

3SUM in **Preprocessed Universes**

FASTER AND SIMPLER

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IIT Delhi

Fine-grained complexity

3SUM

APSP

SETH

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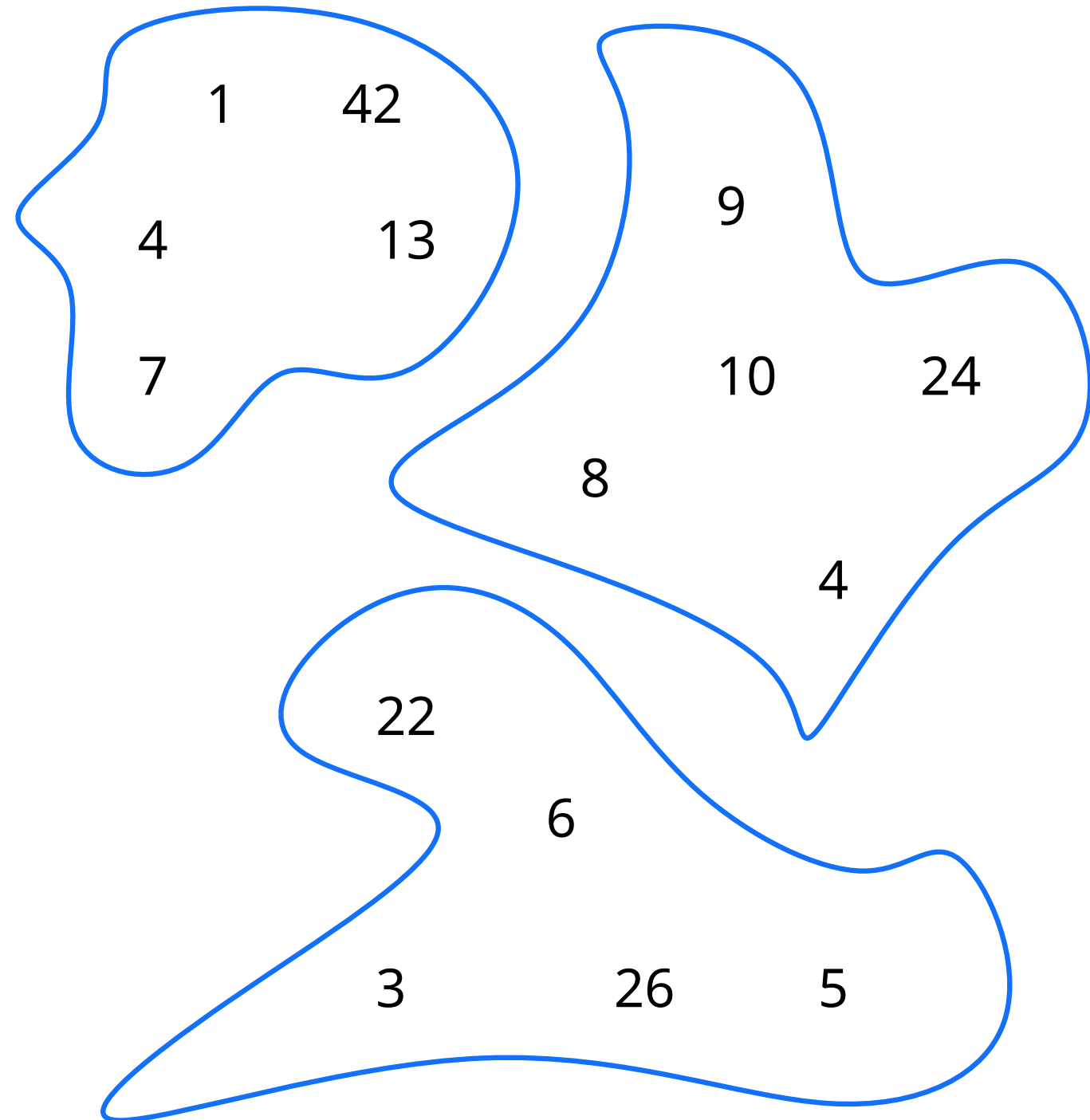
The **3SUM** problem

Input:

Three sets A , B , C of n integers

Output:

$\exists a \in A, b \in B, c \in C$ with $a + b = c$?



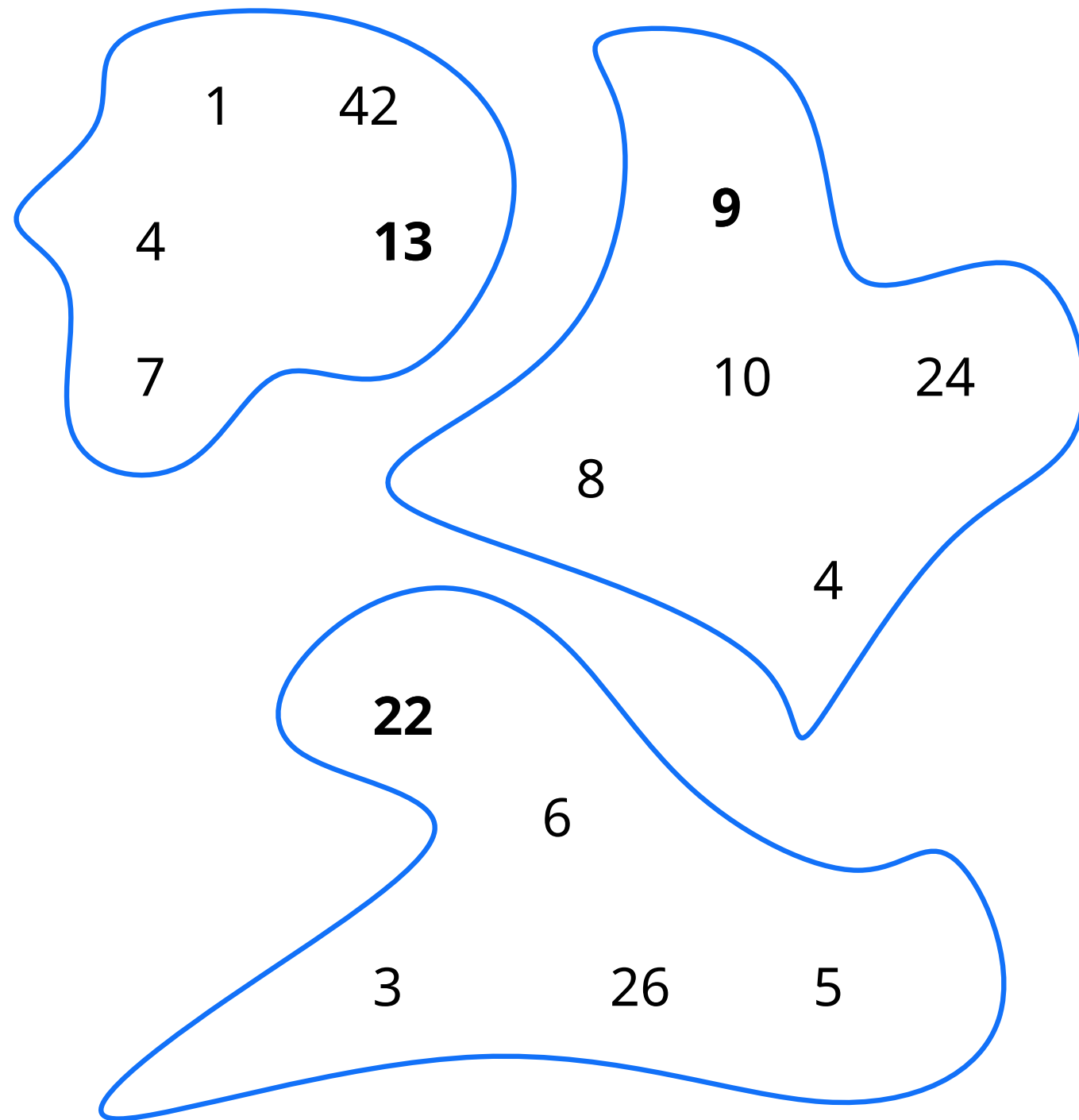
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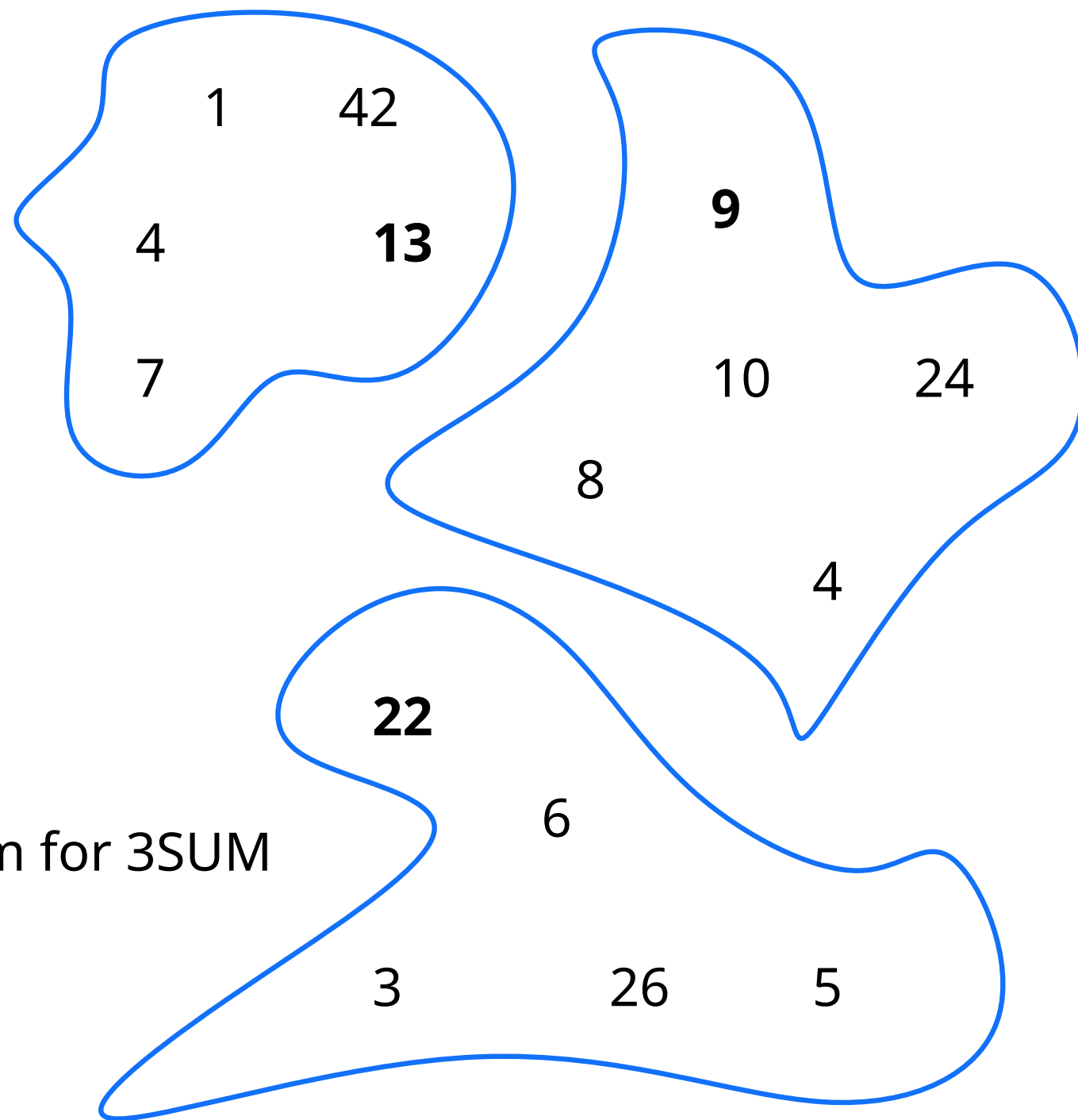
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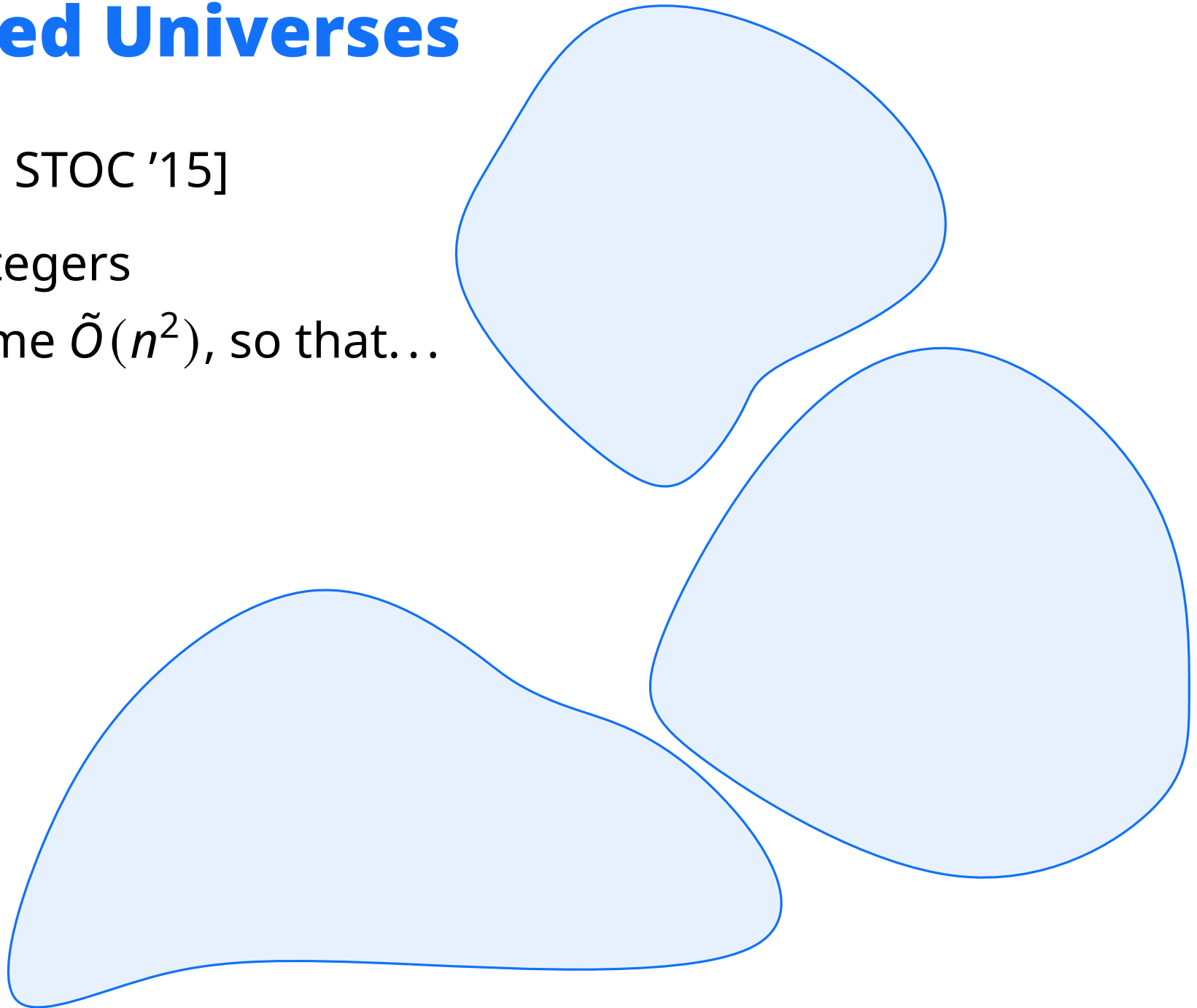
Hypothesis: No $O(n^{1.99})$ time algorithm for 3SUM



3SUM in Preprocessed Universes

Theorem [Chan–Lewenstein, STOC '15]

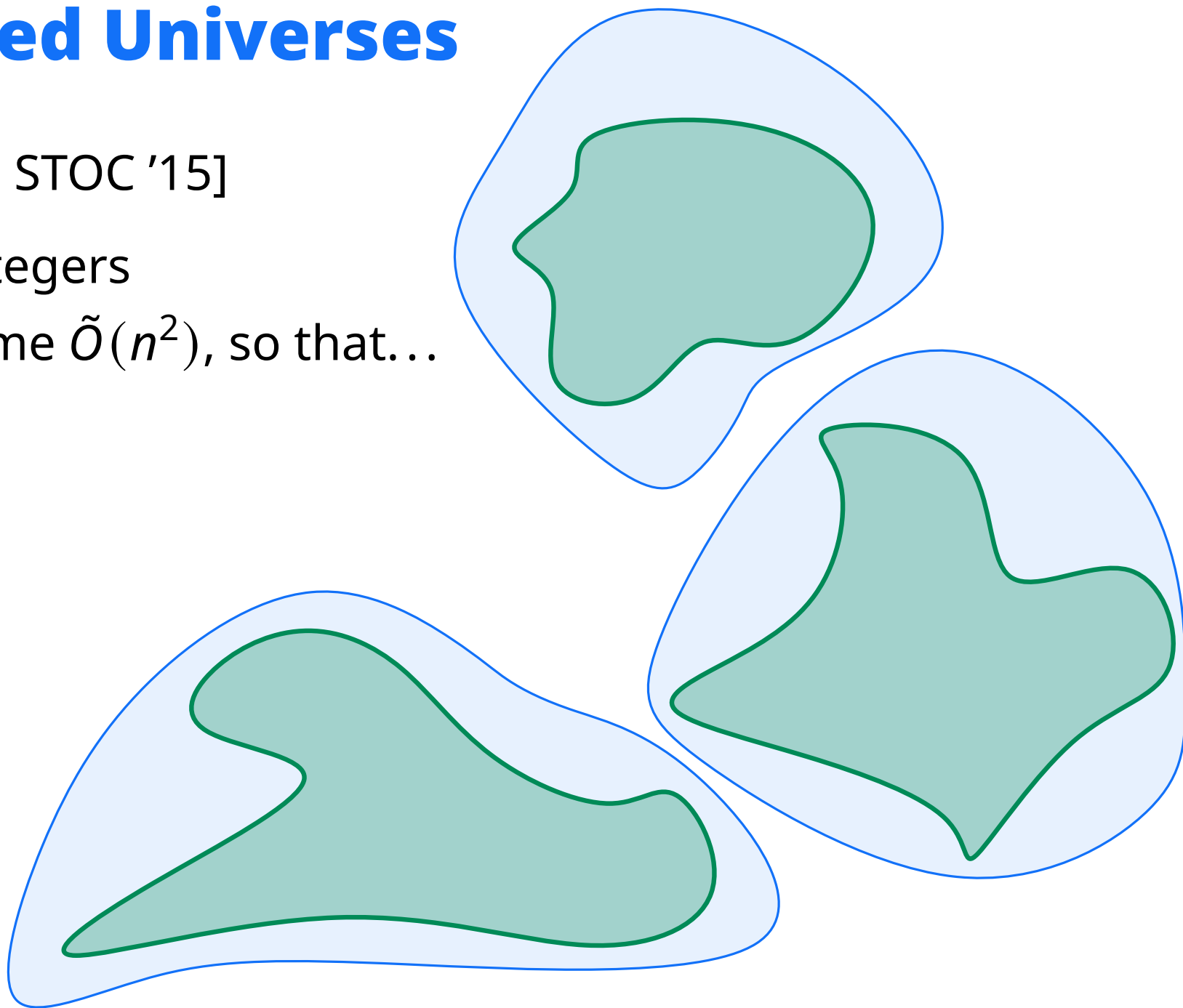
Given three sets A , B , C of n integers
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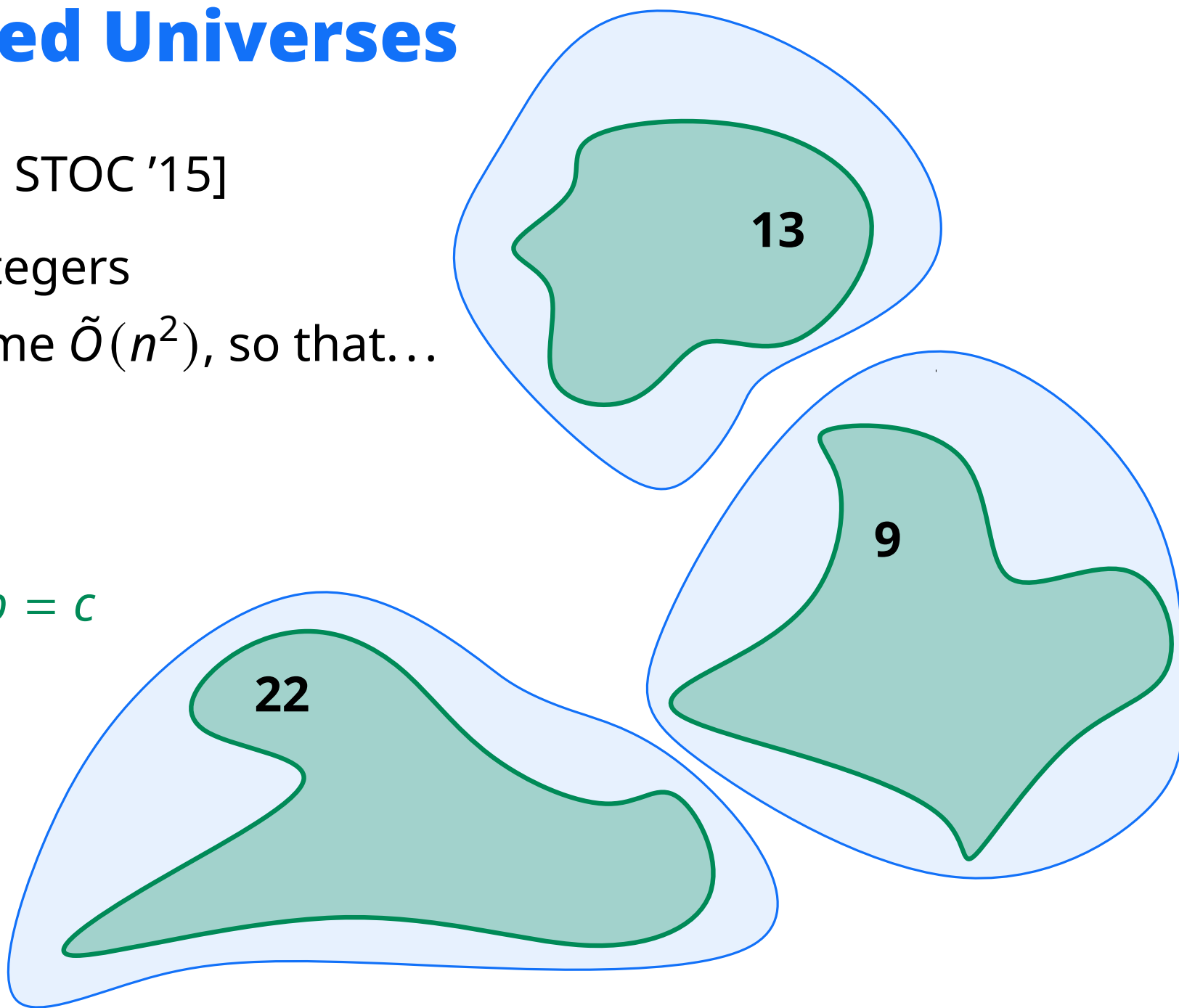
Given three sets A, B, C of n integers
one can preprocess them, in time $\tilde{O}(n^2)$, so that...

given $A' \subseteq A, B' \subseteq B, C' \subseteq C$

one can decide if there exists

$a \in A', b \in B', c \in C'$ with $a + b = c$

in time $\tilde{O}(n^{13/7})$.



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This work

$$O(n^{3/2} \log n)$$

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elementary



Tool: linear hashing **modulo p**

$$\{(a, b, c) \in A \times B \times C : \mathbf{a + b \equiv c \bmod p}\}$$



solutions modulo p

Tool: linear hashing modulo p

$$\{(a, b, c) \in A \times B \times C : a + b \equiv c \pmod{p}\}$$



$$\text{solutions modulo } p = \text{true solutions} \cup \text{false positives}$$

$$\{(a, b, c) \in A \times B \times C : a + b = c\}$$



$$\{(a, b, c) \in A \times B \times C : a + b \equiv c \pmod{p} \wedge a + b \neq c\}$$



Our preprocessing

1. Pick a random prime $p \in [n^{1.5}, 2 \cdot n^{1.5})$

2. List all **false positives** modulo p

$$F = \{(a, b, c) \in A \times B \times C : a + b \equiv c \pmod{p} \wedge a + b \neq c\}$$

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Observation: $\mathbb{E}[|F|] \leq O(n^{1.5} \log n)$



in time $O(n^2 + |F|)$

Bounding the number of **false positives**

$$\mathbf{F} = \{(a, b, c) \in A \times B \times C : a + b \equiv c \bmod p \wedge a + b \neq c\}$$

$$\mathbb{E}[|\mathbf{F}|] = \sum_{a+b \neq c} \Pr[a + b \equiv c \bmod p]$$

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Our algorithm

1. Calculate **number of solutions modulo p** , i.e.,

$$\#\{(a, b, c) \in A' \times B' \times C' : a + b \equiv c \pmod{p}\}$$

2. Subtract **false positives** present in the **actual instance**, i.e.,

$$F \cap (A' \times B' \times C')$$

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in time $O(p \log p)$, using FFT

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$$Q_A(x) = \sum_{a \in A} x^a$$

$$\text{e.g.: } Q_{\{2,3,7\}} = x^2 + x^3 + x^7$$

$$(Q_A \cdot Q_B)(x) = \sum \alpha_c x^c$$

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Note: Can output for **each** $c \in C'$ if there exist $a \in A'$, $b \in B'$ with $a + b = c$

Derandomizing our preprocessing

Need: A modulus $m \approx n^{1.5}$ s.t. # false positives modulo m is $|F_m| \approx n^3/m$

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Idea: **Check all primes** from $[n^{1.5}, 2 \cdot n^{1.5})$, and select one that does the job

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$$\tilde{O}(n^{1.5} \cdot n^{1.5}) = \tilde{O}(n^3) \quad \therefore -$$

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 - ▶ $\tilde{O}(n^{1.5})$ query **tight** for “combinatorial” algorithms under BMM Hypothesis

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 - ▶ Is even our algorithm “combinatorial”? [Pratt–Uffenheimer–Weinstein]

THANK YOU!