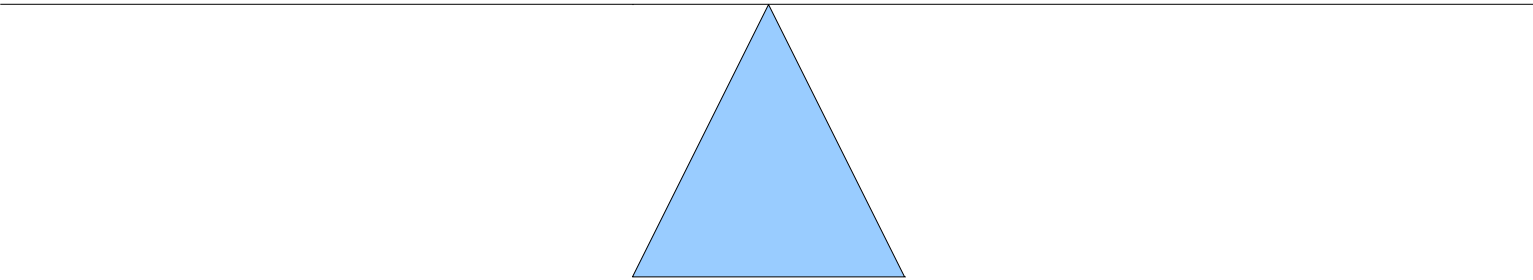
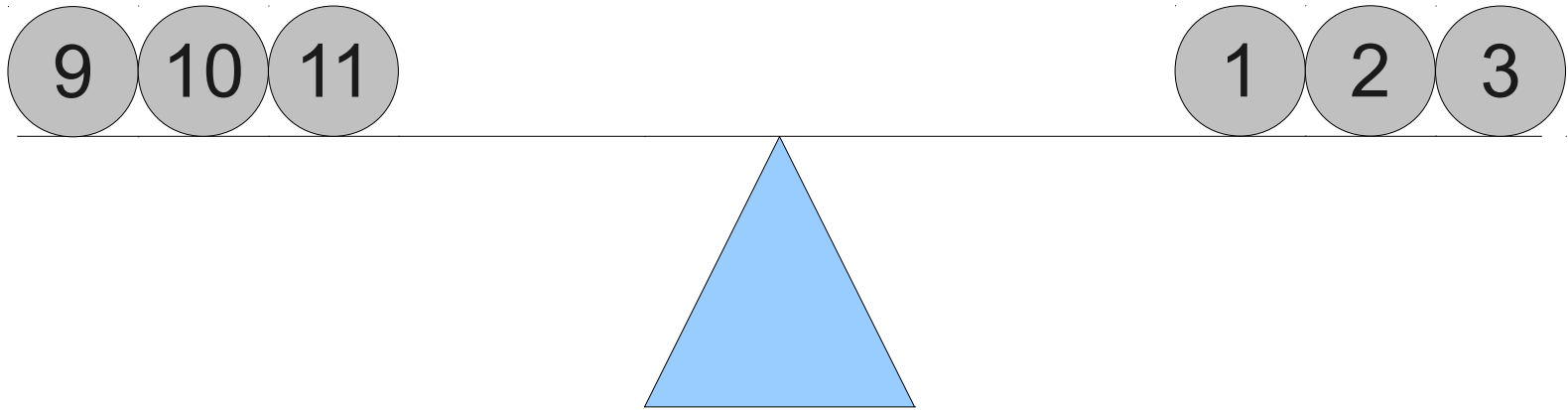


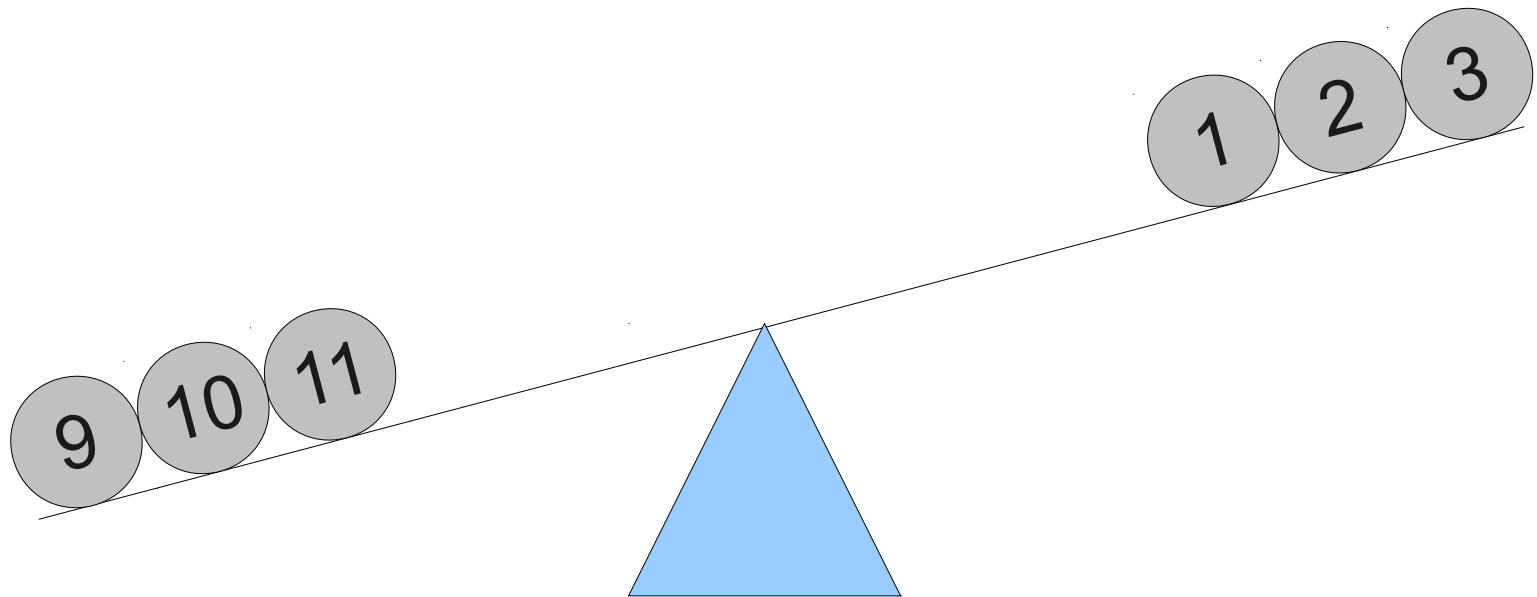
# Fun With Number Systems

Or: How Knowing Number Systems Can Help You Interview Better

# Finding the Odd Ball

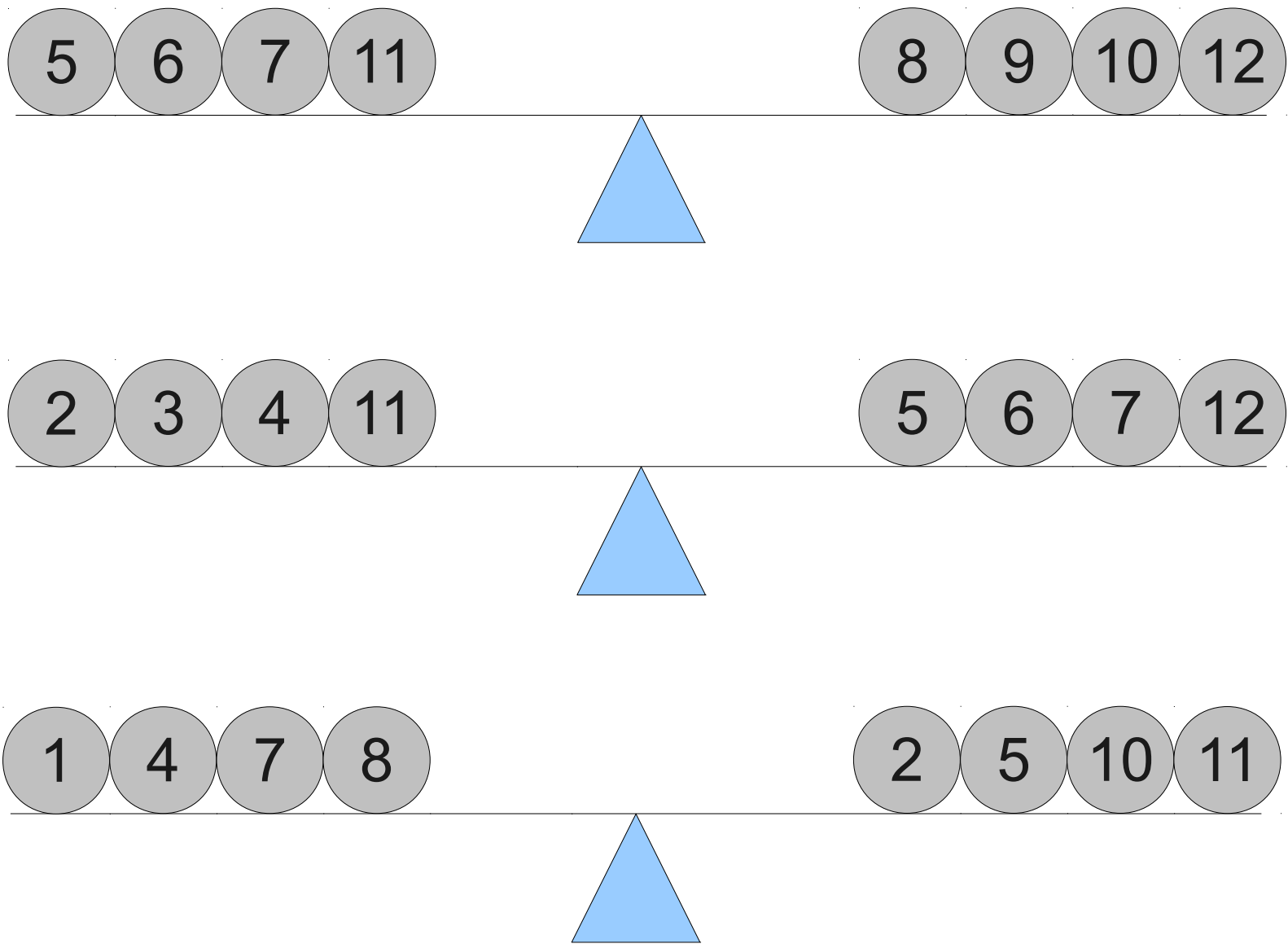






Goal: Find the odd ball and whether it's heavier or lighter in three weighings.

# The Solution



# Balanced Ternary

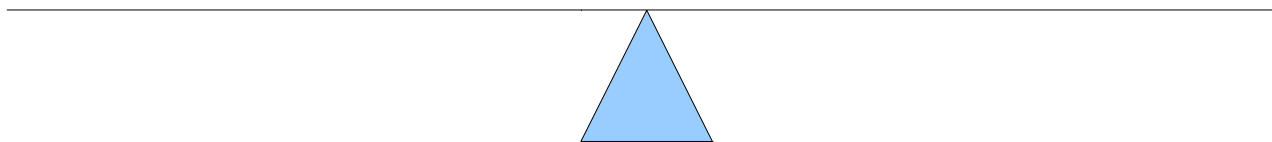
- Number system for encoding three-way comparisons.
- Each digit corresponds to a power of three.
- Digits are -1, 0, +1.
  - For notational simplicity, will use -, 0, +.
- Example: +0-0
  - $1 \times 3^3 + 0 \times 3^2 - 1 \times 3^1 + 0 \times 3^0 = 24$
- Example: --++
  - $-1 \times 3^3 - 1 \times 3^2 + 1 \times 3^1 + 1 \times 3^0 = -32$

# -12 to +12 in Balanced Ternary

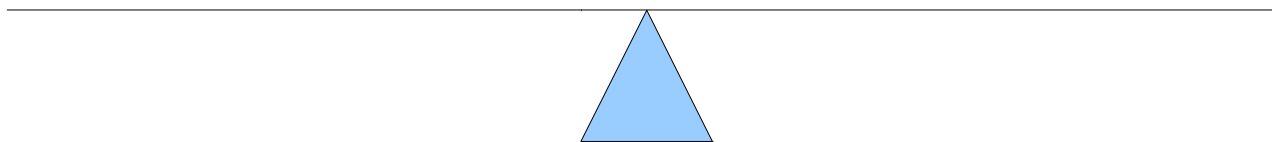
	0	000		
-1	00-		1	00+
-2	0-+		2	0+-
-3	0-0		3	0+0
-4	0--		4	0++
-5	-++		5	+--
-6	-+0		6	+ -0
-7	-+-		7	+ -+
-8	-0+		8	+0-
-9	-00		9	+00
-10	-0-		10	+0+
-11	--+		11	++-
-12	--0		12	++0

1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ - 0
7	+ - +
8	+ 0 -
9	+ 0 0
10	+ 0 +
11	+ + -
12	+ + 0

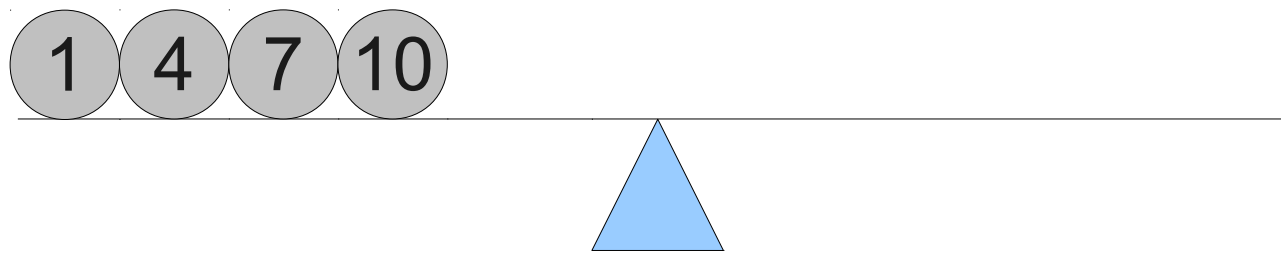
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ - 0
7	+ - +
8	+ 0 -
9	+ 0 0
10	+ 0 +
11	++-
12	++0



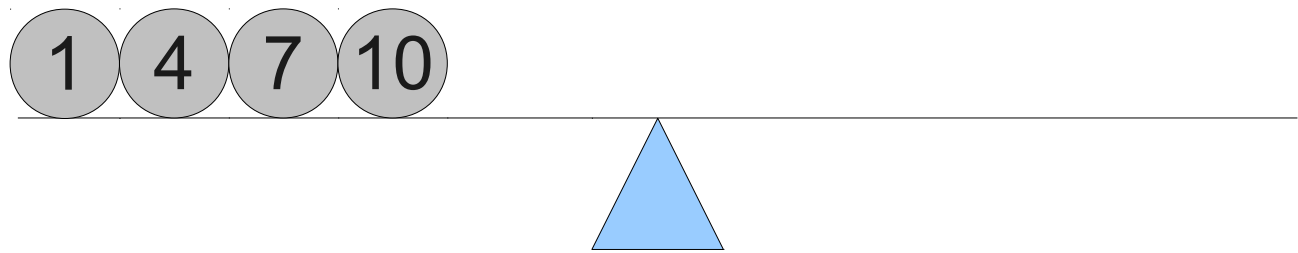
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ - 0
7	+ - +
8	+ 0 -
9	+ 0 0
10	+ 0 +
11	++-
12	++0



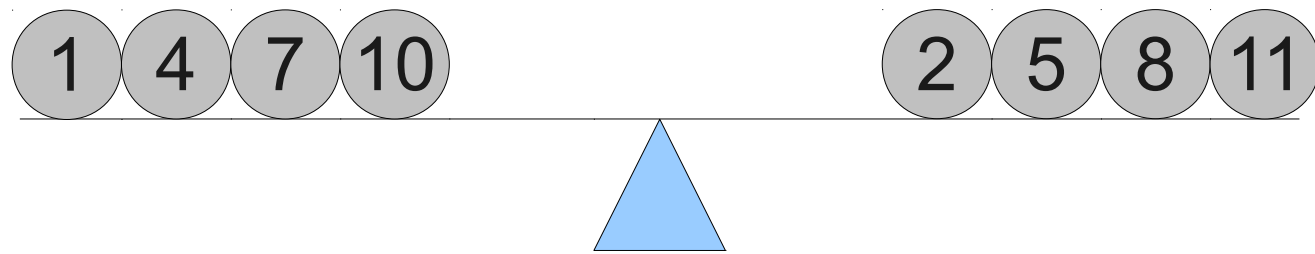
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +--  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



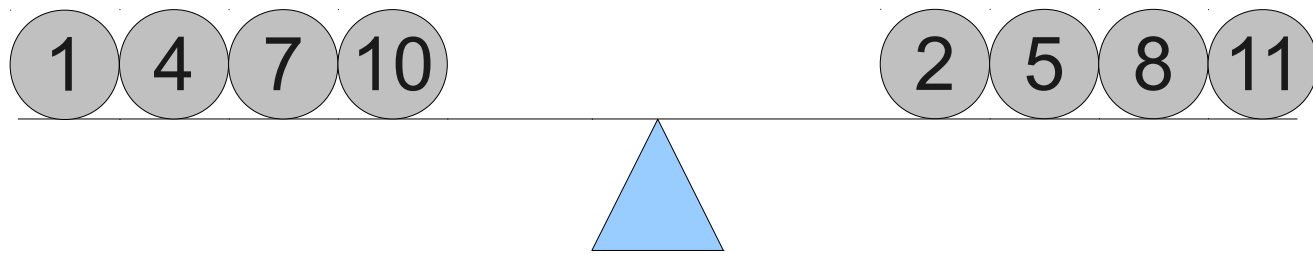
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +-  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



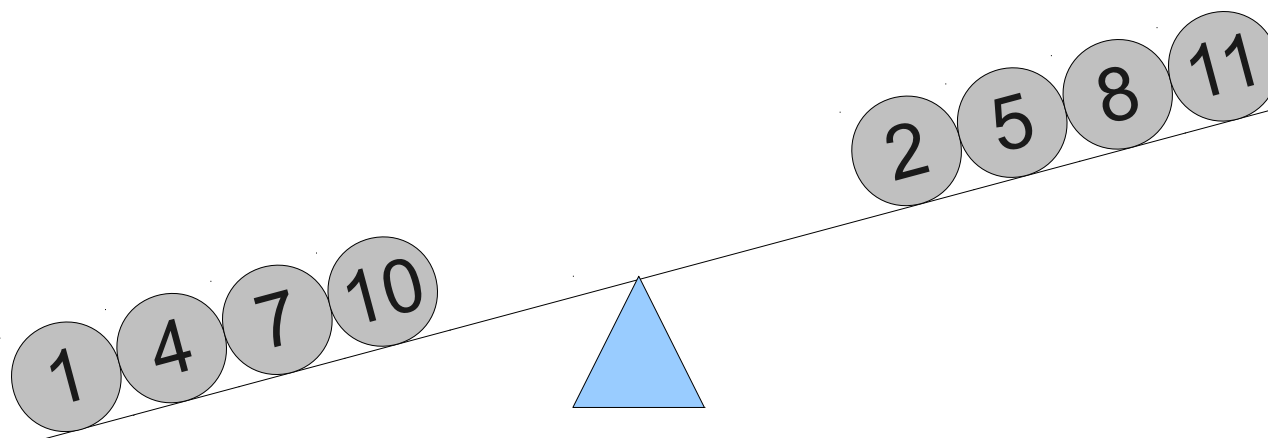
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +-  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



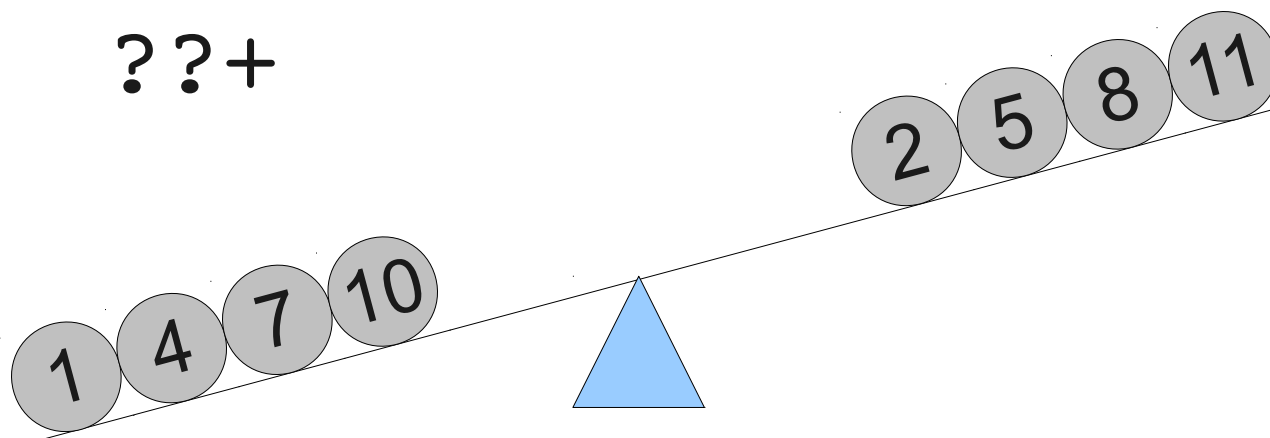
- 1 00+
- 2 0+-
- 3 0+0
- 4 0++
- 5 +--
- 6 +-0
- 7 +-+
- 8 +0-
- 9 +00
- 10 +0+
- 11 ++-
- 12 ++0



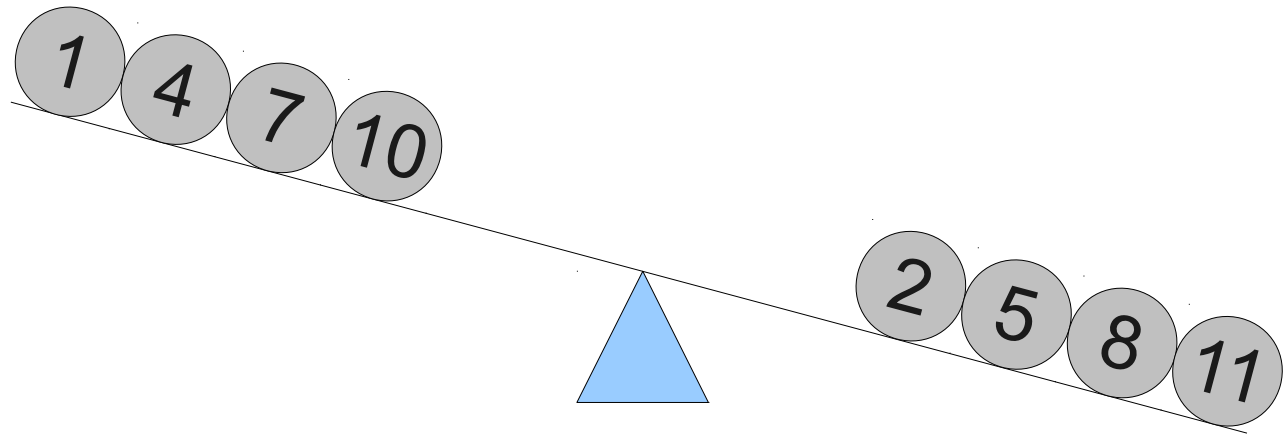
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ -0
7	+ -+
8	+0-
9	+00
10	+0+
11	++-
12	++0



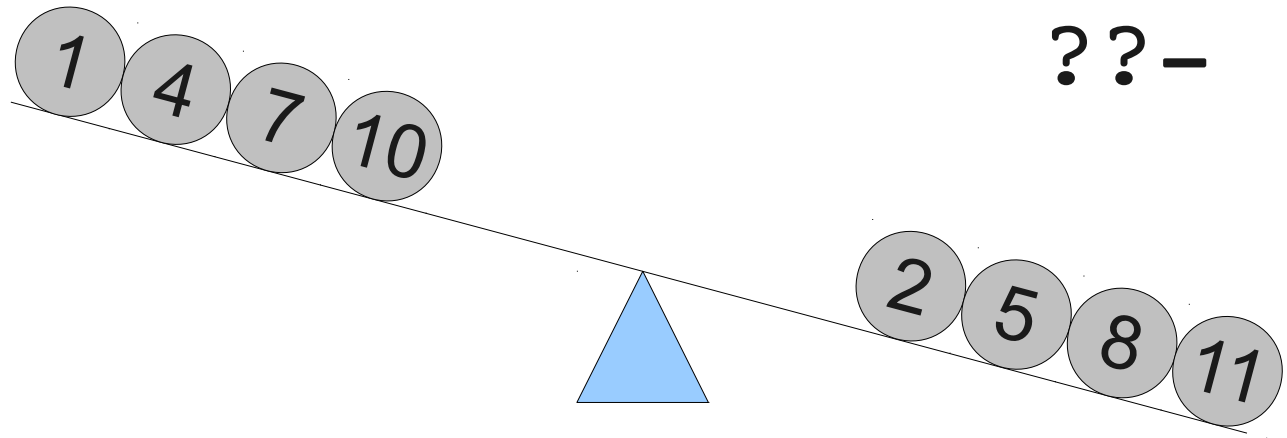
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ -0
7	+ -+
8	+0-
9	+00
10	+0+
11	++-
12	++0



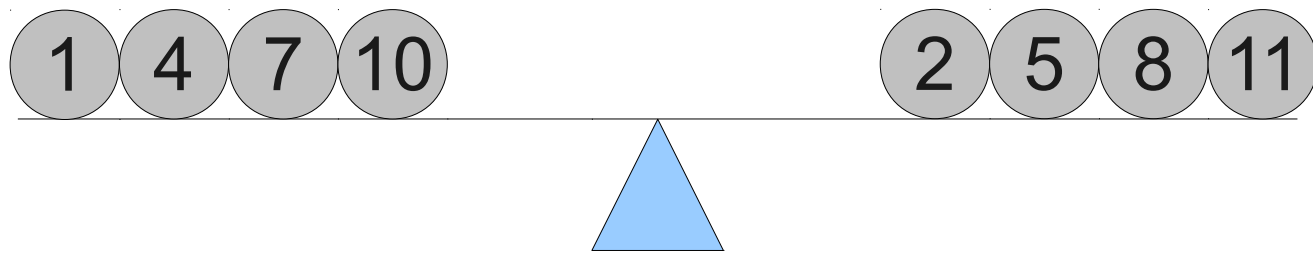
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ -0
7	+ -+
8	+0-
9	+00
10	+0+
11	++-
12	++0



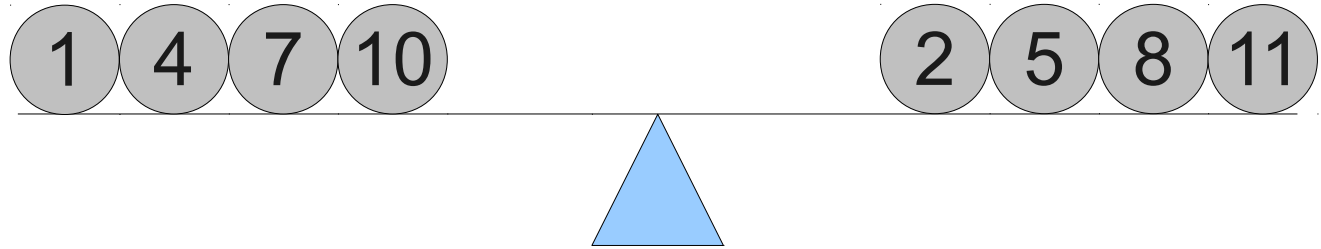
- 1 00+
- 2 0+-
- 3 0+0
- 4 0++
- 5 +--
- 6 +-0
- 7 +-+
- 8 +0-
- 9 +00
- 10 +0+
- 11 ++-
- 12 ++0



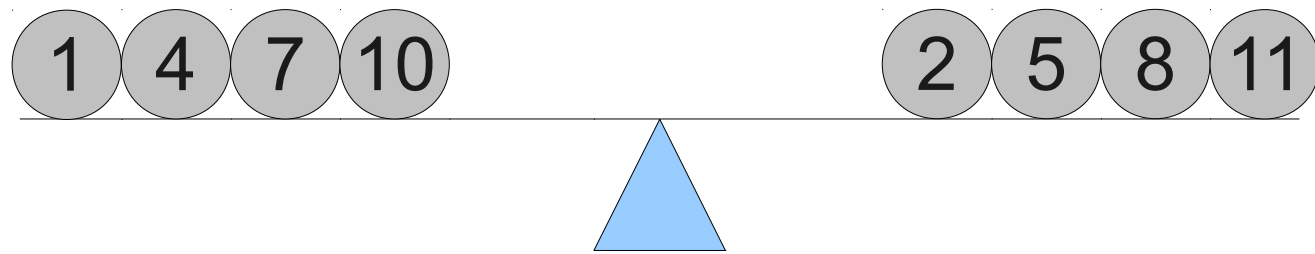
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +--  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



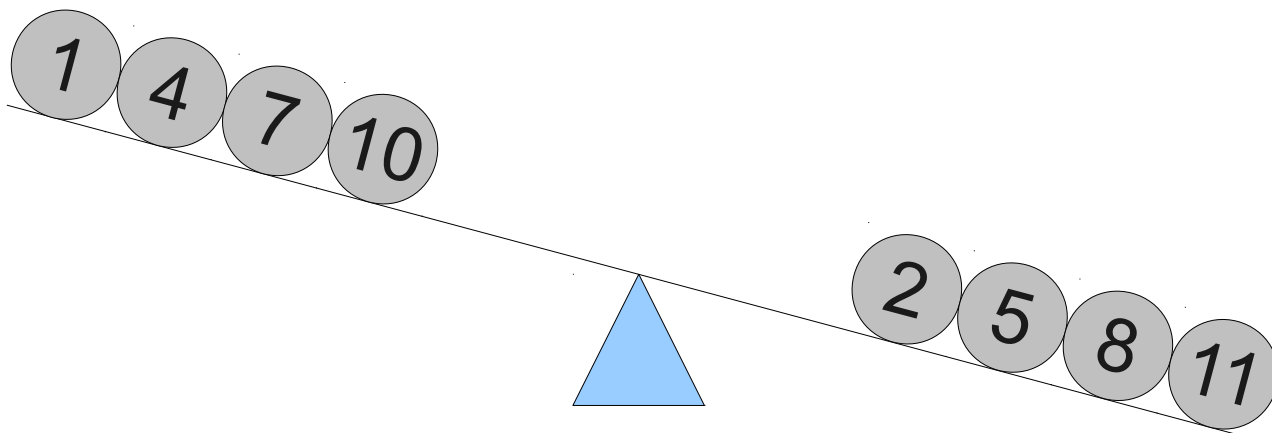
- 1 00+
- 2 0+-
- 3 0+0
- 4 0++
- 5 +--
- 6 +-0
- 7 +-+
- 8 +0-
- 9 +00
- 10 +0+
- 11 ++-
- 12 ++0



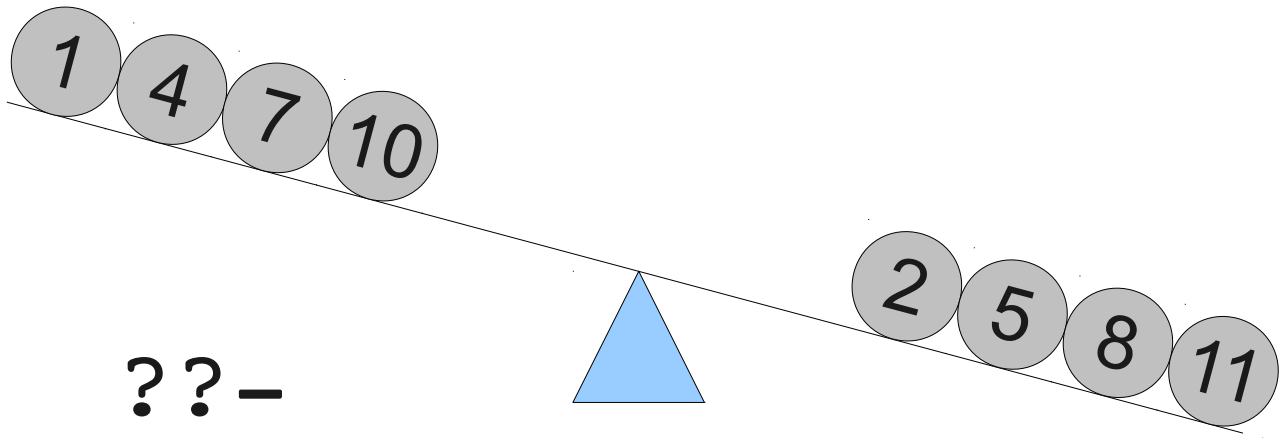
-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



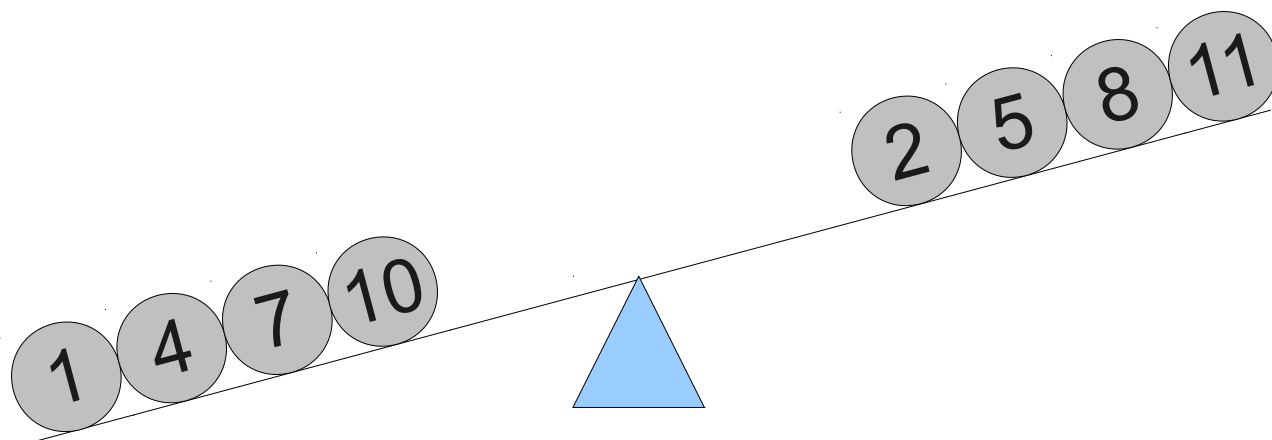
-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



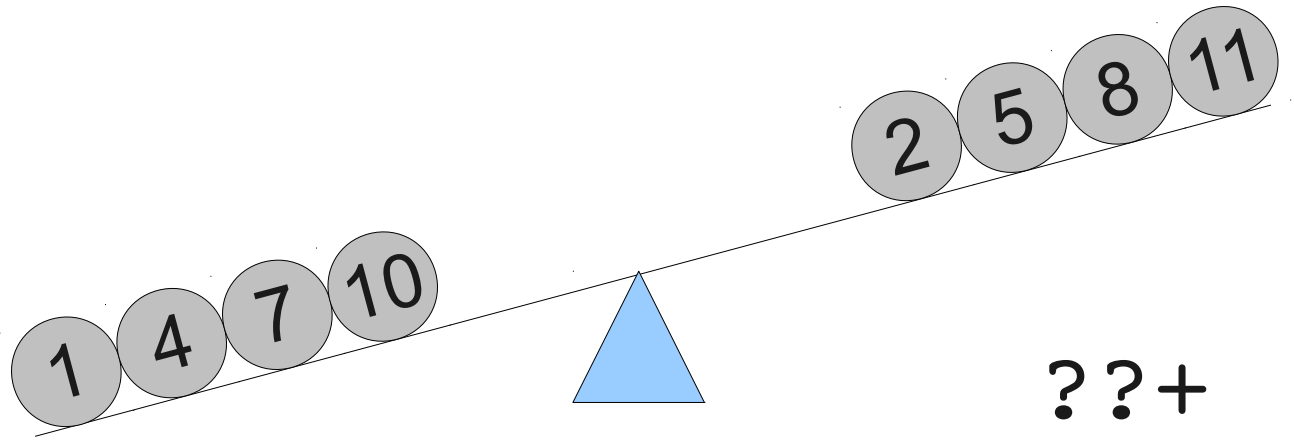
-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



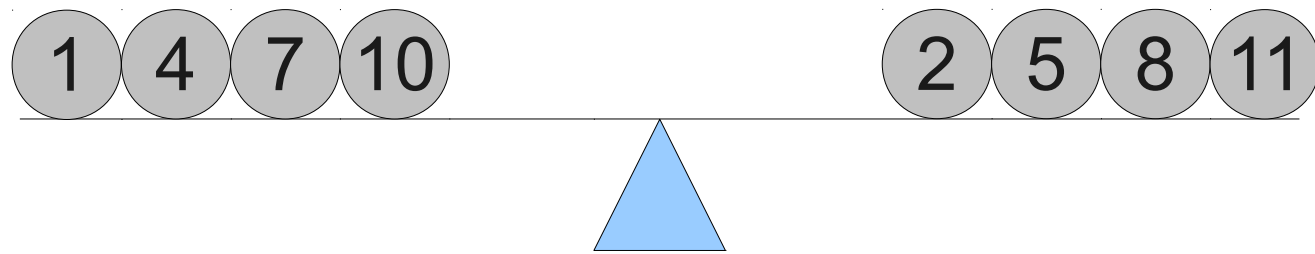
-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



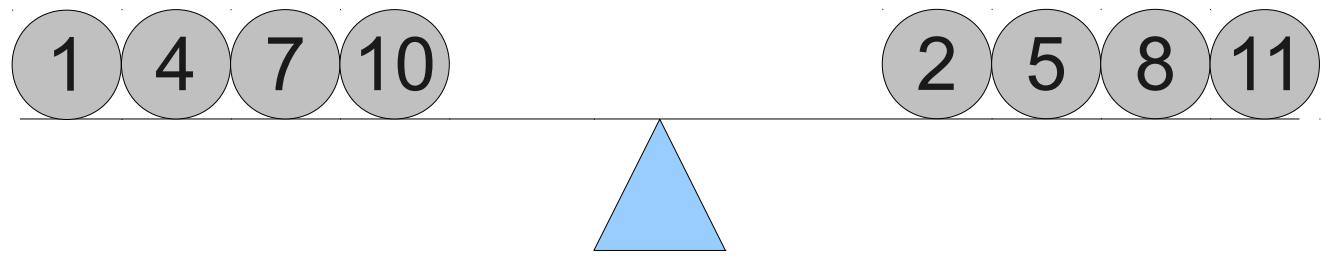
-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



-1 00-  
-2 0-+  
-3 0-0  
-4 0--  
-5 -++  
-6 -+0  
-7 -+-  
-8 -0+  
-9 -00  
-10 -0-  
-11 --+  
-12 --0



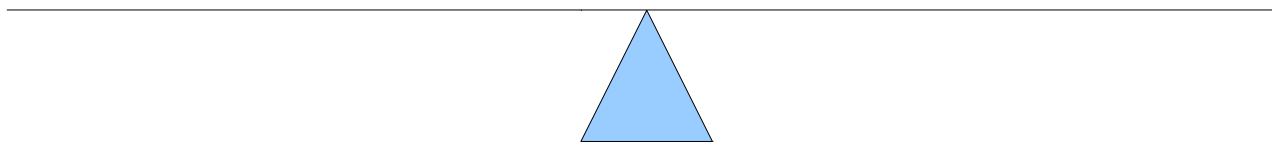
??0

If the left side is heavier, record a +.

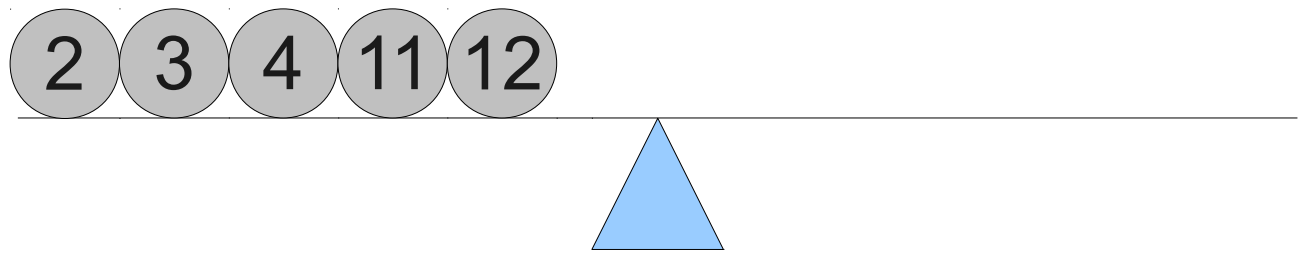
If the right side is heavier, record a -.

If the scale balances, record a 0.

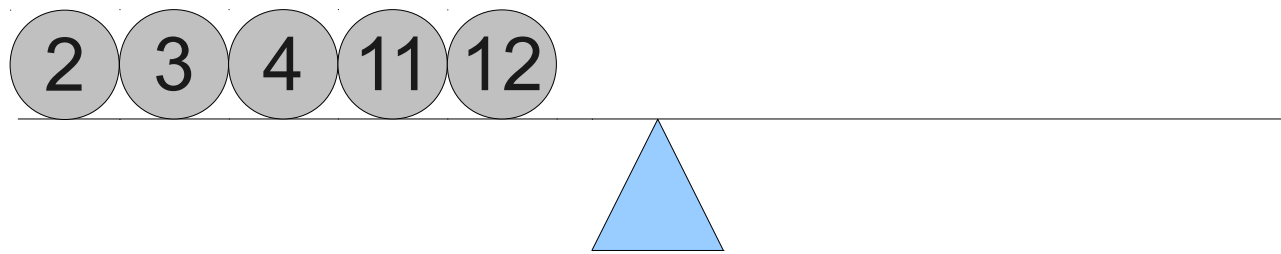
1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ - 0
7	+ - +
8	+ 0 -
9	+ 0 0
10	+ 0 +
11	++-
12	++0



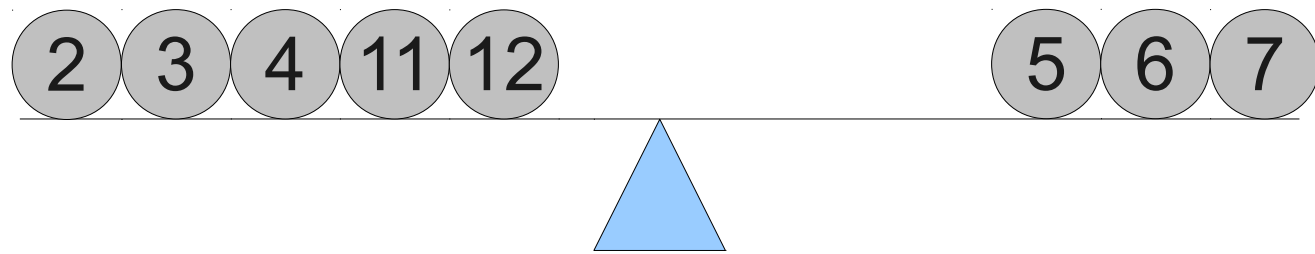
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +--  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



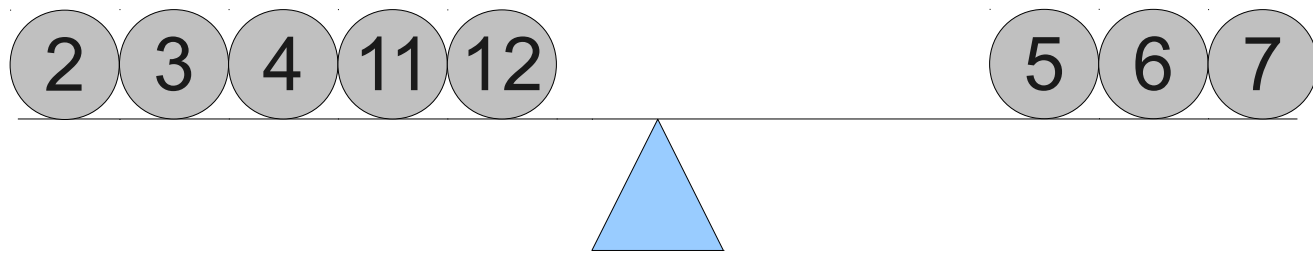
1 00+  
2 0+-  
3 0+0  
4 0++  
5 +-  
6 +-0  
7 +-+  
8 +0-  
9 +00  
10 +0+  
11 ++-  
12 ++0



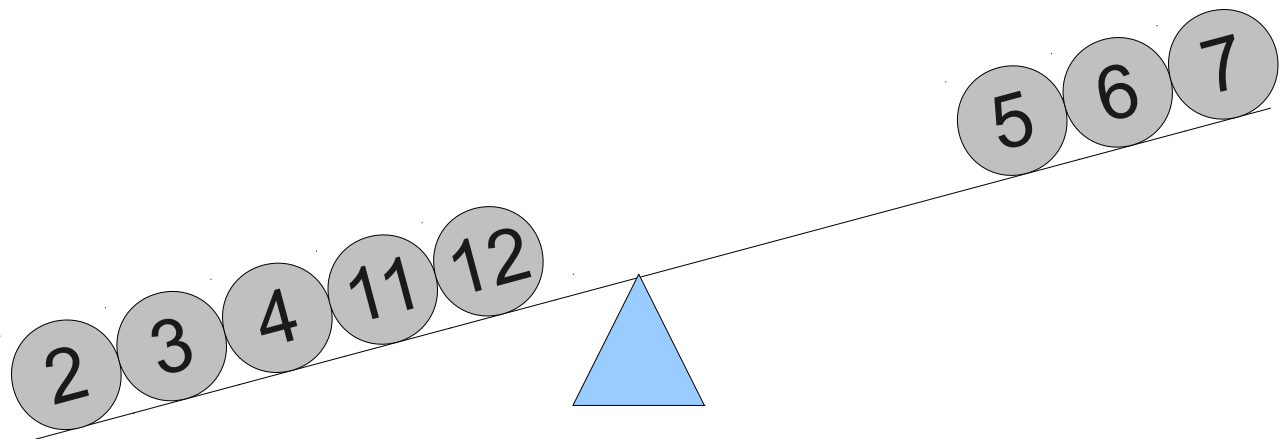
- 1 00+
- 2 0+-
- 3 0+0
- 4 0++
- 5 + - -
- 6 + - 0
- 7 + - +
- 8 + 0 -
- 9 + 0 0
- 10 + 0 +
- 11 + + -
- 12 + + 0



1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ - 0
7	+ - +
8	+ 0 -
9	+ 0 0
10	+ 0 +
11	+ + -
12	+ + 0



1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ -0
7	+ -+
8	+0-
9	+00
10	+0+
11	++-
12	++0



# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
-12	--0	12	++0

# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
<b>-12</b>	<b>--0</b>	<b>12</b>	<b>++0</b>

# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
<b>12</b>	<b>++0</b>	<b>-12</b>	<b>--0</b>

# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
12	++0	-12	--0

# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
<b>-8</b>	<b>-0+</b>	<b>8</b>	<b>+0-</b>
<b>-9</b>	<b>-00</b>	<b>9</b>	<b>+00</b>
<b>-10</b>	<b>-0-</b>	<b>10</b>	<b>+0+</b>
-11	--+	11	++-
12	++0	-12	--0

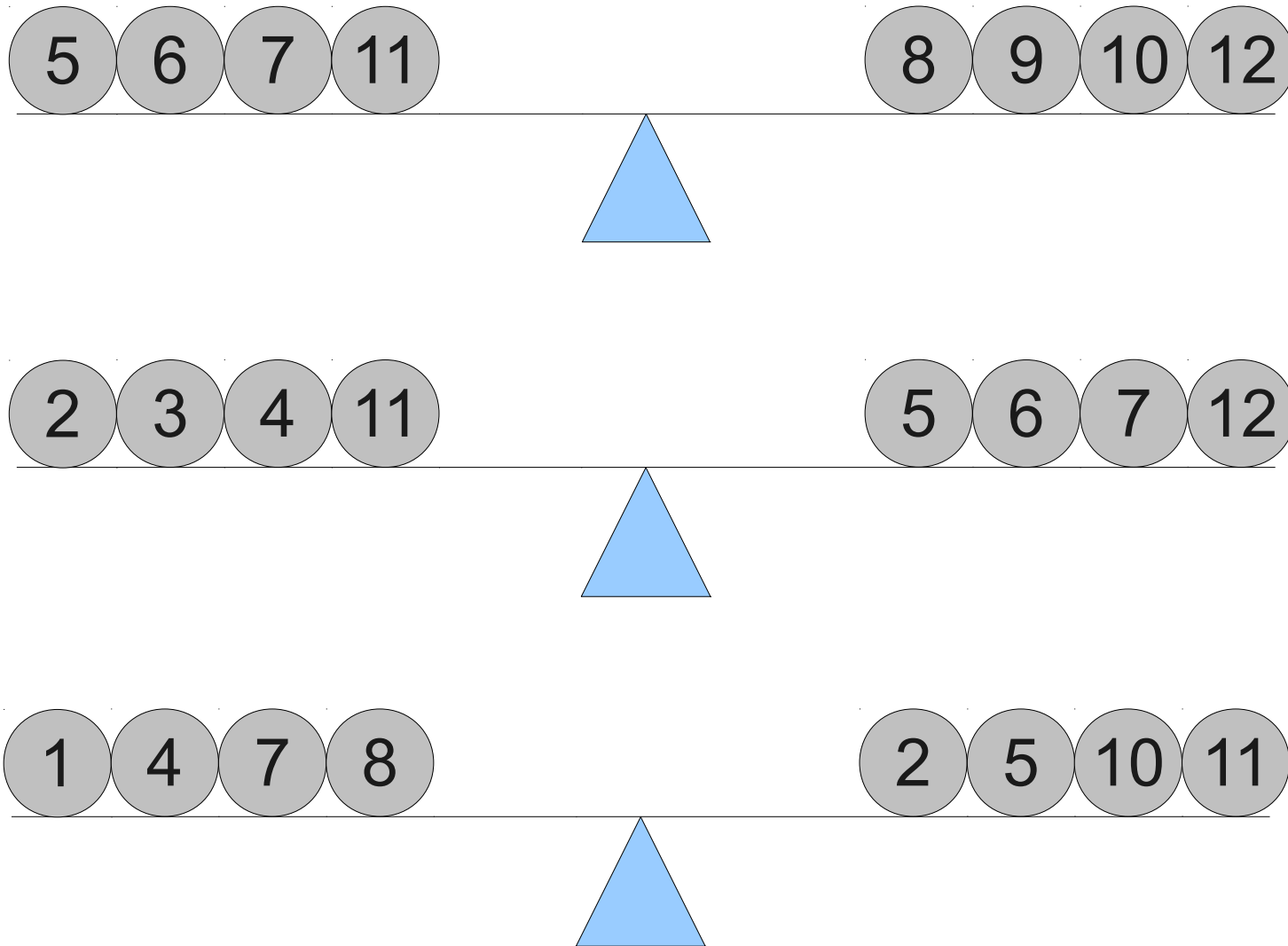
# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
<b>8</b>	<b>+0-</b>	<b>-8</b>	<b>-0+</b>
<b>9</b>	<b>+00</b>	<b>-9</b>	<b>-00</b>
<b>10</b>	<b>+0+</b>	<b>-10</b>	<b>-0-</b>
-11	--+	11	++-
12	++0	-12	--0

# Our Encoding Scheme

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
8	+0-	-8	-0+
9	+00	-9	-00
10	+0+	-10	-0-
-11	--+	11	++-
12	++0	-12	--0

# The Solution



1	00+
2	0+-
3	0+0
4	0++
5	+--
6	+ -0
7	+ -+
-8	-0+
-9	-00
-10	-0-
11	++-
-12	--0

# Generalizing the Result

- Why twelve balls?
  - With three trits, 27 possible combinations. 13 are positive, nine start with +.
  - Must discard one starting with + to ensure number of + and - in each column is the same, leaving 12 positive numbers.
- More generally:
  - With  $n$  trits,  $3^n$  possible combinations.  $(3^n - 1) / 2$  are positive.
  - $3^{n-1}$  numbers start with +. To balance + and -, we need to drop one starting with +, leaving  $(3^n - 3) / 2$  positive numbers.
- Can do 3, 12, 39, 120, 363, 1092, ...

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
-3	-0	3	+0
-4	--	4	++

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
-3	-0	3	+0
<b>-4</b>	<b>--</b>	<b>4</b>	<b>++</b>

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
-3	-0	3	+0

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
<b>-3</b>	<b>-0</b>	<b>3</b>	<b>+0</b>

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
<b>3</b>	<b>+0</b>	<b>-3</b>	<b>-0</b>

# Example: Two Weighings

Lighter		Heavier	
-1	0-	1	0+
-2	-+	2	+ -
3	+0	-3	-0

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
-12	--0	12	++0
-13	---	13	+++

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
-12	--0	12	++0
<b>-13</b>	<b>---</b>	<b>13</b>	<b>+++</b>

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
-8	-0+	8	+0-
-9	-00	9	+00
-10	-0-	10	+0+
-11	--+	11	++-
-12	--0	12	++0

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
<b>-8</b>	<b>-0+</b>	<b>8</b>	<b>+0-</b>
<b>-9</b>	<b>-00</b>	<b>9</b>	<b>+00</b>
<b>-10</b>	<b>-0-</b>	<b>10</b>	<b>+0+</b>
-11	--+	11	++-
<b>-12</b>	<b>--0</b>	<b>12</b>	<b>++0</b>

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
<b>8</b>	<b>+0-</b>	<b>-8</b>	<b>-0+</b>
<b>9</b>	<b>+00</b>	<b>-9</b>	<b>-00</b>
<b>10</b>	<b>+0+</b>	<b>-10</b>	<b>-0-</b>
-11	--+	11	++-
<b>12</b>	<b>++0</b>	<b>-12</b>	<b>--0</b>

# Example: Three Weighings

Lighter		Heavier	
-1	00-	1	00+
-2	0-+	2	0+-
-3	0-0	3	0+0
-4	0--	4	0++
-5	-++	5	+--
-6	-+0	6	+ -0
-7	-+-	7	+ -+
8	+0-	-8	-0+
9	+00	-9	-00
10	+0+	-10	-0-
-11	--+	11	++-
12	++0	-12	--0

# Example: Four Weighings

1	000+	14	+---	27	+000
2	00+-	15	+--0	28	+00+
3	00+0	16	+--+	29	+0+-
4	00++	17	+--0-	30	+0+0
5	0+--	18	+--00	31	+0++
6	0+-0	19	+--0+	32	++--
7	0+--+	20	+--+	33	++-0
8	0+0-	21	+--+0	34	++-+
9	0+00	22	+--++	35	++0-
10	0+0+	23	+0--	36	++00
11	0++-	24	+0-0	37	++0+
12	0++0	25	+0-+	38	+++-
13	0+++	26	+00-	39	+++0
				40	++++

# Example: Four Weighings

1	000+	14	+---	27	+000
2	00+-	15	+--0	28	+00+
3	00+0	16	+--+	29	+0+-
4	00++	17	+--0-	30	+0+0
5	0+--	18	+--00	31	+0++
6	0+-0	19	+--0+	32	++--
7	0+--+	20	+--+-	33	++-0
8	0+0-	21	+--+0	34	++-+
9	0+00	22	+--++	35	++0-
10	0+0+	23	+0--	36	++00
11	0++-	24	+0-0	37	++0+
12	0++0	25	+0-+	38	+++-
13	0+++	26	+00-	39	+++0
				<b>40</b>	<b>++++</b>

# Example: Four Weighings

1	000+	14	+----	27	+000
2	00+-	15	+---0	28	+00+
3	00+0	16	+--++	29	+0+-
4	00++	17	+--0-	30	+0+0
5	0+--	18	+--00	31	+0++
6	0+-0	19	+--0+	32	++--
7	0+--+	20	+--+-	33	++-0
8	0+0-	21	+--+0	34	++-+
9	0+00	22	+--++	35	++0-
10	0+0+	23	+0--	36	++00
11	0++-	24	+0-0	37	++0+
12	0++0	25	+0-+	38	+++-
13	0+++	26	+00-	39	+++0

# Example: Four Weighings

1	000+	14	+---	<b>27</b>	<b>+000</b>
2	00+-	15	+--0	<b>28</b>	<b>+00+</b>
3	00+0	16	+--+	<b>29</b>	<b>+0+-</b>
4	00++	17	+ - 0 -	<b>30</b>	<b>+0+0</b>
5	0+--	18	+ - 0 0	<b>31</b>	<b>+0++</b>
6	0+-0	19	+ - 0 +	32	++--
7	0+ - +	20	+ - + -	33	++-0
8	0+0-	21	+ - + 0	34	++-+
9	0+00	22	+ - ++	<b>35</b>	<b>++0-</b>
10	0+0+	<b>23</b>	<b>+0--</b>	<b>36</b>	<b>++00</b>
11	0++-	<b>24</b>	<b>+0-0</b>	<b>37</b>	<b>++0+</b>
12	0++0	<b>25</b>	<b>+0-+</b>	38	+++ -
13	0+++	<b>26</b>	<b>+00-</b>	<b>39</b>	<b>+++0</b>

# Example: Four Weighings

1	000+	14	+---	<b>-27</b>	<b>-000</b>
2	00+-	15	+--0	<b>-28</b>	<b>-00-</b>
3	00+0	16	+--+	<b>-29</b>	<b>-0-+</b>
4	00++	17	+ - 0 -	<b>-30</b>	<b>-0-0</b>
5	0+--	18	+ - 0 0	<b>-31</b>	<b>-0--</b>
6	0+-0	19	+ - 0 +	32	++--
7	0+ - +	20	+ - + -	33	++-0
8	0+0-	21	+ - + 0	34	++-+
9	0+00	22	+ - ++	<b>-35</b>	<b>--0+</b>
10	0+0+	<b>-23</b>	<b>-0++</b>	<b>-36</b>	<b>--00</b>
11	0++-	<b>-24</b>	<b>-0+0</b>	<b>-37</b>	<b>--0-</b>
12	0++0	<b>-25</b>	<b>-0+-</b>	38	+++ -
13	0+++	<b>-26</b>	<b>-00+</b>	<b>-39</b>	<b>---0</b>

# Example: Four Weighings

1	000+	14	+---	-27	-000
2	00+-	15	+--0	-28	-00-
3	00+0	16	+--+	-29	-0-+
4	00++	17	+--0-	-30	-0-0
5	0+--	18	+--00	-31	-0--
6	0+-0	19	+--0+	32	++--
7	0+--+	20	+--+-	33	++-0
8	0+0-	21	+--+0	34	++-+
9	0+00	22	+--++	-35	--0+
10	0+0+	-23	-0++	-36	--00
11	0++-	-24	-0+0	-37	--0-
12	0++0	-25	-0+-	38	+++-
13	0+++	-26	-00+	-39	---0

# Some Insights

- What number did we drop?
  - With 2 trits, dropped ++.
  - With 3 trits, dropped +++.
  - With 4 trits, dropped ++++.
  - **Always drop ++...++**
- What numbers did we invert?
  - With two trits: +0
  - With three trits: ++0, +0-, +00, +0-
  - With four trits: +++0, ++0-, ++00, ++0+, +0--, +0-0, +0-+, +00-, +000, +00+, +0+-, +0+0, +0++
  - **Always invert numbers starting with ++...++0.**
- **This always works!**

# How Many Extra +'s Per Column?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  extra +'s.

0+

+ -

+ 0

# How Many Extra +'s Per Column?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  extra +'s.

00+

0+-

0+0

# How Many Extra +s Per Column?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  extra +'s.

00+

0+-

0+0

0++

+--

+ - 0

+ - +

+ 0 -

+ 0 0

+ 0 +

+ + -

+ + 0

# How Many Extra +s Per Column?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  extra +'s.

00+
0+-
0+0
0++
+--
+ - 0
+ - +
+ 0 -
+ 0 0
+ 0 +
+ + -
+ + 0

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

0+

+ -

+ 0

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

0+

+ -

+0

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

00+

0+-

0+0

0++

+--

+ - 0

+ - +

+ 0 -

+ 0 0

+ 0 +

++ -

++ 0

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

00+

0+-

0+0

0++

+--

+ - 0

+ - +

+	0	-
+	0	0
+	0	+

++-

+	+	0
---	---	---

# How Many +'s Get Flipped?

- Answer: The  $3^j$  column has  $(3^j - 1) / 2$  flipped +'s.

00+

0+-

0+0

0++

+--

+ - 0

+ - +

+	0	-
+	0	0
+	0	+

++-

+	+	0
---	---	---

$$\sum_{i=0}^{j-1} 3^i = \frac{3^j - 1}{2}$$

# Summary

- A three-way scale lends itself naturally to a **balanced ternary encoding** for each of the balls.
- Given an encoding with the same number of +'s and -'s in each column, we can use the scale to read off one trit of the answer at a time.
- Flipping numbers starting with +0, ++0, etc. guarantees an encoding with this property.

# Generating Permutations

“You are given a sorted string  $S$  of unique characters. Write a Java-style iterator that traverses all the permutations of  $S$  in lexicographical order.”

# Example

# Example

abc

# Example

abc

acb

bac

bca

cab

cba

# Example

0	abc
1	acb
2	bac
3	bca
4	cab
5	cba

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

# Lehmer Codes



# Lehmer Codes



1

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1

# Lehmer Codes



1

# Lehmer Codes



1 0

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0

# Lehmer Codes



1 0

# Lehmer Codes



1 0

# Lehmer Codes



# Lehmer Codes

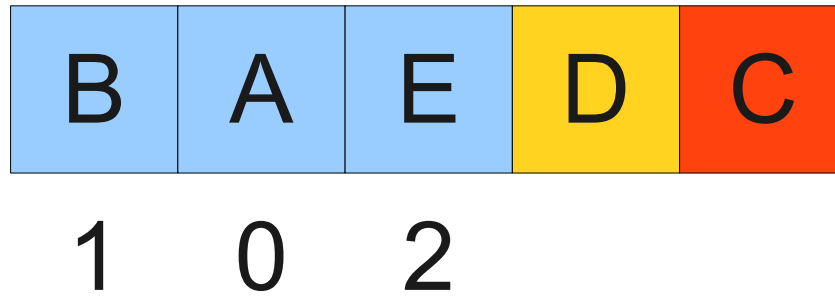
B	A	E	D	C
---	---	---	---	---

1 0 2

# Lehmer Codes

B	A	E	D	C
1	0	2		

# Lehmer Codes



# Lehmer Codes

B	A	E	D	C
1	0	2	1	

# Lehmer Codes

B	A	E	D	C
1	0	2	1	

# Lehmer Codes

B	A	E	D	C
1	0	2	1	

# Lehmer Codes

B	A	E	D	C
1	0	2	1	0

# Lehmer Codes

B	A	E	D	C
1	0	2	1	0

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

2

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

2 2

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

2 2 0

# Lehmer Codes

B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

2 2 0 0

# Lehmer Codes

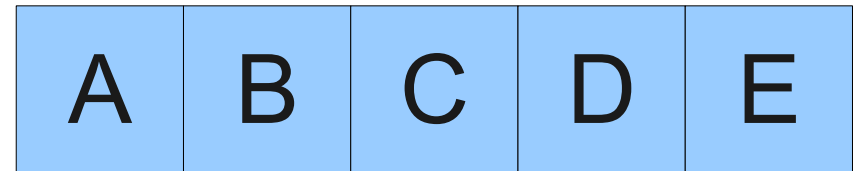
B	A	E	D	C
---	---	---	---	---

1 0 2 1 0

C	D	A	B	E
---	---	---	---	---

2 2 0 0 0

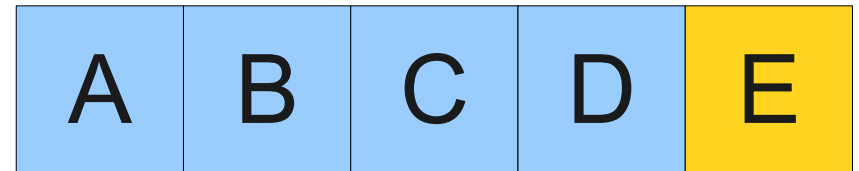
# Lehmer Codes



4 1 0 1 0

# Lehmer Codes

4 1 0 1 0



# Lehmer Codes

E

4 1 0 1 0

A B C D

# Lehmer Codes

E

4 1 0 1 0

A B C D

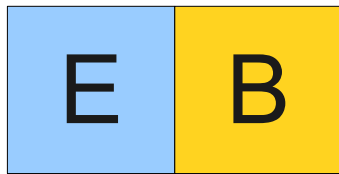
# Lehmer Codes

E

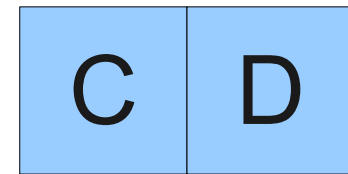
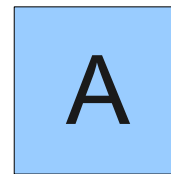
4 1 0 1 0

A B C D

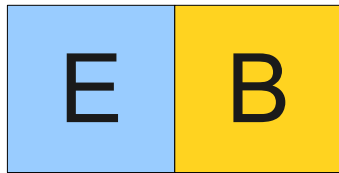
# Lehmer Codes



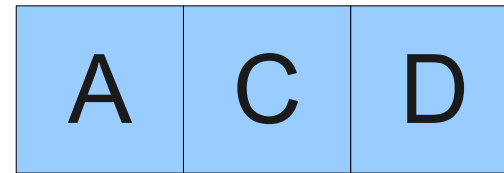
4 1 0 1 0



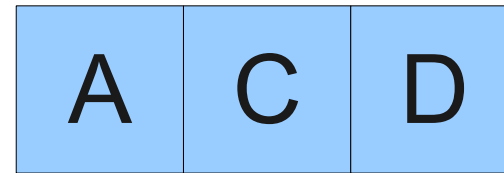
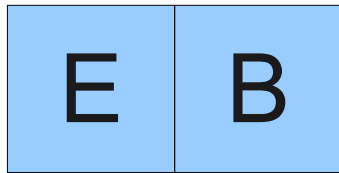
# Lehmer Codes



4 1 0 1 0

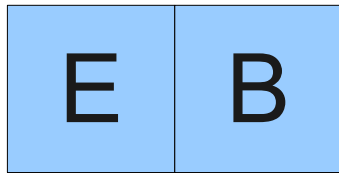


# Lehmer Codes



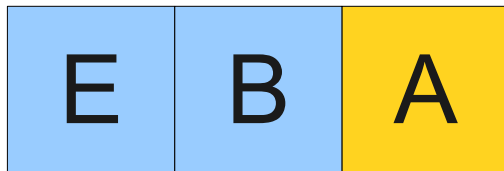
4 1 0 1 0

# Lehmer Codes



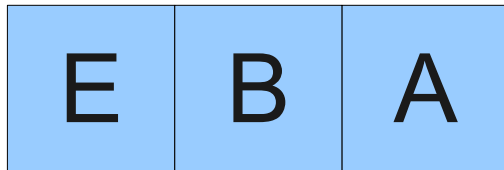
4 1 0 1 0

# Lehmer Codes



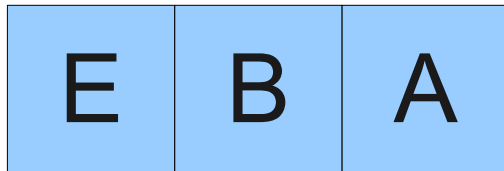
4 1 0 1 0

# Lehmer Codes



4 1 0 1 0

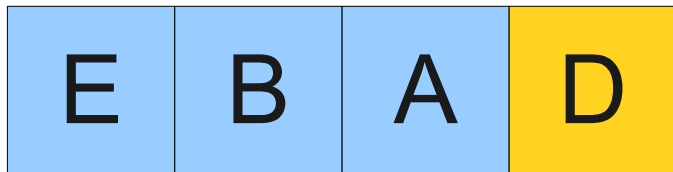
# Lehmer Codes



4 1 0 1 0

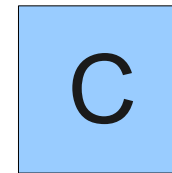
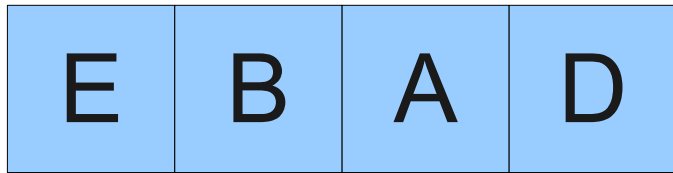


# Lehmer Codes



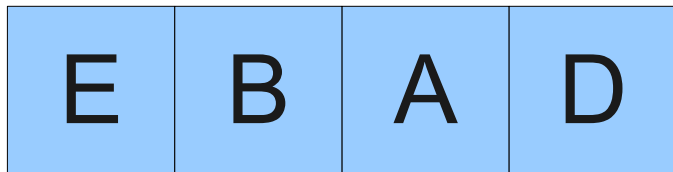
4 1 0 1 0

# Lehmer Codes



4 1 0 1 0

# Lehmer Codes



4 1 0 1 0

# Lehmer Codes

E	B	A	D	C
4	1	0	1	0

# Lehmer Codes

E	B	A	D	C
4	1	0	1	0

# Listing Lehmer Codes

0	abcd	0000	12	cabd	2000
1	abdc	0010	13	cadb	2010
2	acbd	0100	14	cbad	2100
3	acdb	0110	15	cbda	2110
4	adbc	0200	16	cdab	2200
5	adcb	0210	17	cdba	2210
6	bacd	1000	18	dabc	3000
7	badc	1010	19	dacb	3010
8	bcad	1100	20	dbac	3100
9	bcda	1110	21	dbca	3110
10	bdac	1200	22	dcab	3200
11	bdac	1210	23	dcba	3210

# Factoradic Numbers

- Mixed-radix number system.
- Nth digit in base  $n!$ .
- Nth digit can be  $0, 1, 2, \dots, n$
- Example:  $3110_!$ 
  - $3 \times 3! + 1 \times 2! + 1 \times 1! + 0 \times 0! = 21$
- Example:  $1210_!$ 
  - $1 \times 3! + 2 \times 2! + 1 \times 1! + 0 \times 0! = 11$

# Listing Lehmer Codes

0	abcd	0000	12	cabd	2000
1	abdc	0010	13	cadb	2010
2	acbd	0100	14	cbad	2100
3	acdb	0110	15	cbda	2110
4	adbc	0200	16	cdab	2200
5	adcb	0210	17	cdba	2210
6	bacd	1000	18	dabc	3000
7	badc	1010	19	dacb	3010
8	bcad	1100	20	dbac	3100
9	bcda	1110	21	dbca	3110
10	bdac	1200	22	dcab	3200
11	bdac	1210	23	dcba	3210

# Listing Lehmer Codes

0	abcd	0000	12	cabd	2000
1	abdc	0010	13	cadb	2010
2	acbd	0100	14	cbad	2100
3	acdb	0110	15	cbda	2110
4	adbc	0200	16	cdab	2200
5	adcb	0210	17	cdba	2210
6	bacd	1000	18	dabc	3000
7	badc	1010	19	dacb	3010
8	bcad	1100	20	dbac	3100
9	bcda	1110	<b>21</b>	<b>dbca</b>	<b>3110</b>
10	bdac	1200	22	dcab	3200
<b>11</b>	<b>bdac</b>	<b>1210</b>	23	dcba	3210

Writing  $n$  in factoradic gives the  $n$ th Lehmer code.

# Converting to Factoradic

- Goal: convert  $k$  to factoradic.
  - Assume we know  $n$ , the number of elements to permute.
- To get the  $(n - 1)!$  place, divide  $k$  by  $(n - 1)!$ 
  - Quotient is the  $(n - 1)!$  place.
- Repeat for the remaining digits using the remainder.
- Identical to converting to any other base, just using factorials instead of powers.

Example: Convert 13 to Factoradic

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

$$1 = 0 \times 2! + 1$$

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

$$1 = 0 \times 2! + 1$$

$$1 = 1 \times 1! + 0$$

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

$$1 = 0 \times 2! + 1$$

$$1 = 1 \times 1! + 0$$

$$0 = 0 \times 0! + 0$$

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

$$1 = 0 \times 2! + 1$$

$$1 = 1 \times 1! + 0$$

$$0 = 0 \times 0! + 0$$

# Example: Convert 13 to Factoradic

$$13 = 2 \times 3! + 1$$

$$1 = 0 \times 2! + 1$$

$$1 = 1 \times 1! + 0$$

$$0 = 0 \times 0! + 0$$

**Answer:** 2010<sub>!</sub>

# Generating Permutations

```
public static String kthPermutation(String chars, int k)
{
    String result = "";

    for (int n = chars.length() - 1; n >= 0; --n) {
        int quotient = k / factorial(n);
        int remainder = k % factorial(n);

        result += chars.charAt(quotient);

        chars = chars.substring(0, quotient) +
                chars.substring(quotient + 1);

        k = remainder;
    }

    return result;
}
```

# Analysis of Our Algorithm

- To get the kth permutation of n elements:
  - Converting k to factoradic takes  $O(n)$
  - Building up the permutations takes  $O(n^2)$ 
    - Elements stored in a list;  $O(n)$  to remove each.
  - Can reduce to  $O(n \lg n)$  using **order statistic tree**.
- Easy to build an iterator from this.

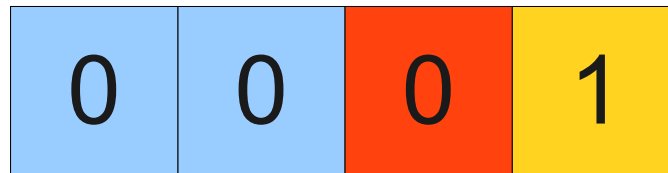
# Incrementing Binary Numbers



# Incrementing Binary Numbers



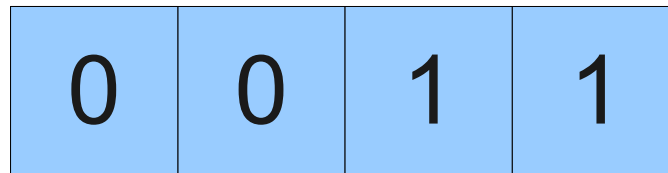
# Incrementing Binary Numbers



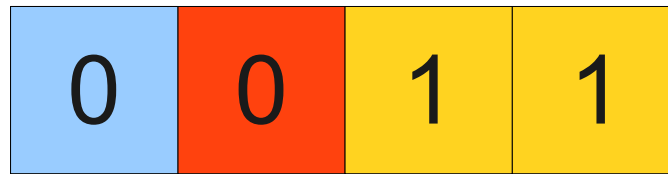
# Incrementing Binary Numbers

0	0	1	0
---	---	---	---

# Incrementing Binary Numbers



# Incrementing Binary Numbers



# Incrementing Binary Numbers

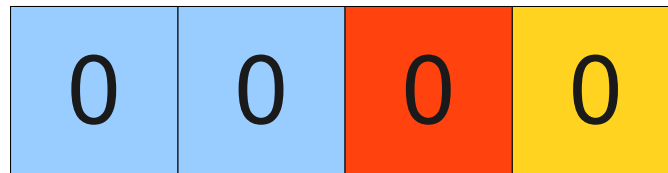


# Incrementing Factoradic Numbers

# Incrementing Factoradic Numbers



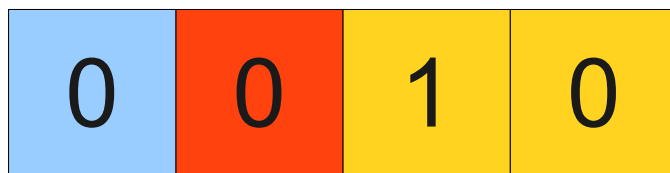
# Incrementing Factoradic Numbers



# Incrementing Factoradic Numbers

0	0	1	0
---	---	---	---

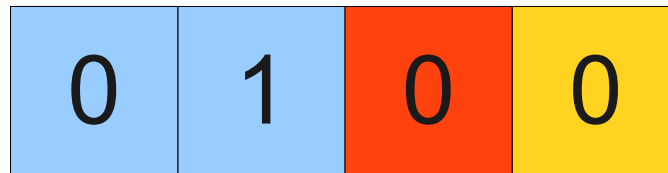
# Incrementing Factoradic Numbers



# Incrementing Factoradic Numbers

0	1	0	0
---	---	---	---

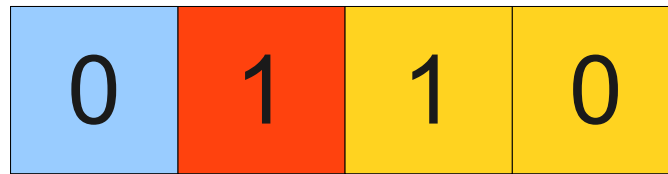
# Incrementing Factoradic Numbers



# Incrementing Factoradic Numbers

0	1	1	0
---	---	---	---

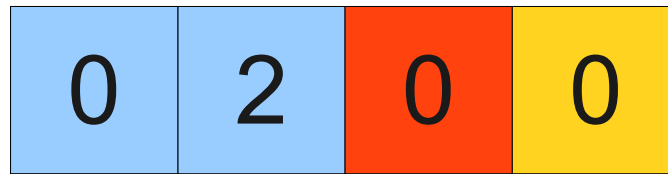
# Incrementing Factoradic Numbers



# Incrementing Factoradic Numbers

0	2	0	0
---	---	---	---

# Incrementing Factoradic Numbers



# Incrementing Factoradic Numbers

0	2	1	0
---	---	---	---

# Incrementing Factoradic Numbers

0	2	1	0
---	---	---	---

# Incrementing Factoradic Numbers

1	0	0	0
---	---	---	---

# Incrementing Factoradic Numbers

- Find the digit to increment.
  - Scan backwards from the end to find the first number not at its maximum.
- Increment that digit.
- Set the digits after that to zero.

# Incrementing Permutations

# Incrementing Permutations

A	B	C	D
0	0	0	0

# Incrementing Permutations

A	B	C	D
0	0	0	0

# Incrementing Permutations

A	B	C	D
0	0	1	0

# Incrementing Permutations

A	B	D	C
0	0	1	0

# Incrementing Permutations

A	B	D	C
0	0	1	0

# Incrementing Permutations

A	B	D	C
0	0	1	0

# Incrementing Permutations

A	B	D	C
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	1	0	0

# Incrementing Permutations

A	C	B	D
0	1	0	0

# Incrementing Permutations

A	C	B	D
0	1	0	0

# Incrementing Permutations

A	C	B	D
0	1	0	0

# Incrementing Permutations

A	C	B	D
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	1	1	0

# Incrementing Permutations

A	C	D	B
0	2	1	0

# Incrementing Permutations

A	D	C	B
0	2	1	0

# Incrementing Permutations

A	D	C	B
0	2	0	0

# Incrementing Permutations

A	D	B	C
0	2	0	0

# Incrementing Permutations

A	D	B	C
0	2	0	0

# Incrementing Permutations

A	D	B	C
0	2	0	0

# Incrementing Permutations

A	D	B	C
0	2	1	0

# Incrementing Permutations

A	D	C	B
0	2	1	0

# Incrementing Permutations

A	D	C	B
0	2	1	0

# Incrementing Permutations

A	D	C	B
0	2	1	0

# Incrementing Permutations

A	D	C	B
1	2	1	0

# Incrementing Permutations

B	D	C	A
1	2	1	0

# Incrementing Permutations

B	D	C	A
1	0	0	0

# Incrementing Permutations

B	A	C	D
1	0	0	0

# Incrementing Permutations

B	A	C	D
1	0	0	0

# Incrementing Permutations

- Find the digit to be incremented.
  - Scan backwards from the end of the sequence to find the longest increasing sequence.
- Increment that digit.
  - Find the smallest element bigger than the element right before that sequence.
  - Swap those two elements.
- Set the digits after that to zero.
  - Reverse the increasing sequence
- Runtime:  **$O(n)$  per permutation.**

# Summary

- Lehmer codes describe a permutation as a series of elements to choose in order.
- The factoradic number system maps directly onto Lehmer codes, and thus onto permutations.
- By simulating what **would** happen if we wrote out the Lehmer code, we can derive a fast algorithm for generating ordered permutations.

# Concluding Thoughts

Number systems are useful in **number recovery** by discovering one component of the number at a time.

Number systems are useful in **enumeration** by revealing structure hidden in the indices.

# Fun With Number Systems

# My Email Address

[htiek@cs.stanford.edu](mailto:htiek@cs.stanford.edu)