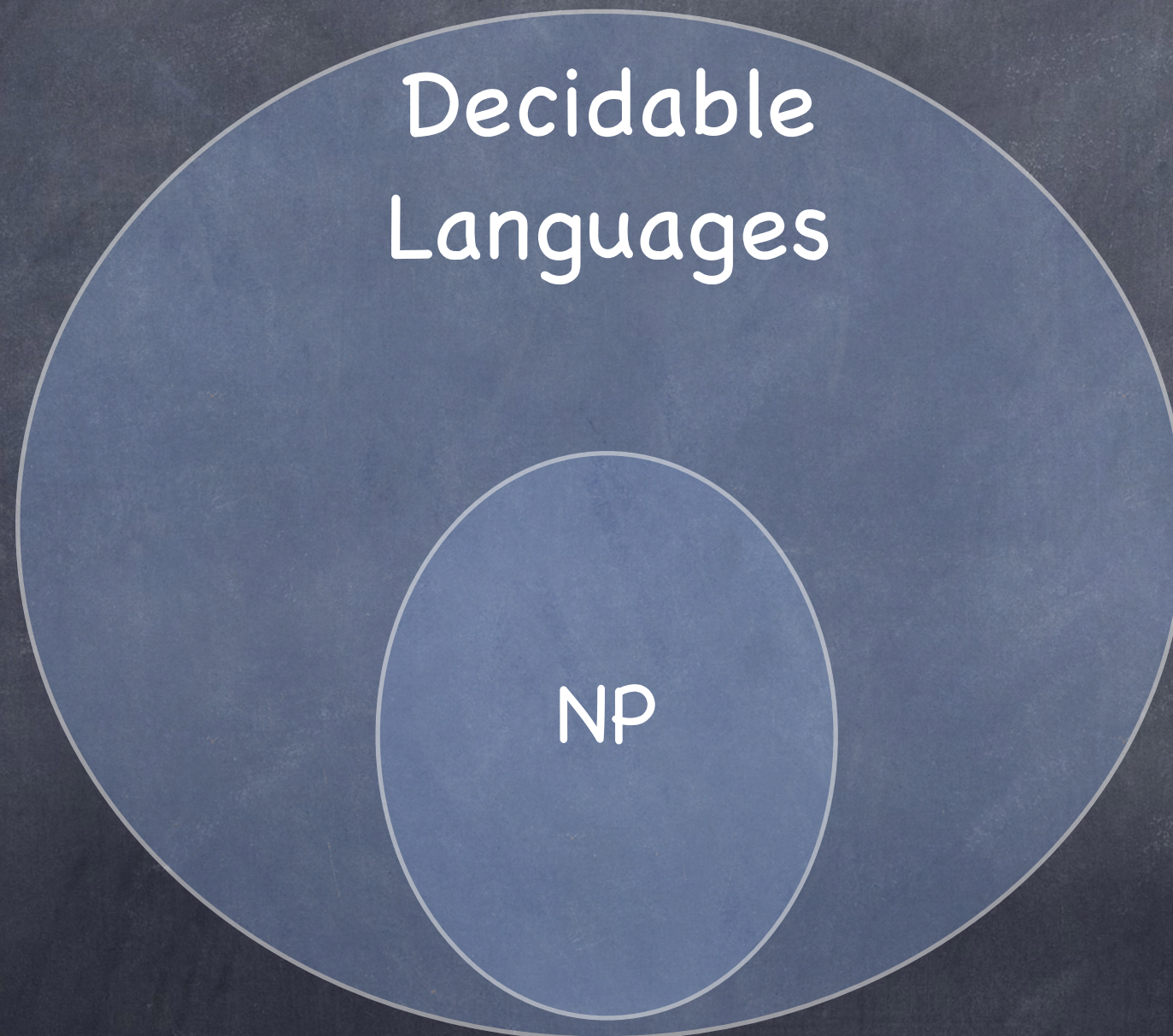
# Complexity Theory



Decidable  
Languages

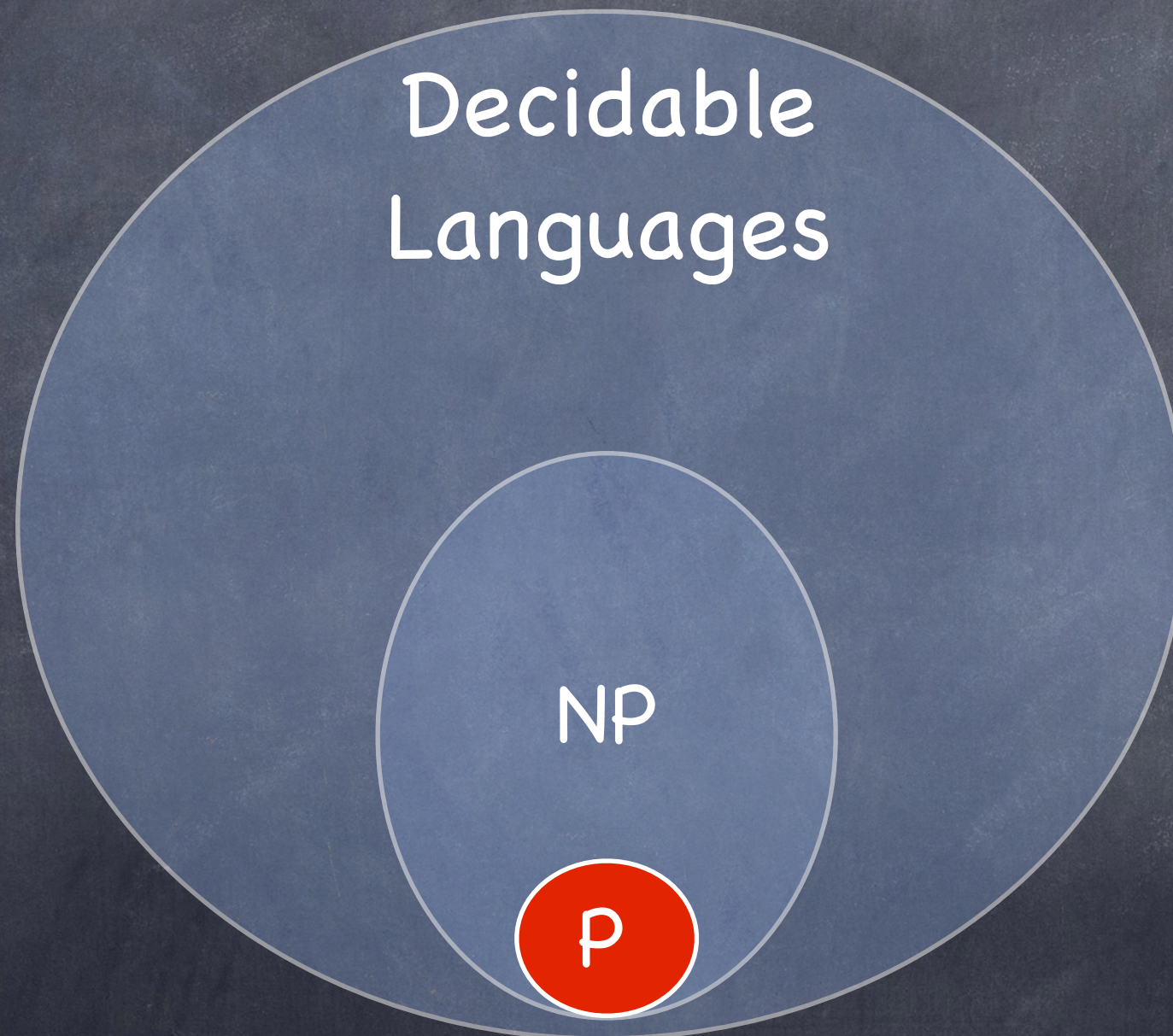


# Complexity Theory



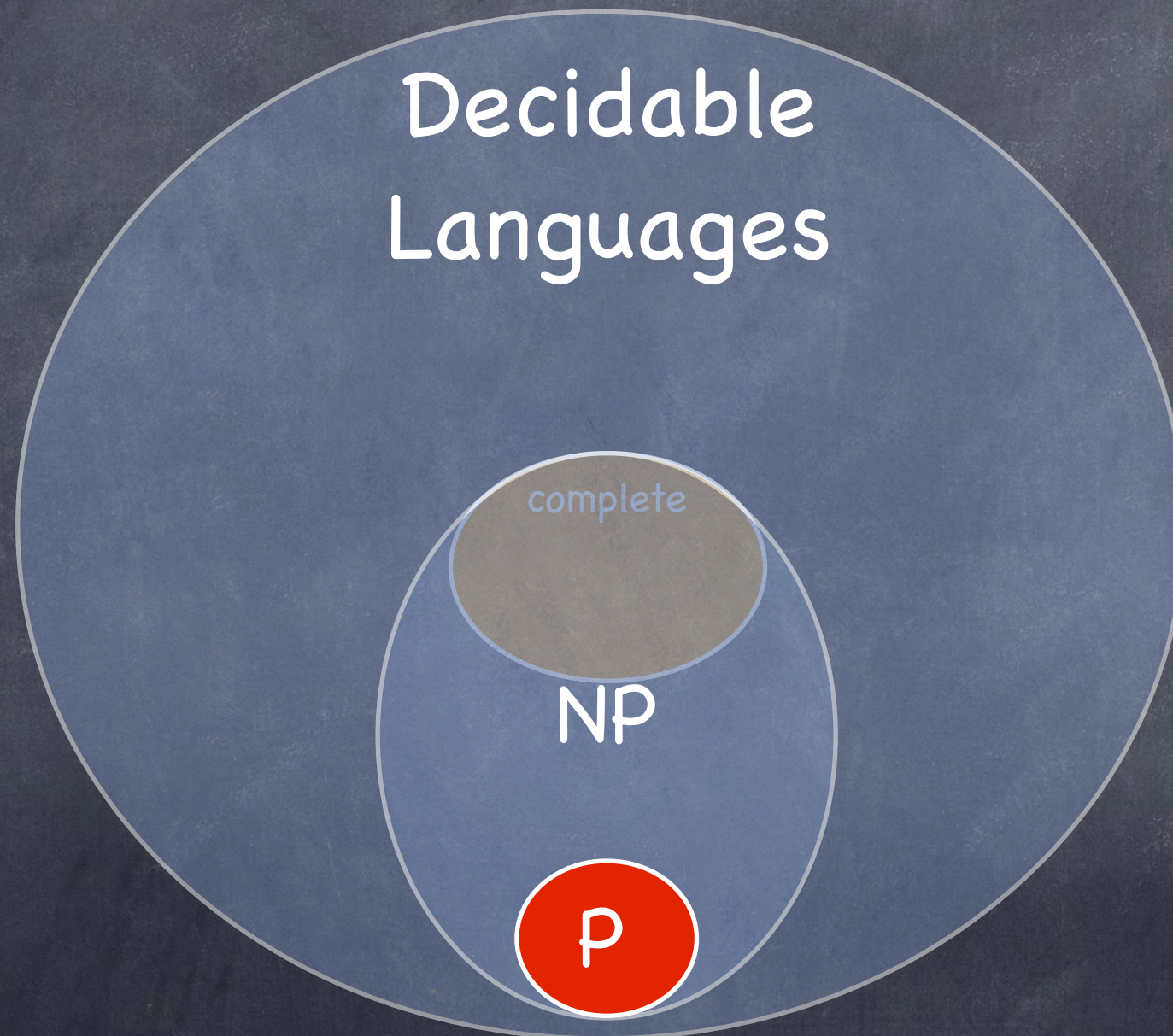


# Complexity Theory



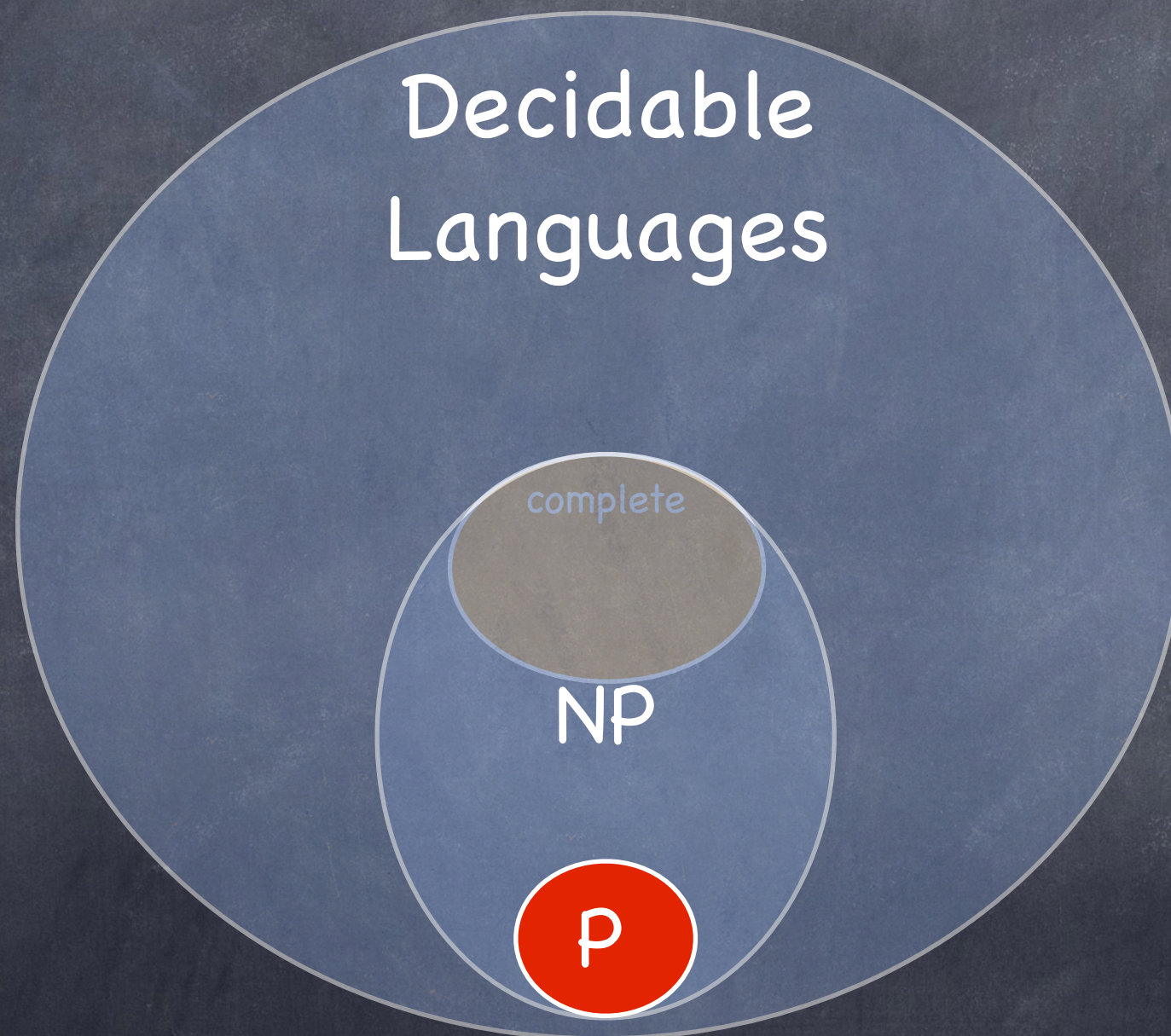


# Complexity Theory





# Complexity Theory



$P = NP ?$



# Beyond NP-Completeness



# Beyond NP-Completeness

- P-Space Completeness: problems that require a reasonable (Poly) amount of **space** to be solved but may use very long time though.



# Beyond NP-Completeness

- P-Space Completeness: problems that require a reasonable (Poly) amount of **space** to be solved but may use very long time though.
- Many such problems. If any of them may be solved within reasonable (Poly) amount of time, then all of them can.



# P-Space Completeness



# P-Space Completeness

- Geography Game:

Given a set of country names: Afghanistan, Algeria, Canada, France, Japan, North Korea.



# P-Space Completeness

- Geography Game:

Given a set of country names: Afghanistan, Algeria, Canada, France, Japan, North Korea.

- A two player game: One player chooses a name. The other player must choose a name that starts with the last letter of the previous name and so on. A player wins when his opponent cannot play any name.



# Generalized Geography



# Generalized Geography

- Given an arbitrary set of names:  $w_1, \dots, w_n$ .

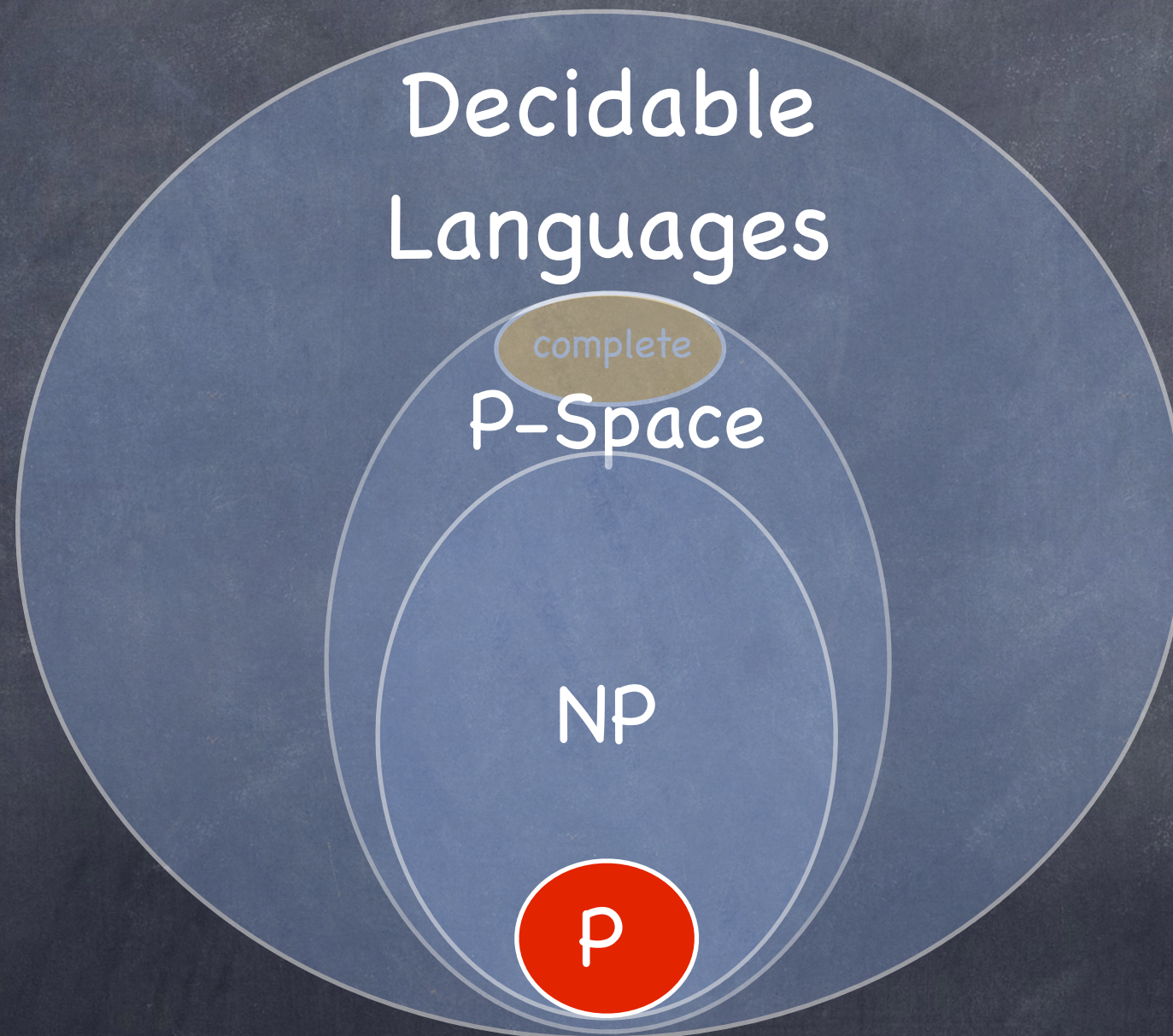


# Generalized Geography

- Given an arbitrary set of names:  $w_1, \dots, w_n$ .
- Is there a winning strategy for the first player to the previous game ?

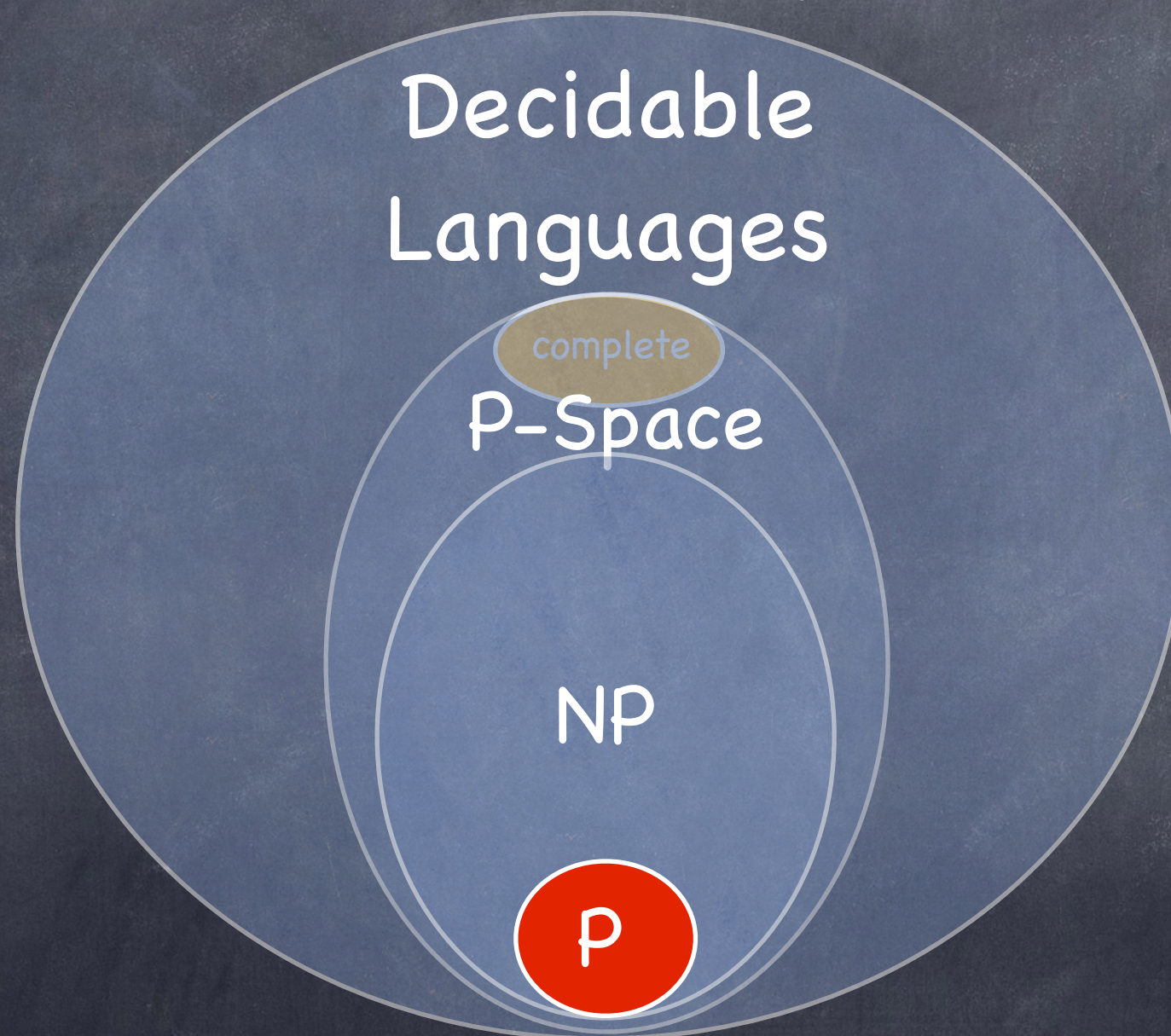


# Complexity Theory





# Complexity Theory



NP = P-Space ?



# Theoretical Computer Science



# Theoretical Computer Science

## • Challenges of TCS:



# Theoretical Computer Science

- Challenges of TCS:
- **FIND** efficient solutions to many problems.



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# Theoretical Computer Science

- Challenges of TCS:
- **FIND** efficient solutions to many problems.
- **PROVE** that certain problems are **NOT** computable within a certain time or space.  
(With applications to cryptography)
- Consider new models of computation.  
(Such as a Quantum Computer)







Afghanistan

Afghanistan 2

Albania

Albania 2

Albania 3

Albania 4

Algeria

Andorra

Andorra 2

Angola

Angola 2

Antigua and Barbuda

Antigua and Barbuda 2

Argentina

Armenia

Armenia 2

Australia

Australia 2

Australia 3

Austria

Austria 2

Azerbaijan

Azerbaijan 2

Bahamas, The



# PCP with constraints

- input  $(a^{n_1}/a^{m_1}), (a^{n_2}/a^{m_2})$
- find  $k_1, k_2 \geq 0$  s.t.  $k_1 n_1 + k_2 n_2 = k_1 m_1 + k_2 m_2$
- find  $k_1, k_2 \geq 0$  s.t.  $k_1(n_1 - m_1) = k_2(m_2 - n_2)$
- if  $n_1 = m_1$  then set  $k_1 = 1, k_2 = 0$
- else if  $n_2 = m_2$  then set  $k_1 = 0, k_2 = 1$
- else if  $(n_1 - m_1)(n_2 - m_2) < 0$  then set  $k_1 = |n_2 - m_2|, k_2 = |n_1 - m_1|$
- else no solution exists