Data Analytics in Health Care

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FDP on Data Analytics in Healthcare

SSN College of Engineering

17 January, 2022

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- Major outbreak of cholera in London in 1854

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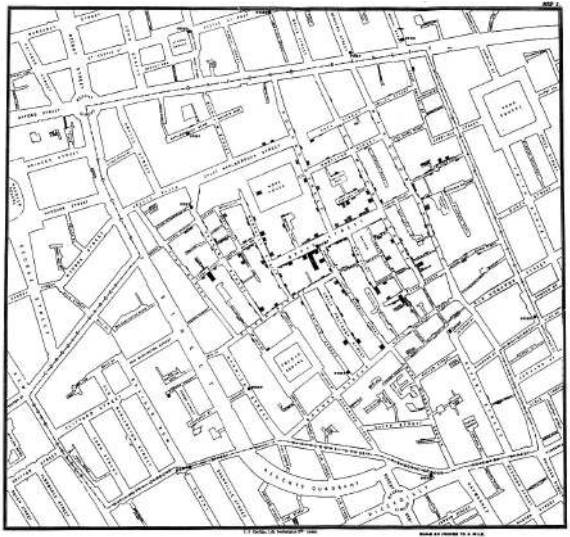

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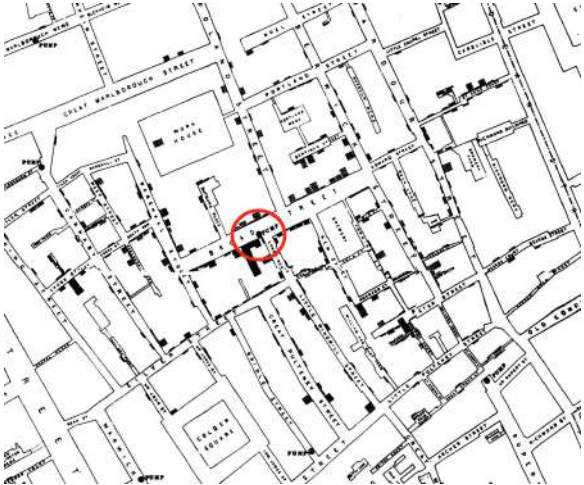
- Cluster of points pointed to contaminated water pump on Broad Street



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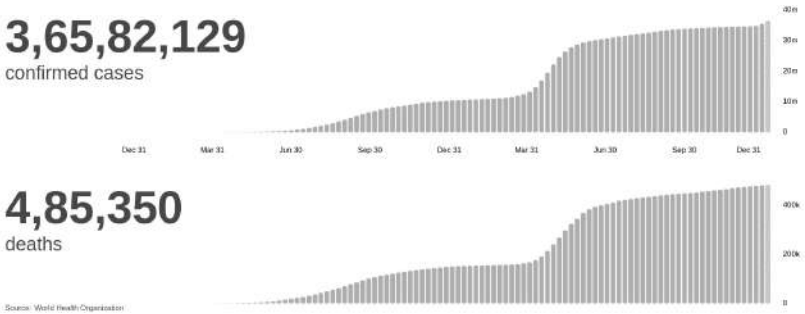

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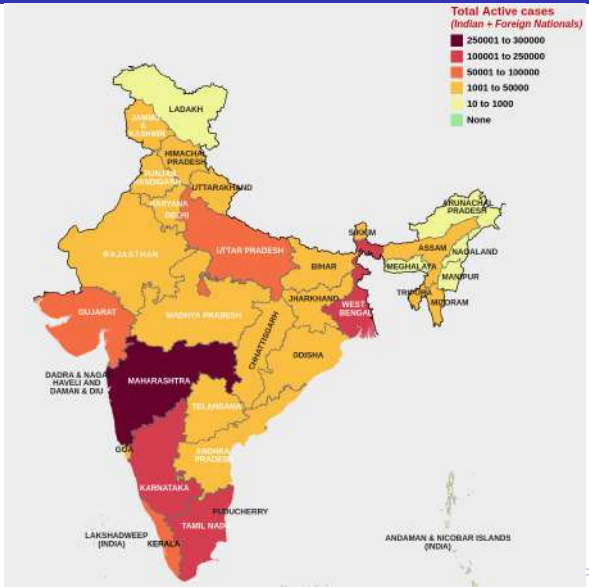

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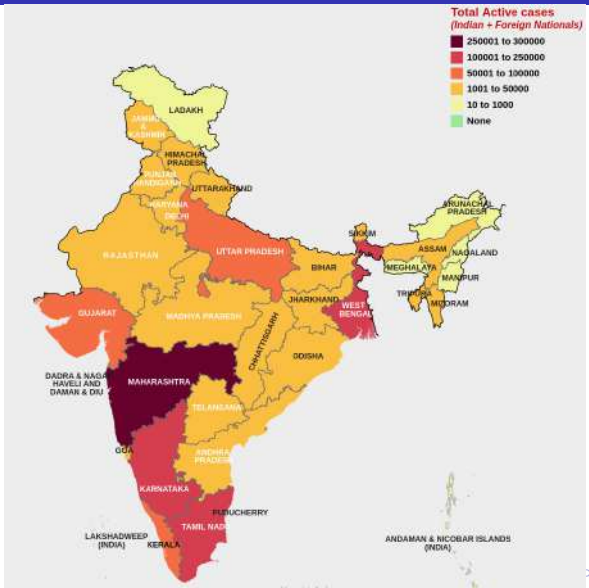

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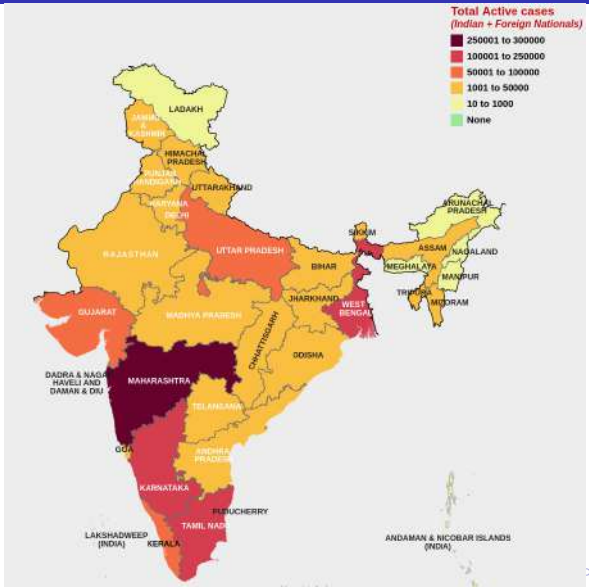

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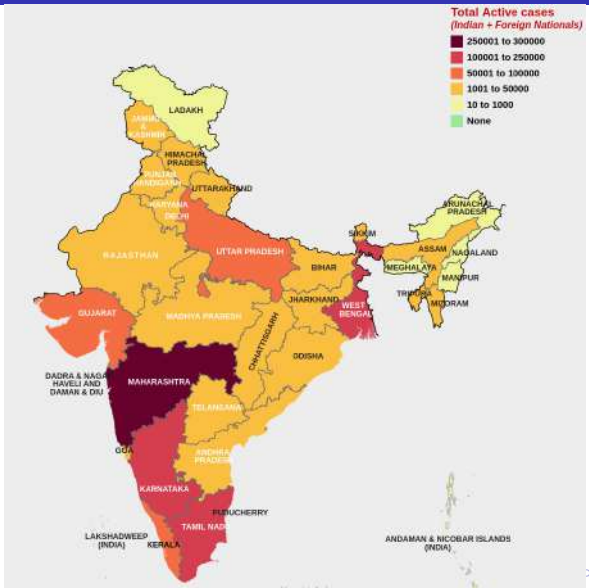

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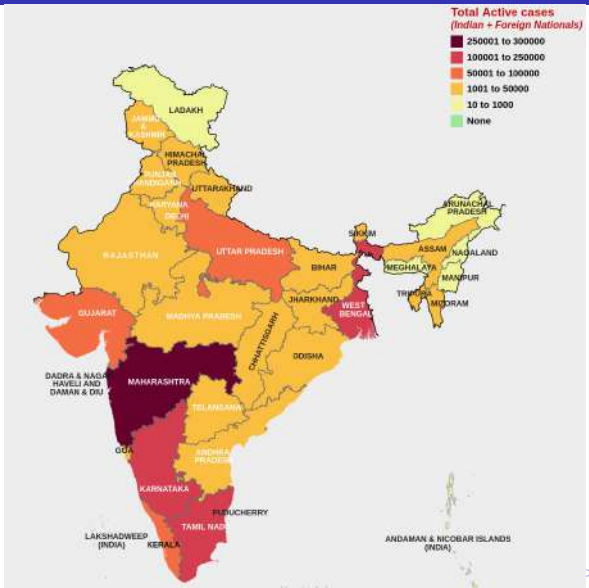

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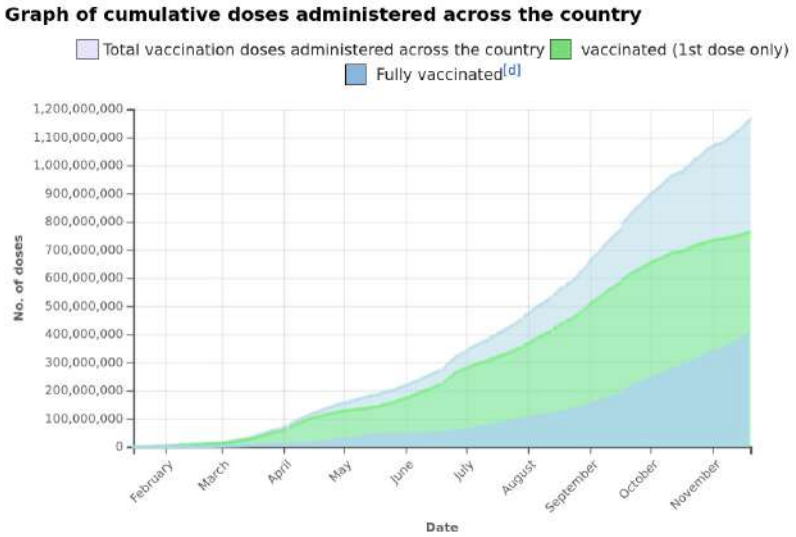

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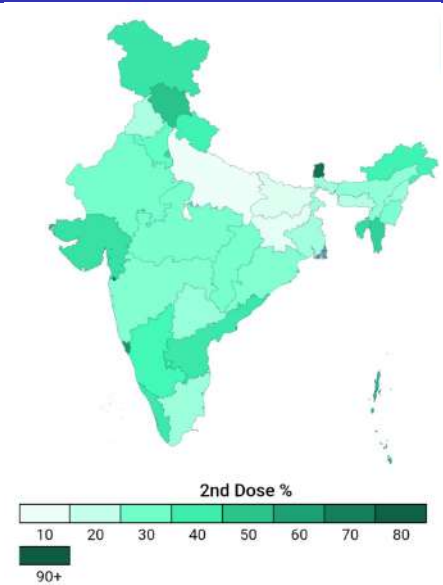

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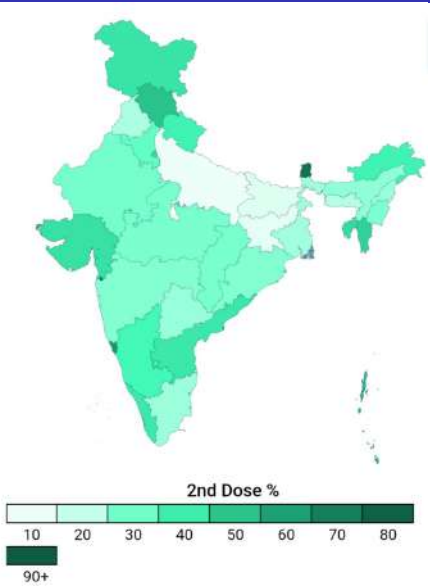

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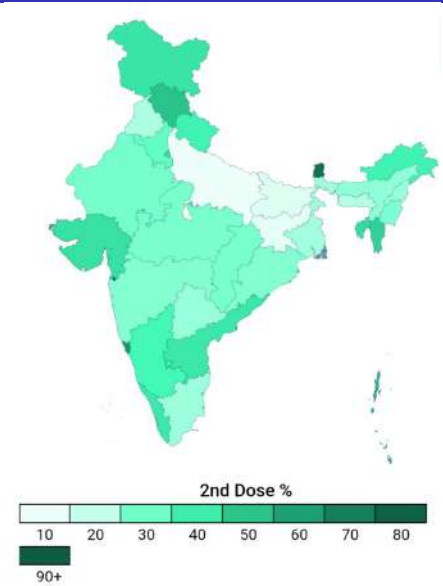

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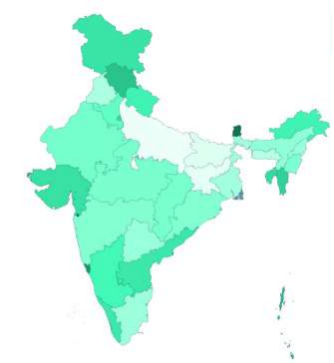

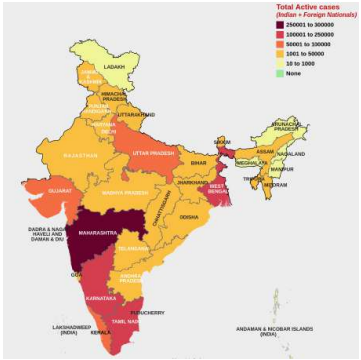

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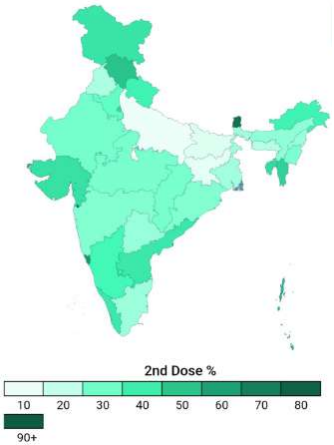

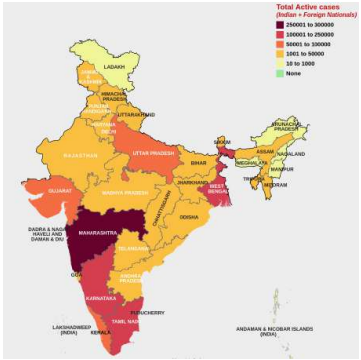

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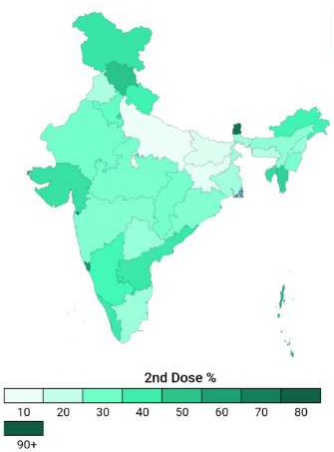

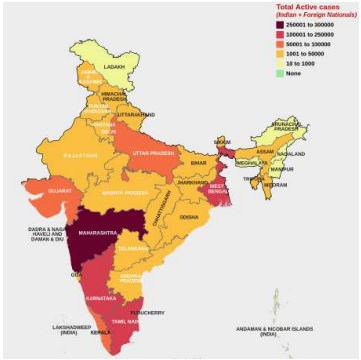

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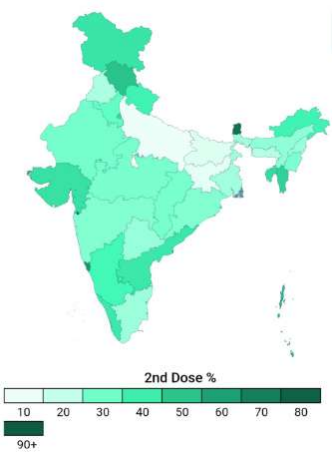

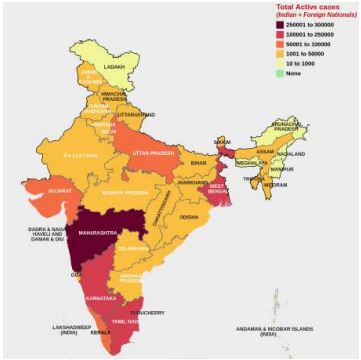

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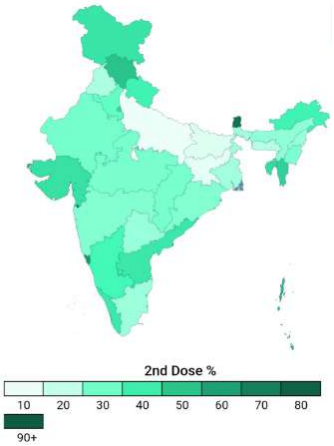

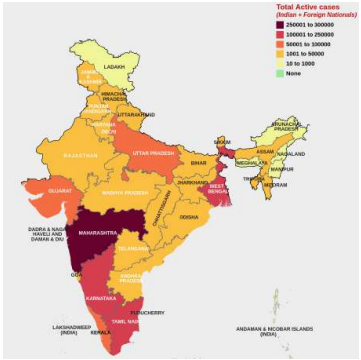

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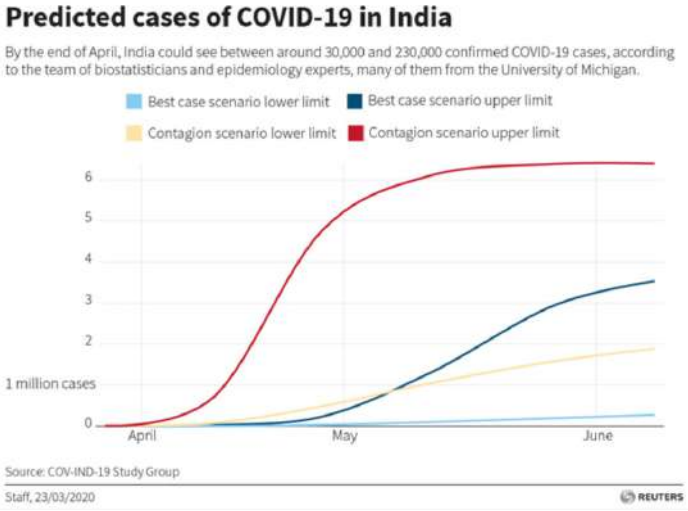
- "Data driven" predictions
  - Speculative, unfalsifiable



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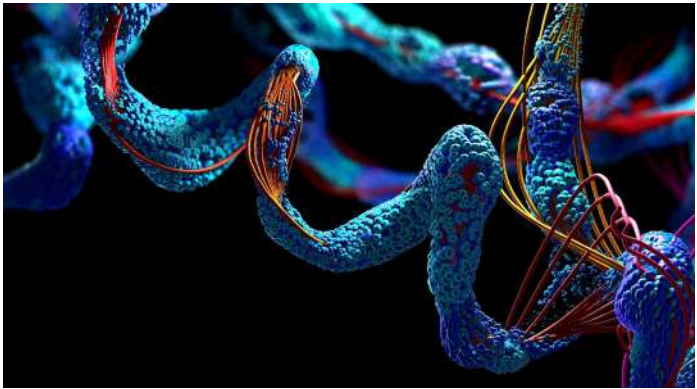

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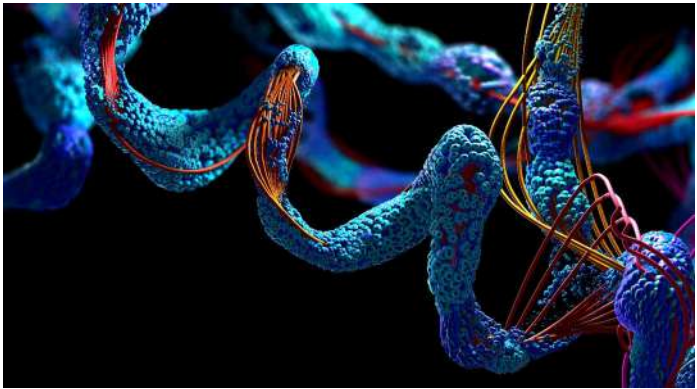

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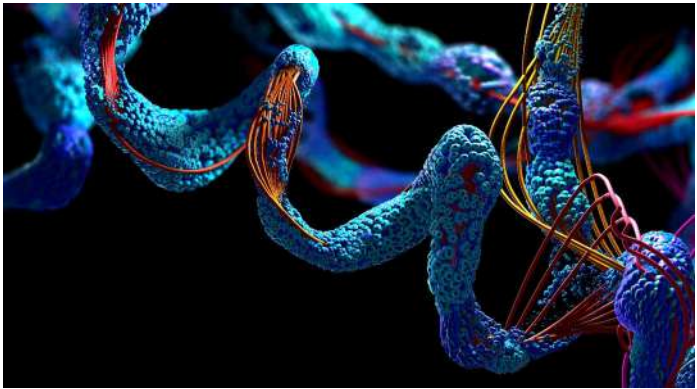

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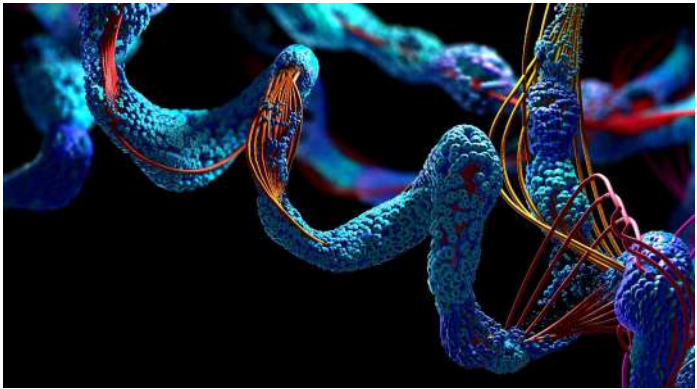

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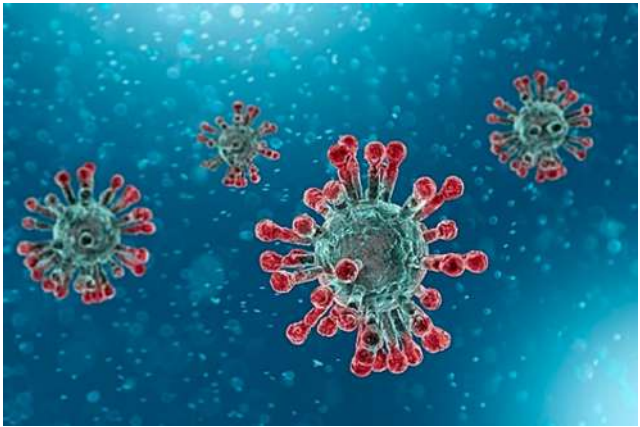

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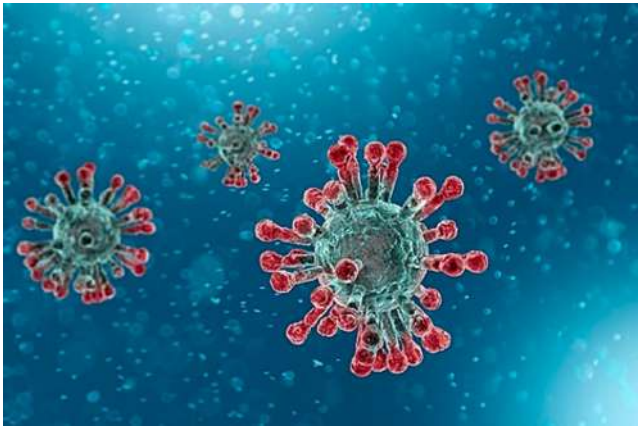

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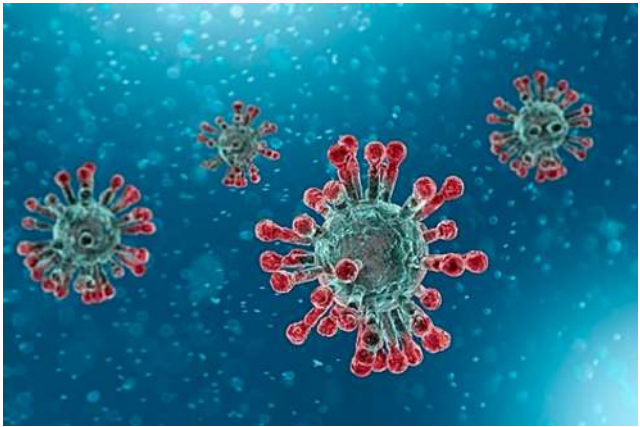

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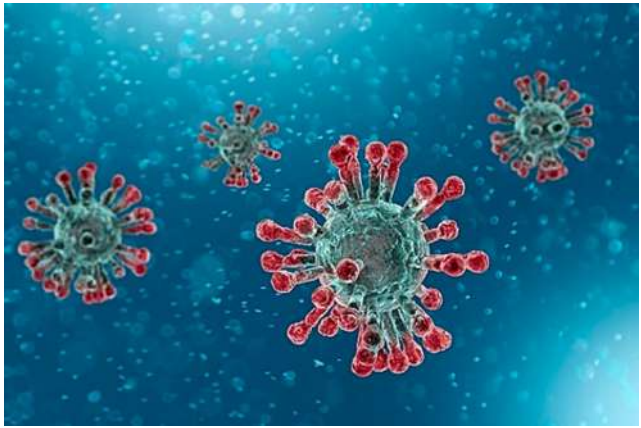

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- Data privacy
  - "Triangulate" medical data to identify individuals
  - Balancing individual privacy and public good
  - Example — contact tracing

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- Security of devices
  - Wearable devices connect to the internet
  - How to prevent malicious interference

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- There is no shortage of irrational skeptics!