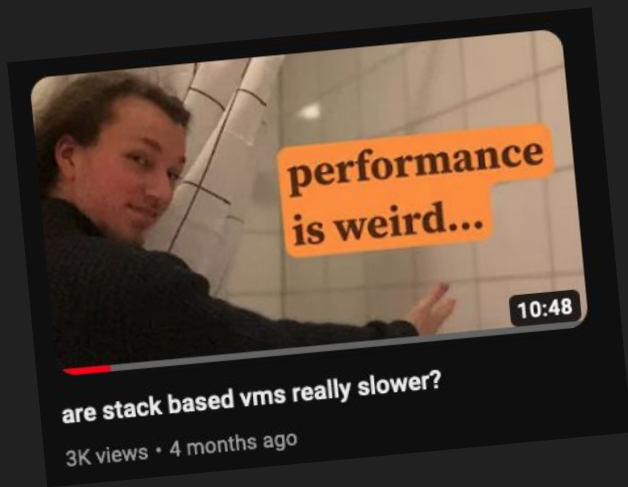


intro



today:  
tips for going fast



# Advent of Code

## {:year 2022}

--- Day 19: Not Enough Minerals ---

Your scans show that the lava did indeed form obsidian!

The wind has changed direction enough to stop sending lava droplets toward you, so you and the elephants exit the cave. As you do, you notice a collection of **geodes** around the pond. Perhaps you could use the obsidian to create some **geode-cracking robots** and break them open?

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from: 139.2288 s

# Advent of Code

## {:year 2022}

--- Day 19: Not Enough Minerals ---

Your scans show that the lava did indeed form obsidian!

The wind has changed direction enough to stop sending lava droplets toward you, so you and the elephants exit the cave. As you do, you notice a collection of **geodes** around the pond. Perhaps you could use the obsidian to create some geode-cracking robots and break them open?

from: 139.2288 s  
to: 0.0027 s





, no  
- multi-threading

, no

- multi-threading
- SIMD

, no

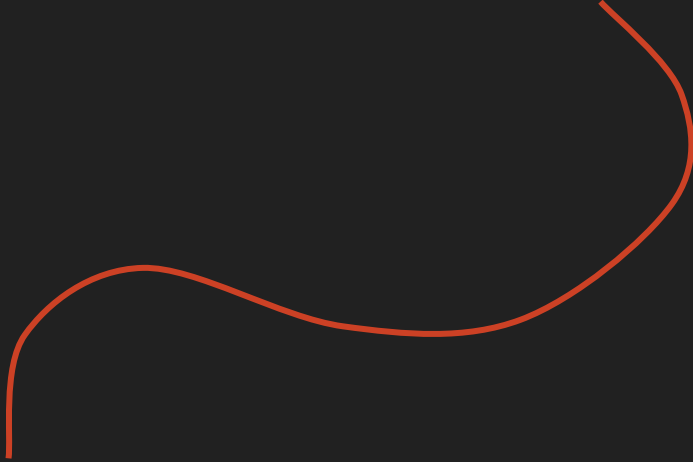
- multi-threading
- SIMD
- memory layout

, no

- multi-threading
- SIMD
- memory layout
- data dependencies

doing less

↓ t

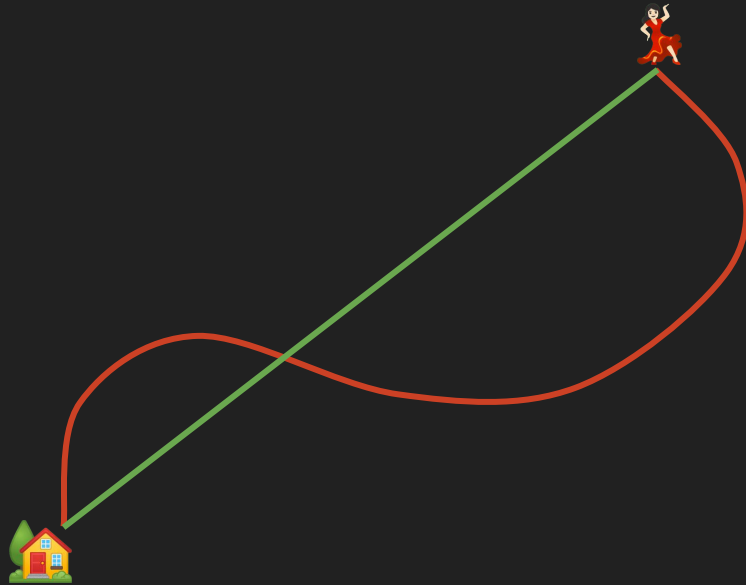


$$\downarrow t = \frac{v}{\uparrow}$$

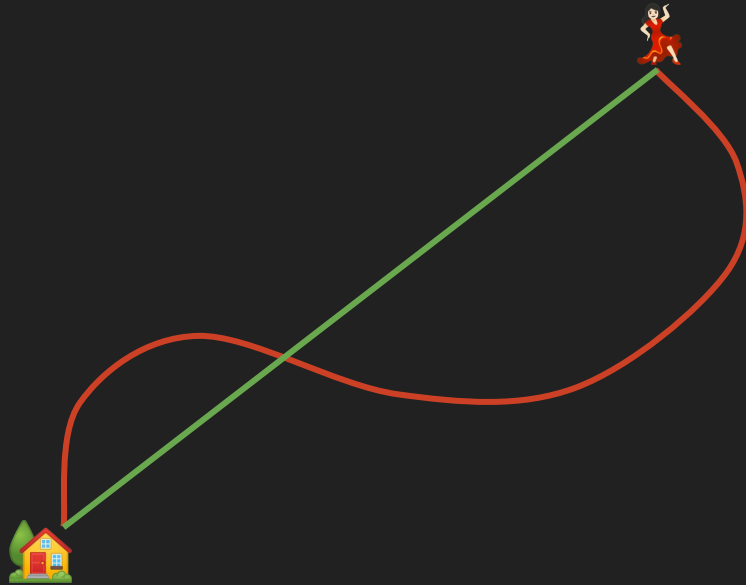




$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$



$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$



$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$

- 
- multi-threading
  - SIMD
  - memory layout
  - data dependencies

- algorithms & data structures

$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$

- 
- multi-threading
  - SIMD
  - memory layout
  - data dependencies

- algorithms & data structures
- domain knowledge

$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$

- 
- multi-threading
  - SIMD
  - memory layout
  - data dependencies

$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$

- algorithms & data structures
  - domain knowledge
  - relaxing requirements
- 

- multi-threading
- SIMD
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$$\downarrow t = \frac{x \downarrow}{v \uparrow}$$

- algorithms & data structures
  - domain knowledge
  - relaxing requirements
- 

- multi-threading
- SIMD
- memory layout
- data dependencies

 tip #1

first, try doing less



 tip #1

first, try doing less



problem description

have:  
- resources



have:

- resources



goal:

- maximize number of geodes

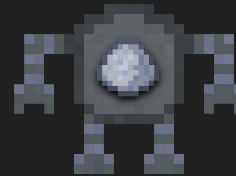
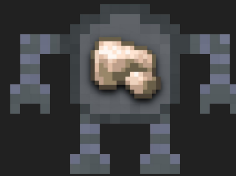
have:

- resources
- robots



goal:

- maximize number of geodes



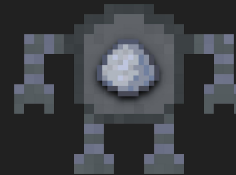
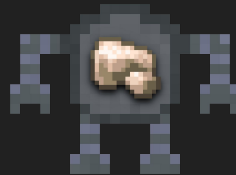
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot  $\rightarrow$  1 resource at end of turn

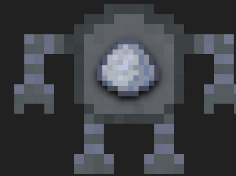
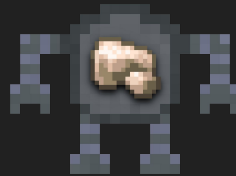
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot  $\rightarrow$  1 resource at end of turn
- start with 1 ore robot

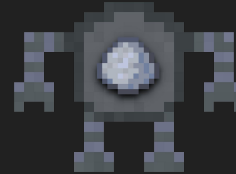
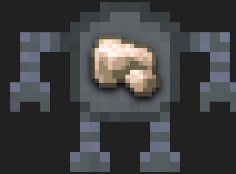
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot  $\rightarrow$  1 resource at end of turn
- start with 1 ore robot
- can build up to 1 robot per turn



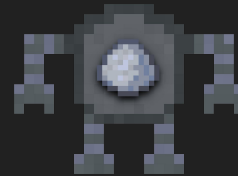
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot -> 1 resource at end of turn
- start with 1 ore robot
- can build up to 1 robot per turn

**blueprint 1:**

ore robot:	4 ore
clay robot:	2 ore
obsidian robot:	3 ore, 14 clay
geode robot:	2 ore, 7 obsidian

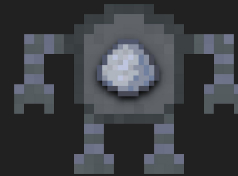
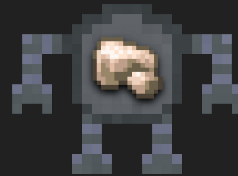
have:

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- robot -> 1 resource at end of turn
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#### blueprint 1:

ore robot:	4 ore
clay robot:	2 ore
obsidian robot:	3 ore, 14 clay
geode robot:	2 ore, 7 obsidian

solution?

```
#[derive(Clone, Copy, Debug)]
pub struct Blueprint {
    pub id: u32,
    pub ore_robot: u32,
    pub clay_robot: u32,
    pub obsidian_robot: (u32, u32),
    pub geode_robot: (u32, u32),
}

pub fn parse(input: &str) -> Vec<Blueprint> { ... }
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct State {
    minute: u8,
    ore_robot:    u32,
    clay_robot:   u32,
    obsidian_robot: u32,
    geode_robot:   u32,
    ore:          u32,
    clay:         u32,
    obsidian:      u32,
    geode:         u32,
}
```

```
if state.can_build_geode_robot(bp) {
    state = state.build_geode_robot(bp);
}
```

efficient strategy?

1) geode robot is what we want,  
so if can build geode robot, do that.

- 1) geode robot is what we want,  
so if can build geode robot, do that.
- 2) otherwise, try to build obsidian robot.  
that will help us build geode robots.



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so if can build geode robot, do that.
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that will help us build geode robots.
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- 1) geode robot is what we want,  
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that will help us build geode robots.
- 3) otherwise, try to build a clay robot.
- 4) otherwise, try to build an ore robot.

- 1) geode robot is what we want,  
so if can build geode robot, do that.
- 2) otherwise, try to build obsidian robot.  
that will help us build geode robots.
- 3) otherwise, try to build a clay robot.
- 4) otherwise, try to build an ore robot.
- 5) repeat until reached time limit.

```
pub fn solve(bp: &Blueprint, limit: u8) -> u32 {  
    let mut state = State::new();  
    for _ in 0..limit {  
        if state.can_build_geode_robot(bp) {  
            state = state.step().build_geode_robot(bp);  
        }  
        else if state.can_build_obsidian_robot(bp) {  
            state = state.step().build_obsidian_robot(bp);  
        }  
        else if state.can_build_clay_robot(bp) {  
            state = state.step().build_clay_robot(bp);  
        }  
        else if state.can_build_ore_robot(bp) {  
            state = state.step().build_ore_robot(bp);  
        }  
        else {  
            state = state.step();  
        }  
    }  
  
    state.geode  
}
```

no work 🙄

no work 😞

problem: always builds robots (greedy).

no work 😞

problem: always builds robots (greedy).

need to account for future actions.

 tip #2

start with an algorithm that is *definitely* correct  
(even if it may be too slow)



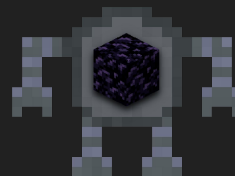
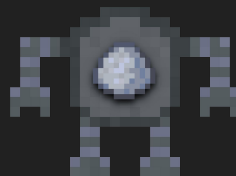
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot  $\rightarrow$  1 resource at end of turn
- start with 1 ore robot
- can build up to 1 robot per turn



exercise:

what's an algorithm to find the maximum number of geodes, that's definitely correct.

brute force



4-0-0

2-0-0

3-14-0

2-0-7





4-0-0

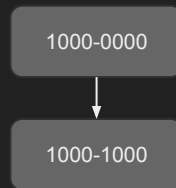
2-0-0

3-14-0

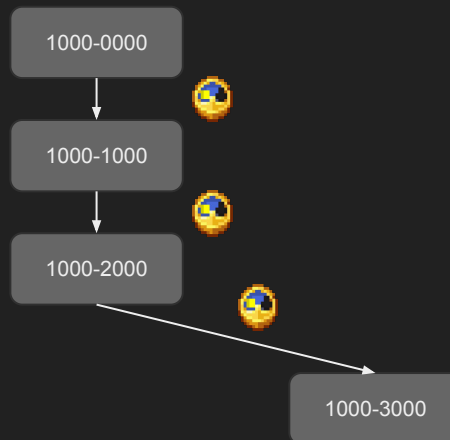
2-0-7

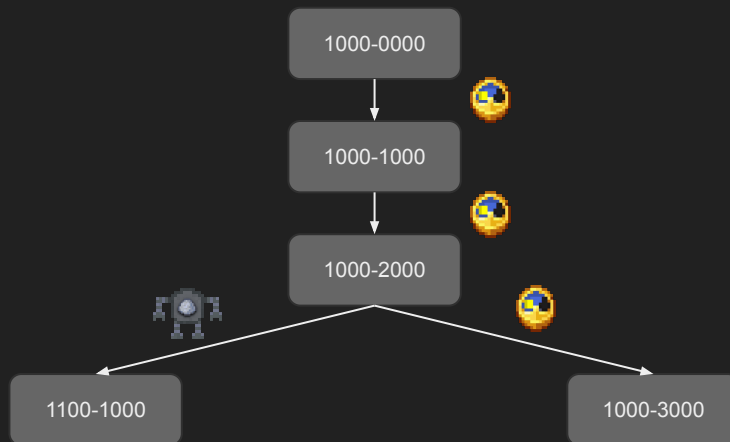


1000-0000

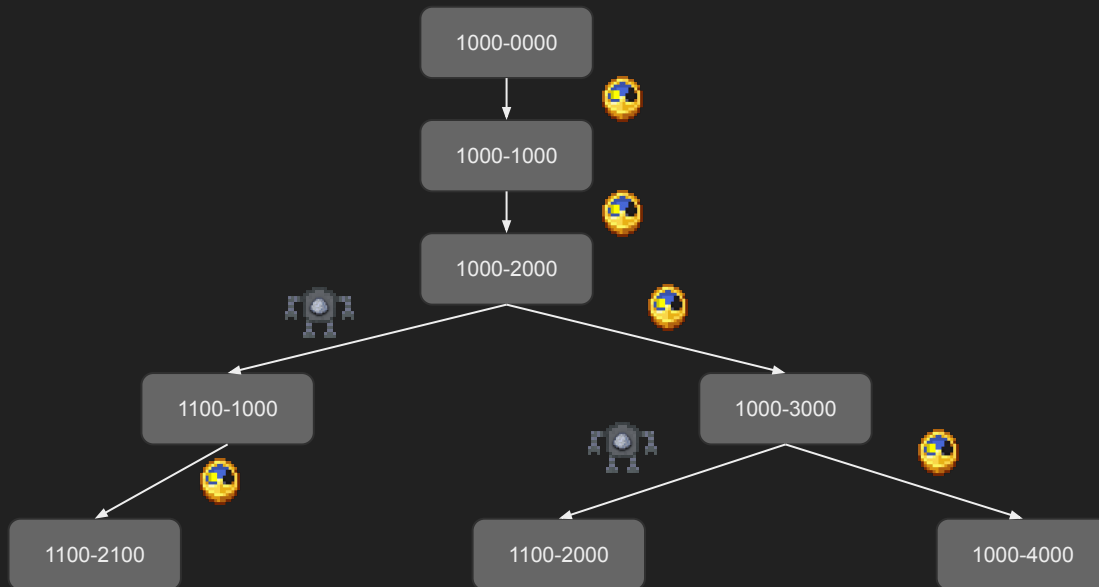


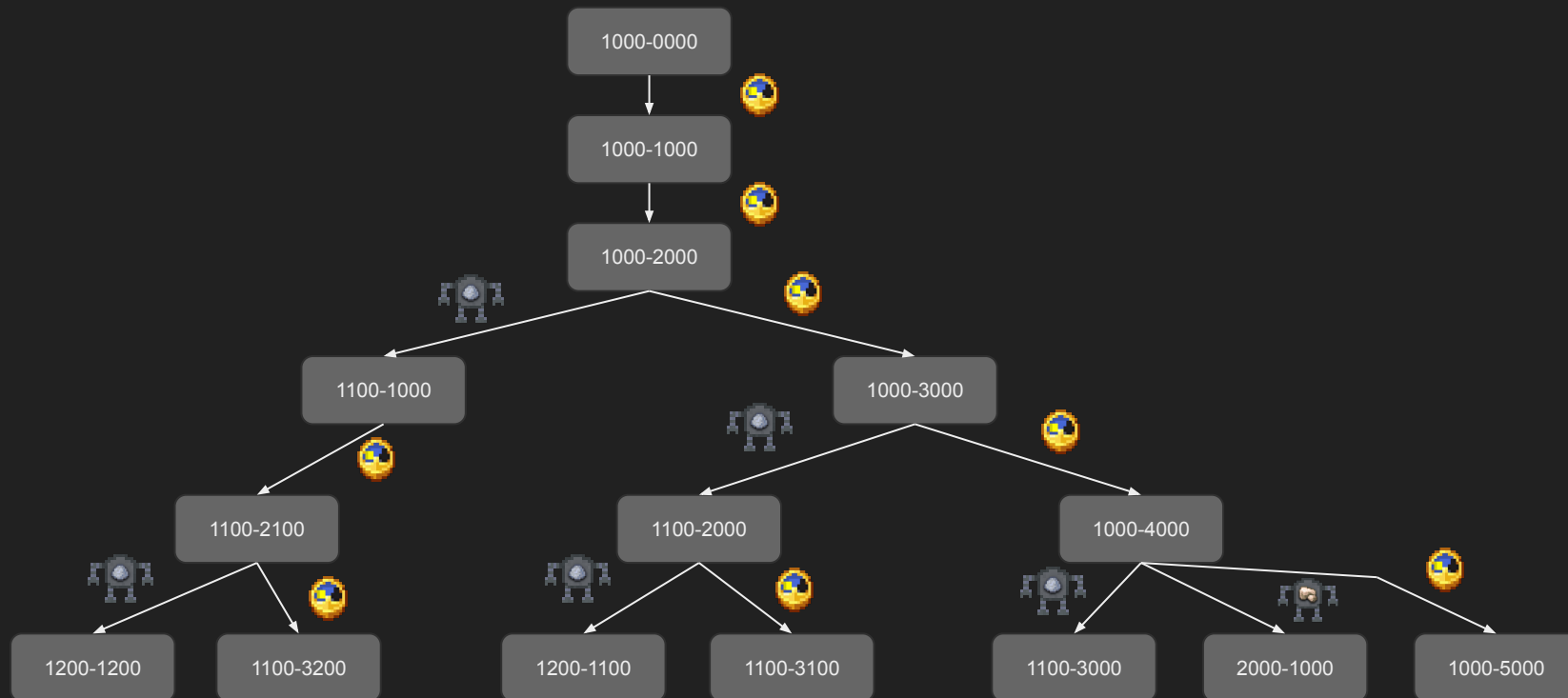












```
fn solution(state: State, bp: &Blueprint, limit: u8) -> u32 {
    if state.minute == limit {
        return state.geode;
    }

    let mut result = 0;

    if state.can_build_geode_robot(bp) {
        result = result.max(solution(state.step().build_geode_robot(bp), bp, limit));
    }

    if state.can_build_obsidian_robot(bp) {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit));
    }

    if state.can_build_clay_robot(bp) {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit));
    }

    if state.can_build_ore_robot(bp) {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit));
    }

    result = result.max(solution(state.step(), bp, limit));

    return result;
}
```

```
fn solution(state: State, bp: &Blueprint, limit: u8) -> u32 {
    if state.minute == limit {
        return state.geode;
    }

    let mut result = 0;

    if state.can_build_geode_robot(bp) {
        result = result.max(solution(state.step().build_geode_robot(bp), bp, limit));
    }

    if state.can_build_obsidian_robot(bp) {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit));
    }

    if state.can_build_clay_robot(bp) {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit));
    }

    if state.can_build_ore_robot(bp) {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit));
    }

    result = result.max(solution(state.step(), bp, limit));

    return result;
}
```

execution time: DNF 🙄

```
fn solution(state: State, bp: &Blueprint, limit: u8) -> u32 {
    if state.minute == limit {
        return state.geode;
    }

    let mut result = 0;

    if state.can_build_geode_robot(bp) {
        result = result.max(solution(state.step().build_geode_robot(bp), bp, limit));
    }

    if state.can_build_obsidian_robot(bp) {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit));
    }

    if state.can_build_clay_robot(bp) {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit));
    }

    if state.can_build_ore_robot(bp) {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit));
    }

    result = result.max(solution(state.step(), bp, limit));

    return result;
}
```



exercise:

what's a generic optimization we could try here?

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<State, u32>) -> u32 {
    if let Some(result) = memo.get(&state).copied() {
        return result;
    }

    if state.minute == limit {
        let result = state.geode;
        memo.insert(state, result);
        return result;
    }

    let mut result = 0;

    if state.can_build_geode_robot(bp) {
        result = result.max(solution(state.step().build_geode_robot(bp), bp, limit, memo));
    }

    if state.can_build_obsidian_robot(bp) {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit, memo));
    }

    if state.can_build_clay_robot(bp) {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit, memo));
    }

    if state.can_build_ore_robot(bp) {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit, memo));
    }

    result = result.max(solution(state.step(), bp, limit, memo));

    memo.insert(state, result);

    return result;
}
```

```

fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<State, u32>) -> u32 {
    if let Some(result) = memo.get(&state).copied() {
        return result;
    }

    if state.minute == limit {
        let result = state.geode;
        memo.insert(state, result);
        return result;
    }

    let mut result = 0;

    if state.can_build_geode_robot(bp) {
        result = result.max(solution(state.step().build_geode_robot(bp), bp, limit, memo));
    }

    if state.can_build_obsidian_robot(bp) {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit, memo));
    }

    if state.can_build_clay_robot(bp) {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit, memo));
    }

    if state.can_build_ore_robot(bp) {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit, memo));
    }

    result = result.max(solution(state.step(), bp, limit, memo));

    memo.insert(state, result);

    return result;
}

```

execution time: 140 s 🐱

 tip #3

use caches to avoid doing *expensive* work multiple times

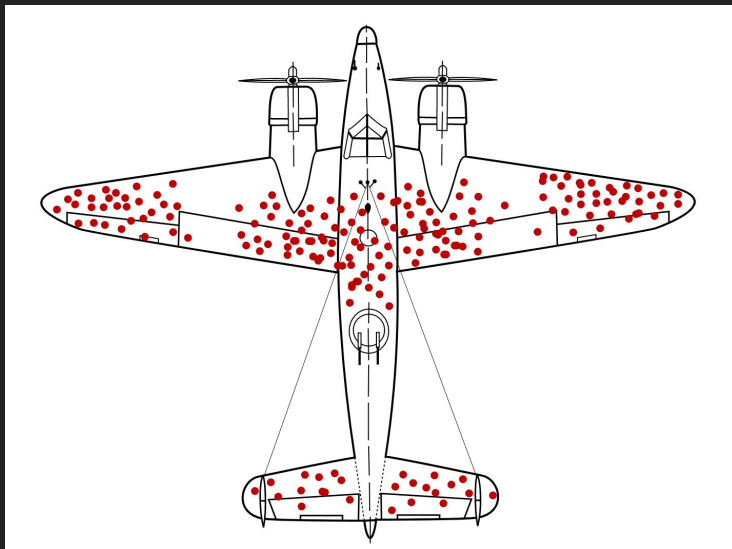


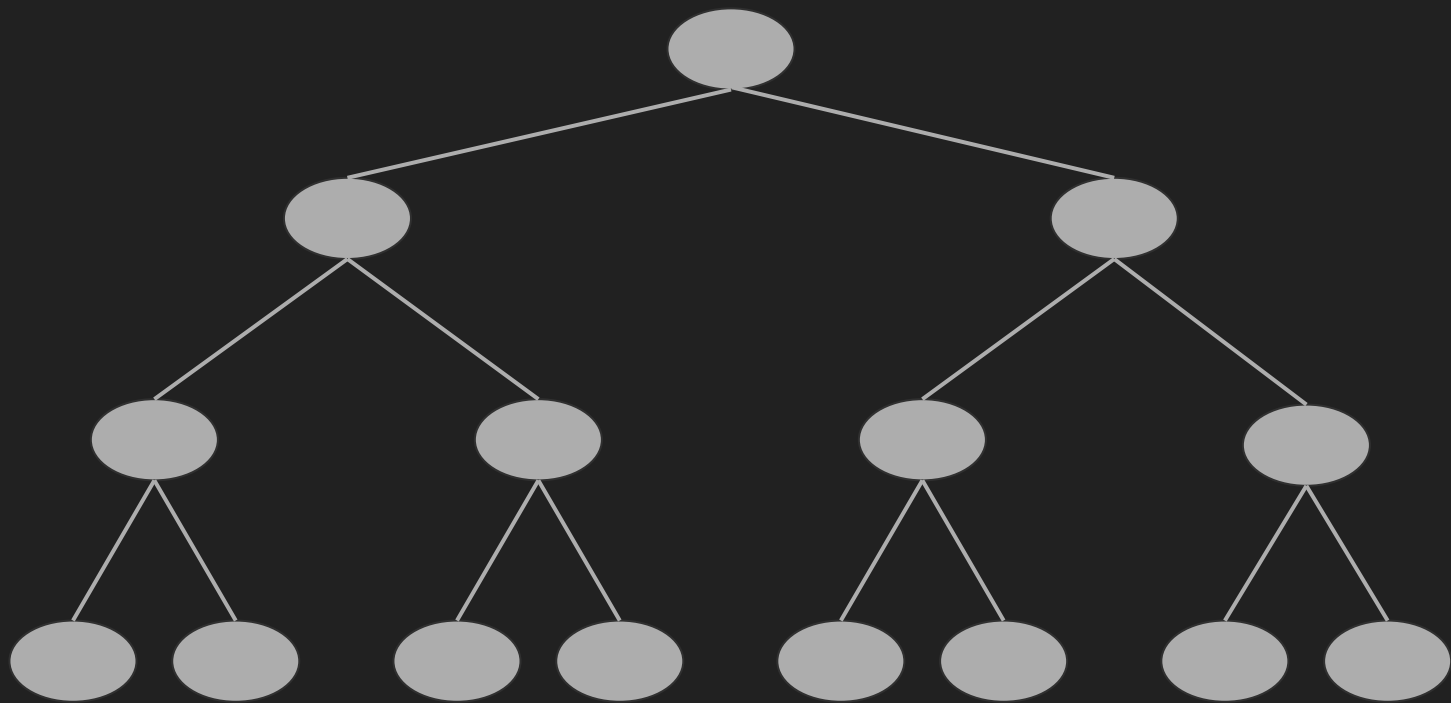
```
struct Stats {  
    memo_refs: u64,  
    memo_hits: u64,  
    states_visited: u64,  
}
```

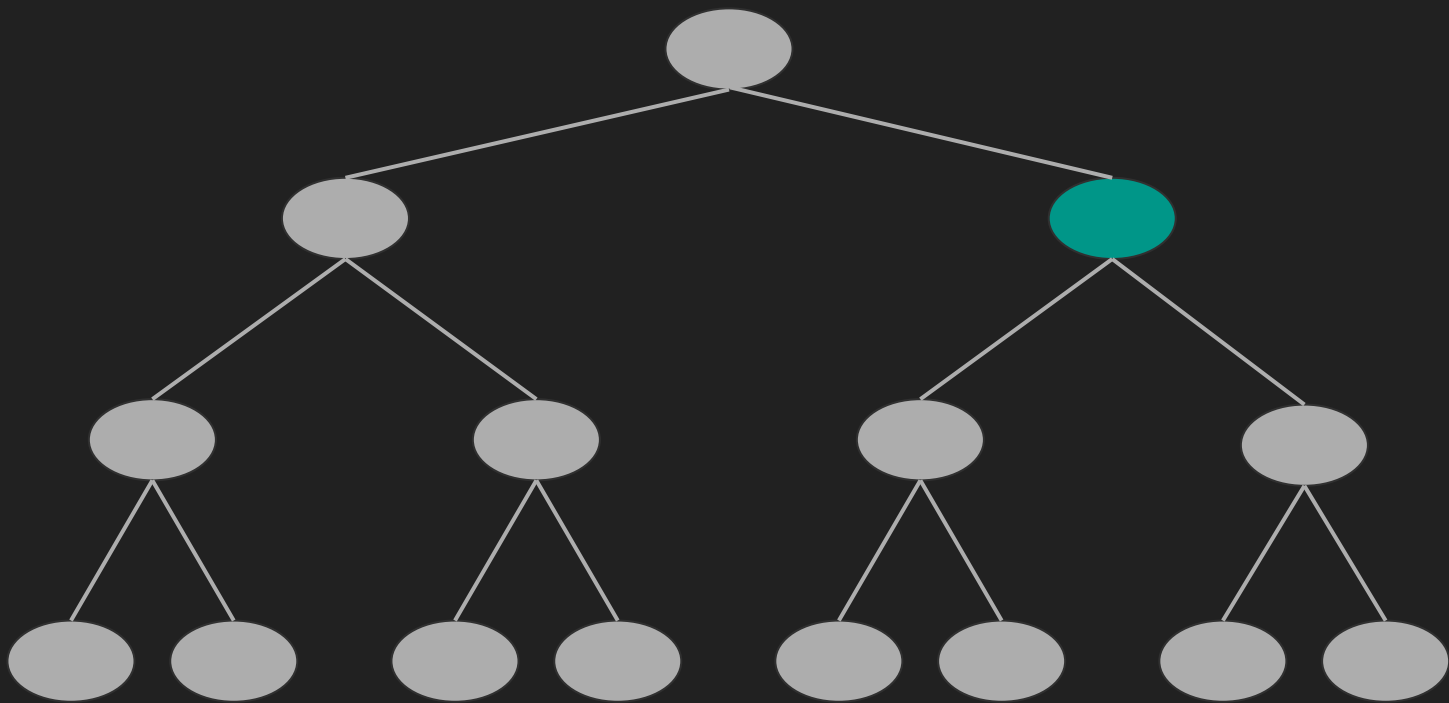
memo refs: 834,619,249  
memo hits: 398,856,779 (48%)

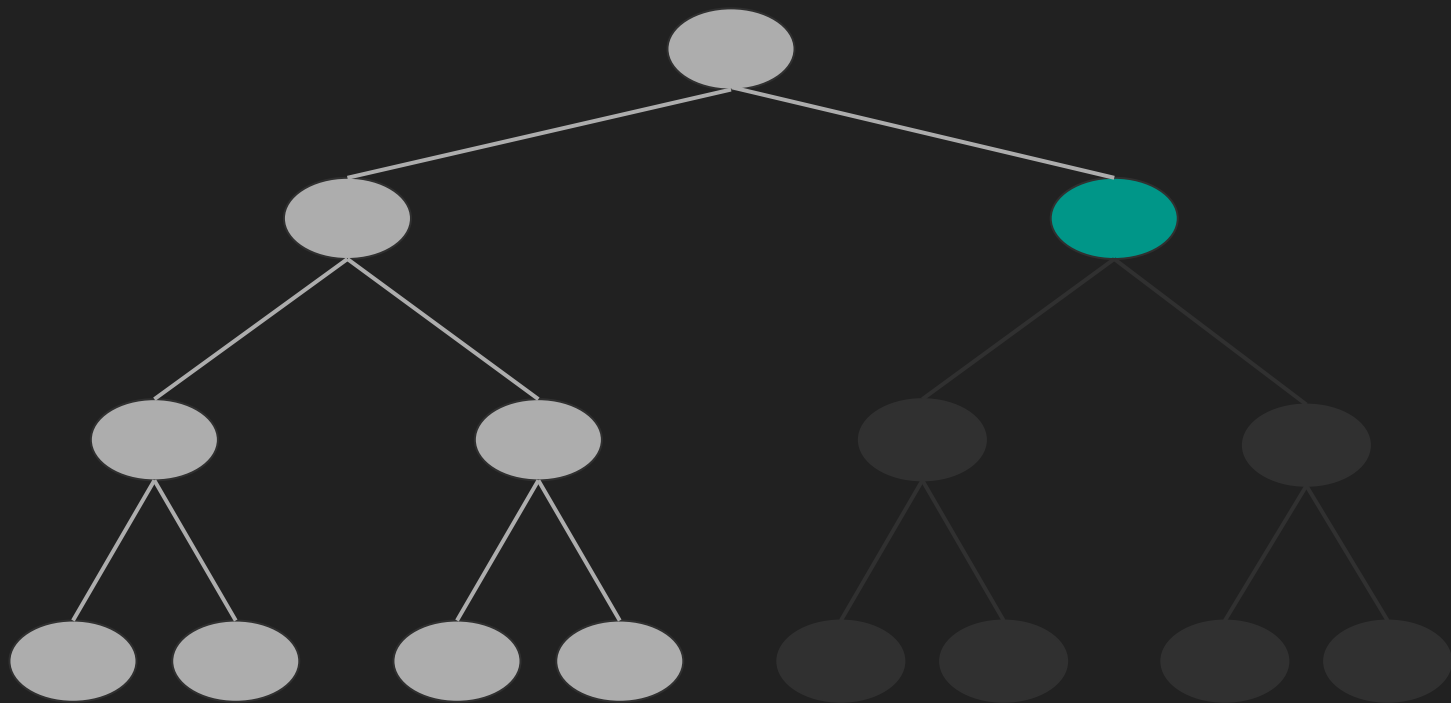
```
memo refs: 834,619,249  
memo hits: 398,856,779 (48%)
```

🤔 exercise:  
does the cache only result in a 2x speedup?

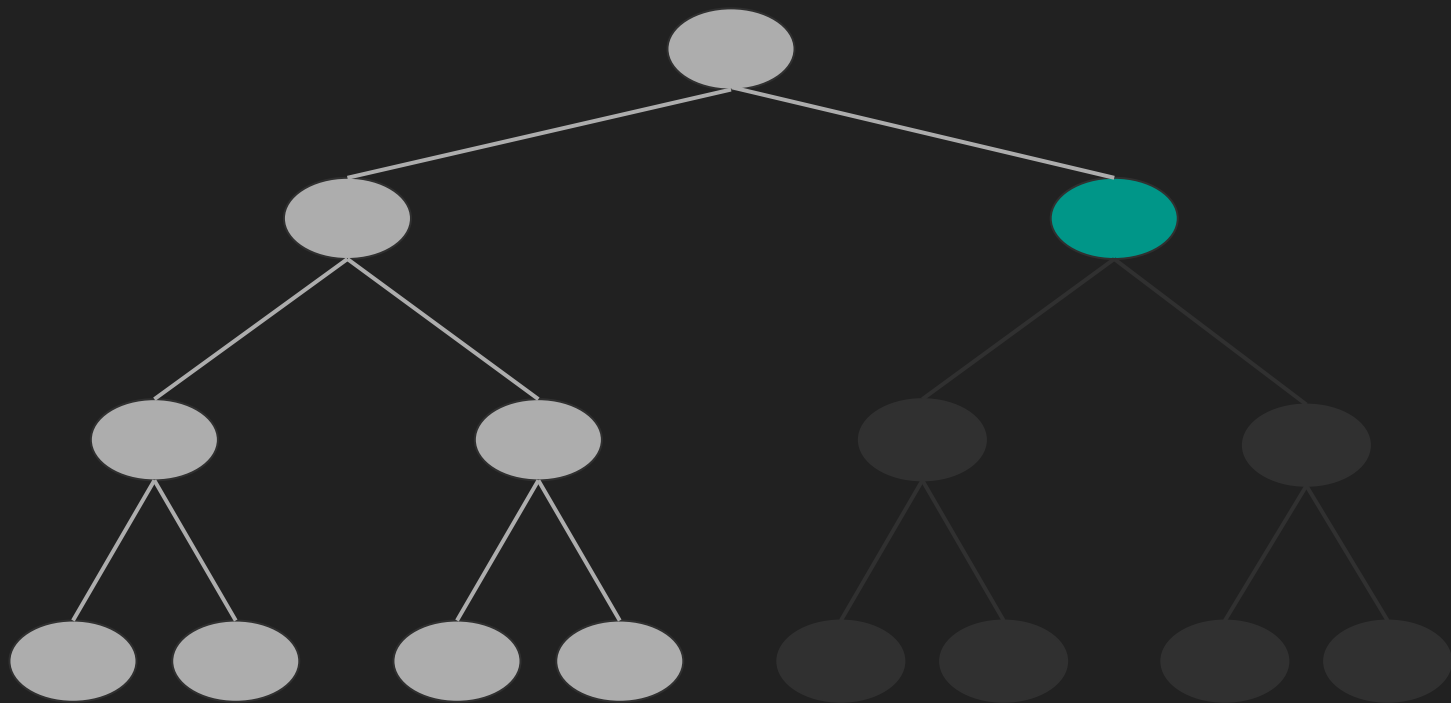








memo refs: 9  
memo hits: 1 (11%)



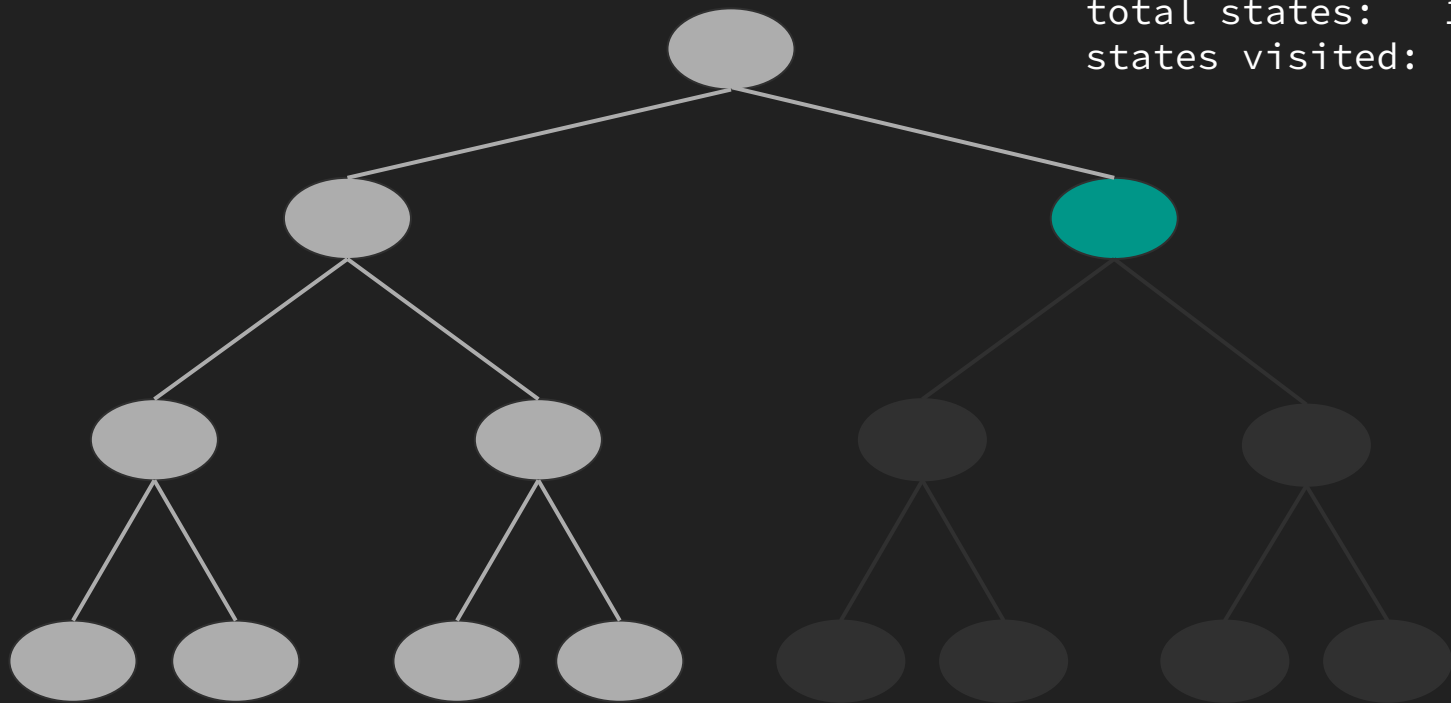


memo refs: 9

memo hits: 1 (11%)

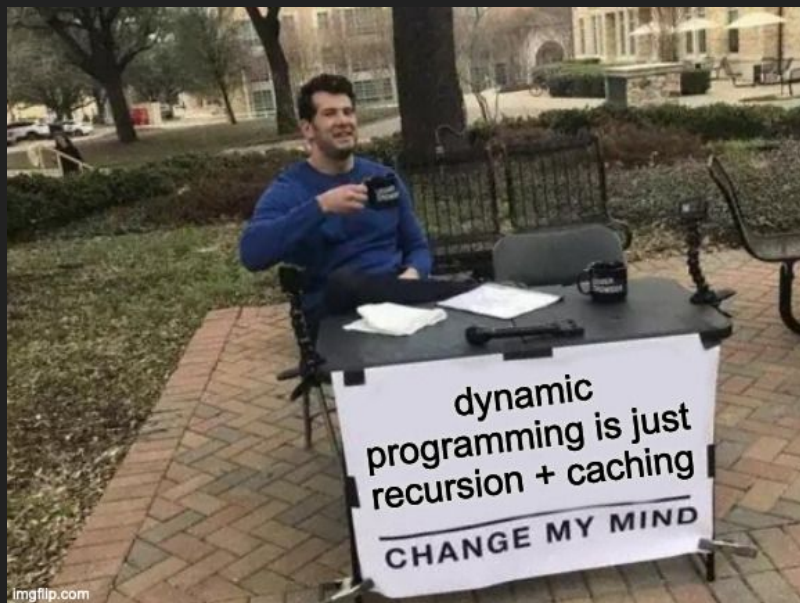
total states: 15

states visited: 9 (60%)



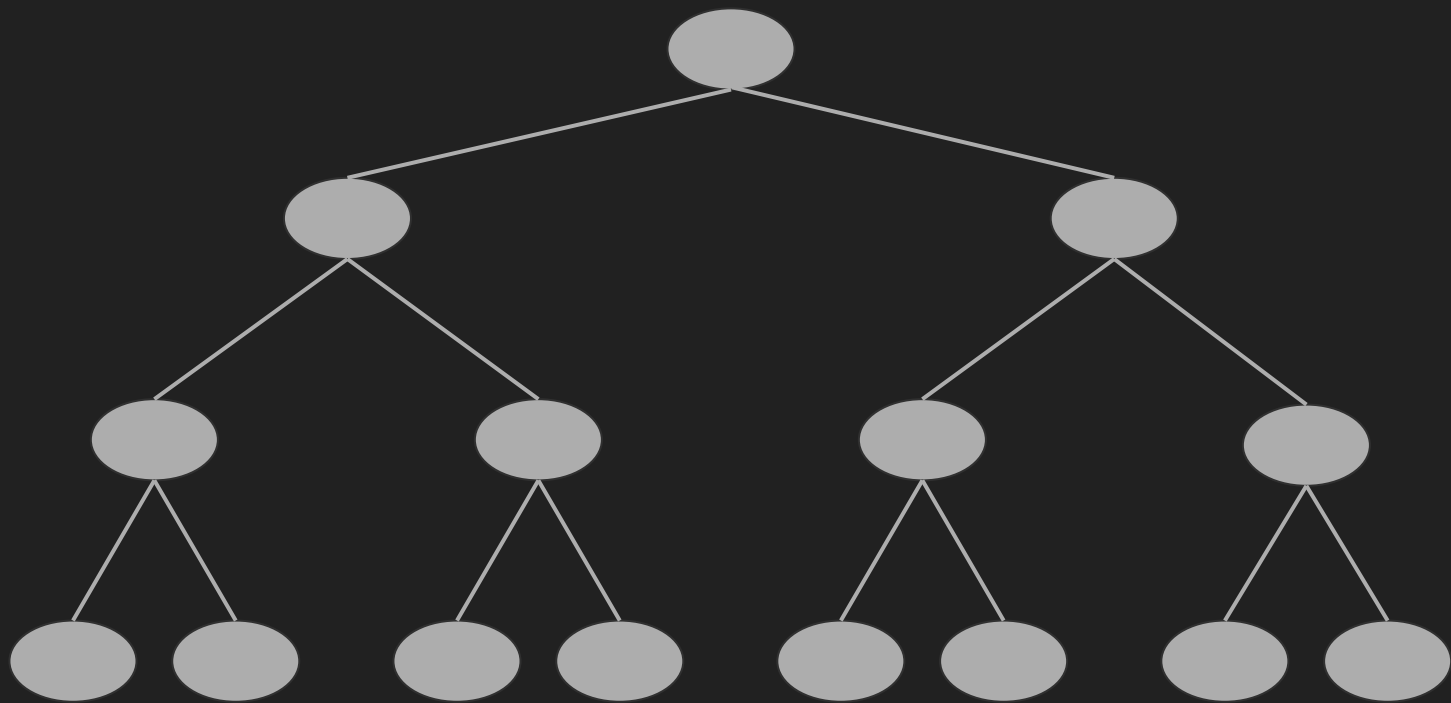
memo refs:	834,619,249	
memo hits:	398,856,779	(48%)
total states:	434,570,542,645	
states skipped:	433,735,923,396	(99.8%)

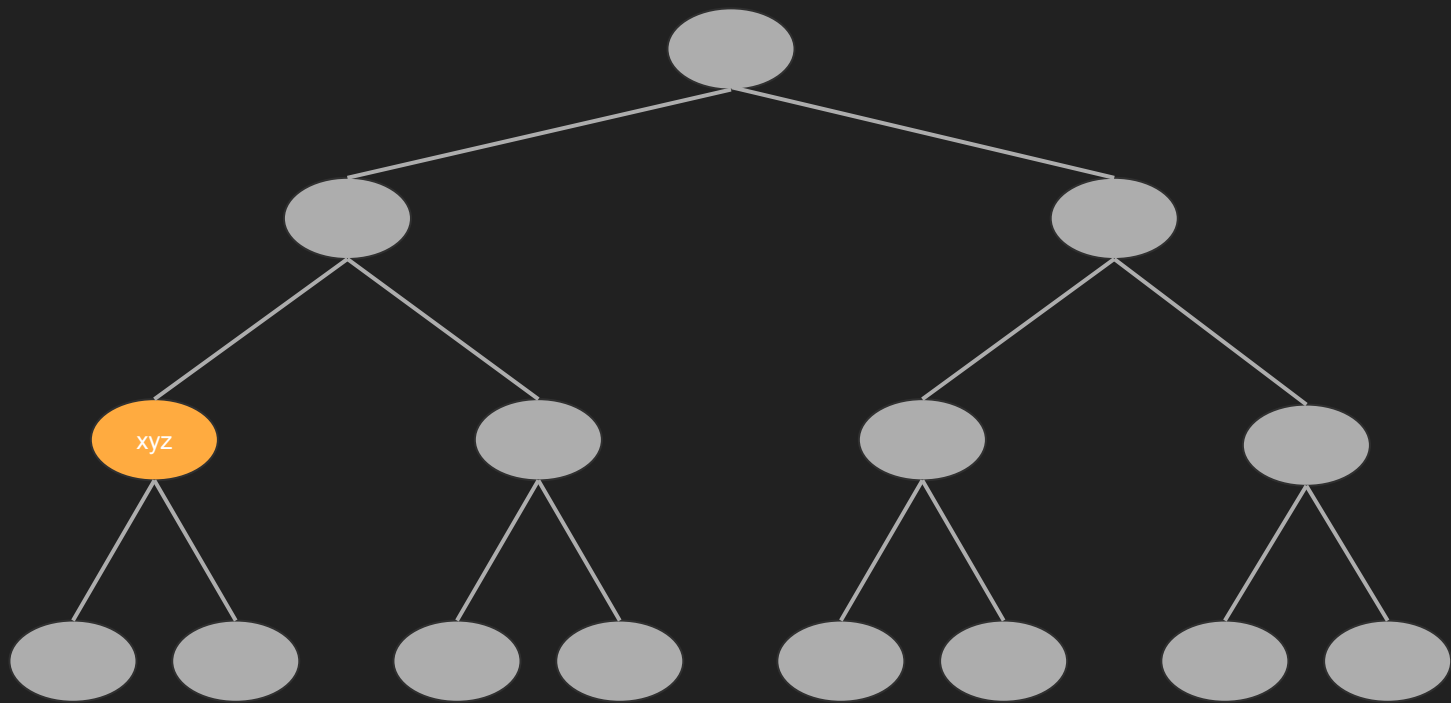
🚀 tip #4

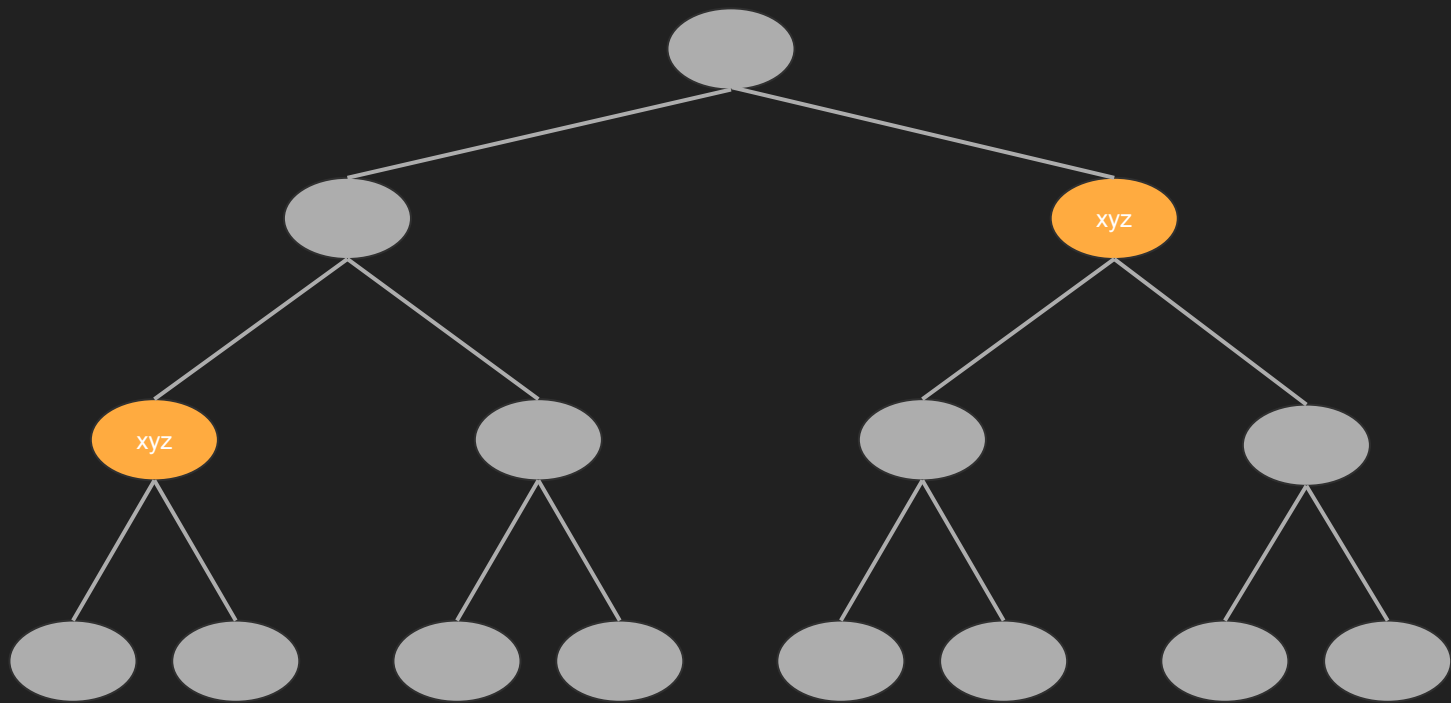


domain knowledge

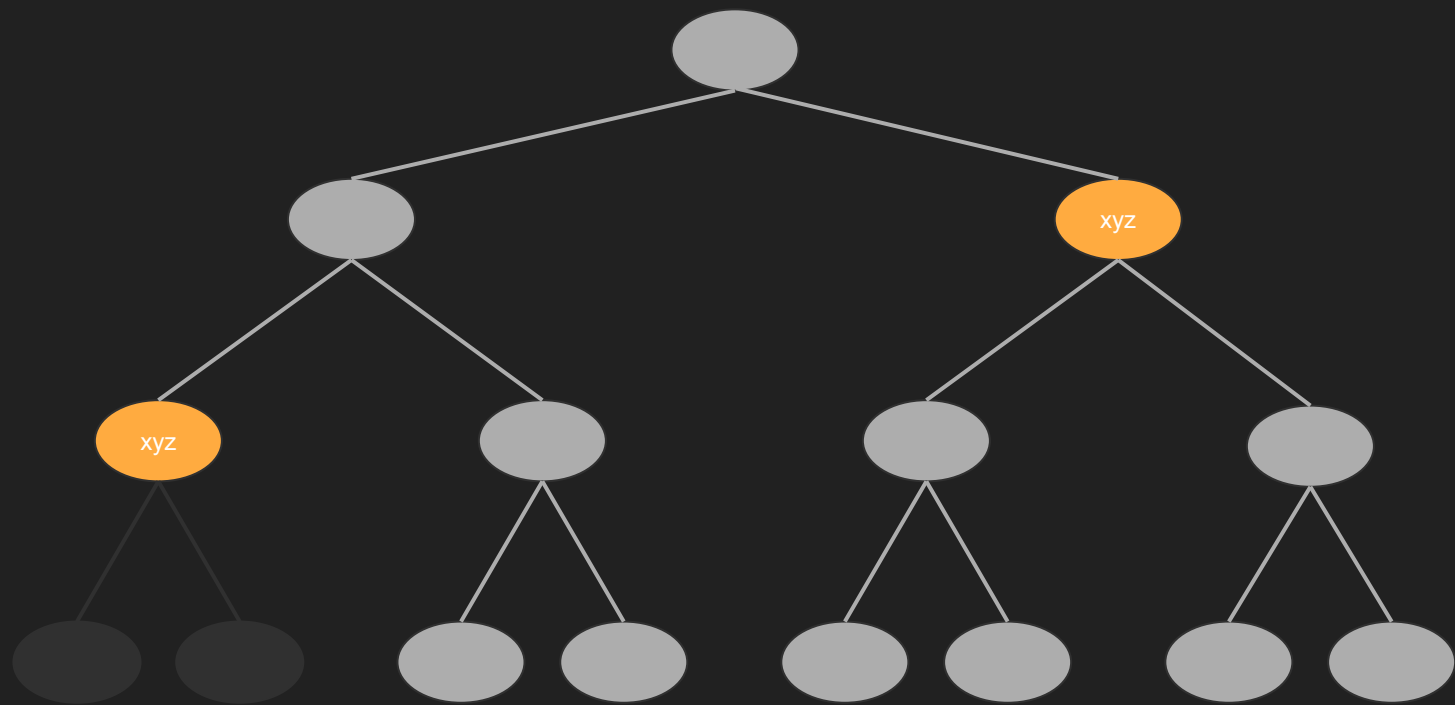
more time > less time

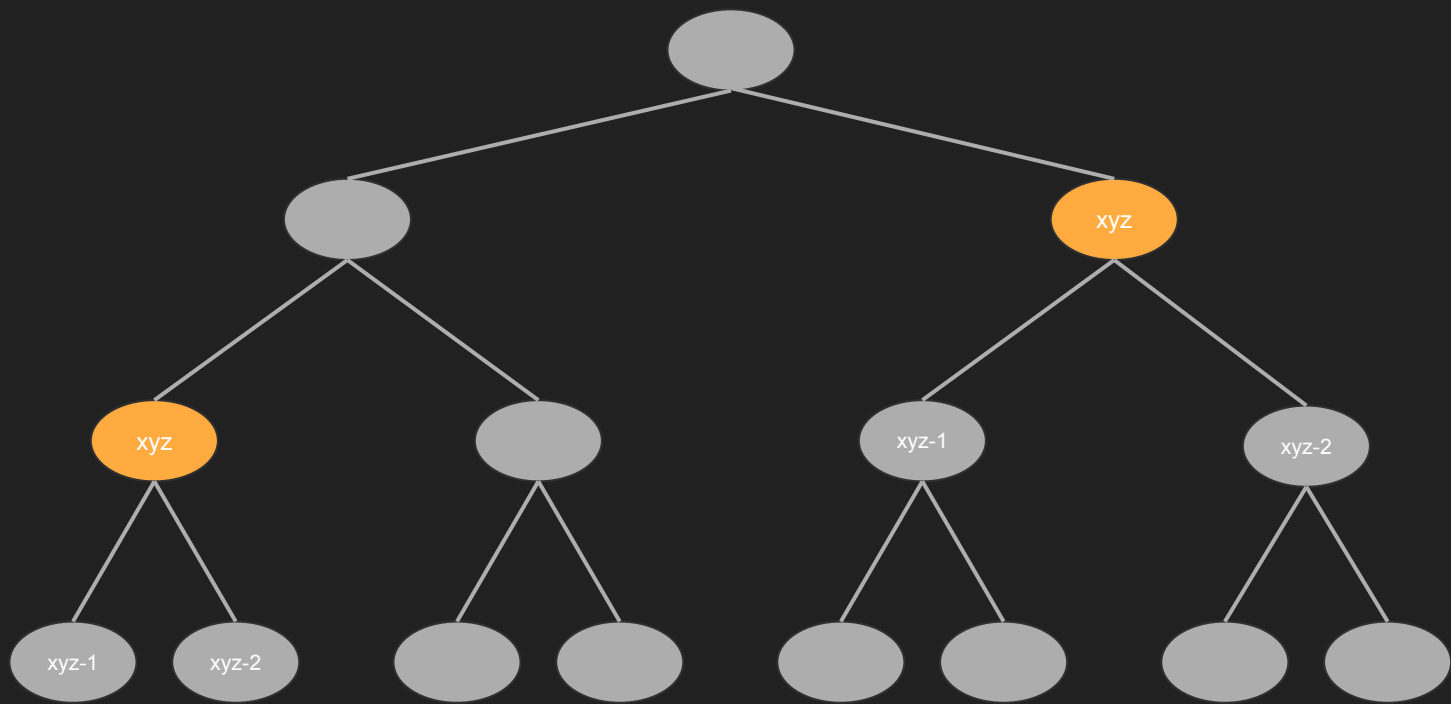












```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:    u32,
    clay_robot:   u32,
    obsidian_robot: u32,
    geode_robot:  u32,
    ore:          u32,
    clay:         u32,
    obsidian:     u32,
    geode:        u32,
}

#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct State {
    minute: u8,
    pack:   Pack,
}
```

```
[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:    u32,
    clay_robot:   u32,
    obsidian_robot: u32,
    geode_robot:  u32,
    ore:          u32,
    clay:         u32,
    obsidian:     u32,
    geode:        u32,
}

[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct State {
    minute: u8,
    pack:   Pack,
}
```

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<Pack, (u32, u8)>) -> u32 {
    if let Some((result, minute)) = memo.get(&state.pack).copied() {
        if state.minute >= minute {
            return result;
        }
    }
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:    u32,
    clay_robot:   u32,
    obsidian_robot: u32,
    geode_robot:  u32,
    ore:          u32,
    clay:         u32,
    obsidian:     u32,
    geode:        u32,
}

#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct State {
    minute: u8,
    pack:   Pack,
}
```

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<Pack, (u32, u8)>) -> u32 {
    if let Some((result, minute)) = memo.get(&state.pack).copied() {
        if state.minute >= minute {
            return result;
        }
    }
}
```

execution time: 70 s (2x) 🐱

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u32,
    clay_robot:     u32,
    obsidian_robot: u32,
    geode_robot:    u32,
    ore:            u32,
    clay:           u32,
    obsidian:       u32,
    geode:          u32,
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u8,
    clay_robot:     u8,
    obsidian_robot: u8,
    geode_robot:    u8,
    ore:            u8,
    clay:           u8,
    obsidian:       u8,
    geode:          u8,
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u32,
    clay_robot:     u32,
    obsidian_robot: u32,
    geode_robot:    u32,
    ore:            u32,
    clay:           u32,
    obsidian:       u32,
    geode:          u32,
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u8,
    clay_robot:     u8,
    obsidian_robot: u8,
    geode_robot:    u8,
    ore:            u8,
    clay:           u8,
    obsidian:       u8,
    geode:          u8,
}
```

execution time: 59 s 🍷

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:    u32,
    clay_robot:   u32,
    obsidian_robot: u32,
    geode_robot:   u32,
    ore:          u32,
    clay:         u32,
    obsidian:      u32,
    geode:         u32,
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:    u8,
    clay_robot:   u8,
    obsidian_robot: u8,
    geode_robot:   u8,
    ore:          u8,
    clay:         u8,
    obsidian:      u8,
    geode:         u8,
}
```

execution time: 59 s 👍

1) cpu cache?



```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u32,
    clay_robot:     u32,
    obsidian_robot: u32,
    geode_robot:    u32,
    ore:            u32,
    clay:           u32,
    obsidian:       u32,
    geode:          u32,
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Hash)]
struct Pack {
    ore_robot:      u8,
    clay_robot:     u8,
    obsidian_robot: u8,
    geode_robot:    u8,
    ore:            u8,
    clay:           u8,
    obsidian:       u8,
    geode:          u8,
}
```

execution time: 59 s 👍

- 1) cpu cache?
- 2) hashing overhead.

```
impl core::hash::Hash for Pack {  
    fn hash<H: Hasher>(&self, state: &mut H) {  
        self.ore_robot.hash(state);  
        self.clay_robot.hash(state);  
        self.obsidian_robot.hash(state);  
        self.geode_robot.hash(state);  
        self.ore.hash(state);  
        self.clay.hash(state);  
        self.obsidian.hash(state);  
        self.geode.hash(state);  
    }  
}
```

```
impl core::hash::Hash for Pack {  
    fn hash<H: Hasher>(&self, state: &mut H) {  
        self.ore_robot.hash(state);  
        self.clay_robot.hash(state);  
        self.obsidian_robot.hash(state);  
        self.geode_robot.hash(state);  
        self.ore.hash(state);  
        self.clay.hash(state);  
        self.obsidian.hash(state);  
        self.geode.hash(state);  
    }  
}
```

h(  )


```
impl core::hash::Hash for Pack {  
    fn hash<H: Hasher>(&self, state: &mut H) {  
        self.ore_robot.hash(state);  
        self.clay_robot.hash(state);  
        self.obsidian_robot.hash(state);  
        self.geode_robot.hash(state);  
        self.ore.hash(state);  
        self.clay.hash(state);  
        self.obsidian.hash(state);  
        self.geode.hash(state);  
    }  
}
```

```
fn hash(&mut self, bytes: &[u8]) {  
    if bytes.len() % 8 != 0 {  
        // put into internal buffer.  
    }  
  
    // ...  
}
```

h(  )

```
impl core::hash::Hash for Pack {  
    fn hash<H: Hasher>(&self, state: &mut H) {  
        self.ore_robot.hash(state);  
        self.clay_robot.hash(state);  
        self.obsidian_robot.hash(state);  
        self.geode_robot.hash(state);  
        self.ore.hash(state);  
        self.clay.hash(state);  
        self.obsidian.hash(state);  
        self.geode.hash(state);  
    }  
}
```



```
fn hash(&mut self, bytes: &[u8]) {  
    if bytes.len() % 8 != 0 {  
        // put into internal buffer.  
    }  
  
    // ...  
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )



```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
impl core::hash::Hash for Pack {
    fn hash<H: Hasher>(&self, state: &mut H) {
        self.ore_robot.hash(state);
        self.clay_robot.hash(state);
        self.obsidian_robot.hash(state);
        self.geode_robot.hash(state);
        self.ore.hash(state);
        self.clay.hash(state);
        self.obsidian.hash(state);
        self.geode.hash(state);
    }
}
```

```
fn hash(&mut self, bytes: &[u8]) {
    if bytes.len() % 8 != 0 {
        // put into internal buffer.
    }

    // ...
}
```

h(         )

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<u64, (u8, u8)>) -> u8 {  
    let pack_64 = unsafe { core::mem::transmute(state.pack) };  
  
    if let Some((result, minute)) = memo.get(&pack_64).copied() {  
        if state.minute >= minute {  
            return result;  
        }  
    }  
}
```

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<u64, (u8, u8)>) -> u8 {  
    let pack_64 = unsafe { core::mem::transmute(state.pack) };  
  
    if let Some((result, minute)) = memo.get(&pack_64).copied() {  
        if state.minute >= minute {  
            return result;  
        }  
    }  
}
```

execution time: 44 s 🎉

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<u64, (u8, u8)>) -> u8 {
    let pack_64 = u64::from_ne_bytes([
        state.pack.ore_robot,
        state.pack.clay_robot,
        state.pack.obsidian_robot,
        state.pack.geode_robot,
        state.pack.ore,
        state.pack.clay,
        state.pack.obsidian,
        state.pack.geode,
    ]);

    if let Some((result, minute)) = memo.get(&pack_64).copied() {
        if state.minute >= minute {
            return result;
        }
    }
}
```

```
#[derive(Clone, Copy, Debug, PartialEq, Eq, Default)]
#[repr(C)]
struct Pack {
    ore_robot:    u8,
    clay_robot:   u8,
    obsidian_robot: u8,
    geode_robot:   u8,
    ore:          u8,
    clay:         u8,
    obsidian:     u8,
    geode:        u8,
}
```

```
fn solution(state: State, bp: &Blueprint, limit: u8, memo: &mut HashMap<u64, (u8, u8)>) -> u8 {
    let pack_64 = u64::from_ne_bytes([
        state.pack.ore_robot,
        state.pack.clay_robot,
        state.pack.obsidian_robot,
        state.pack.geode_robot,
        state.pack.ore,
        state.pack.clay,
        state.pack.obsidian,
        state.pack.geode,
    ]);

    if let Some((result, minute)) = memo.get(&pack_64).copied() {
        if state.minute >= minute {
            return result;
        }
    }
}
```



 tip #5

use bigger hashmap keys?

 tip #5

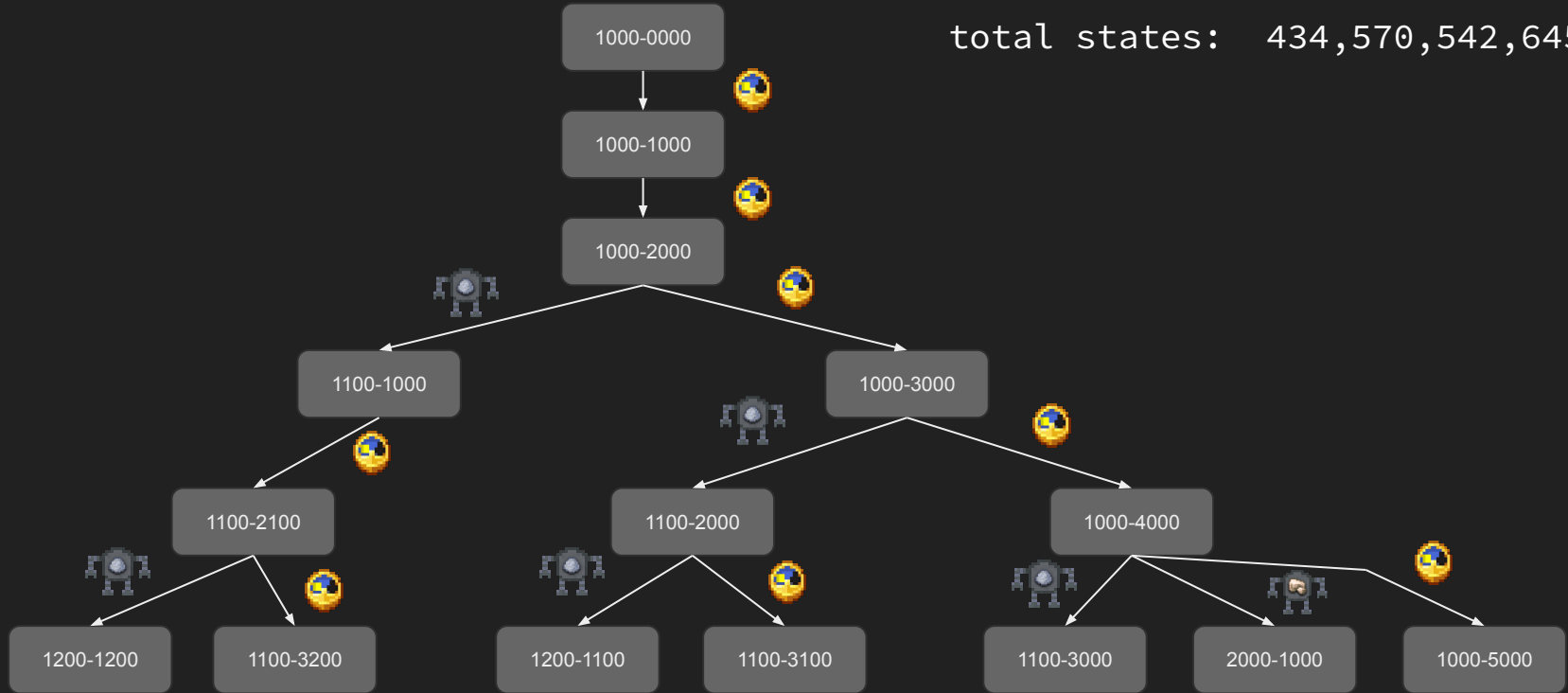
understand how abstractions work,  
so you can use them effectively

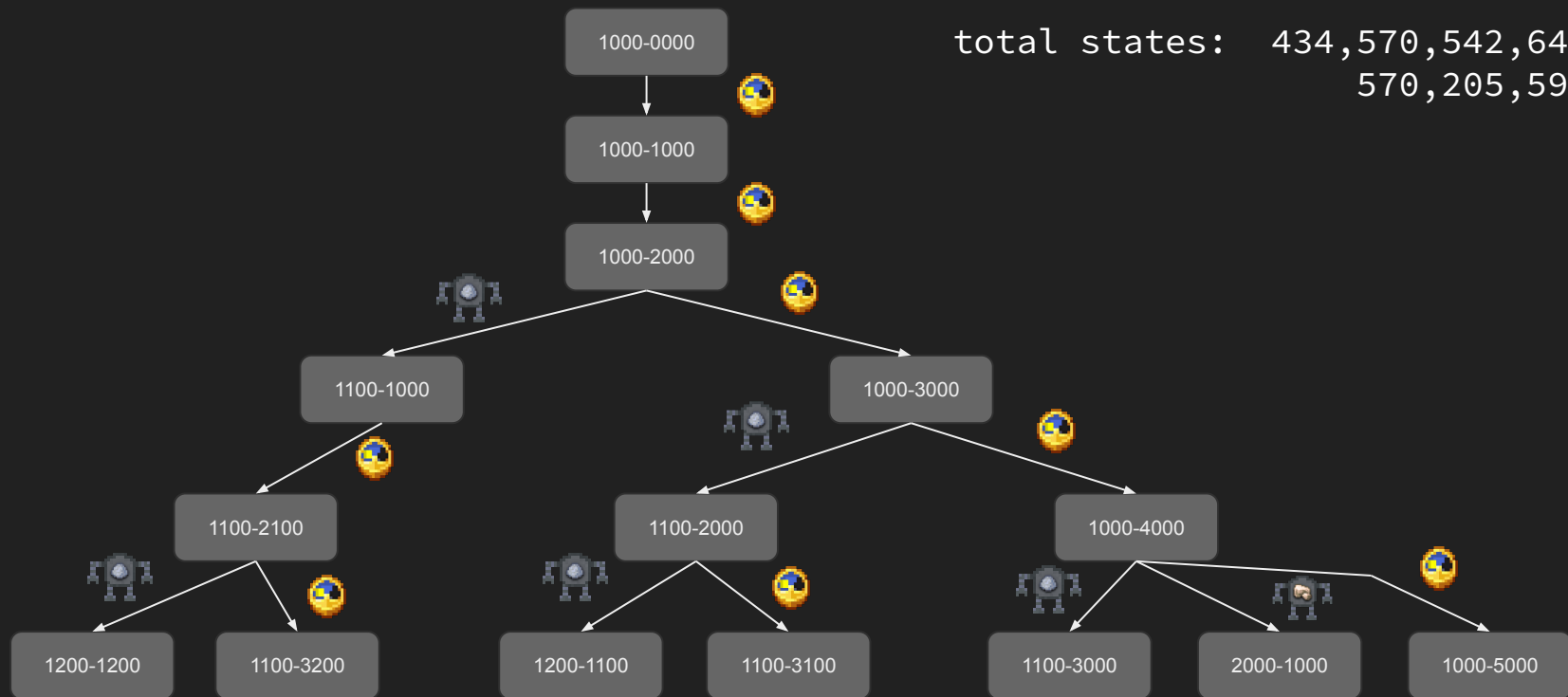




44 s -> 24 ms

total states: 434,570,542,645





total states: 434,570,542,645  
570,205,591

```
fn solution(state: State, bp: &Blueprint, limit: u8,  
    memo: &mut HashMap<u64, (u8, u8)>, max_result: &mut u8  
) -> u8 {
```

```
fn solution(state: State, bp: &Blueprint, limit: u8,  
    memo: &mut HashMap<u64, (u8, u8)>, max_result: &mut u8  
) -> u8 {  
    if state.cant_beat(limit, *max_result) {  
        return 0;  
    }  
  
    // ...  
}
```





```
impl State {  
    fn cant_beat(&self, limit: u8, max_geodes: u8) -> bool {  
        let max_future_geodes = ?;  
  
        return self.pack.geode as u32 + max_future_geodes <= max_geodes as u32;  
    }  
}
```

```
impl State {  
    fn cant_beat(&self, limit: u8, max_geodes: u8) -> bool {  
        let remaining = (limit - self.minute) as u32;  
  
        let max_future_geodes =  
            // future yield of current geode bots.  
            remaining * self.pack.geode_robot as u32;  
  
        return self.pack.geode as u32 + max_future_geodes <= max_geodes as u32;  
    }  
}
```

```
impl State {  
    fn cant_beat(&self, limit: u8, max_geodes: u8) -> bool {  
        let remaining = (limit - self.minute) as u32;  
  
        let max_future_geodes =  
            // future yield of current geode bots.  
            remaining * self.pack.geode_robot as u32  
            // max future yield, if we build one geode bot  
            // on all future turns.  
            + remaining*(remaining-1)/2;  
  
        return self.pack.geode as u32 + max_future_geodes <= max_geodes as u32;  
    }  
}
```

```

impl State {
  fn cant_beat(&self, limit: u8, max_geodes: u8) -> bool {
    let remaining = (limit - self.minute) as u32;

    let max_future_geodes =
      // future yield of current geode bots.
      remaining * self.pack.geode_robot as u32
      // max future yield, if we build one geode bot
      // on all future turns.
      + remaining*(remaining-1)/2;

    return self.pack.geode as u32 + max_future_geodes <= max_geodes as u32;
  }
}

```

execution time: 3.36s 🇺🇸

states visited	
brute force:	434,570,542,645
basic cache:	834,619,249
earlier result:	570,205,591
max_result:	82,929,763

```
impl State {
  fn cant_beat(&self, limit: u8, max_geodes: u8) -> bool {
    let remaining = (limit - self.minute) as u32;

    let max_future_geodes =
      // future yield of current geode bots.
      remaining * self.pack.geode_robot as u32
      // max future yield, if we build one geode bot
      // on all future turns.
      + remaining*(remaining-1)/2;

    return self.pack.geode as u32 + max_future_geodes <= max_geodes as u32;
  }
}
```

execution time: 3.36s 🇺🇸

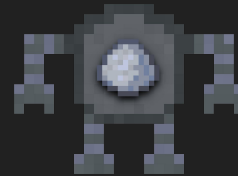
have:

- resources
- robots



goal:

- maximize number of geodes



rules:

- robot -> 1 resource at end of turn
- start with 1 ore robot
- can build up to 1 robot per turn

**blueprint 1:**

ore robot:	4 ore
clay robot:	2 ore
obsidian robot:	3 ore, 14 clay
geode robot:	2 ore, 7 obsidian

```
if state.can_build_geode_robot(bp) {
    result = result.max(solution(state.step()).build_geode_robot(bp), bp, limit, memo, max_result));
}

if state.can_build_obsidian_robot(bp) {
    // can only build one bot per turn.
    // don't need more bots, if we're producing enough,
    // so we can build the most expensive bot on each turn.
    if state.pack.obsidian_robot < bp.max_obsidian_cost() {
        result = result.max(solution(state.step()).build_obsidian_robot(bp), bp, limit, memo, max_result));
    }
}

if state.can_build_clay_robot(bp) {
    if state.pack.clay_robot < bp.max_clay_cost() {
        result = result.max(solution(state.step()).build_clay_robot(bp), bp, limit, memo, max_result));
    }
}

if state.can_build_ore_robot(bp) {
    if state.pack.ore_robot < bp.max_ore_cost() {
        result = result.max(solution(state.step()).build_ore_robot(bp), bp, limit, memo, max_result));
    }
}

result = result.max(solution(state.step()), bp, limit, memo, max_result));
```



states visited	
brute force:	434,570,542,645
basic cache:	834,619,249
earlier result:	570,205,591
max_result:	82,929,763
enough bots:	12,741,390

```
if state.can_build_geode_robot(bp) {
    result = result.max(solution(state.step()).build_geode_robot(bp), bp, limit, memo, max_result));
}

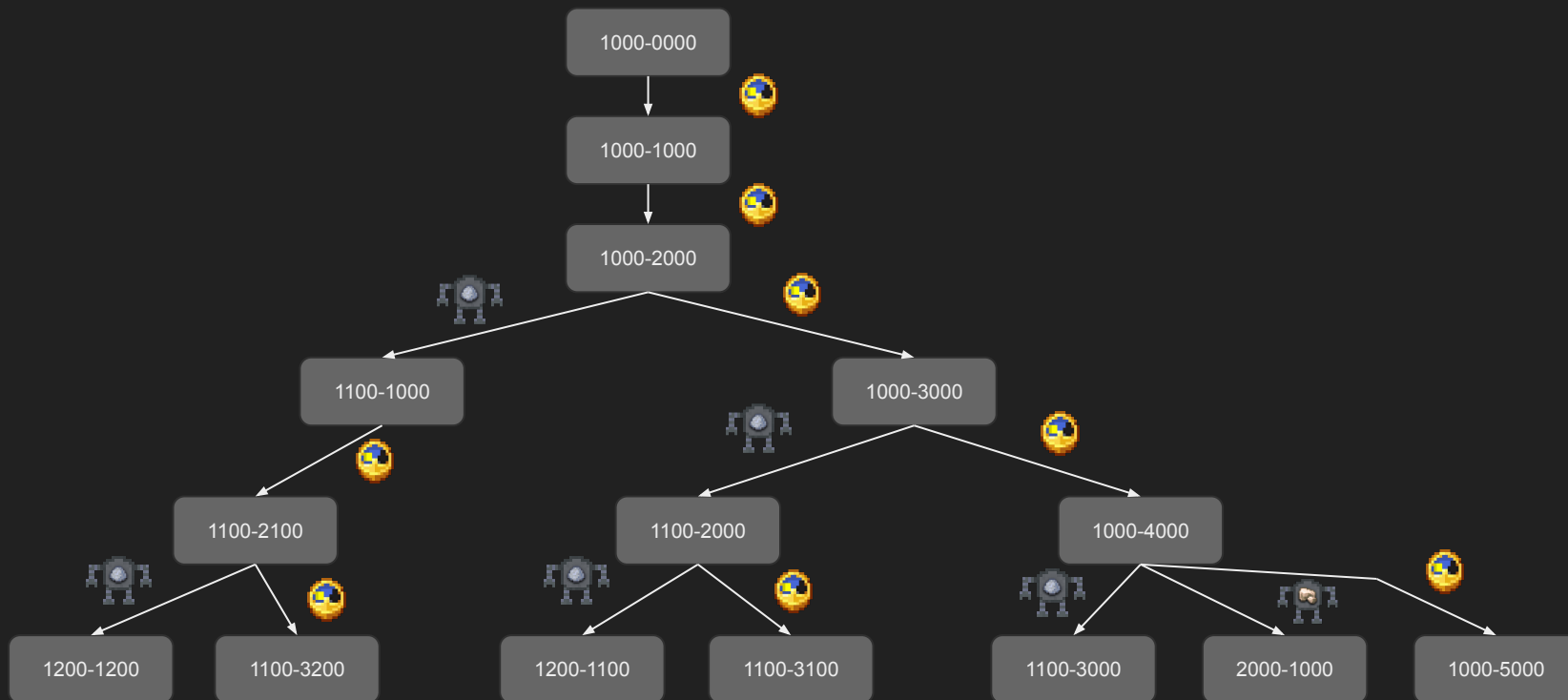
if state.can_build_obsidian_robot(bp) {
    // can only build one bot per turn.
    // don't need more bots, if we're producing enough,
    // so we can build the most expensive bot on each turn.
    if state.pack.obsidian_robot < bp.max_obsidian_cost() {
        result = result.max(solution(state.step()).build_obsidian_robot(bp), bp, limit, memo, max_result));
    }
}

if state.can_build_clay_robot(bp) {
    if state.pack.clay_robot < bp.max_clay_cost() {
        result = result.max(solution(state.step()).build_clay_robot(bp), bp, limit, memo, max_result));
    }
}

if state.can_build_ore_robot(bp) {
    if state.pack.ore_robot < bp.max_ore_cost() {
        result = result.max(solution(state.step()).build_ore_robot(bp), bp, limit, memo, max_result));
    }
}

result = result.max(solution(state.step(), bp, limit, memo, max_result));
```

execution time: 417 ms 🎉



```
fn solution(state: State, bp: &Blueprint, limit: u8,  
    memo: &mut HashMap<u64, (u8, u8)>, max_result: &mut u8,  
    can_ore: bool, can_clay: bool, can_obsidian: bool  
) -> u8 {
```

```
let mut result = 0;

if state.can_build_geode_robot(bp) {
    result = result.max(solution(state.step().build_geode_robot(bp), bp, limit, memo, max_result, true, true, true));
}

let mut new_can_obsidian = true;
if state.can_build_obsidian_robot(bp) {
    new_can_obsidian = false;

    if can_obsidian && state.pack.obsidian_robot < bp.max_obsidian_cost() {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_clay = true;
if state.can_build_clay_robot(bp) {
    new_can_clay = false;

    if can_clay && state.pack.clay_robot < bp.max_clay_cost() {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_ore = true;
if state.can_build_ore_robot(bp) {
    new_can_ore = false;

    if can_ore && state.pack.ore_robot < bp.max_ore_cost() {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

result = result.max(solution(state.step(), bp, limit, memo, max_result, new_can_ore, new_can_clay, new_can_obsidian));
```

```

let mut result = 0;

if state.can_build_geode_robot(bp) {
    result = result.max(solution(state.step().build_geode_robot(bp), bp, limit, memo, max_result, true, true, true));
}

let mut new_can_obsidian = true;
if state.can_build_obsidian_robot(bp) {
    new_can_obsidian = false;

    if can_obsidian && state.pack.obsidian_robot < bp.max_obsidian_cost() {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_clay = true;
if state.can_build_clay_robot(bp) {
    new_can_clay = false;

    if can_clay && state.pack.clay_robot < bp.max_clay_cost() {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_ore = true;
if state.can_build_ore_robot(bp) {
    new_can_ore = false;

    if can_ore && state.pack.ore_robot < bp.max_ore_cost() {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

result = result.max(solution(state.step(), bp, limit, memo, max_result, new_can_ore, new_can_clay, new_can_obsidian));

```

execution time: 23.99 ms 🥳

states visited	
brute force:	434,570,542,645
basic cache:	834,619,249
earlier result:	570,205,591
max_result:	82,929,763
enough bots:	12,741,390
no idling:	566,020

```
let mut result = 0;

if state.can_build_geode_robot(bp) {
    result = result.max(solution(state.step().build_geode_robot(bp), bp, limit, memo, max_result, true, true, true));
}

let mut new_can_obsidian = true;
if state.can_build_obsidian_robot(bp) {
    new_can_obsidian = false;

    if can_obsidian && state.pack.obsidian_robot < bp.max_obsidian_cost() {
        result = result.max(solution(state.step().build_obsidian_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_clay = true;
if state.can_build_clay_robot(bp) {
    new_can_clay = false;

    if can_clay && state.pack.clay_robot < bp.max_clay_cost() {
        result = result.max(solution(state.step().build_clay_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

let mut new_can_ore = true;
if state.can_build_ore_robot(bp) {
    new_can_ore = false;

    if can_ore && state.pack.ore_robot < bp.max_ore_cost() {
        result = result.max(solution(state.step().build_ore_robot(bp), bp, limit, memo, max_result, true, true, true));
    }
}

result = result.max(solution(state.step(), bp, limit, memo, max_result, new_can_ore, new_can_clay, new_can_obsidian));
```

execution time: 23.99 ms 🥳

	states visited	time
brute force:	434,570,542,645	DNF
basic cache:	834,619,249	140 s
earlier result:	570,205,591	70 s
u8	570,205,591	44 s
max_result:	82,929,763	3359 ms
enough bots:	12,741,390	417 ms
no idling:	566,020	24 ms

	states visited	time
brute force:	434,570,542,645	DNF
basic cache:	834,619,249	140 s
earlier result:	570,205,591	70 s
u8	570,205,591	44 s
max_result:	82,929,763	3359 ms
enough bots:	12,741,390	417 ms
no idling:	566,020	24 ms
?	?	3 ms



	states visited	time
brute force:	434,570,542,645	DNF
basic cache:	834,619,249	140 s
earlier result:	570,205,591	70 s
u8	570,205,591	44 s
max_result:	82,929,763	3359 ms
enough bots:	12,741,390	417 ms
no idling:	566,020	24 ms
?	?	3 ms



exercise:

given this data, what might the last optimization be?

	states visited	time	
brute force:	434,570,542,645	DNF	
basic cache:	834,619,249	140 s	
earlier result:	570,205,591	70 s	
u8	570,205,591	44 s	
max_result:	7x 82,929,763	3359 ms	13x
enough bots:	6x 12,741,390	417 ms	8x
no idling:	22x 566,020	24 ms	17x
?	?	3 ms	



exercise:

given this data, what might the last optimization be?

	states visited	time	cache hits
brute force:	434,570,542,645	DNF	<i>n/a</i>
basic cache:	834,619,249	140 s	48%
earlier result:	570,205,591	70 s	48%
u8	570,205,591	44 s	48%
max_result:	82,929,763	3359 ms	46%
enough bots:	12,741,390	417 ms	39%
no idling:	566,020	24 ms	5%
?	?	3 ms	?



exercise:

given this data, what might the last optimization be?

	states visited	time	cache hits
brute force:	434,570,542,645	DNF	<i>n/a</i>
basic cache:	834,619,249	140 s	48%
earlier result:	570,205,591	70 s	48%
u8	570,205,591	44 s	48%
max_result:	82,929,763	3359 ms	46%
enough bots:	12,741,390	417 ms	39%
no idling:	566,020	24 ms	5%
no memo table:	674,356	3 ms	<i>n/a</i>

doing less