

## Midterm 2 Review.

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**Midterm Topics:** Notes 6-14.

Modular Arithmetic. Inverses. GCD/Extended-GCD.

RSA/Cryptography.

Polynomials.

Secret Sharing.

Erasur Resistant Encoding.

Error Correction.

Counting.

Countability.

Computability.

Probability Topics covered by Prof. Walrand.

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Be familiar with Midterm1 topics... but MT2 will focus on Notes 6-14.

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Property 2 and pigeonhole principle.

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Idea: Error locator polynomial of degree  $k$  with zeros at errors.

For all points  $i = 1, \dots, i, n+2k$ ,  $P(i)E(i) = R(i)E(i) \pmod{p}$   
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All countably infinite sets are the same cardinality as each other.

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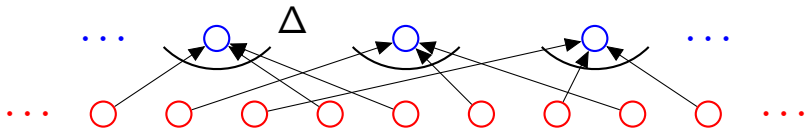
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## Example: visualize.

**First rule:**  $n_1 \times n_2 \cdots \times n_3$ . **Product Rule.**

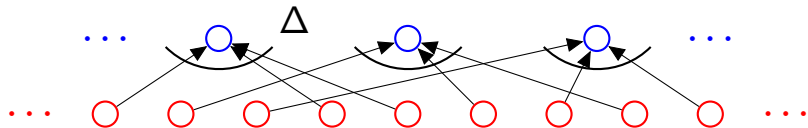
**Second rule:** when order doesn't matter divide..when possible.



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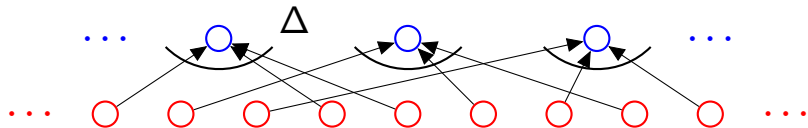
3 card Poker deals: 52



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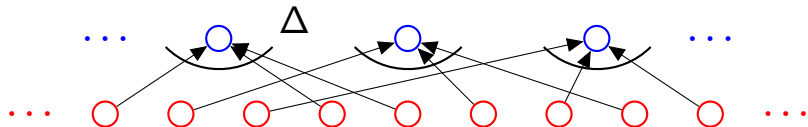


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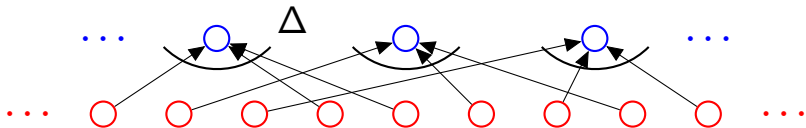


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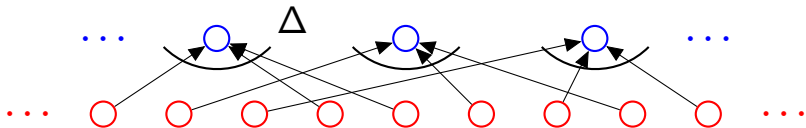


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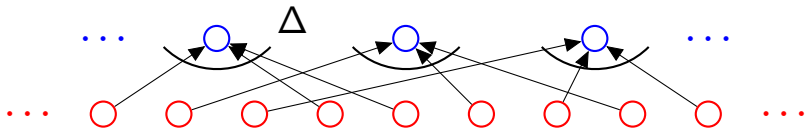


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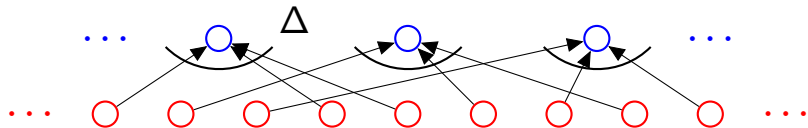
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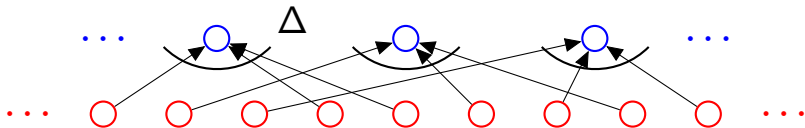
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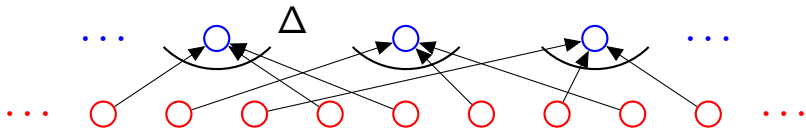
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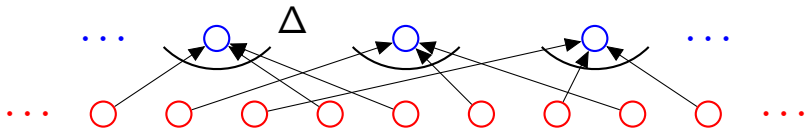
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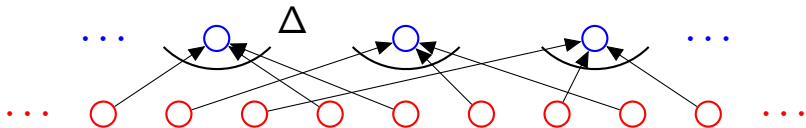
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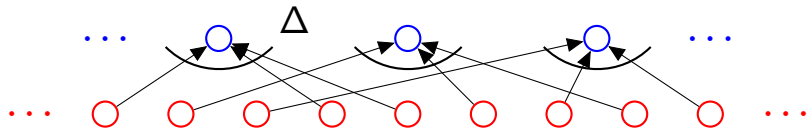
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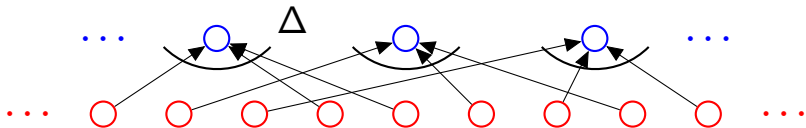
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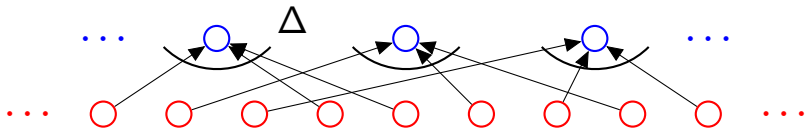
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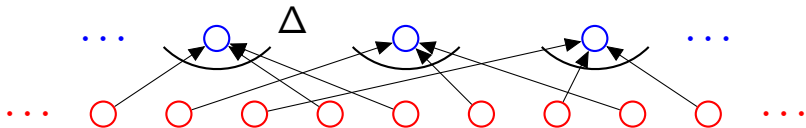
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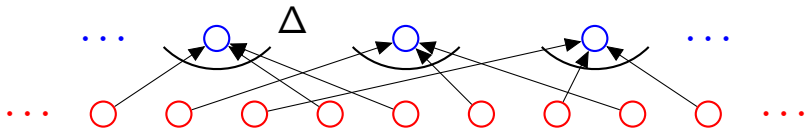
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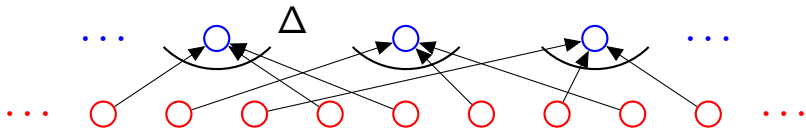
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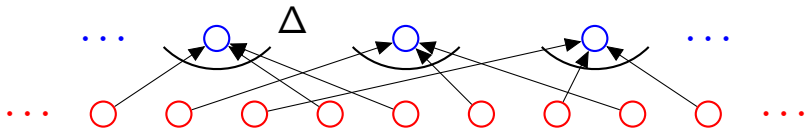
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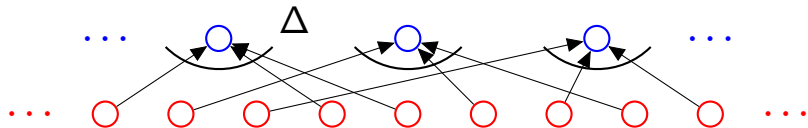
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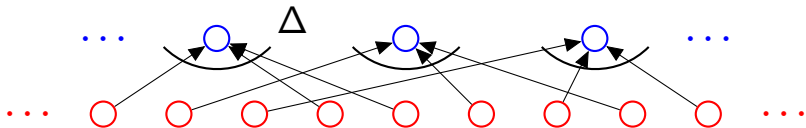
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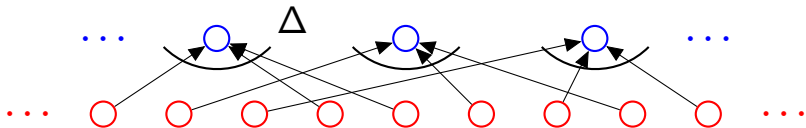
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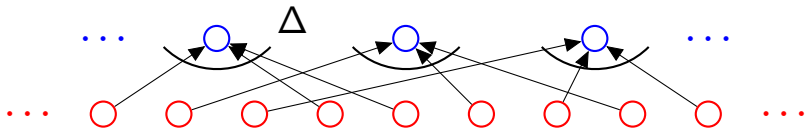
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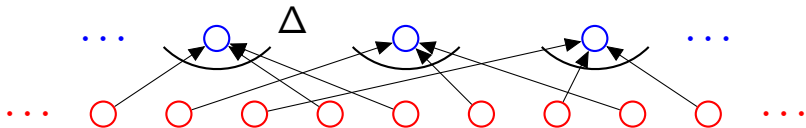
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**Example:** How many 10-digit phone numbers have 7 as their first or second digit?

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Answer:  $|S| + |T| - |S \cap T| = 10^9 + 10^9 - 10^8$ .

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Good Studying and Good Luck!!!