

# Clustered Integer 3SUM via Additive Combinatorics

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# The Big Questions I

- Problem: **All-Pairs Shortest Paths (APSP)**

Given weighted graph with  $n$  vertices, find shortest paths between all pairs, in  $n^{3-\Omega(1)}$  time?

- Equiv. Problem: **(min,+) Matrix Multiplication**

Given  $n \times n$  matrices  $\{a_{ij}\}, \{b_{ij}\}$ , compute  $s_{ij} = \min_k (a_{ik} + b_{kj}) \forall i, j$ , in  $n^{3-\Omega(1)}$  time?

- Special Case: **(min,+) Convolution**

Given sequences  $\{a_i\}, \{b_i\}$  of length  $n$ , compute  $s_i = \min_k (a_k + b_{i-k}) \forall i$ , in  $n^{2-\Omega(1)}$  time?

# The Big Questions II

- Problem: **3SUM**

Given sets  $A, B, S$  of  $n$  elements, decide if  $\exists a \in A, b \in B, s \in S$  with  $a + b = s$ ,  
in  $n^{2-\Omega(1)}$  time?

- Equiv. Problem: **3SUM<sup>+</sup>**

Given sets  $A, B, S$  of  $n$  elements, decide for every  $s \in S$ , if  $\exists a \in A, b \in B$  with  $a + b = s$ ,  
in  $n^{2-\Omega(1)}$  time?

Conjecture: **no** to these questions

But I like positive results...

# “Easy” Special Cases

- **Small Int. APSP**

$c^{O(1)}n^{2.373}$  time [Alon&Galil&Margalit'91/Seidel'92]  
(undirected) or  $c^{O(1)}n^{2.58}$  time [Zwick'98]  
(directed) if weights are in  $[c]$

- **Small Int. (min,+) Convolution**

$O(cn \log n)$  time by FFT if elements are in  $[c]$

- **Bounded Int. 3SUM<sup>+</sup>**

$O(cn \log n)$  time by FFT if elements are in  $[cn]$

# Open Special Cases

- Problem: **Small-Diff. Int. (min,+) Convolution**  
Given int. sequence  $\{a_i\}, \{b_i\}$  with  
 $|a_{i+1} - a_i|, |b_{i+1} - b_i| \leq c,$   
compute (min,+) convolution
- Equiv. Problem: **Bounded Int. Monotone (min,+) Convolution**  
Given monotone increas. sequence  $\{a_i\}, \{b_i\}$  in  
 $[cn]$ , compute (min,+) convolution

# Open Special Cases

- Equiv. Problem: **Binary Jumbled Indexing**

Given binary string of length  $n$ , compute, for all  $i$ ,  
 $s_i = \min$  (or  $\max$ ) # of 1's over all length- $i$   
substrings

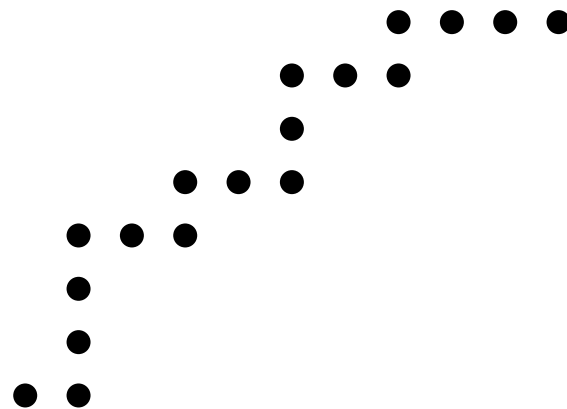
posed by **many** people [Burcsi&Cicalese&Fici&Lipták'10,  
Moosa&Rahman'10, Hermelin&Landau&Rabinovich&  
Weimann'14, ...]

(let  $a_i = i$ -th prefix sum  $\Rightarrow s_i = \min_k (a_{k+i} - a_k)$ )

# Open Special Cases

- Equiv. Problem: **Bounded Int. Connected Monotone 3SUM<sup>+</sup> in 2D**

Given  $A, B, S \subset [cn]^2$  that form connected  $xy$ -monotone sequences, solve 3SUM<sup>+</sup>



(let  $x$  = length of prefix,  $y$  = # of 1's in prefix)



# New Results

- First truly subquadratic alg'ms for this group of problems!
- Randomized time  $\tilde{O}(n^{(9+\sqrt{177})/12}) = \tilde{O}(n^{1.859})$
- Deterministic time  $\tilde{O}(n^{1.864})$

APSP  $\leftrightarrow$  (min,+) Matrix Mult.

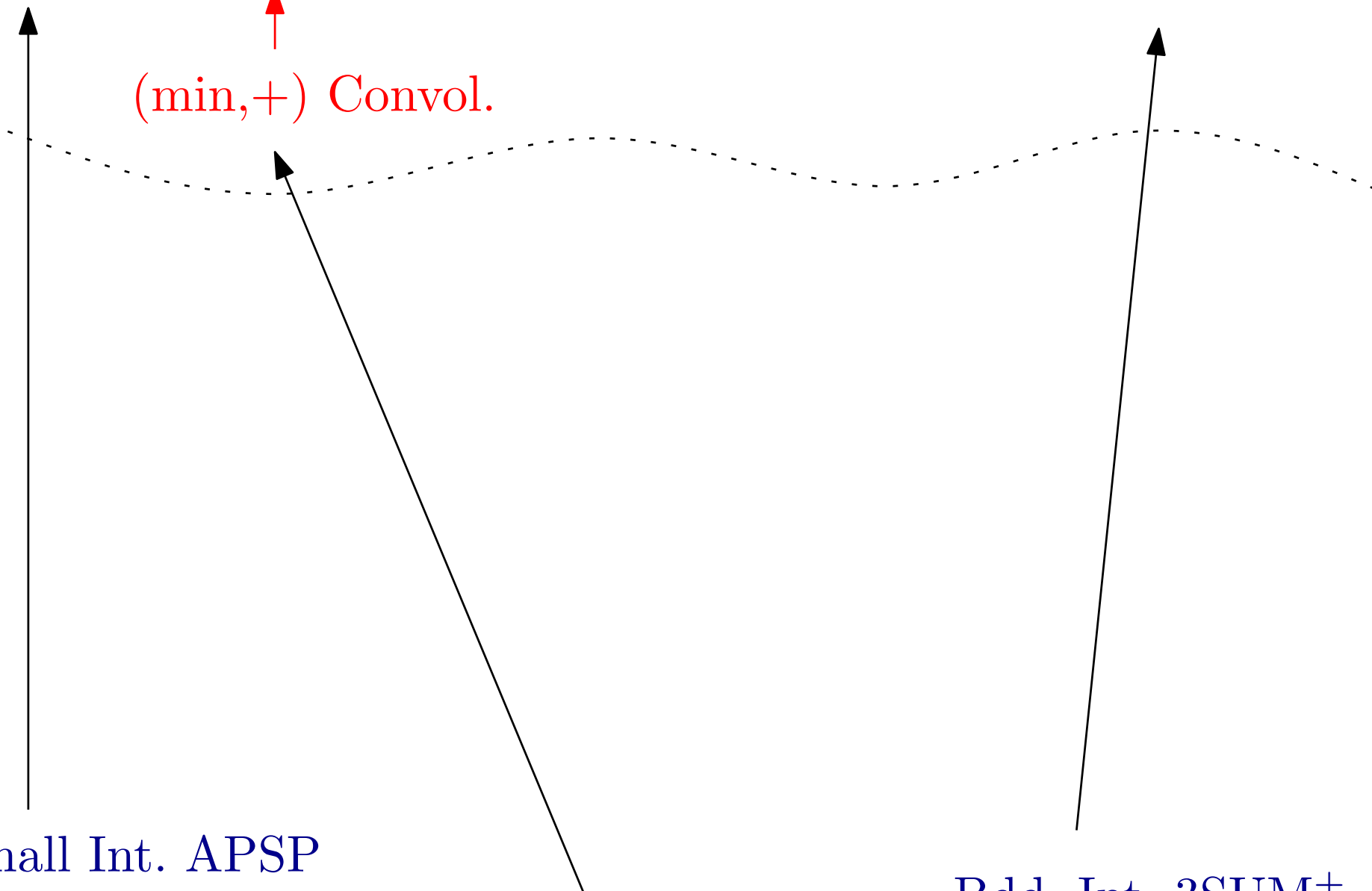
3SUM  $\leftrightarrow$  3SUM<sup>+</sup>

(min,+) Convolution

Small Int. APSP

Small Int. (min,+) Convolution

Bdd. Int. 3SUM<sup>+</sup>



APSP  $\leftrightarrow$  (min,+) Matrix Mult.

3SUM  $\leftrightarrow$  3SUM<sup>+</sup>

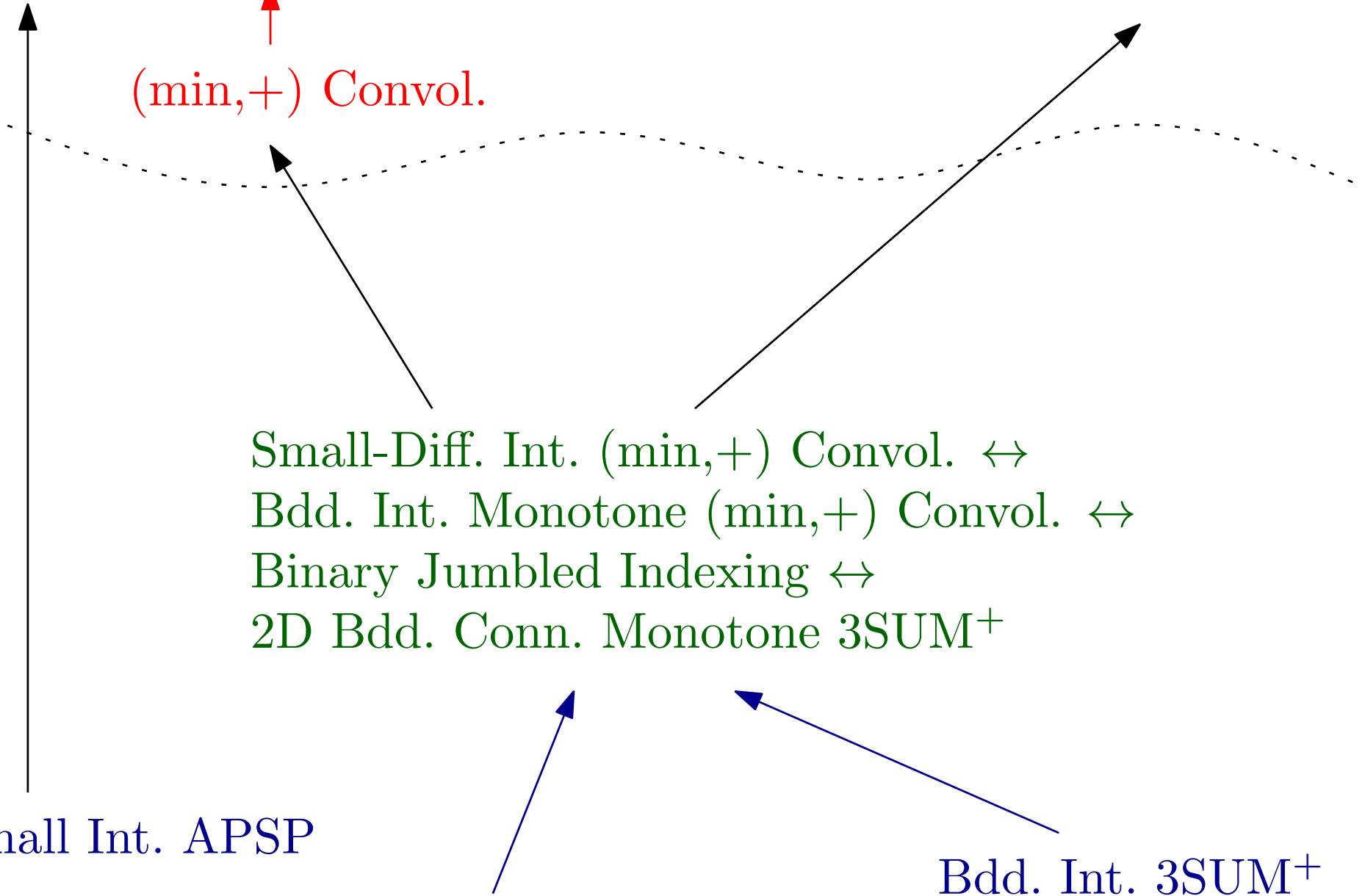
(min,+) Convolution

Small-Diff. Int. (min,+) Convolution  $\leftrightarrow$   
Bdd. Int. Monotone (min,+) Convolution  $\leftrightarrow$   
Binary Jumbled Indexing  $\leftrightarrow$   
2D Bdd. Conn. Monotone 3SUM<sup>+</sup>

Small Int. APSP

Small Int. (min,+) Convolution

Bdd. Int. 3SUM<sup>+</sup>



# More Results

- Bounded Int. Monotone 3SUM<sup>+</sup> in  $dD$  in  $n^{2-2/(d+O(1))}$  rand. time
- Clustered Int. 3SUM<sup>+</sup> in  $n^{2-\Omega(\varepsilon)}$  rand. time if input can be covered by  $n^{1-\varepsilon}$  intervals of length  $n$

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3SUM  $\leftrightarrow$  3SUM<sup>+</sup>

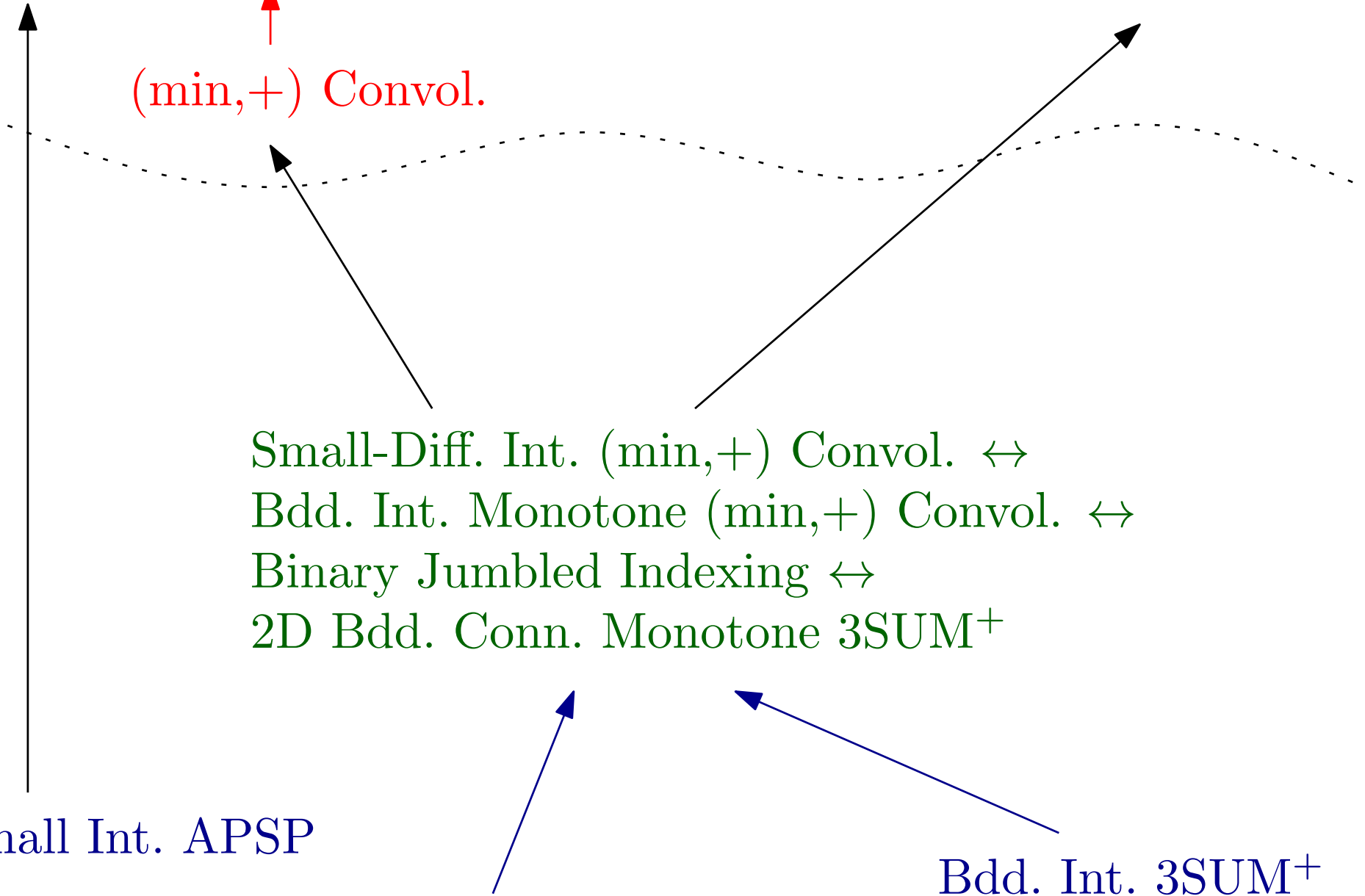
(min,+) Convolution

Small-Diff. Int. (min,+) Convolution  $\leftrightarrow$   
Bdd. Int. Monotone (min,+) Convolution  $\leftrightarrow$   
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2D Bdd. Conn. Monotone 3SUM<sup>+</sup>

Small Int. APSP

Small Int. (min,+) Convolution

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APSP  $\leftrightarrow$  (min,+) Matrix Mult.

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Clustered Int. 3SUM<sup>+</sup>

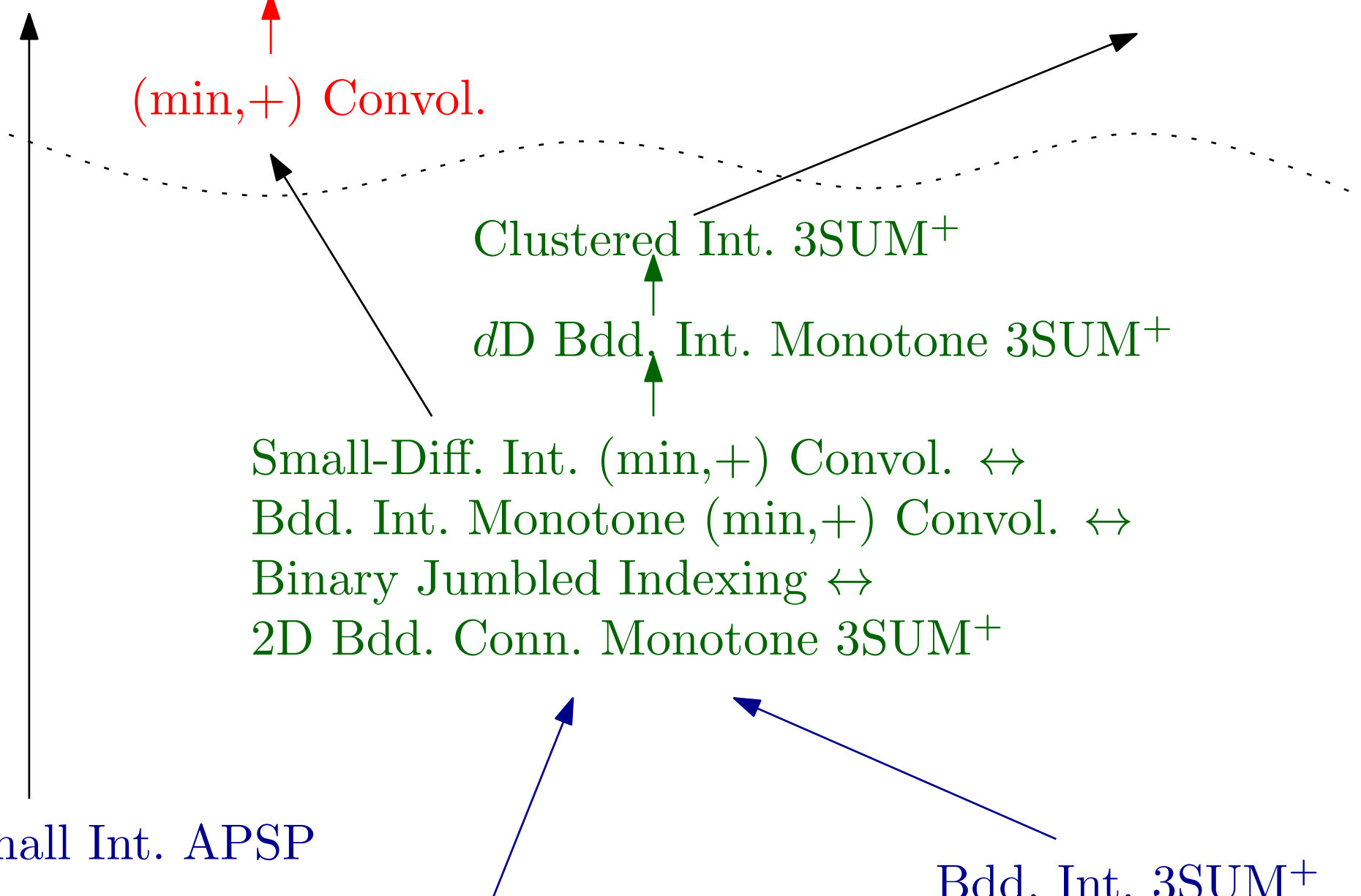
dD Bdd. Int. Monotone 3SUM<sup>+</sup>

Small-Diff. Int. (min,+) Convolution  $\leftrightarrow$   
Bdd. Int. Monotone (min,+) Convolution  $\leftrightarrow$   
Binary Jumbled Indexing  $\leftrightarrow$   
2D Bdd. Conn. Monotone 3SUM<sup>+</sup>

Small Int. APSP

Small Int. (min,+) Convolution

Bdd. Int. 3SUM<sup>+</sup>



# Yet More Results...

- **Data structure version** of these problems

For any query element  $s$ , decide if  $\exists a \in A, b \in B$   
with  $a + b = s$

e.g.,  $n^{2-\Omega(1/d)}$  preprocessing alg'm for  $d$ -ary jumbled indexing with  $O(n^{2/3+\varepsilon})$  query time

- **3SUM for preprocessed universes:**

After preprocessing  $A, B, S$  in  $\tilde{O}(n^2)$  time,  
can solve 3SUM for any subsets  $A', B', S'$  of  
 $A, B, S$  in  $\tilde{O}(n^{13/7})$  time

this holds for **arbitrary** integer input!

# Surprising New Techniques

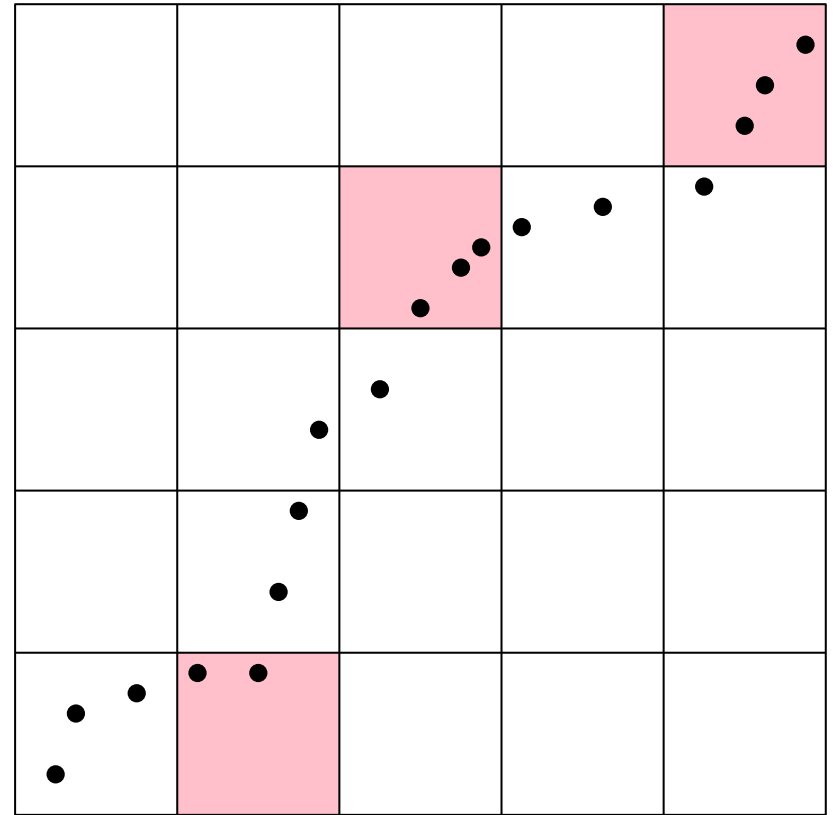
Besides FFT & fast matrix multiplication,  
additive combinatorics...



2D Bdd. Int. Monotone 3SUM

# Divide&Conquer Alg'm (1st Attempt)

- Given monotone sets  $A, B, S \subset [n]^2$
- Divide  $[n]^2$  into  $g^2$   $(n/g) \times (n/g)$  grid cells
- Let  $A^*, B^*, S^*$  be the nonempty cells of  $A, B, S$  ( $|A^*|, |B^*|, |S^*| = O(g)$ )
- For each triple  $(a^*, b^*, s^*)$  with  $a^* + b^* = s^* \pmod{\pm 1}$ , recurse on the points inside cells  $a^*, b^*, s^*$



# Divide&Conquer Alg'm (1st Attempt)

- Recurrence:

$$T(n) \leq O(g^2) T(n/g) + O(n)$$

$$\Rightarrow T(n) = \tilde{O}(n^2) \text{ bad!}$$

- **Bad case**: when can # of subproblems  $\approx \Omega(g^2)$ ?

e.g., when  $A^*, B^*, S^*$  are all **nearly collinear**...

...but then we can subtract a linear function & make all  $y$  values small ints, & solve by FFT

# Need a Theorem that Says...

If we are in the **bad case**,  
then the points must be **nearly collinear**??

# Balog–Szemerédi–Gowers (BSG) Theorem

Let  $A, B, S$  be sets of size  $N$  in an abelian group.

If  $|\{(a, b) \in A \times B : a + b \in S\}| = \Omega(\alpha N^2)$ ,

then  $\exists A' \subset A, B' \subset B$  s.t.

- $|A' + B'| = O((1/\alpha)^5 N)$
- $|A'|, |B'| = \Omega(\alpha N)$

[Freiman's theorem says that if  $|A' + A'|$  is small, then  $A'$  is close to “collinear” in some vague sense...]

[First proof by Balog&Szemerédi'94 required regularity lemma...]

Simpler proof by Gowers'01, further refined by Balog'07/ Sudakov& Szemerédi&Vu'05]

# Balog–Szemerédi–Gowers (BSG) Theorem: Stronger Version

Let  $A, B, S$  be sets of size  $N$  in an abelian group.

If  $G \subset \{(a, b) \in A \times B : a + b \in S\}$  &  $|G| = \Omega(\alpha N^2)$ ,  
then  $\exists A' \subset A, B' \subset B$  s.t.

- $|A' + B'| = O((1/\alpha)^5 N)$
- $|G \cap (A' \times B')| = \Omega(\alpha^2 N^2)$

# Corollary to BSG

Let  $A, B, S$  be sets of size  $N$  in an abelian group.

Then  $\exists A_1, \dots, A_k \subset A, B_1, \dots, B_k \subset B$  s.t.

- $R = \{(a, b) \in A \times B : a + b \in S\} \setminus \bigcup_i (A_i \times B_i)$   
has size  $O(\alpha N^2)$
- $|A_i + B_i| = O((1/\alpha)^5 N)$
- $k = O((1/\alpha)^2)$

# Corollary to BSG

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has size  $O(\alpha N^2)$
- $|A_i + B_i| = O((1/\alpha)^5 N)$
- $k = O(1/\alpha)$



# New Divide&Conquer Alg'm

0. Apply BSG Corollary to the sets  $A^*, B^*, S^*$  of grid cells  
 $\Rightarrow \tilde{O}(g^2)$  rand. time [see paper]
1. For each  $(a^*, b^*) \in R$ ,  
recurse for the points inside cells  $a^*, b^*, a^* + b^*$   
 $\Rightarrow O(\alpha g^2) T(n/g)$  time
2. For  $i = 1, \dots, k$ ,  
compute  $\{\text{all points in } A_i^*\} + \{\text{all points in } B_i^*\}$   
& check if it contains any point in  $S$   
 $\Rightarrow$  sumsets have  $O(1/\alpha) \cdot O((1/\alpha)^5 g) \cdot (n/g)^2$  total  
size & can be computed by FFT in rand. time near  
linear in output size [see paper, or Cole&Hariharan'02]

# New Divide&Conquer Alg'm

- Recurrence:

$$T(n) \leq O(\alpha g^2) T(n/g) + \tilde{O}(n + g^2) + \tilde{O}(1/\alpha) \cdot O((1/\alpha)^5 g) \cdot (n/g)^2$$

- Set  $g = n^{0.9293}$ ,  $1/\alpha = n^{0.1313}$

$$\Rightarrow T(n) = \boxed{O(n^{1.859})}$$

# Final Remarks

- Other results also follow from BSG Corollary
- Open: further improve the exponents,  
e.g., by improving the  $\alpha$ -dependencies in BSG?
- Could additive combinatorics help for  $k$ SUM?  
Bdd. Monotone (min,+) Matrix Multiplication?  
Subset Sum?? General Int. 3SUM???  
General Int. APSP???