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  - If tabular, are most values identifiers (e.g, transaction/ product numbers) or discrete/real values or other?

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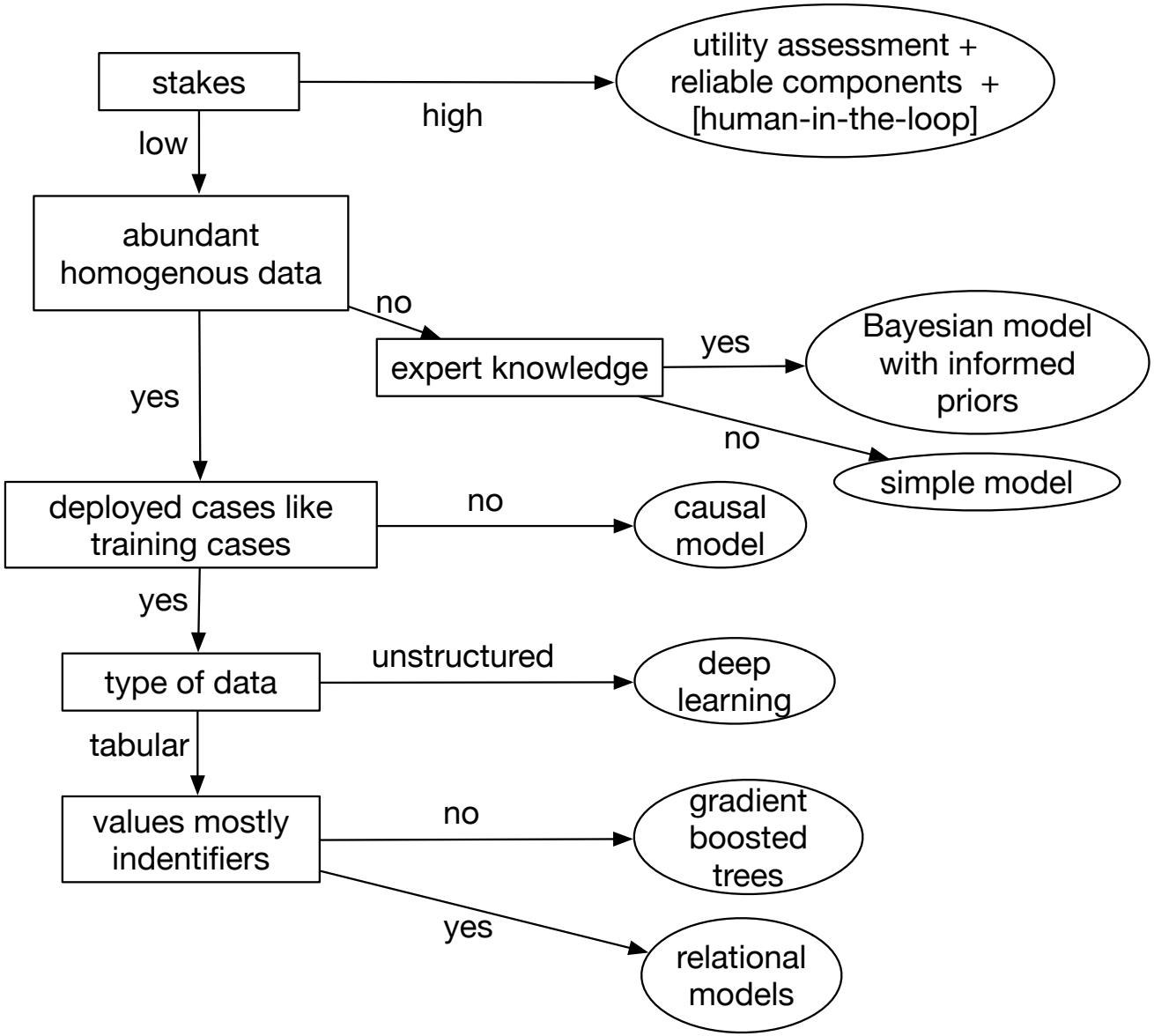

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- Relational models are used for tabular data where most values are identifiers.
- If the assumption that deployment is like training is inappropriate, causal models can be used to adjust to the deployed situation.

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- When the stakes are high:
  - Carry out a complex cost–benefit analysis, based on the utility of all affected stakeholders.
  - Ensure that failures and possibly bad outcomes can be explained and debugged
  - Use a combination of techniques, where each component is well tested and reliable.