

\*Two NP-complete problems useful for reducing to arithmetic (summing) problems:

(2-)Partition: given integers  $A = \{a_1, a_2, \dots, a_n\}$ ,  
partition  $A$  into two sets  $A = A_1 \dot{\cup} A_2$   
of equal sum:  $\frac{\sum A}{2} = \sum A_1 = \sum A_2 = t$   
[Karp 1972]

Generalization: Subset Sum

$$t = \frac{\sum A}{2}$$

given integers  $A = \{a_1, a_2, \dots, a_n\}$ ,  
and a target integer  $t$ ,  
find a subset  $S \subseteq A$  of sum  $\sum S = t$

3-Partition: given integers  $A = \{a_1, a_2, \dots, a_n\}$ ,  
partition  $A$  into  $n/3$  sets  $A_i$   
of equal sum,  $\sum A / (n/3) = \sum A_i = t$

- can assume each  $a_i \in (t/4, t/2)$

$\Rightarrow$  each set  $A_i$  contains exactly 3 items

[Garey & Johnson - SICOMP 1975]

$\Rightarrow$  can make each  $a_i$  close to  $t/3$ :

add huge number ( $n^{100} \cdot \max A$ ) to each  $a_i$

Garey & Johnson [book] reduce

3SAT  $\rightarrow$  3DM  $\rightarrow$  4-partition  $\rightarrow$  3-partition

$\rightarrow$  numerical 3DM

## Variation: Numerical 3-dimensional matching

given integers  $A = \{a_1, a_2, \dots, a_n\}$ ,

multisets

$B = \{b_1, b_2, \dots, b_n\}$

$C = \{c_1, c_2, \dots, c_n\}$

partition into  $n$  triples  $S_i \in A \times B \times C$   
of equal sum  $t = \sum(A \cup B \cup C) / n$

[Garey & Johnson - SICOMP 1975]

## Reduction to 3-partition: (so it's simpler)

- add  $\varepsilon \ll 1$  to each  $a_i$  e.g.  $\varepsilon = 1/4$
  - add  $\delta \ll \varepsilon$  to each  $b_i$   $\delta = 1/16$
  - subtract  $\varepsilon + \delta$  from each  $c_i$
  - scale back to integers  $\times 16$
  - in sum of 3,  $\delta$  never becomes  $\varepsilon$  &  $\varepsilon$  never becomes 1
- $\Rightarrow \varepsilon$  &  $\delta$ s must cancel algebraically

## Generalization: <sup>→ cf. (2D) matching</sup> 3-dimensional matching (3DM)

given a tripartite hypergraph with vertices  $A \cup B \cup C$ ,  $|A| = |B| = |C| = n$ , & hyperedges  $E \subseteq A \times B \times C$ , find  $n$  disjoint hyperedges  $S \subseteq E$  (which must partition the vertices)

[Karp 1972]

## Generalization: Exact Cover by 3-sets (X3C)

given 3-uniform hypergraph  $(V, E)$ ,  
 $\forall e \in E: |e| = 3 \leftarrow$  find  $|V|/3$  disjoint edges ( $\Rightarrow$  partition  $V$ )

\* Two types of NP-hardness for number problems:

involving integers, not just combinatorics ↙

Weakly NP-hard = NP-hard number of numbers ↗

- allow numbers to have value exponential in  $n$
- encoding length =  $\log(2^{n^c}) = n^c$  still polynomial

Strongly NP-hard = NP-hard even when restricted to numbers with value polynomial in  $n$  (i.e. even if numbers encoded in unary)

\* Corresponding algorithmic notions:

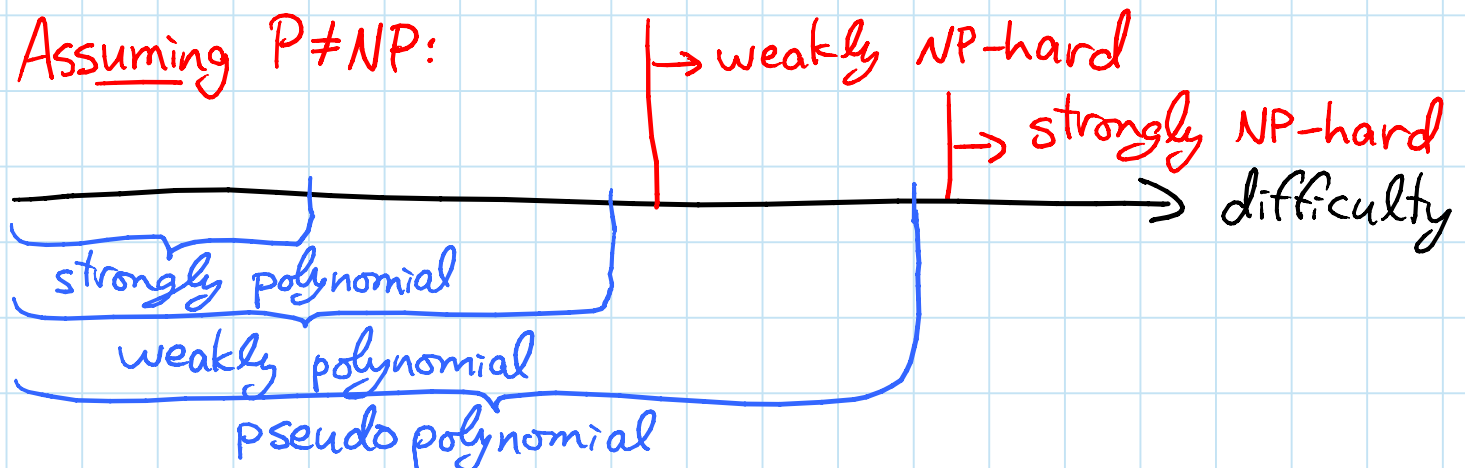
Pseudopolynomial = polynomial in  $n$  & largest number (unary encoding) ↘

Weakly polynomial = polynomial = polynomial in  $n$  &  $\log(\text{largest number})$

Strongly polynomial = polynomial in  $n$  ↘ # numbers

Weak NP-hardness precludes polynomial algorithm (assuming  $P \neq NP$ ) but leaves possible pseudopolynomial

Assuming  $P \neq NP$ :



## Multiprocessor scheduling: [Garey & Johnson - SICOMP 1975]

- given  $n$  jobs with processing times  $a_1, a_2, \dots, a_n$
- given  $p$  processors (each sequential & identical)
- assign jobs to processors to minimize maximum completion time (makespan)
- decision version: can all processors finish by  $\leq t$ ?
- NP certificate: job  $\rightarrow$  processor mapping  
( $a_i$  as is)

Reduction from (2-)Partition:  $p = 2 \Rightarrow$  weakly NP-hard

Reduction from 3-Partition:  $p = n/3 \Rightarrow$  strongly NP-hard

(This was Garey & Johnson's motivation for introducing 3-partition in 1975.)

Claim: jobs finishable in makespan  $t$   $\rightarrow$  target sum

$\Leftrightarrow$  (3-Partition instance has a solution

## Rectangle packing:

- given  $n$  rectangles & target rectangle  $\rightarrow A \rightarrow B$
- can you pack former into latter?  
 $\hookrightarrow$  rotate & translate to fit without overlap
- **OPEN**:  $\in NP$ ?
- special case: exact packing - no gaps  
 $\hookrightarrow$  hardness result is stronger theorem
- rotation  $\in \{0, 90^\circ, 180^\circ, 270^\circ\}$ , translation integral  
(proof by induction: consider corner, repeat)
- NP certificate: translations & rotations

Reduction from Partition:  $A = \overbrace{\boxed{a_1}} \overbrace{\boxed{a_2}} \dots \overbrace{\boxed{a_n}} \varepsilon$   
 $B = \boxed{\quad\quad\quad} 2\varepsilon \ll 1$   
 $t = \sum a_i / 2$   $\rightarrow$  avoid rotation

Reduction from 3-Partition:  $B = \boxed{\quad\quad\quad} \left[ \frac{n}{3} \varepsilon \ll 1 \right]$   
 $t = \sum a_i / (n/3)$

Scaling trick to make all dimensions integral:

$$A = \left\{ \overbrace{\boxed{n a_i}} 1 \right\}, B = \boxed{\quad\quad\quad} \frac{n}{3}$$

$n t$

Here, just adding  $n/3$  to each  $a_i$  suffices:

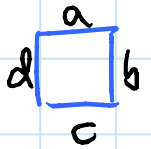
$$A = \left\{ \overbrace{\boxed{\frac{n}{3} + a_i}} 1 \right\}, B = \boxed{\quad\quad\quad} \frac{n}{3}$$

$t + n$

[Demaine & Demaine - G&C 2007]

# Edge-matching puzzles: [Demaine & Demaine - G&C 2007]

- given unit square tiles, each side labeled with a "color"
- given target rectangle
- goal: put tiles in target such that tiles sharing an edge have matching colors



No numbers  $\Rightarrow$  can't use Partition!

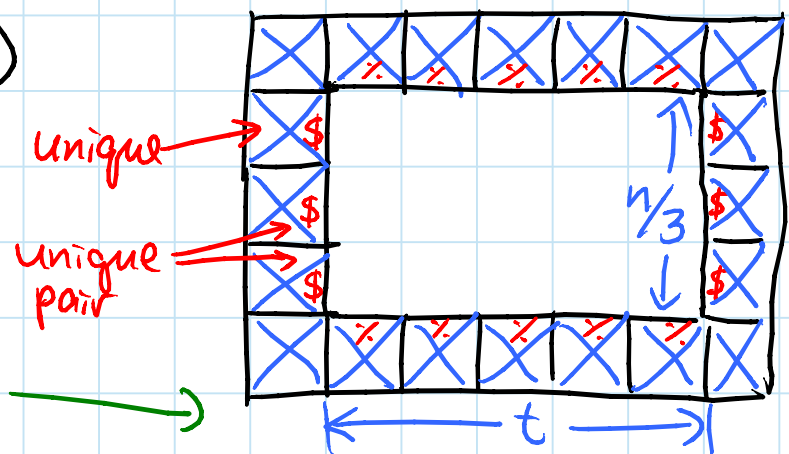
## Reduction from 3-Partition: (like rect. packing)

- $a_i$  gadget:   $\leftarrow$  effectively unary encoding!  
 $\leftarrow$  prevents rotation

- if  $i$  colors go together, forced to make this
- but some could go on boundary...

- frame gadget: ("infrastructure")

add more rows to make target square  $\rightarrow$



- unique colors forced on boundary  $\Rightarrow$  frame construction forced
- target shape:  $(n/3 + 2) \times (t + 2)$ 
  - $\Rightarrow a_i$  construction forced (no boundary left)
  - $\Rightarrow$  effectively rectangle packing

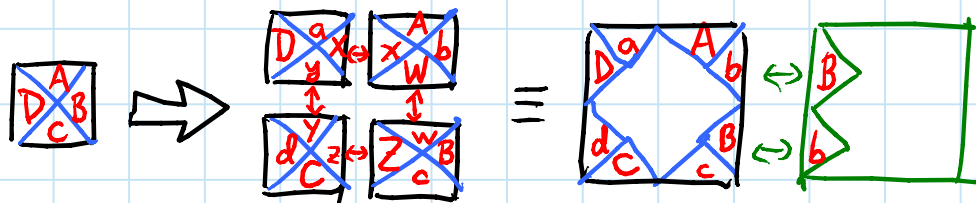
## Signed edge-matching puzzles: (lizards etc.)

- colors come in matching pairs:

a & A, b & B, etc.

- color does not match itself ~ only its mate

## Reduction from unsigned edge-matching puzzles:



- interior colors (x, y, z, w) are unique pairs

⇒ must assemble 2x2

(assuming frame to prevent boundary use)

⇒ acts like unsigned tile

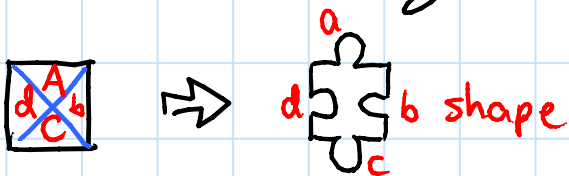


## Jigsaw puzzles:

[Demaine & Demaine - G&C 2007]

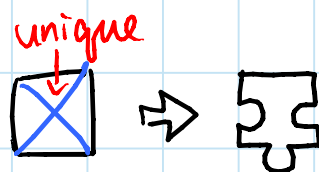
- no guiding picture
- ambiguous mates (fitting  $\nrightarrow$  correct)

## Reduction from signed edge-matching puzzles:



lower case  $\rightarrow$  pocket  
upper case  $\rightarrow$  tab

- for rectangular boundary:  
 $\hookrightarrow$  even square



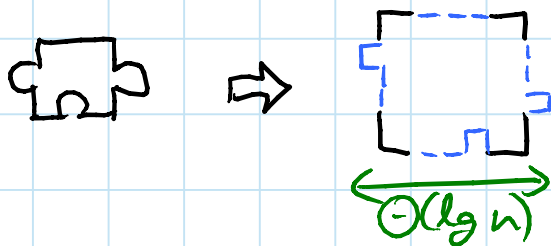
## Polyomino packing:

[Demaine & Demaine - G&C 2007]

- given polyominoes = edge-to-edge joinings of unit squares (like Tetris)
- given target rectangle
- goal: exact pack former into latter

- rectangle packing is a special case  $\Rightarrow$  done
- but piece areas are  $> n$
- what if areas are polylog?
- EXERCISE: logarithmic area  $O(\sqrt{\lg n}) \times O(\sqrt{\lg n})$

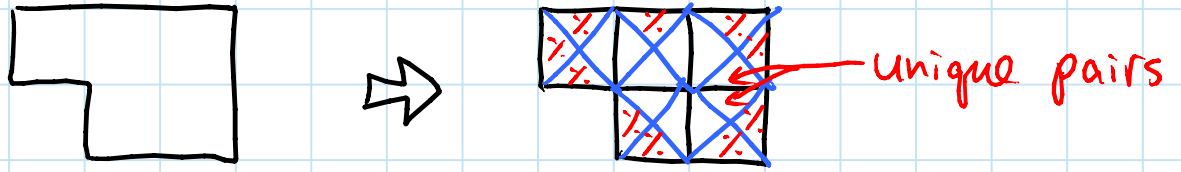
## Reduction from jigsaw puzzles:



} binary encoding of color  
- can get equal areas



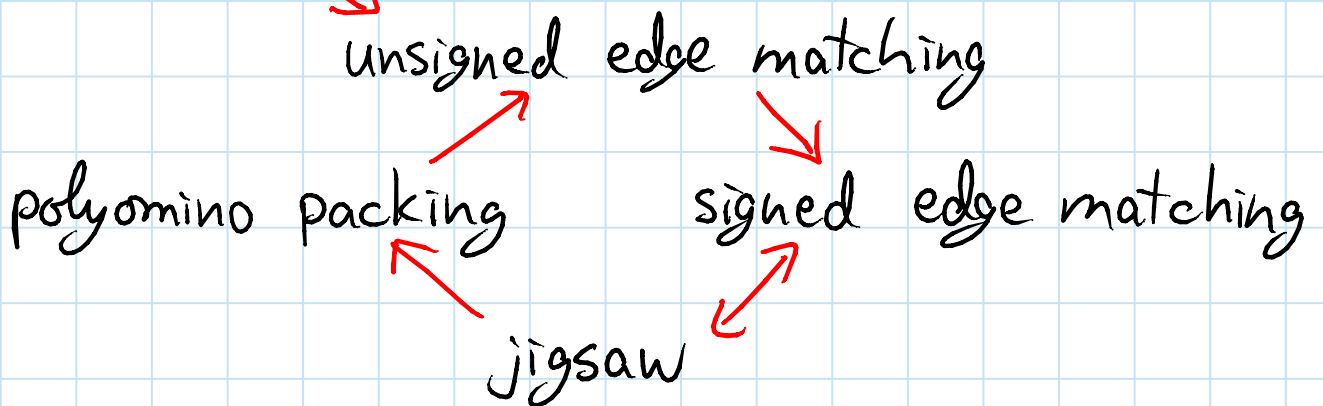
Closing the loop: [Demaine & Demaine - G&C 2007]  
reduction from polyomino packing  
to unsigned edge-matching puzzles



- use frame, but with  $\# = \%$

So: all 4 puzzle types are NP-complete  
& constant-factor equivalent: can convert  
one to the other with  $O(1)$  factor blowup

3-partition



(exact)

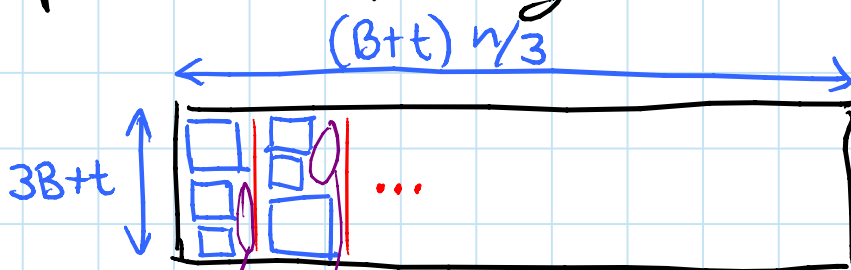
Packing squares into a square: strongly NP-complete

[Leung, Tam, Wong, Young, Chin - JPD 1990]

- motivation: scheduling square jobs on grid supercomputer

Rectangle target:

- squares of dimension  $a_i + B$  ← huge  $\Rightarrow \approx B$
- pack into rectangle of height  $\approx 3B$ :



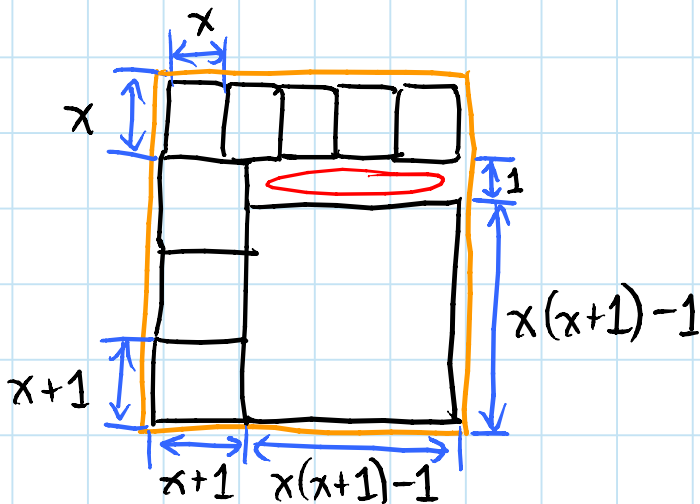
- total slop  $\leq (3B+t) \cdot (t/3)$   
 $< B^2 < \text{one square}$

if  $B > tn$   
 $\Rightarrow$  "doesn't help"

Exact packing: add  $1 \times 1$  squares to fill extra area

Square target:

- infrastructure to build rectangular space



- scale by  $3B+t$
- set  $x$  large enough to get enough width
- pad excess with  $B \times B$  squares