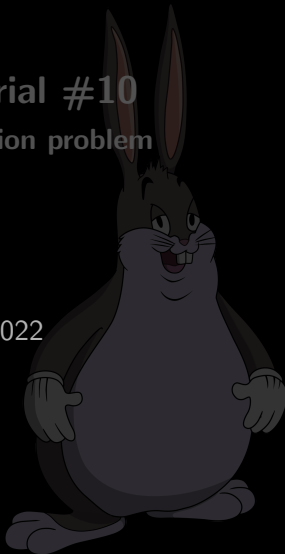


# CSC363 Tutorial #10

## Subset Sum, Partition problem

March 30, 2022



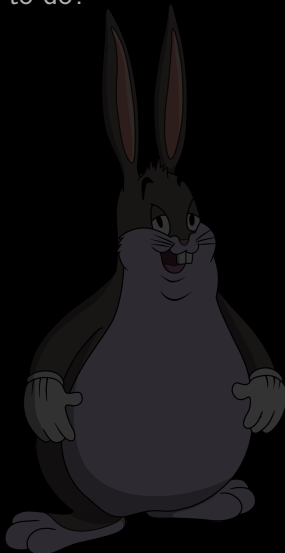
# Learning objectives this tutorial

- ▶ Review the Subset Sum Problem.
- ▶ Introduce the Partition problem.
- ▶ Prove that the Subset Sum Problem and the Partition Problem  $p$ -reduce to each other.



# Subset Sum Review

**Task:** Recall the (integer, multiset) Subset Sum (Decision) Problem.  
What are you given? What are you asked to do?



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<sup>1</sup>A multiset is a set that allows duplicates.

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**Task:** Solve the subset sum problem for the following inputs:

- ▶  $S = \{18, 37, 20, 13, 33\}$ ,  $t = 75$ .
- ▶  $S = \{20, 21, 22, 36, 67\}$ ,  $t = 90$ .



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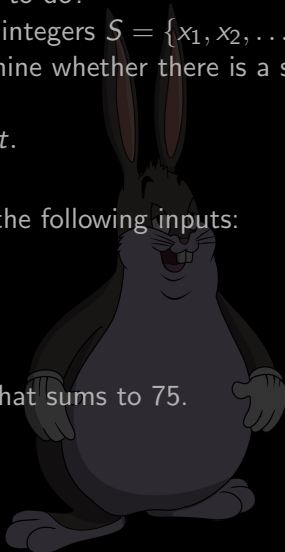
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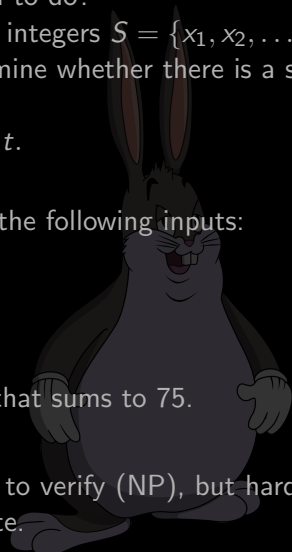
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**Ans:**

- ▶ There is a subset  $S' = \{18, 37, 20\}$  that sums to 75.
- ▶ There is no subset that sums to 90.

Remind yourself that Subset Sum is easy to verify (NP), but hard to solve (NP-hard), so Subset Sum is NP-complete.

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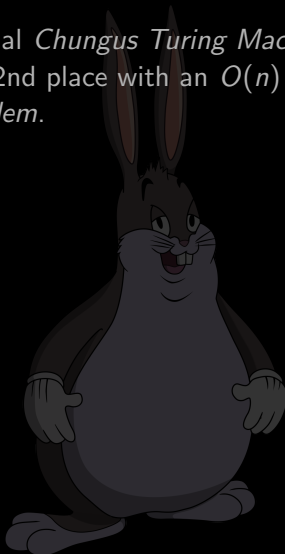




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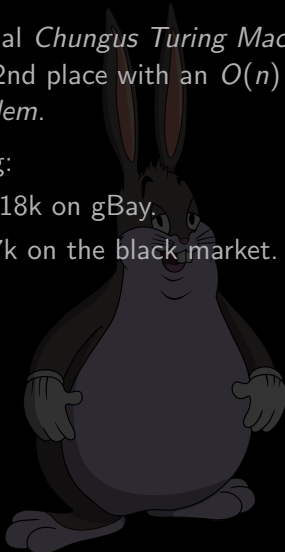
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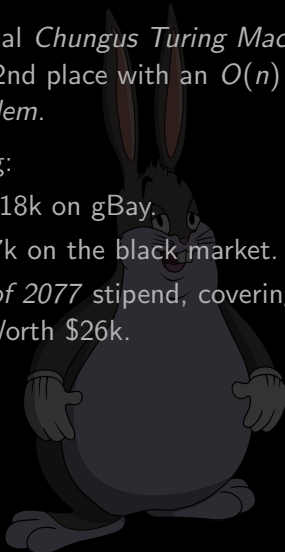
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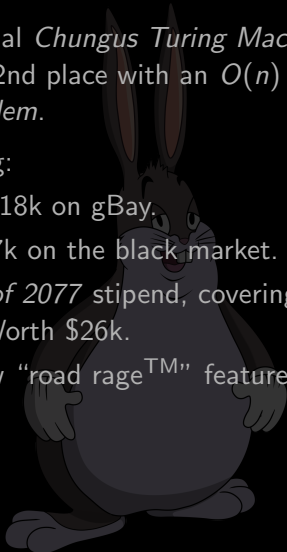
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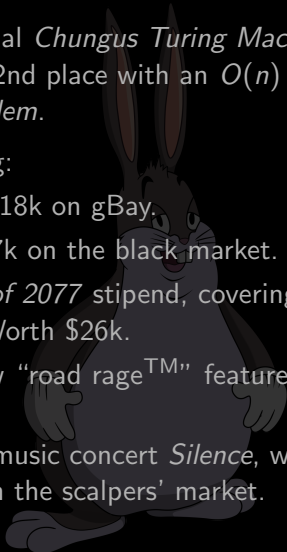
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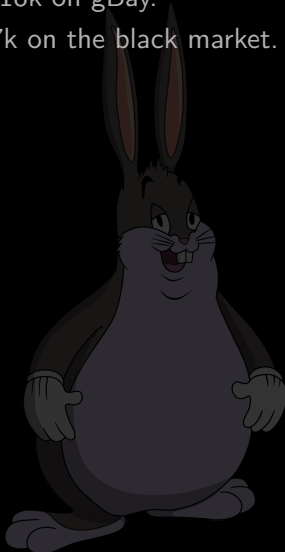
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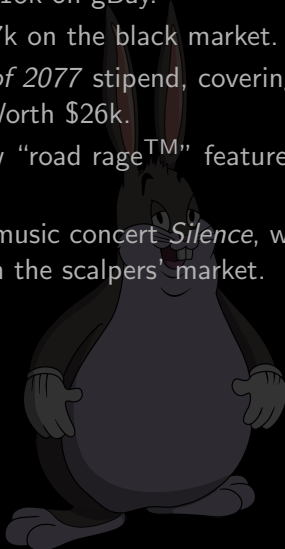
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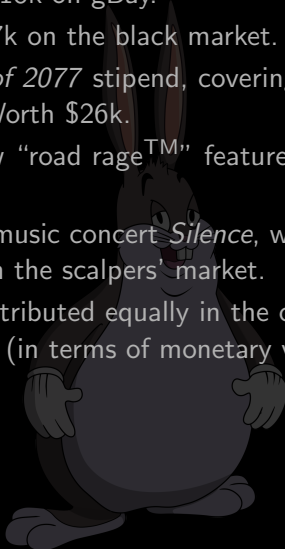


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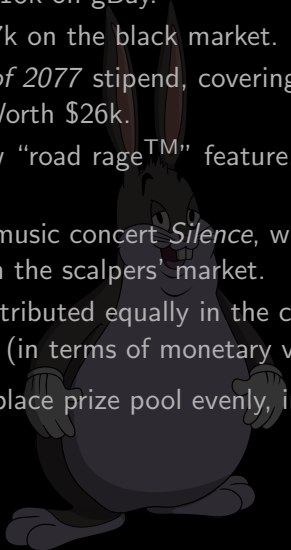
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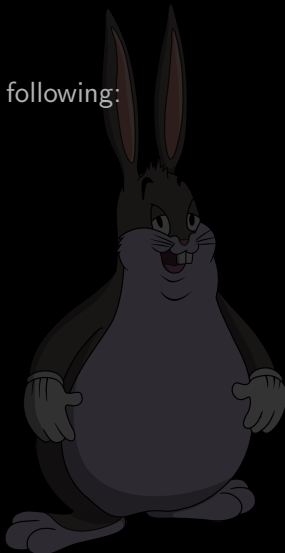
**Question:** Is it possible to split the 2nd place prize pool evenly, in terms of monetary value?

**Ans:** Yes. You take the Chungus plushie (\$37k) and the stipend (\$26k), and your friend takes the rest. Your prize is  $37k + 26k = 53k$ , while your friend's prize is  $18k + 15k + 15k + 15k = 53k$ .



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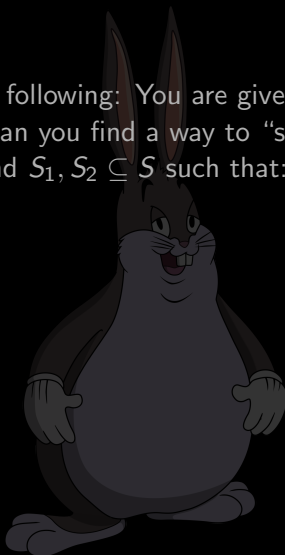
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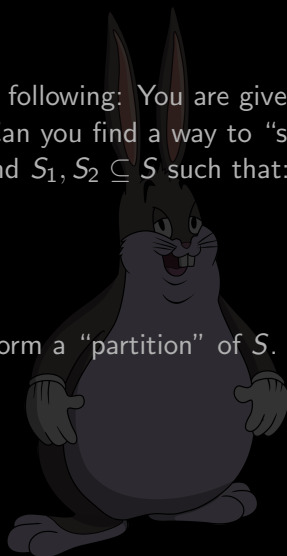


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Note that 1. and 2. say that  $S_1$  and  $S_2$  form a “partition” of  $S$ .



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**Task:** Determine if the following sets are partitionable.

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2.  $S = \{18, 37, 20, 13, 33\}$ .
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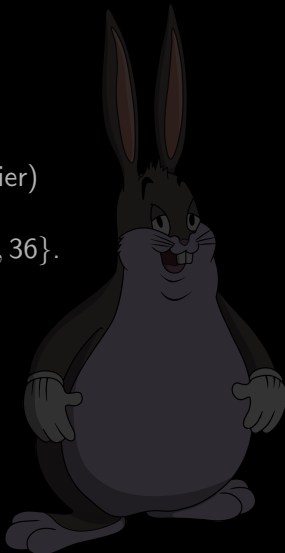
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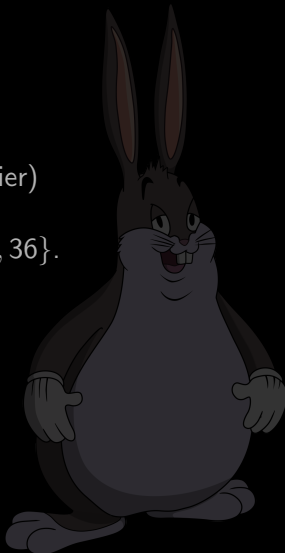
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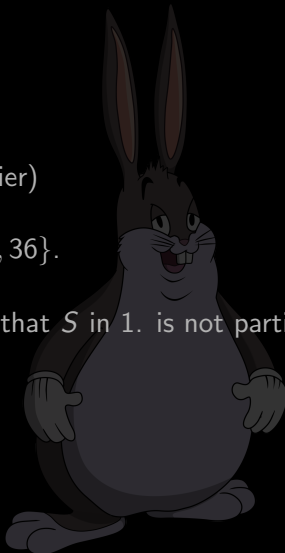
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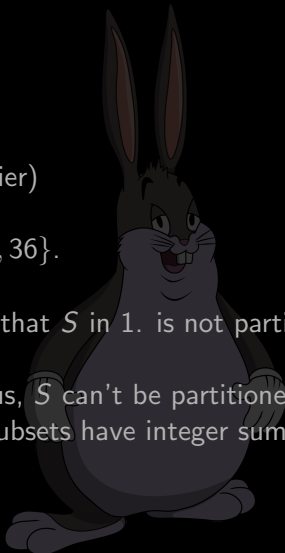
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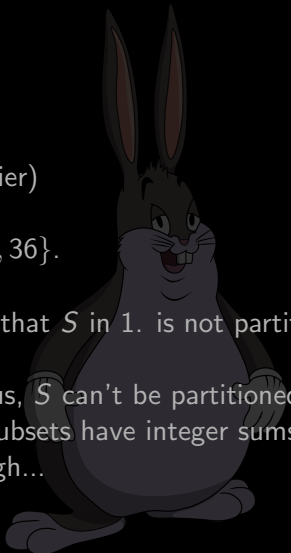
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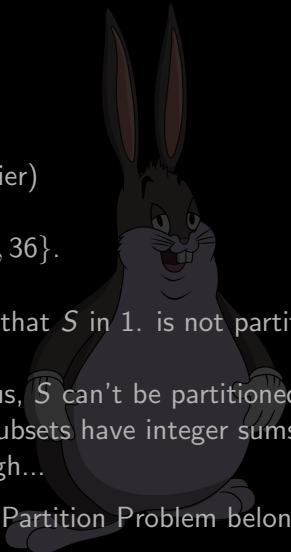
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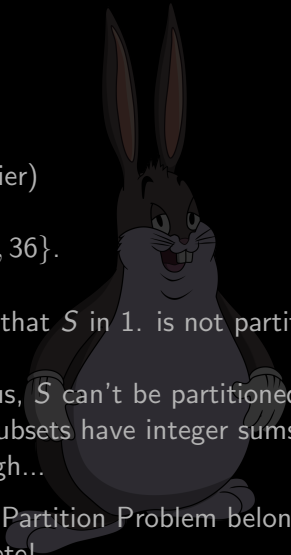
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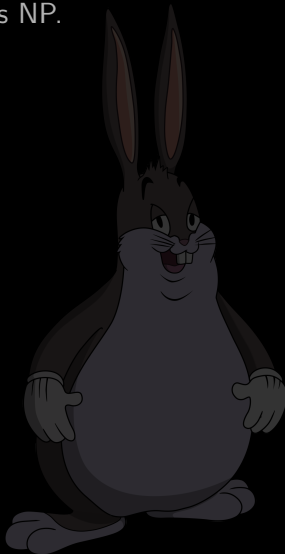
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**Ans:** The partition problem is NP-complete!



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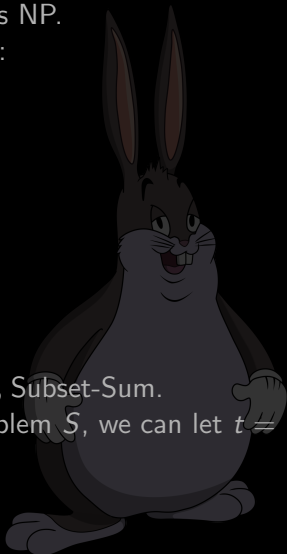
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**Ans:** For an instance of the partition problem  $S$ , we can let  $t = \frac{1}{2} \sum S$ .  $S$  is partitionable iff  $(S, t)$  is in subset sum.





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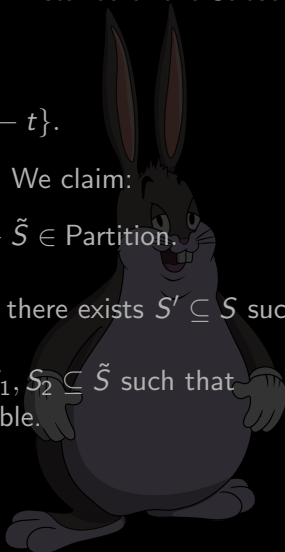
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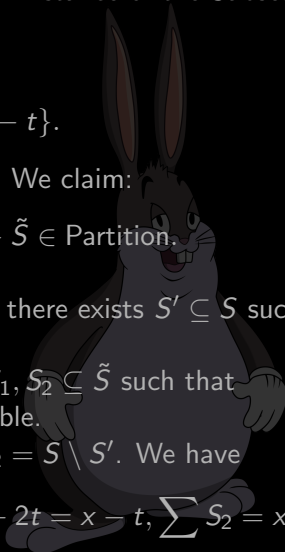
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**Ans:** Defining  $S_1 = S' \cup \{x - 2t\}$  and  $S_2 = S \setminus S'$ . We have

$$\sum S_1 = (\sum S') + x - 2t = t + x - 2t = x - t, \sum S_2 = x - t.$$



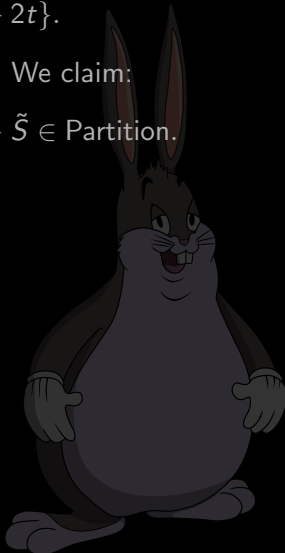
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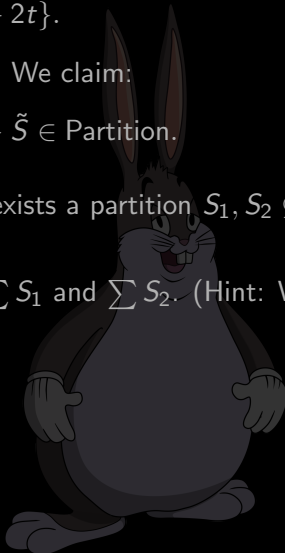
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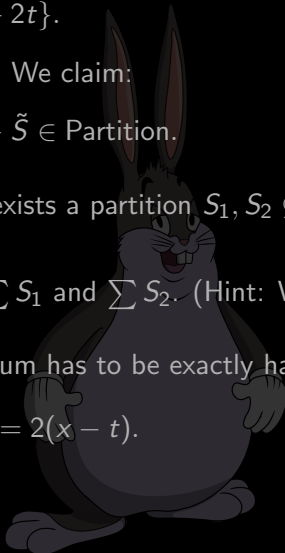
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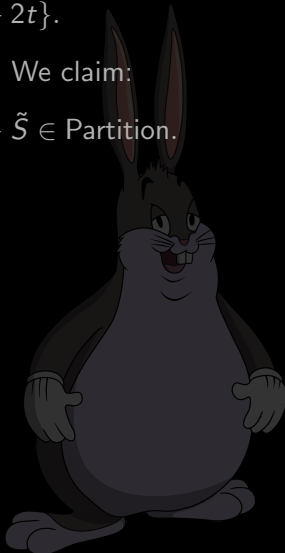
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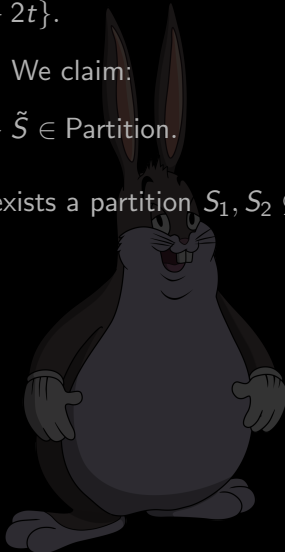
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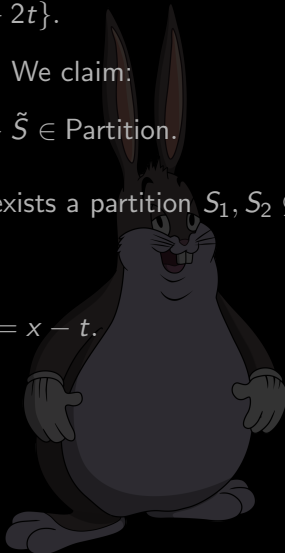
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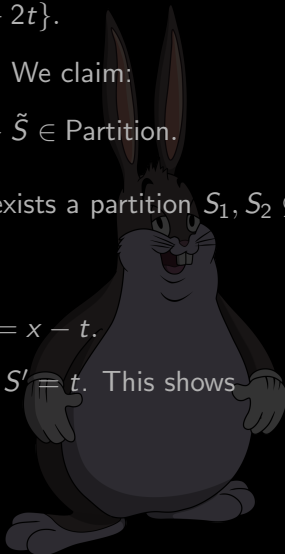
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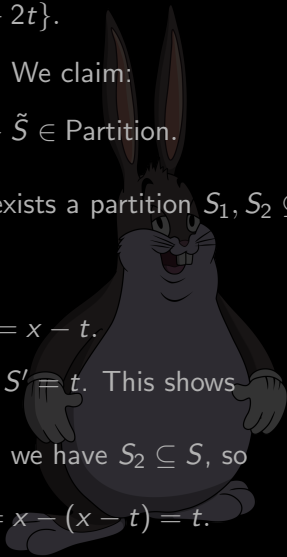
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$$\sum S' = \sum S - \sum S_2 = x - (x - t) = t.$$





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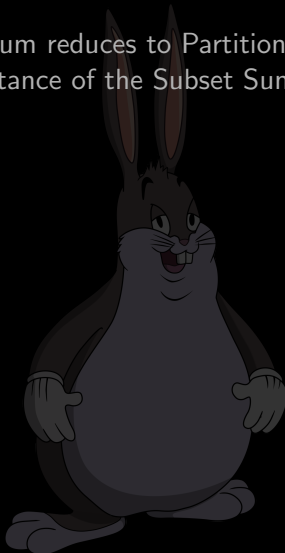
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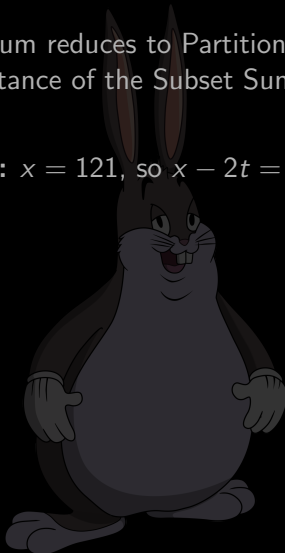
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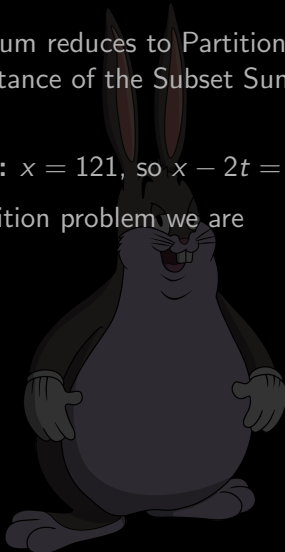


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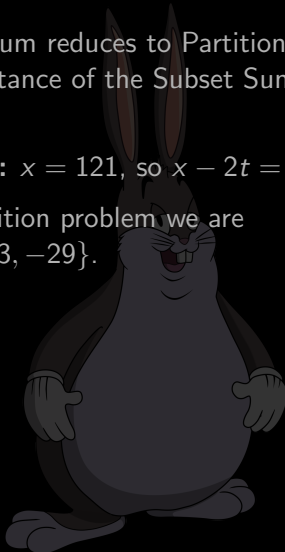


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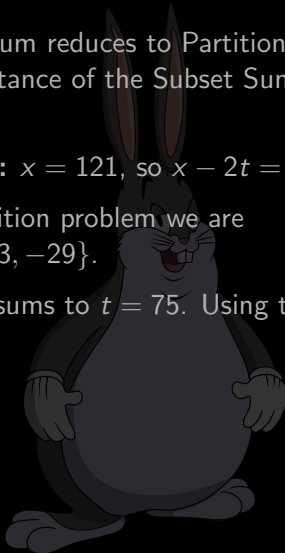
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