

Temperature-based Characterization of Process Variation

Ivan, Mattias, Petru, and Zebo

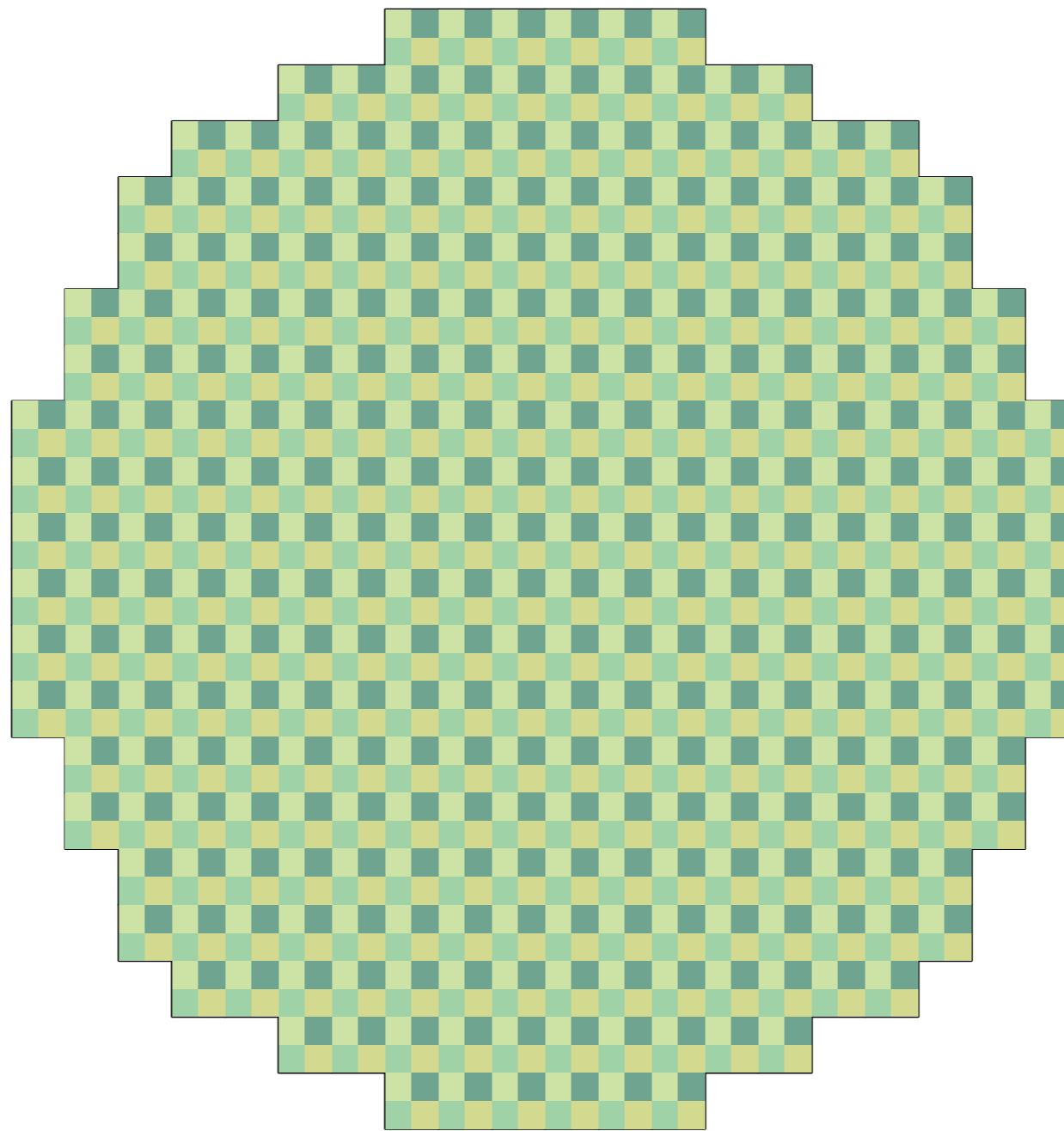
Linköping University

June 2013

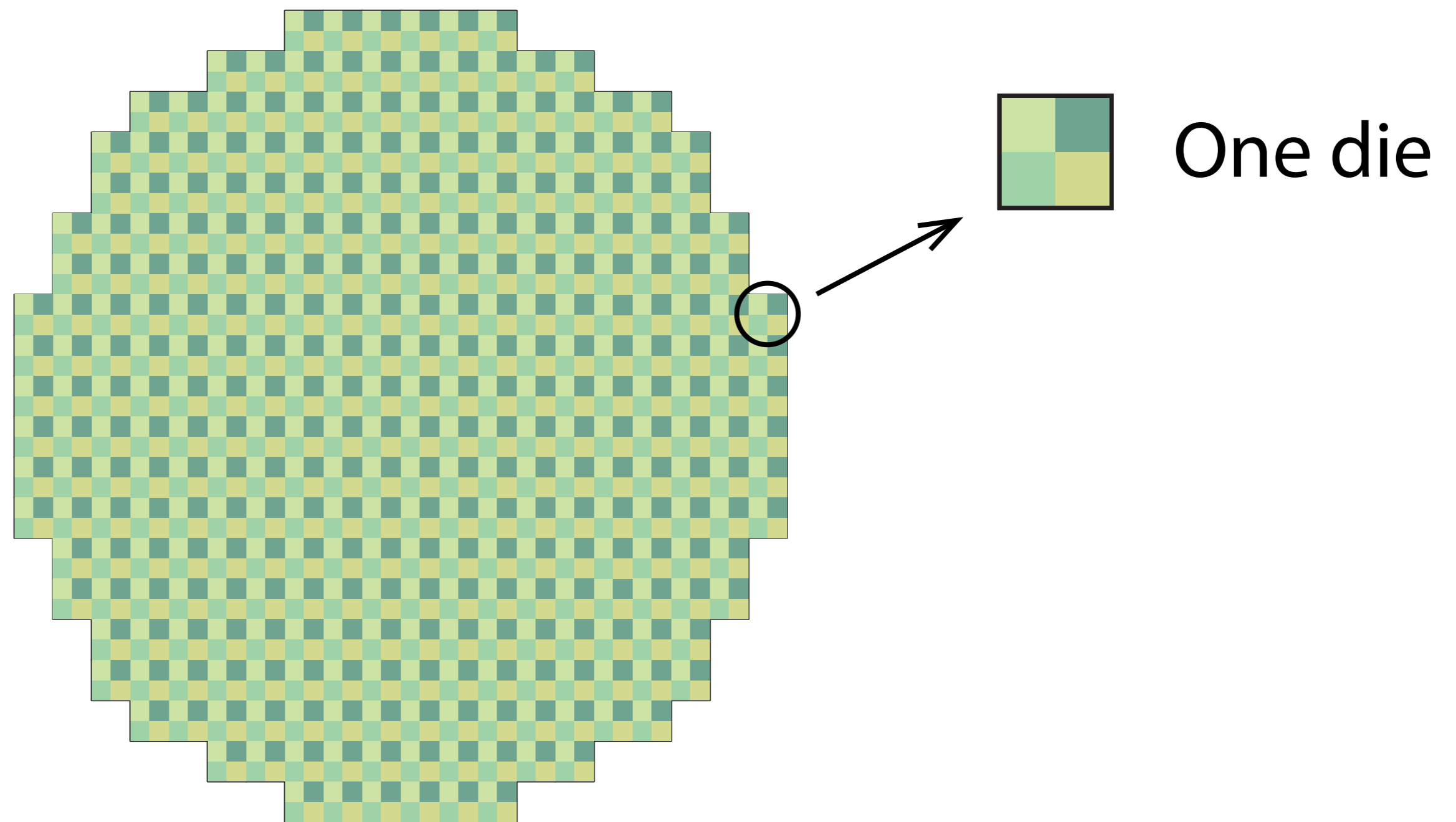
Outline

1. What?
2. Why?
3. How?

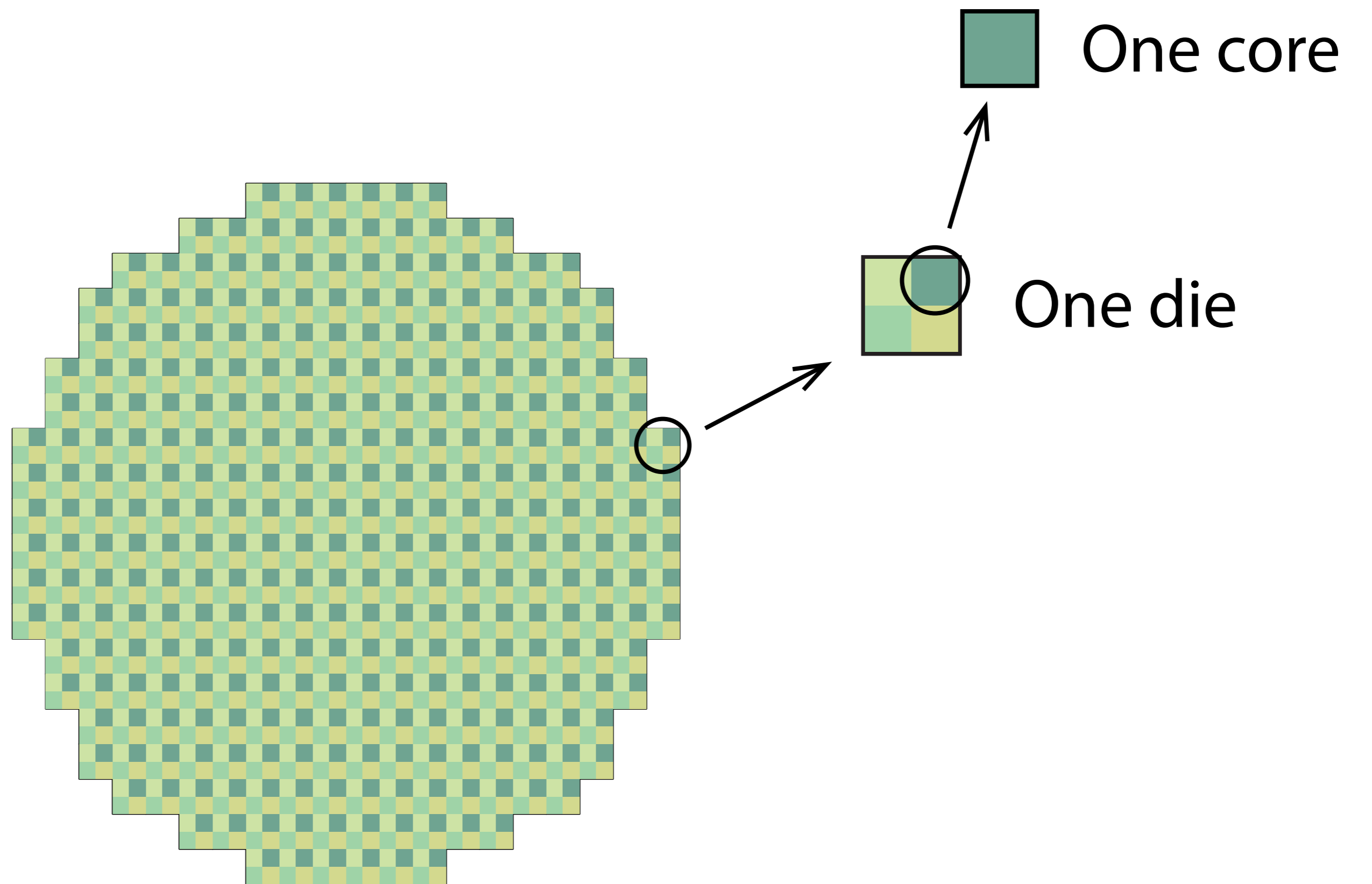
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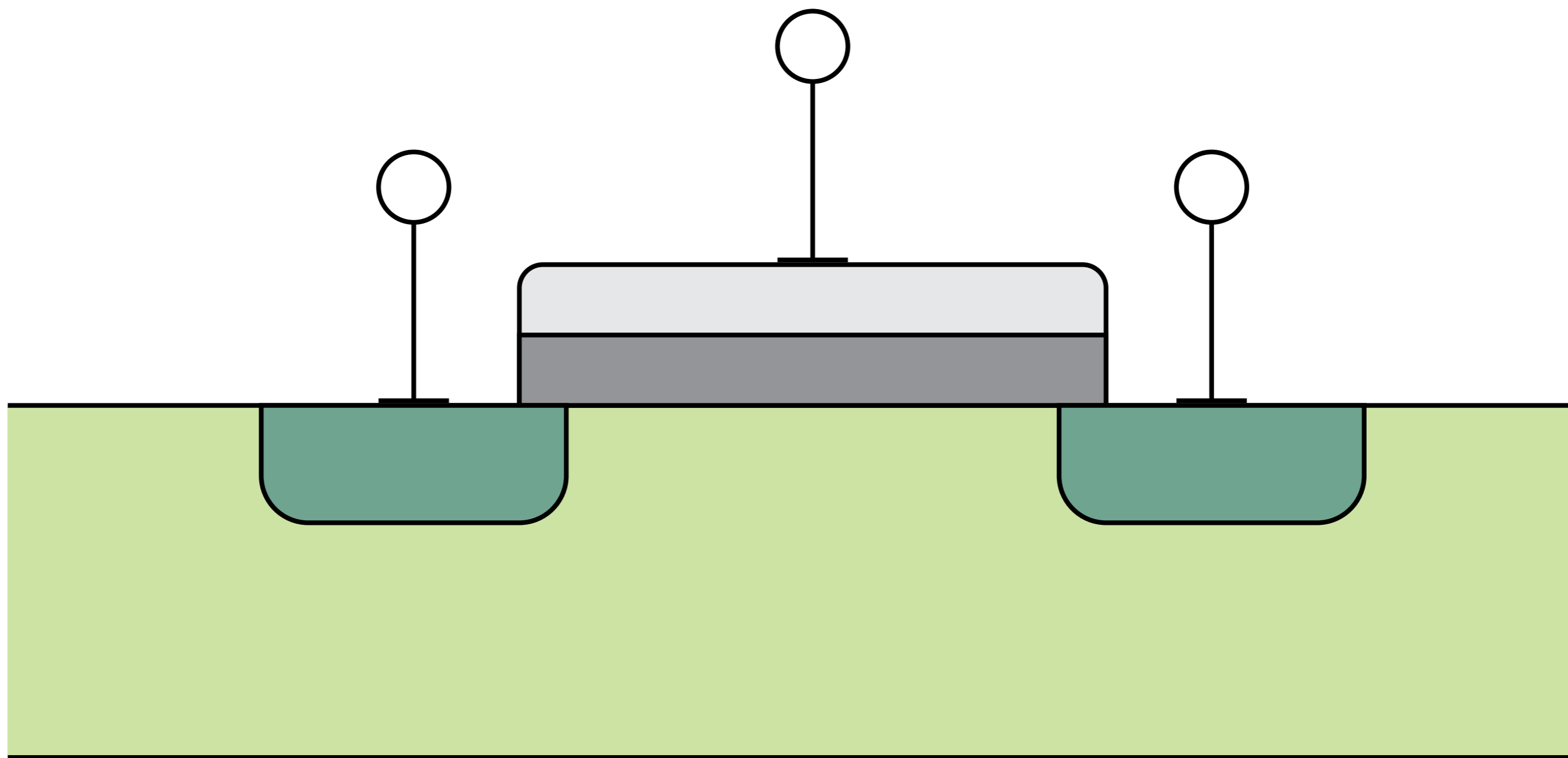
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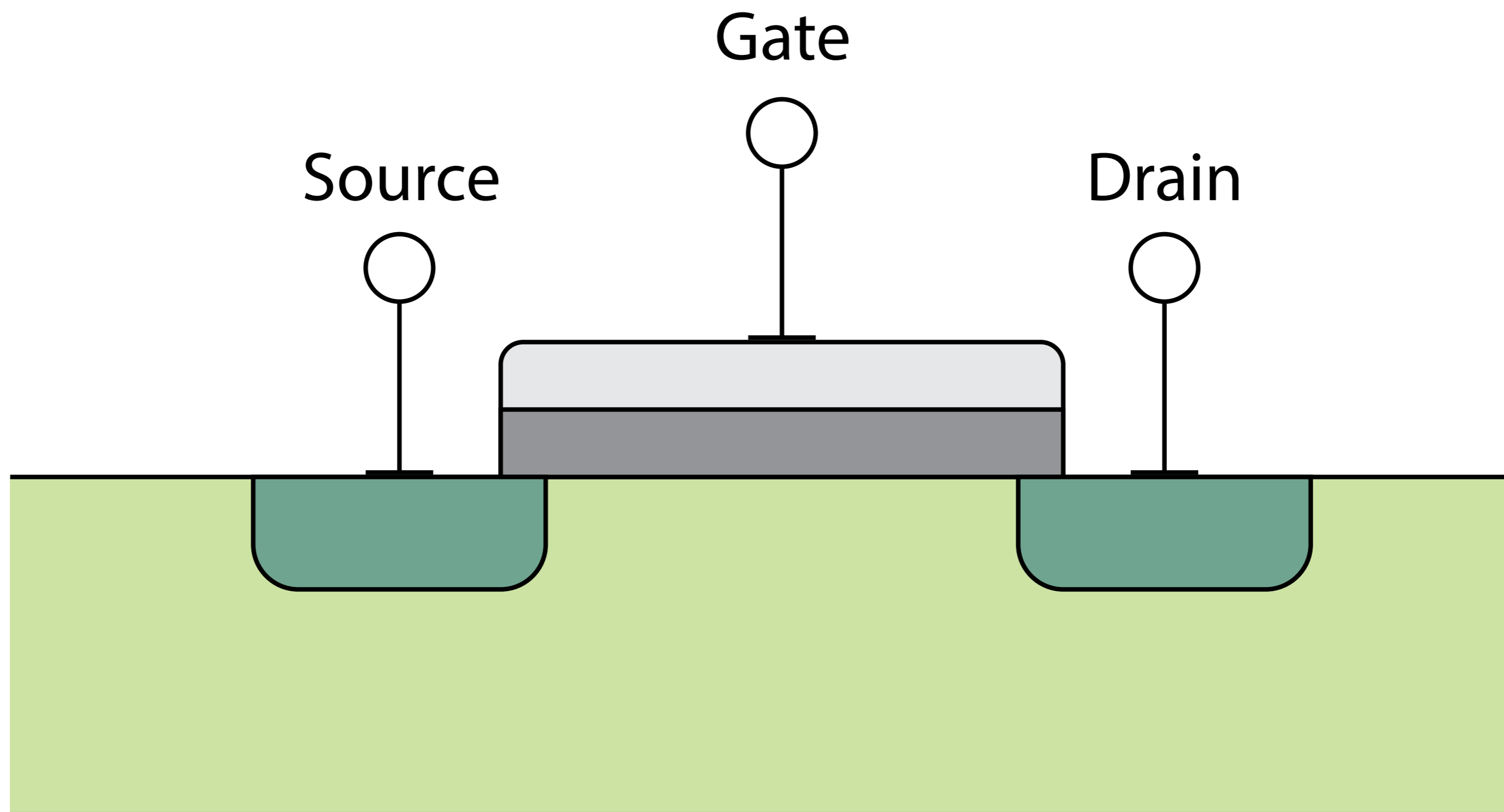
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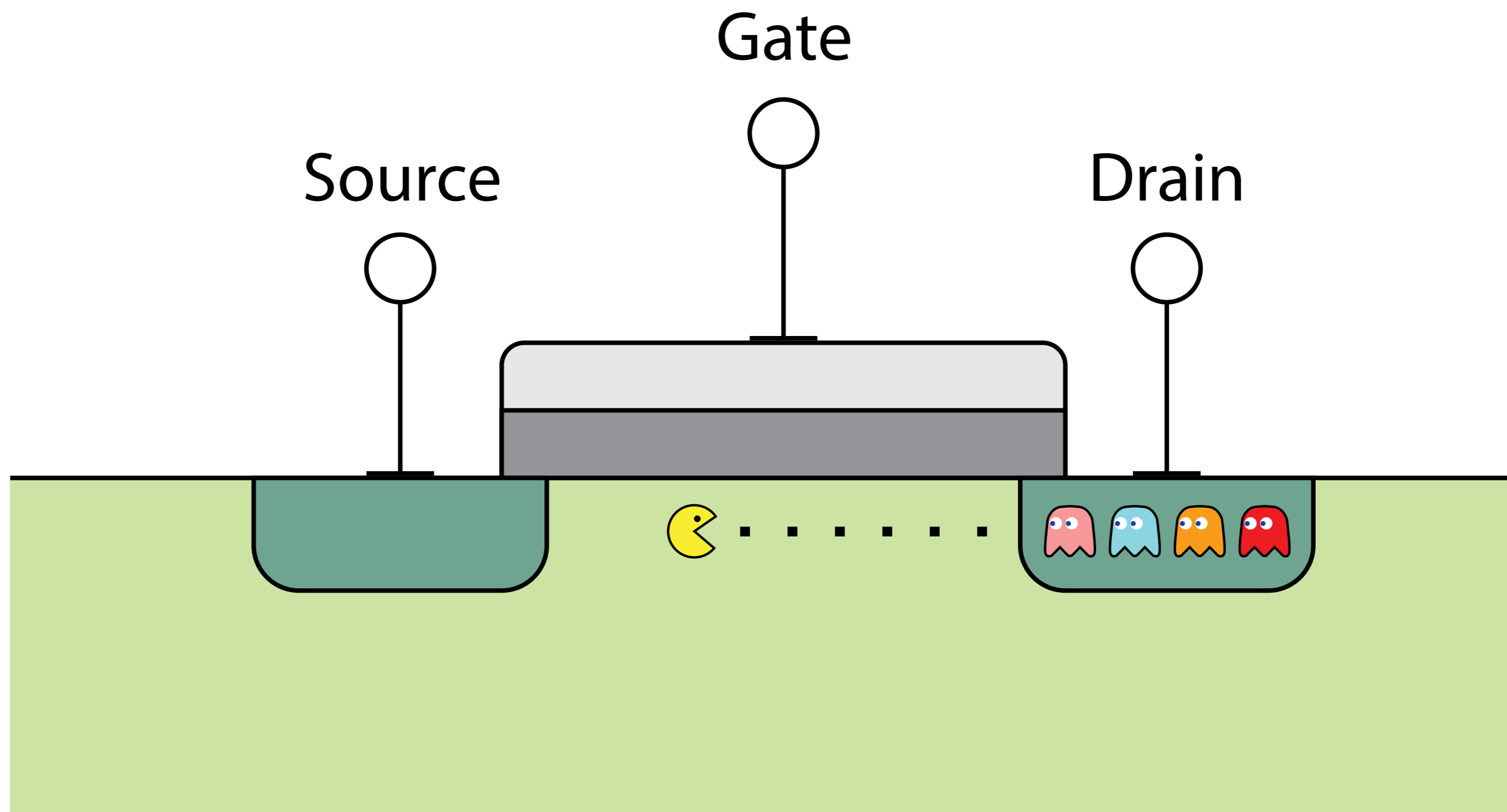
Transistor



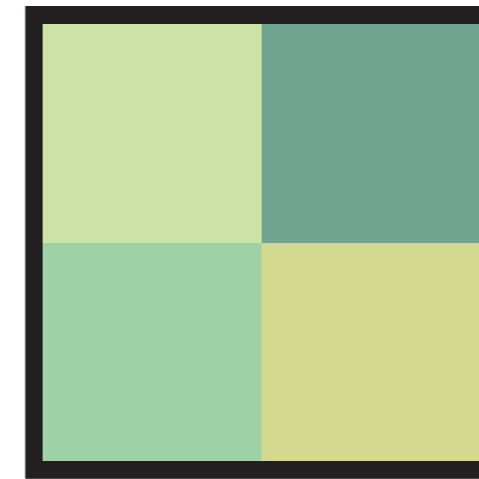
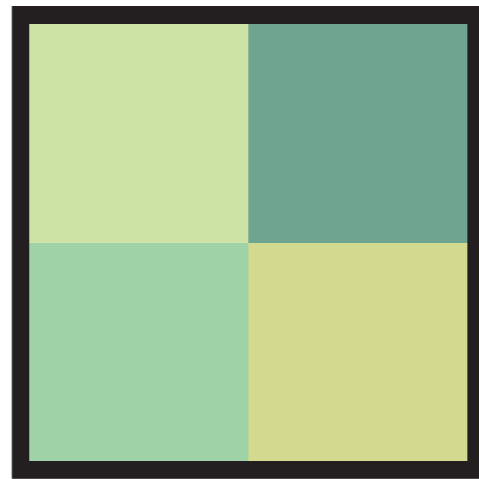
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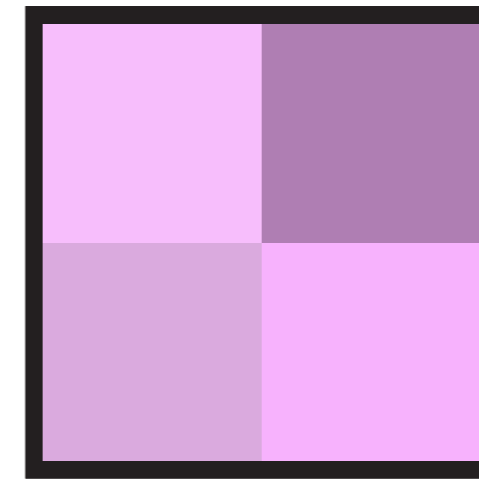
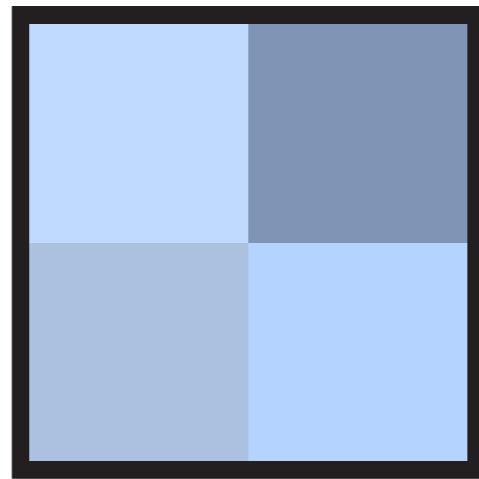
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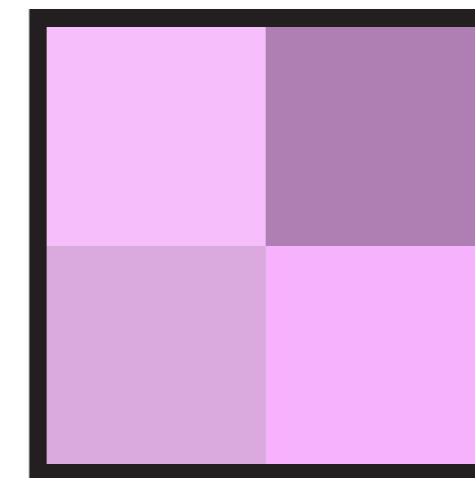
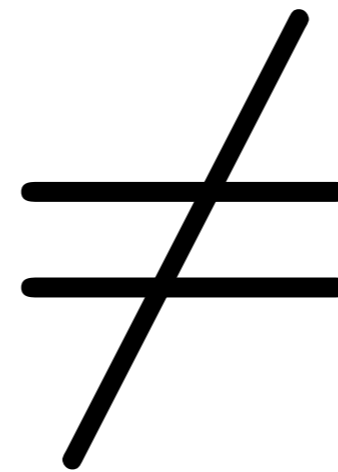
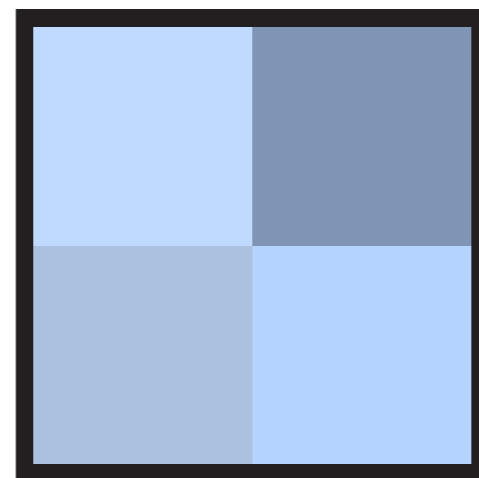
Process Variation



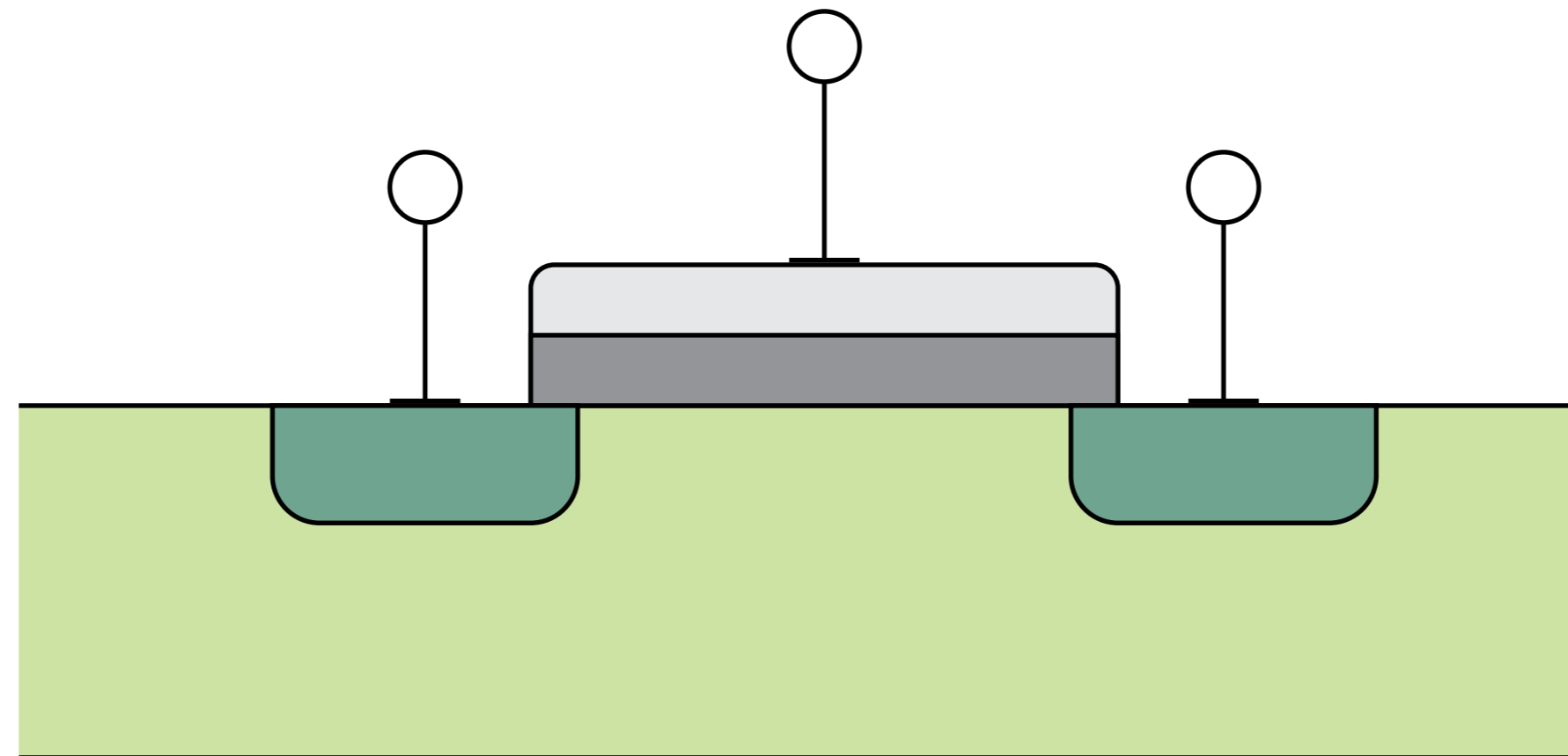
Process Variation



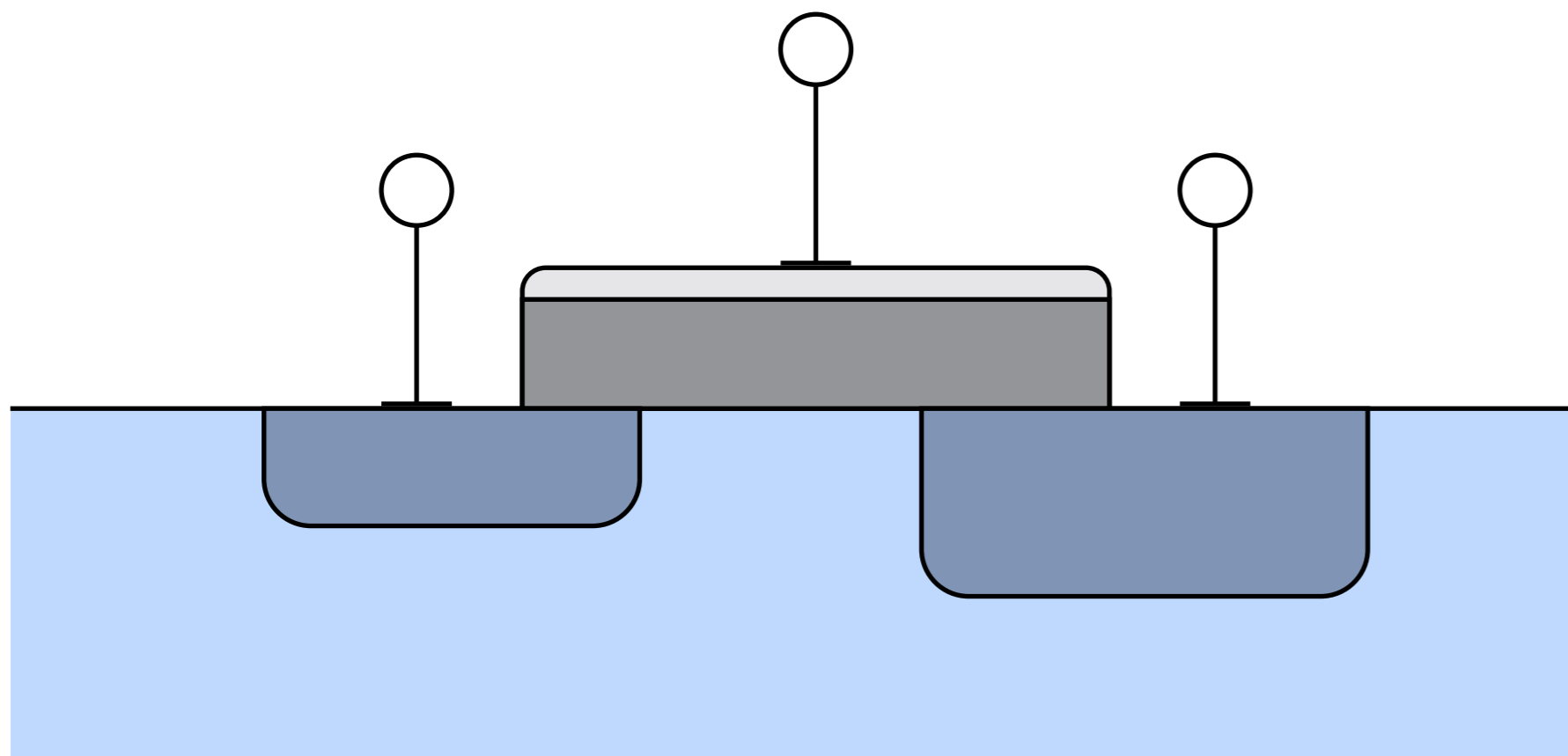
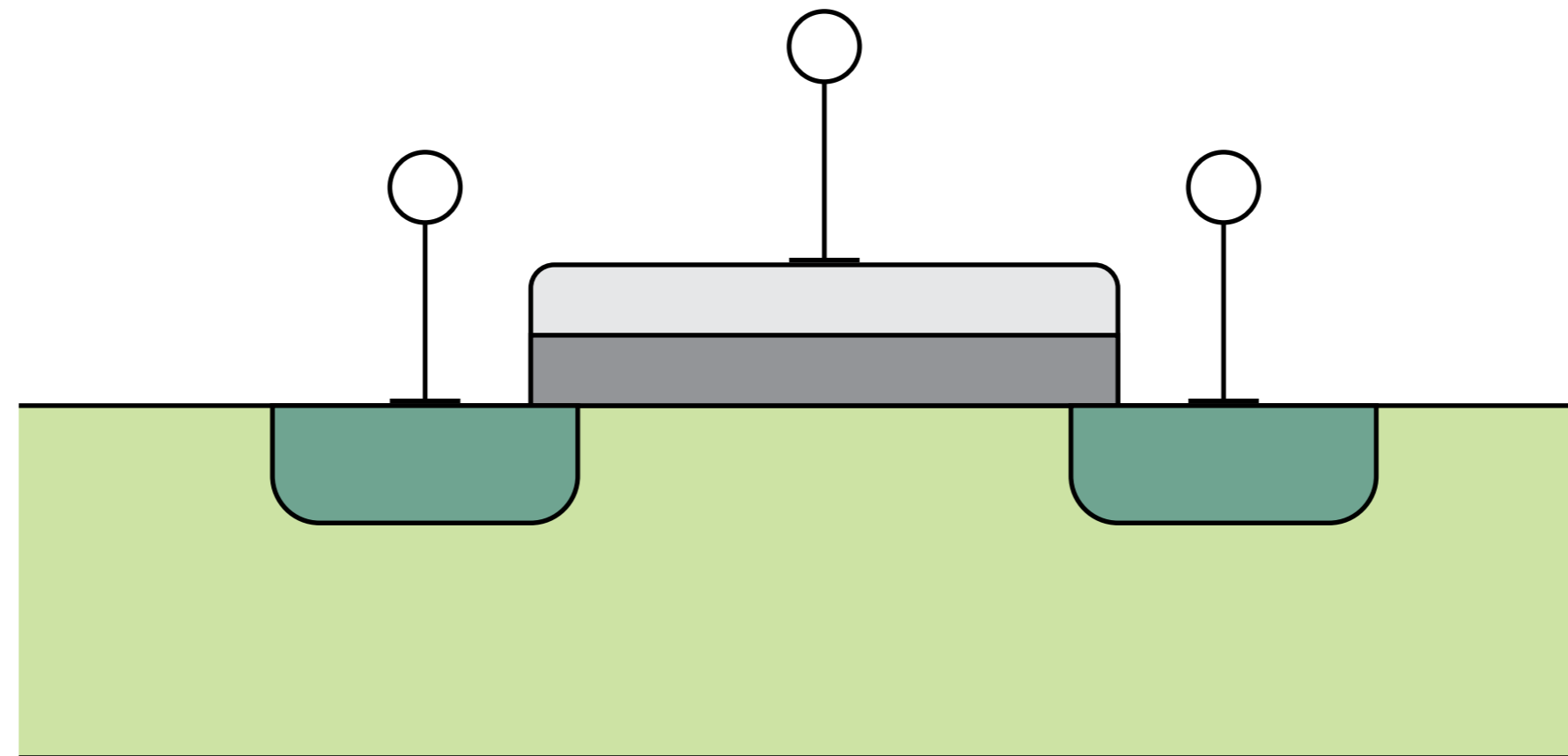
Process Variation



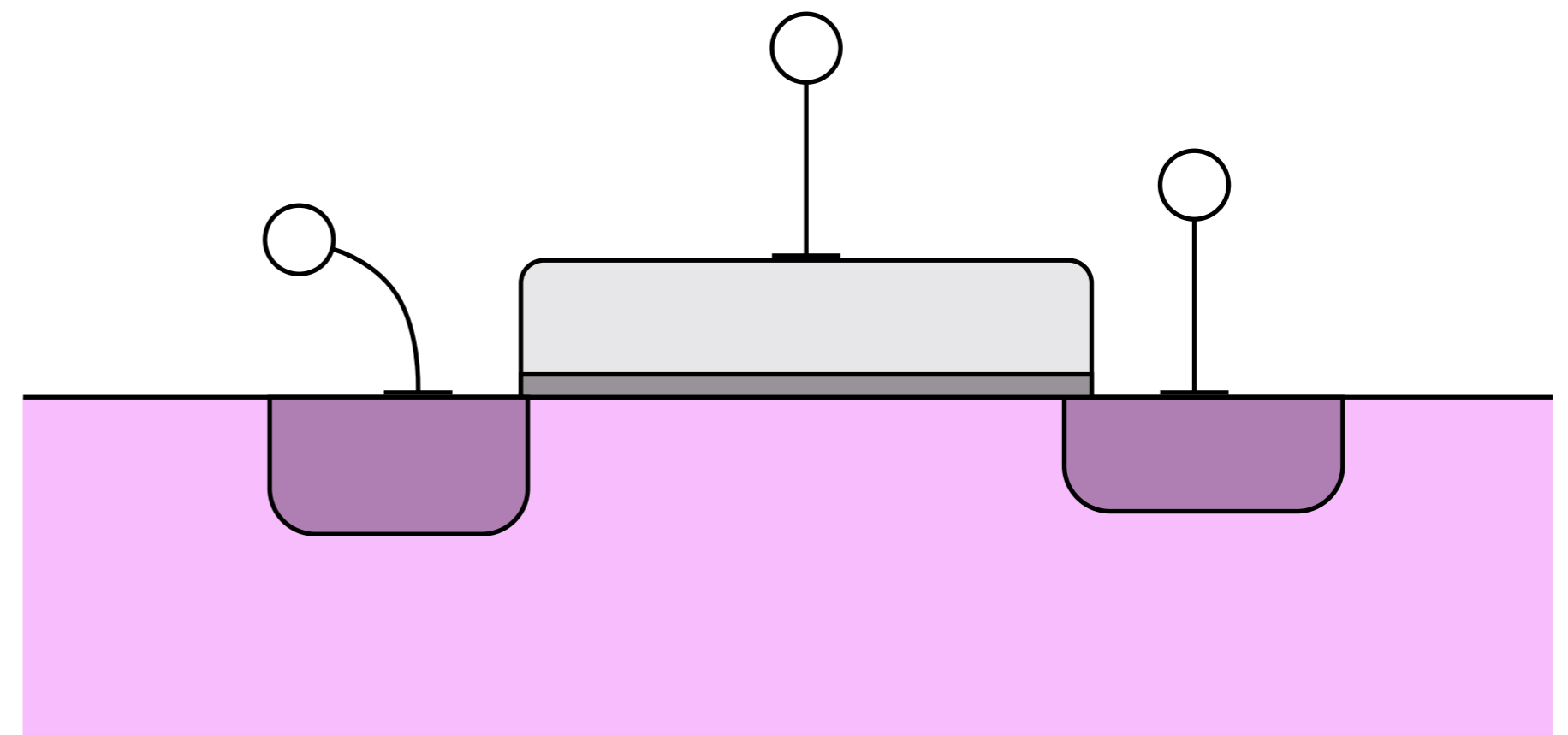
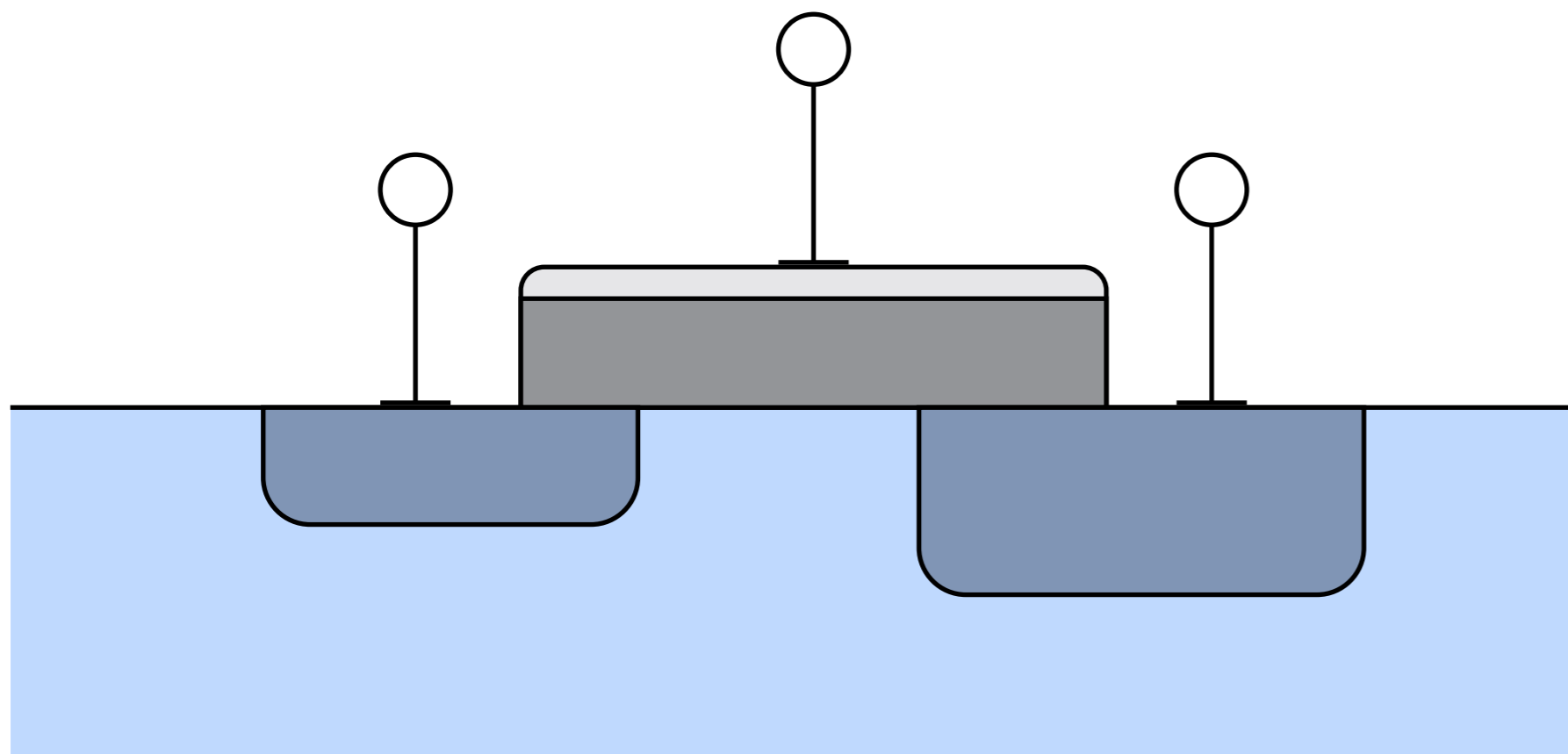
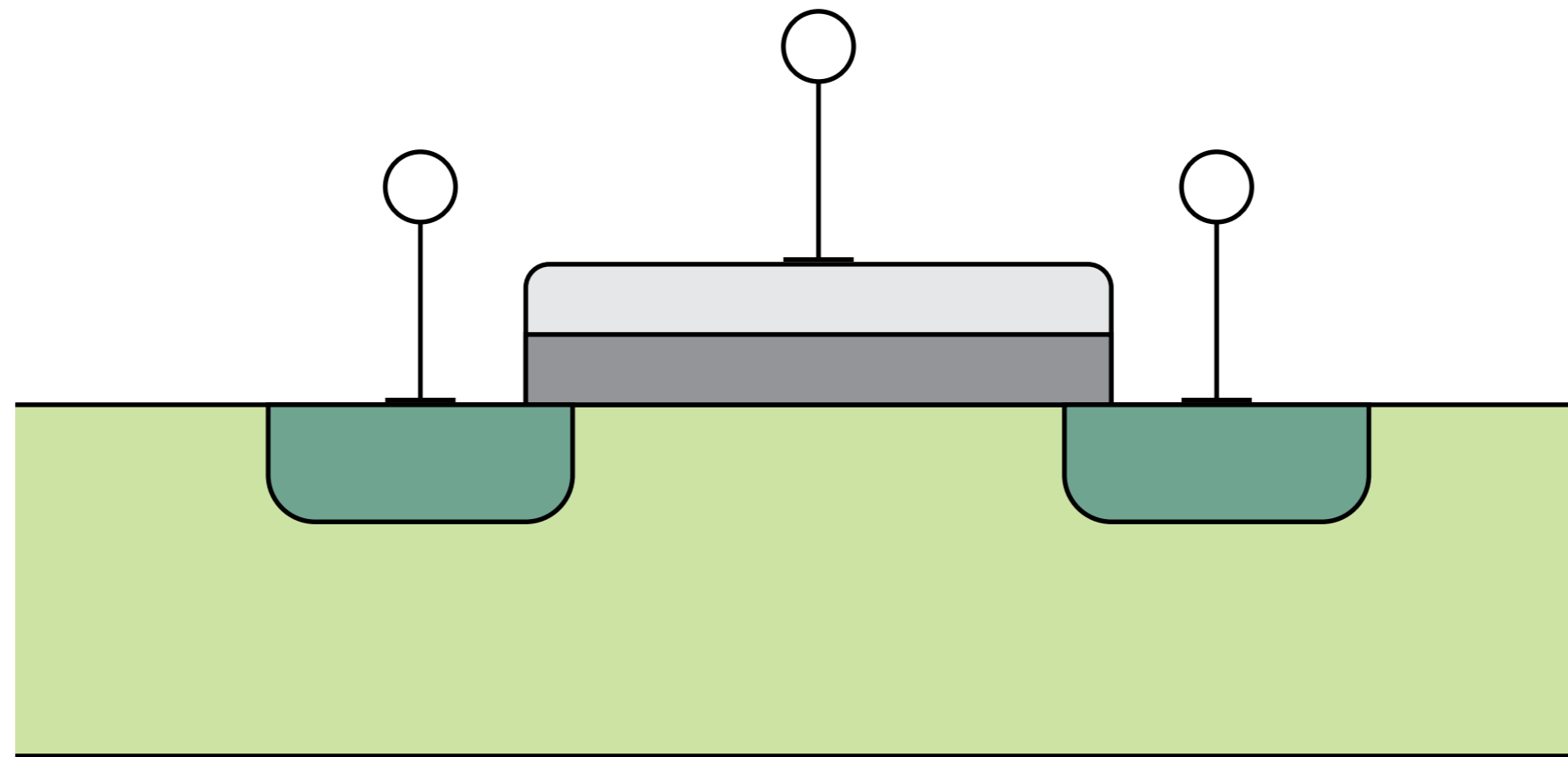
Process Variation



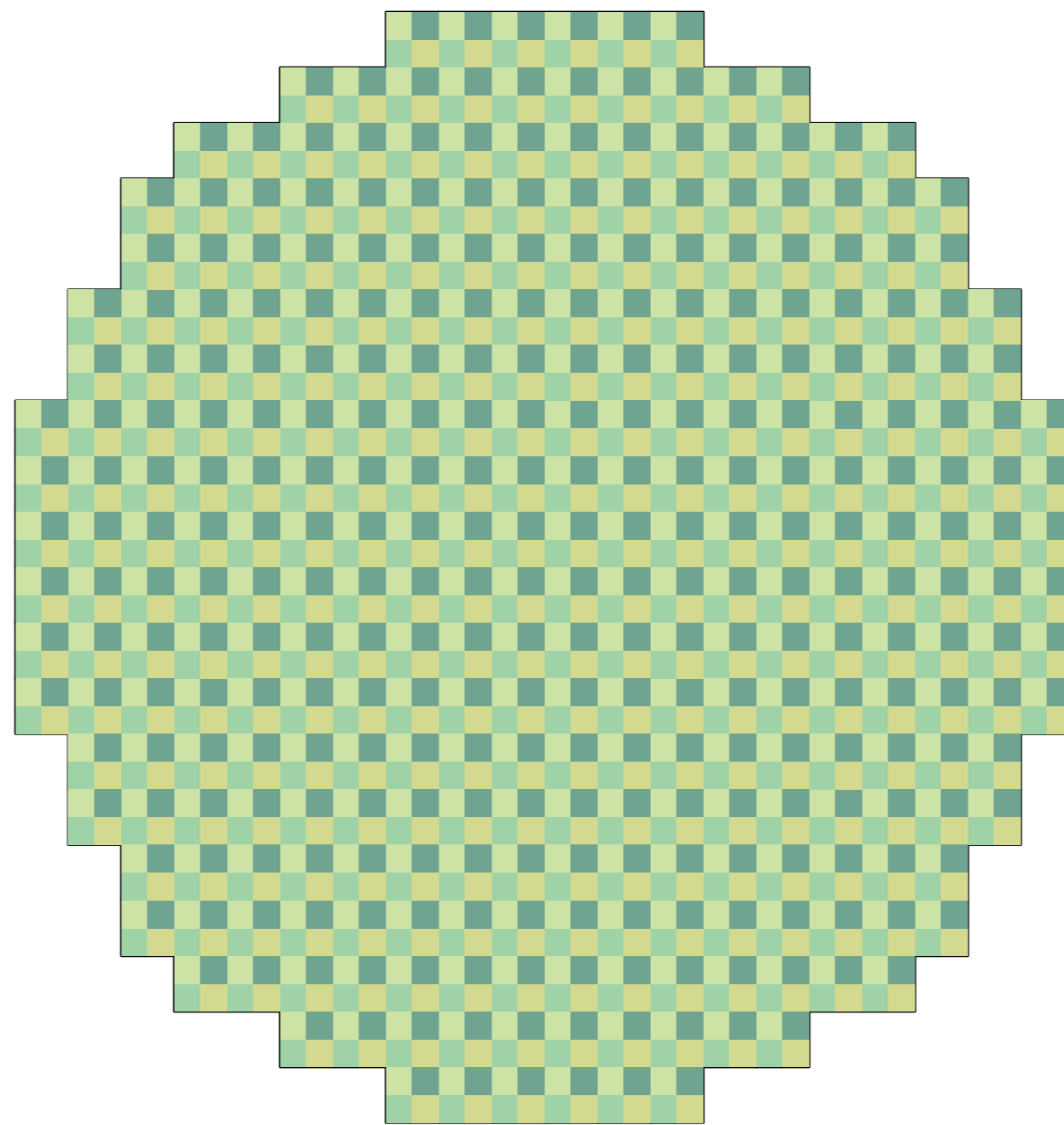
Process Variation



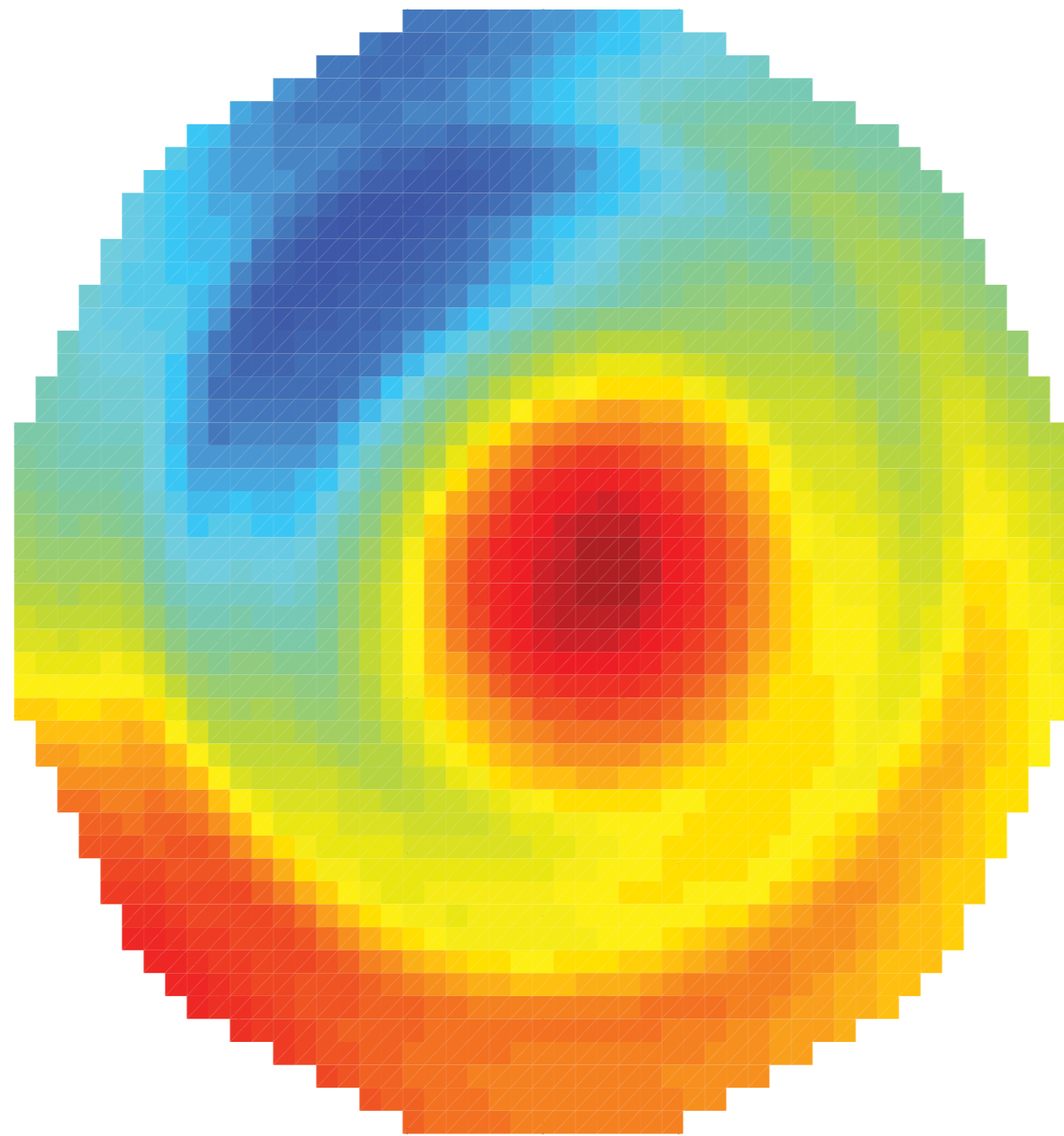
Process Variation



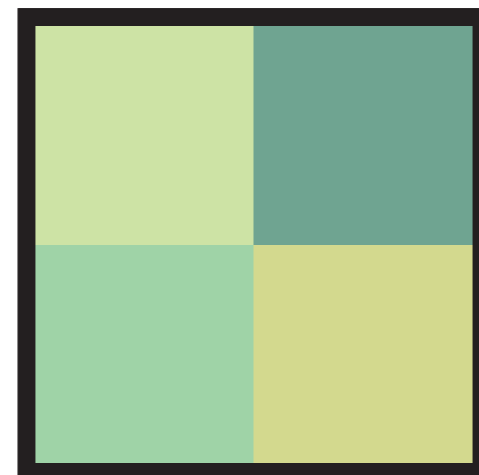
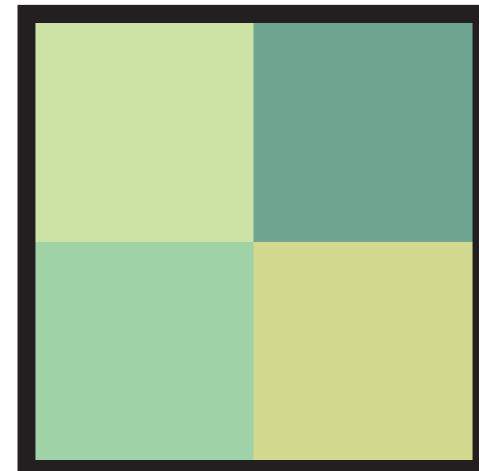
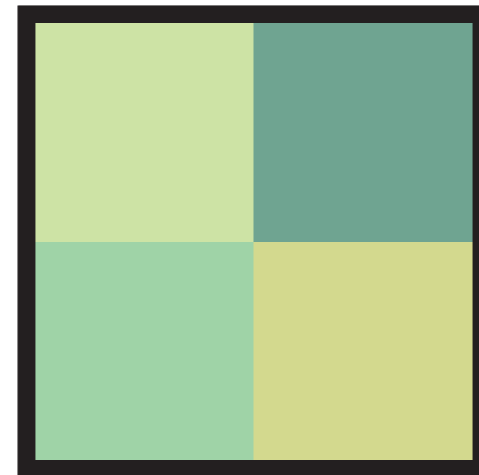
Process Variation



Process Variation

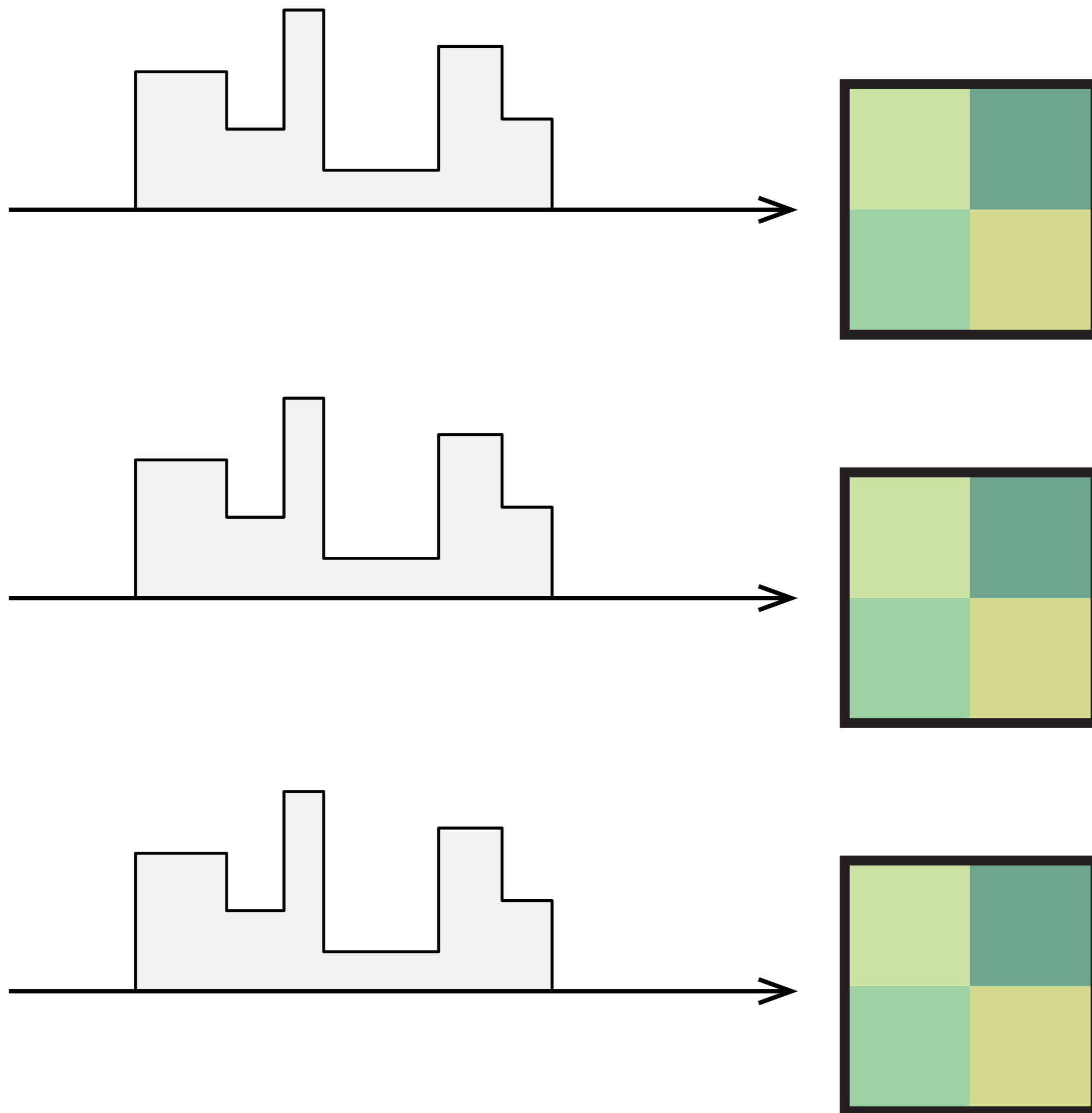


Process Variation



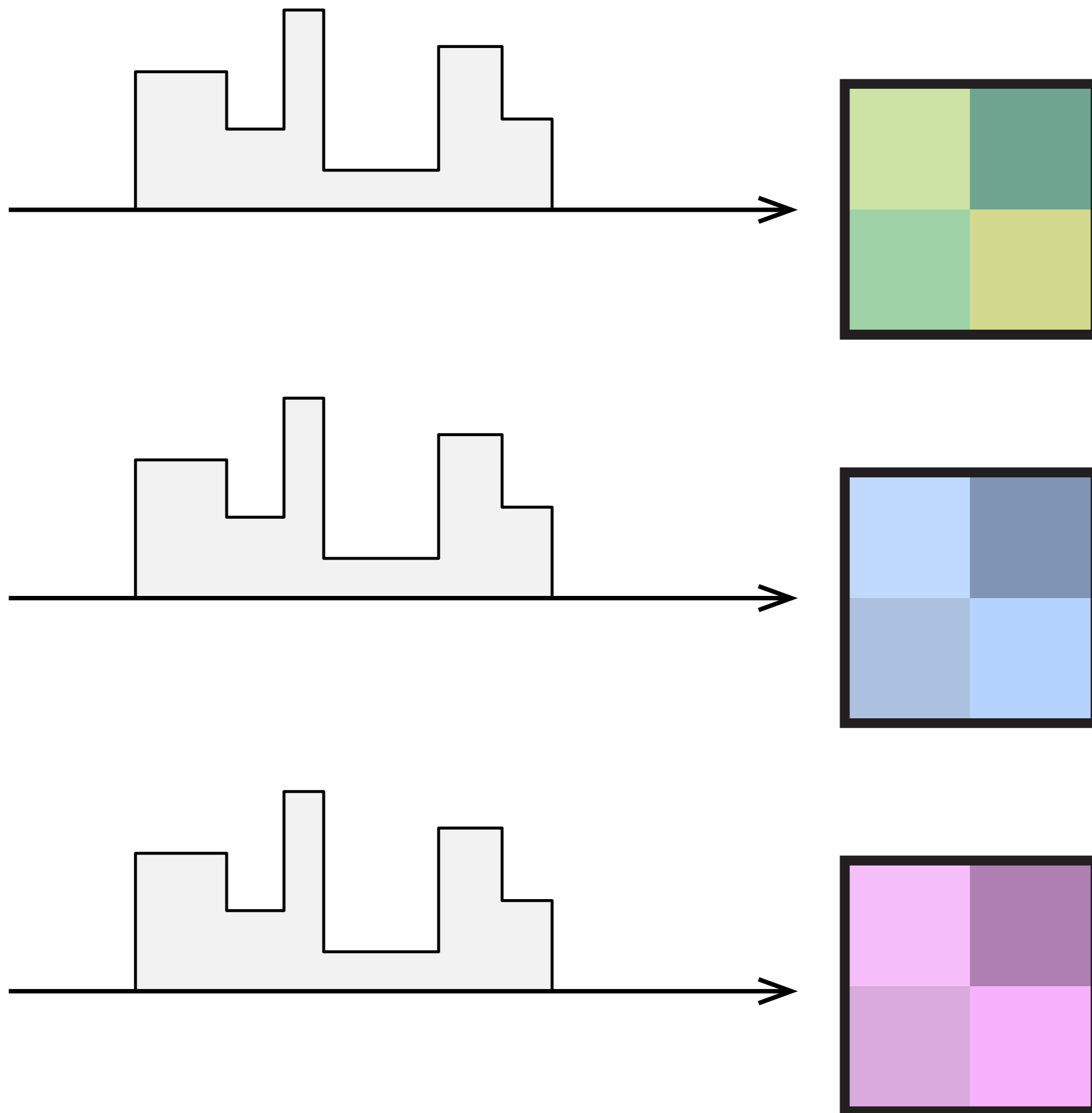
Process Variation

Workload



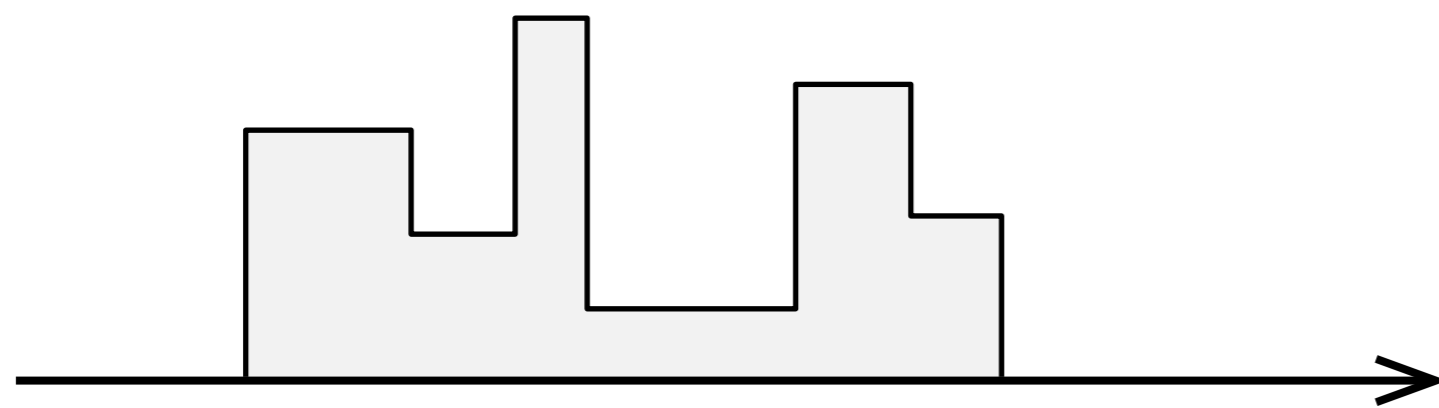
Process Variation

Workload

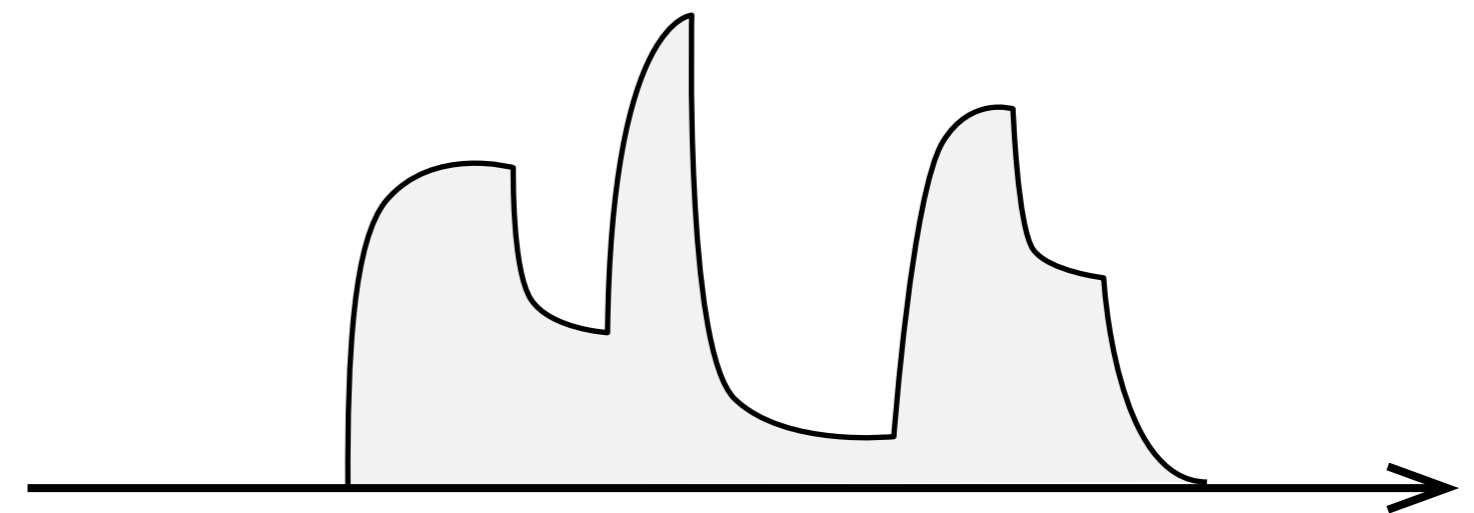
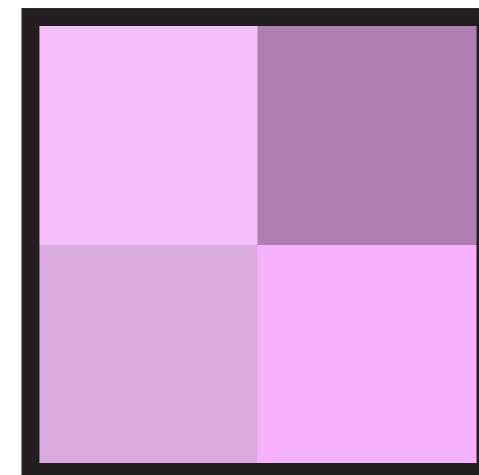
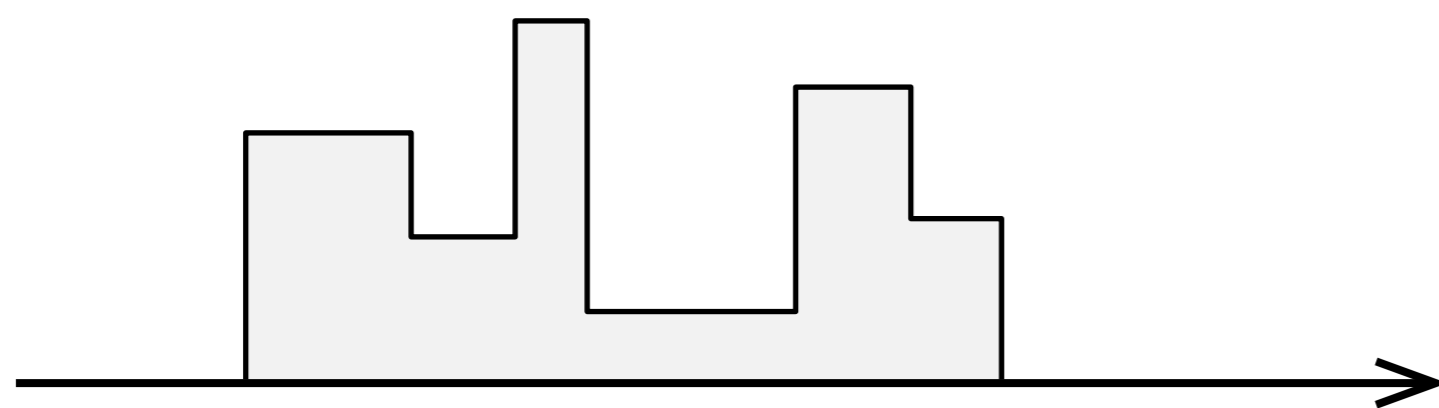
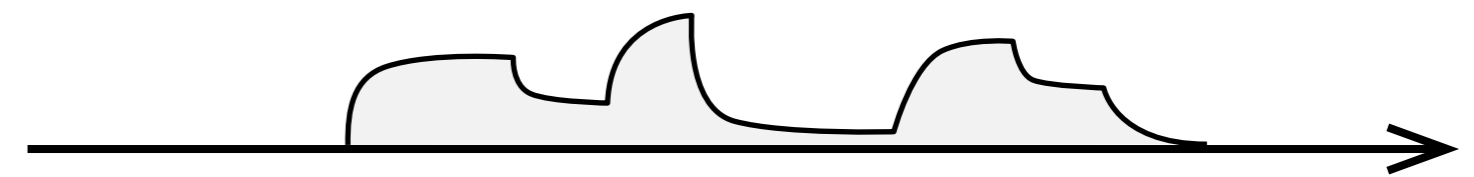
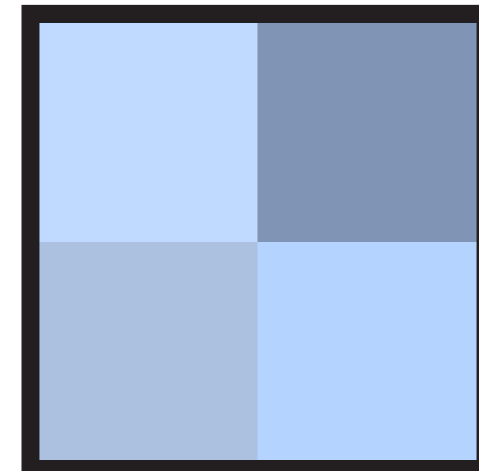
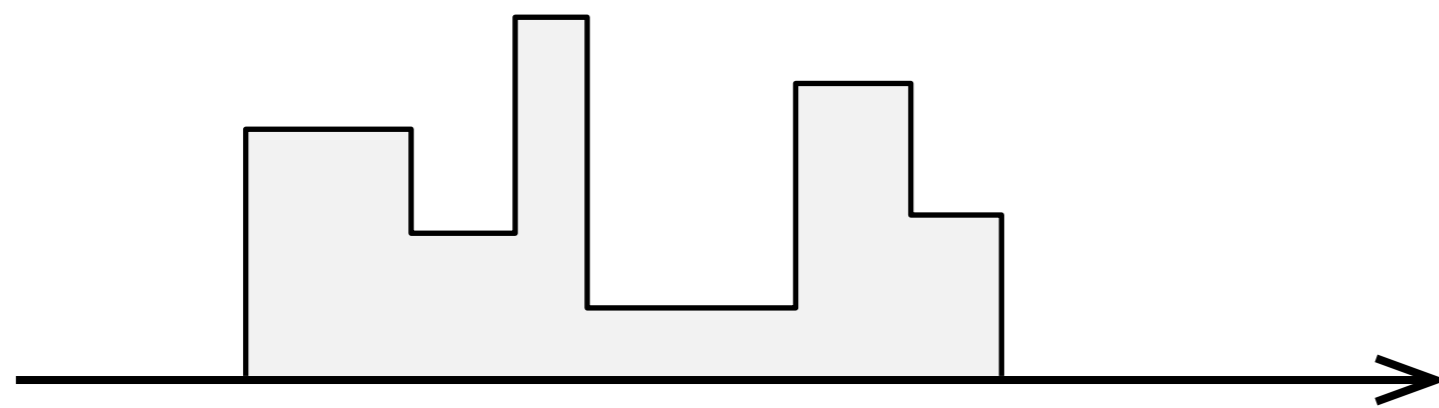
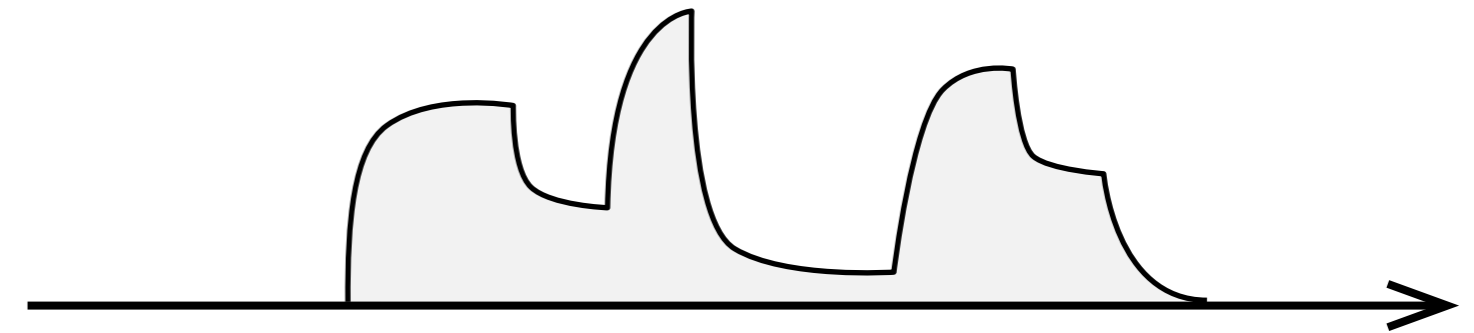


Process Variation

Workload

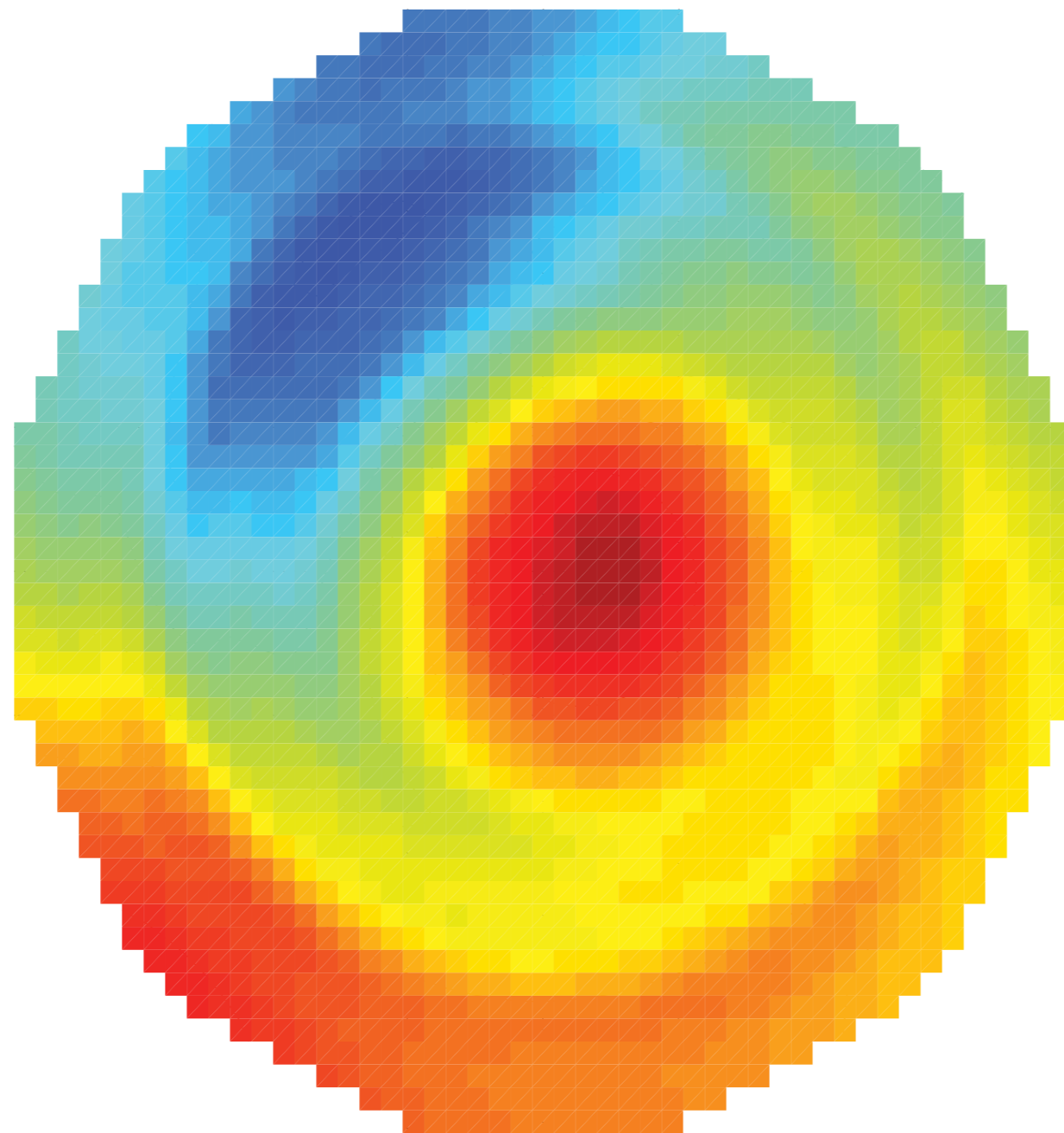


Temperature

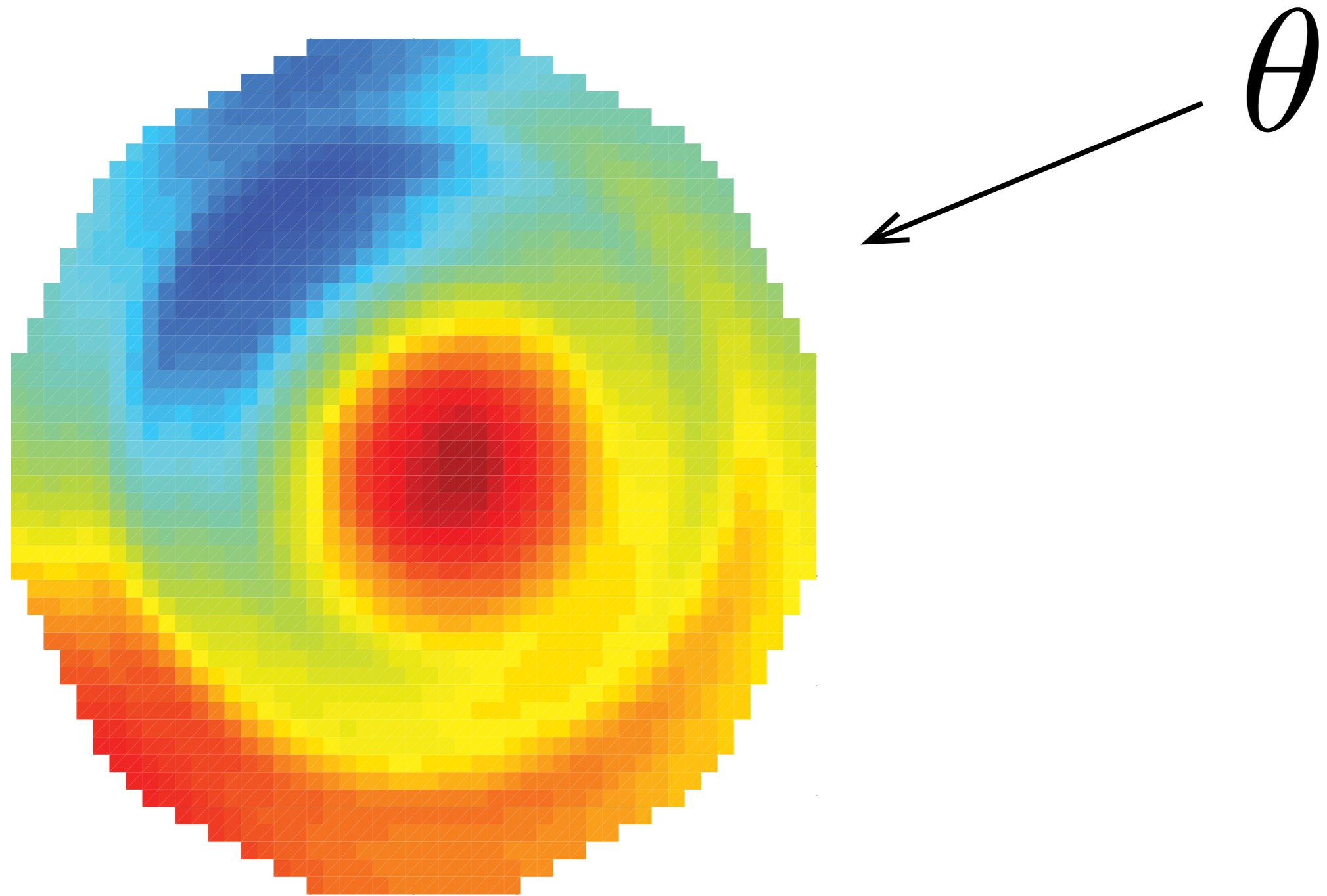


Goal

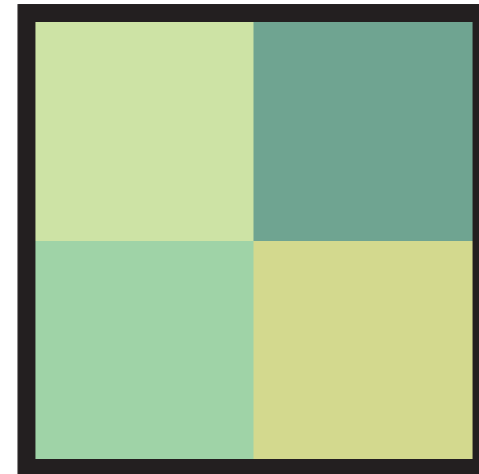
Goal



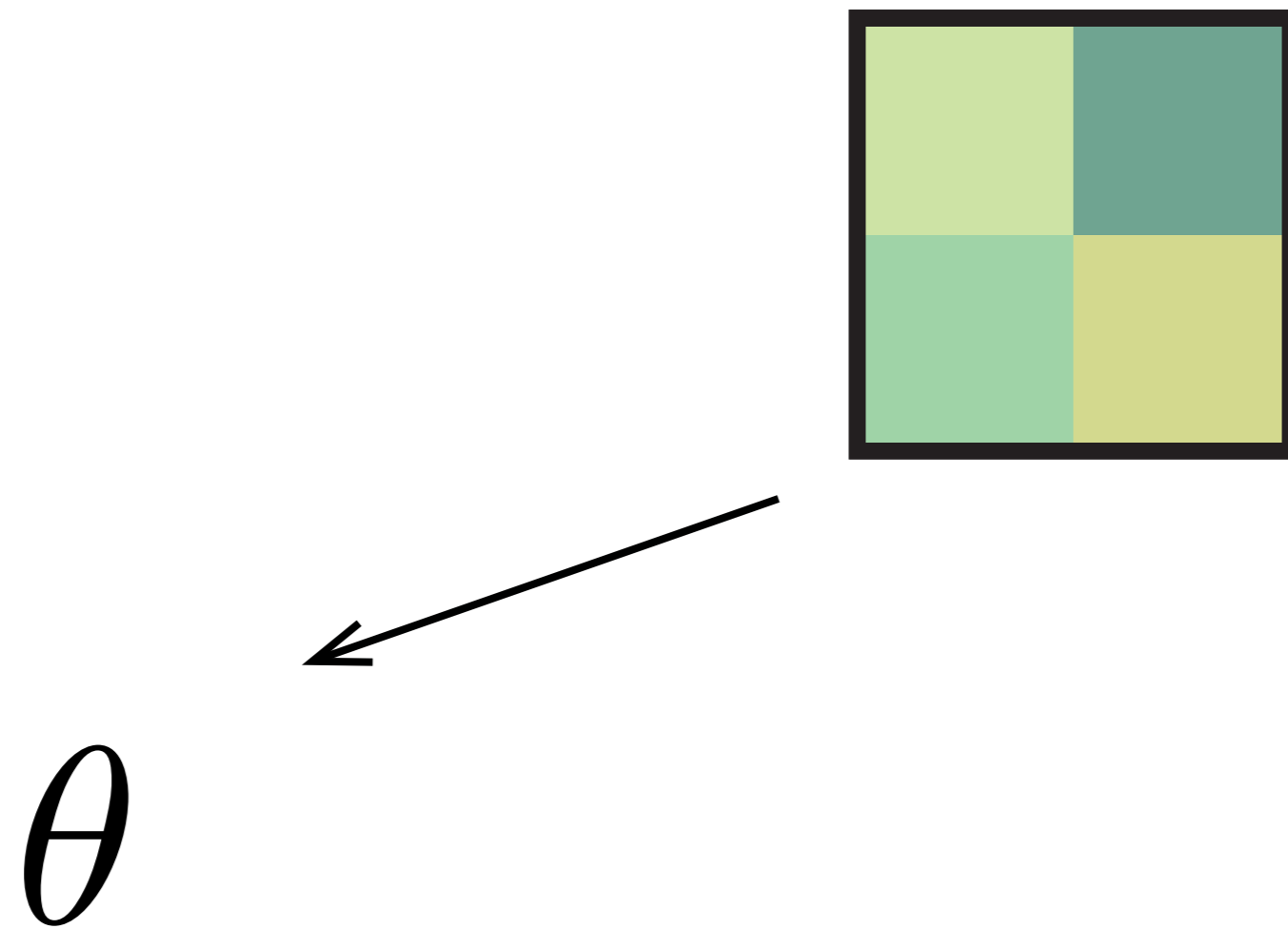
Goal



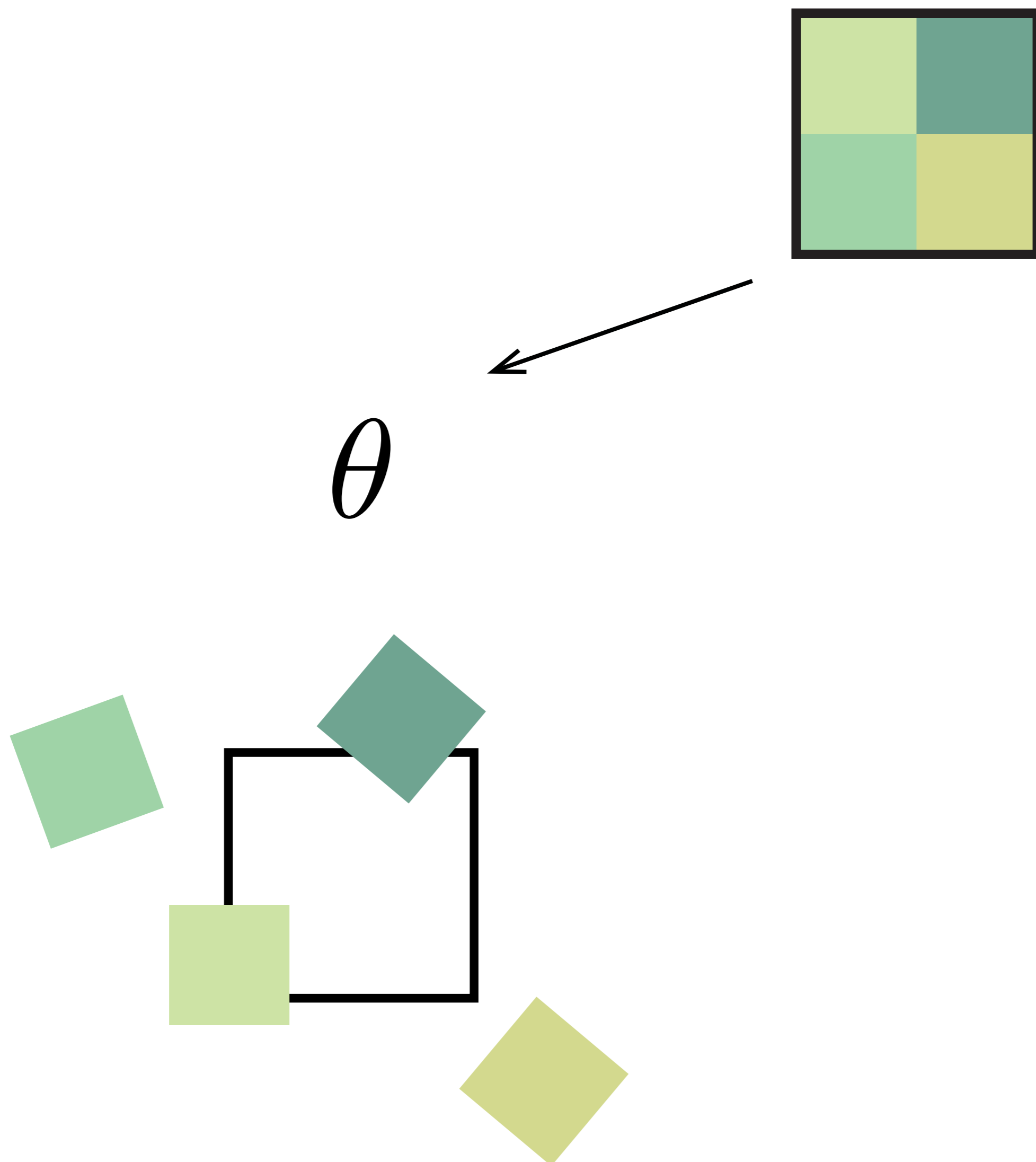
Alternatives



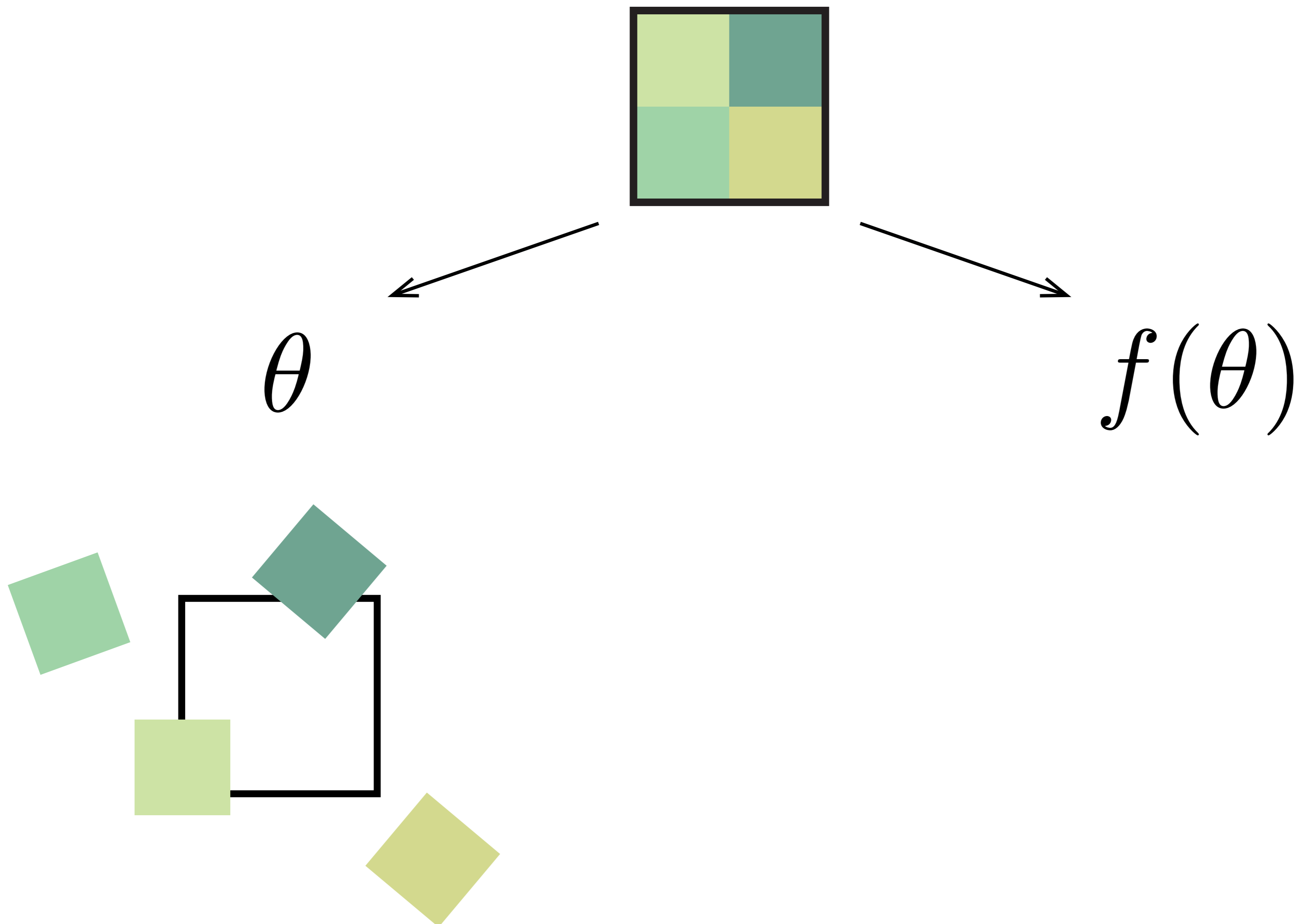
Alternatives



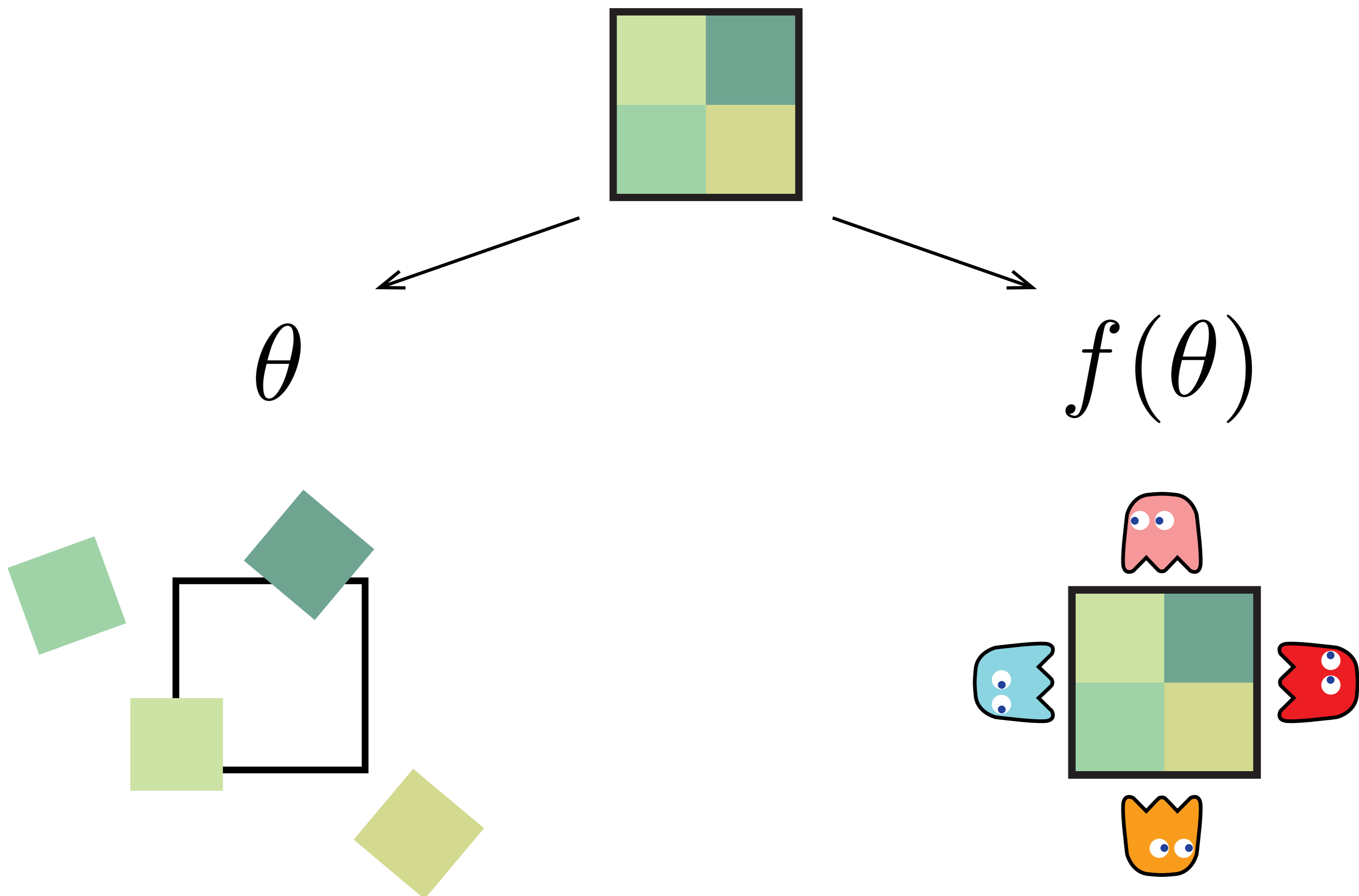
Alternatives



Alternatives



Alternatives

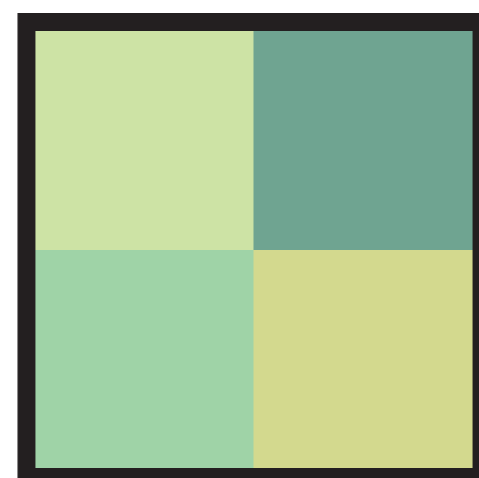
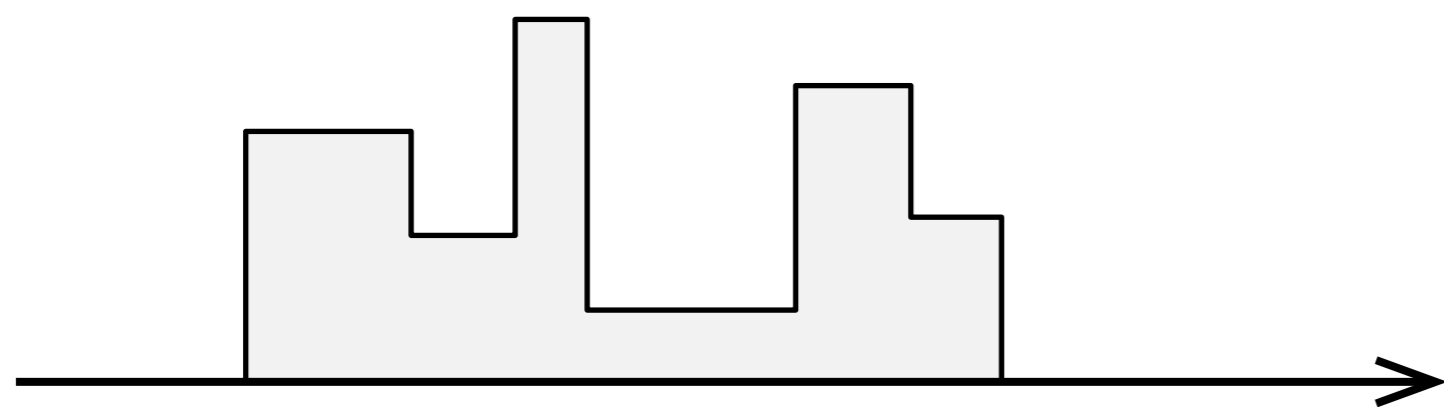


Our Solution

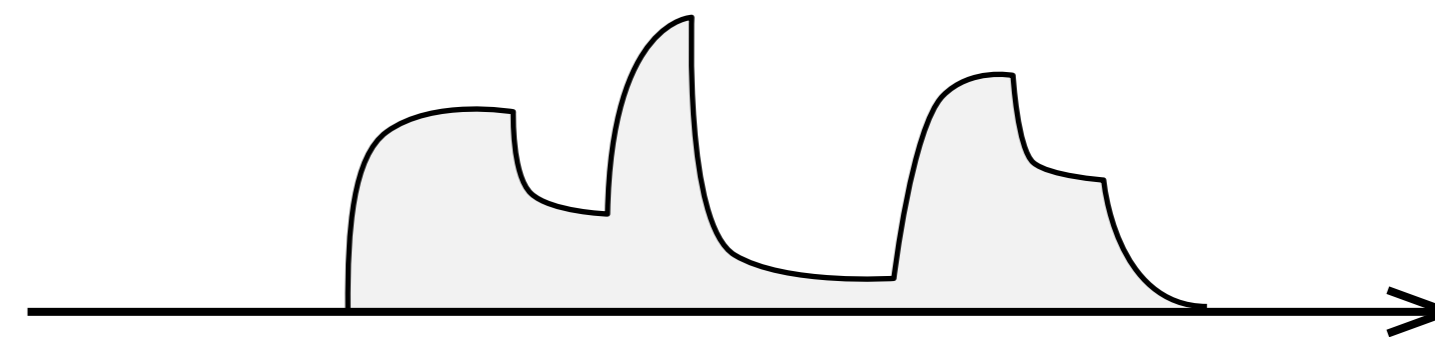


Our Solution

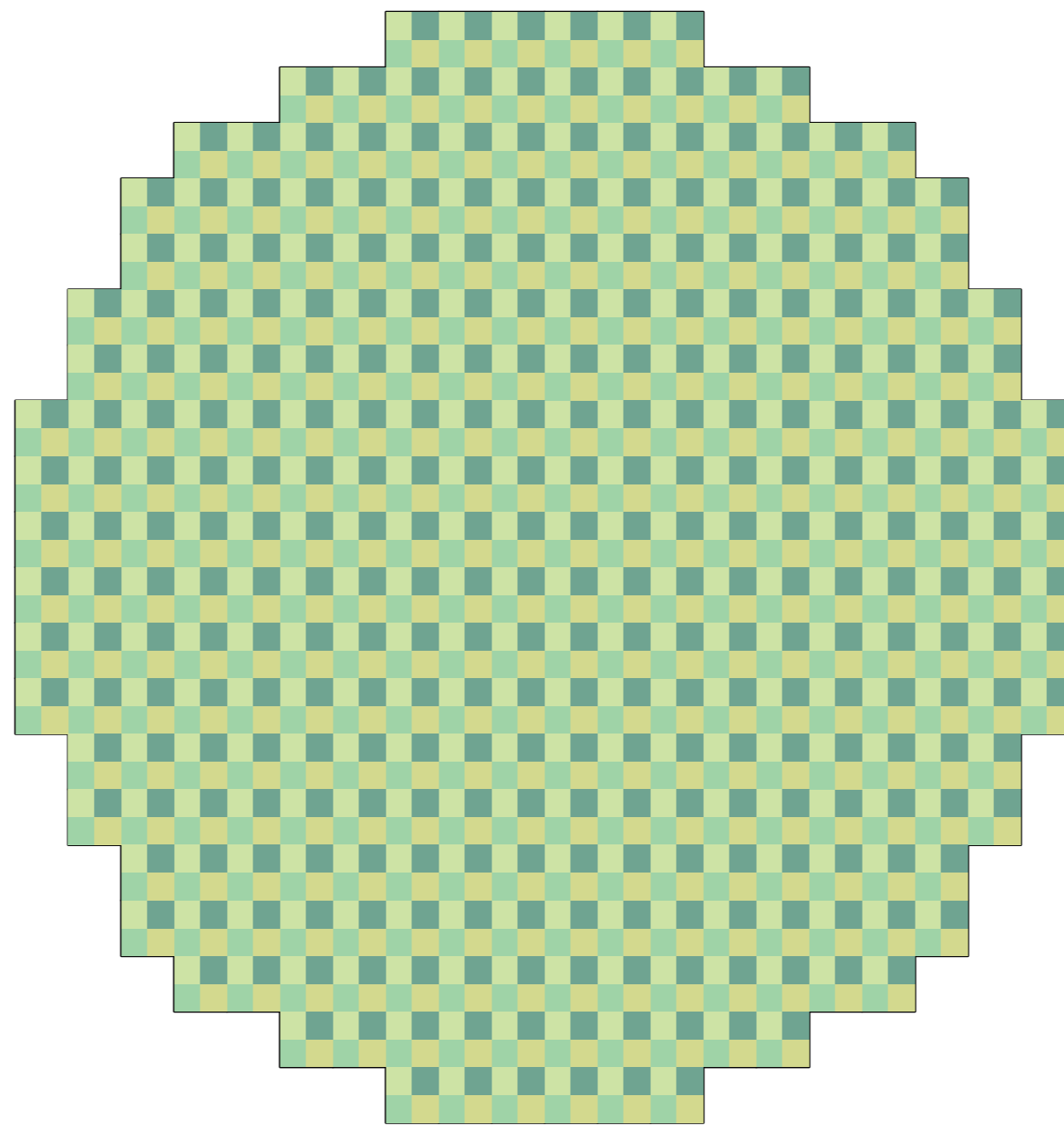
Workload



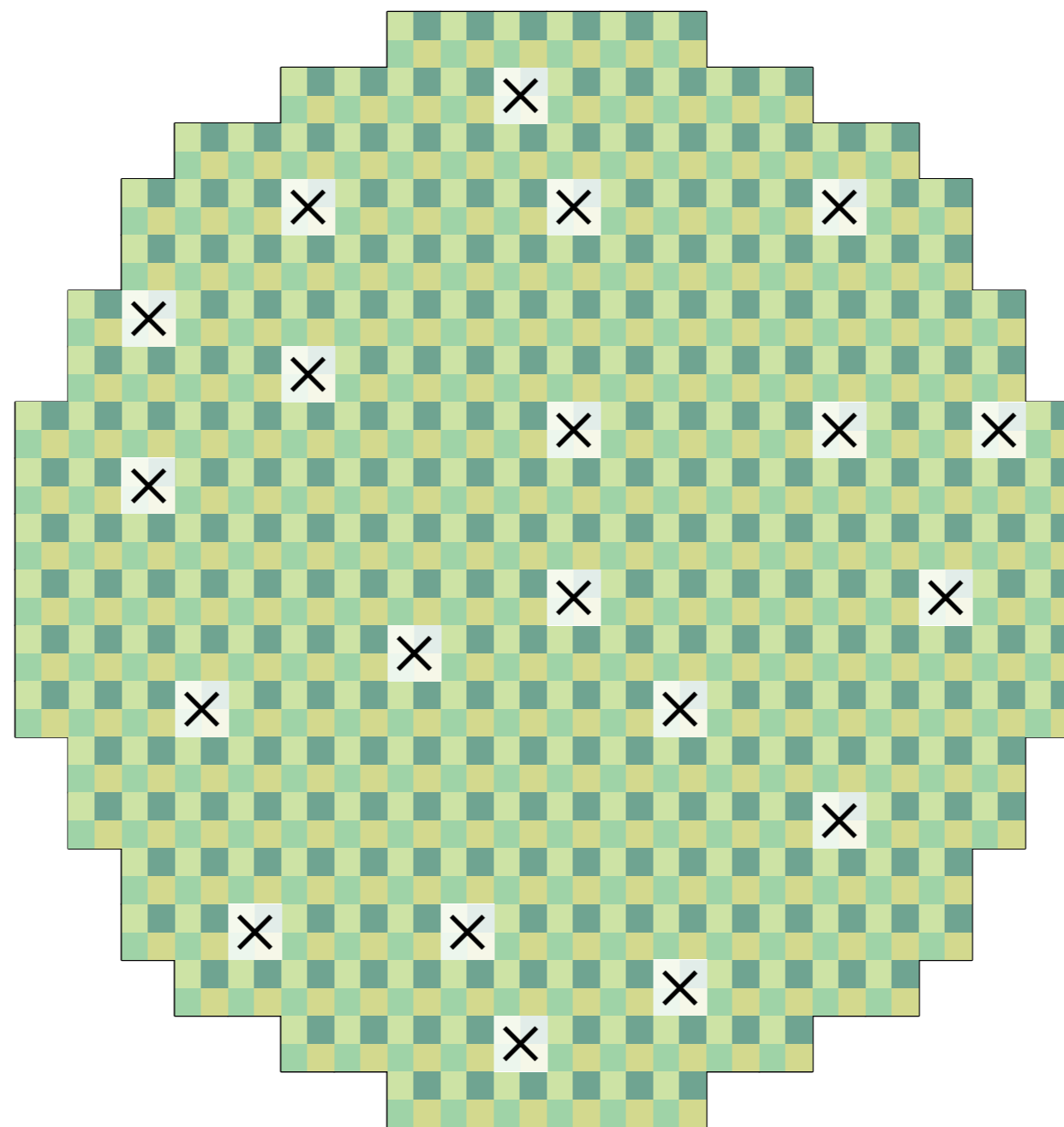
Temperature



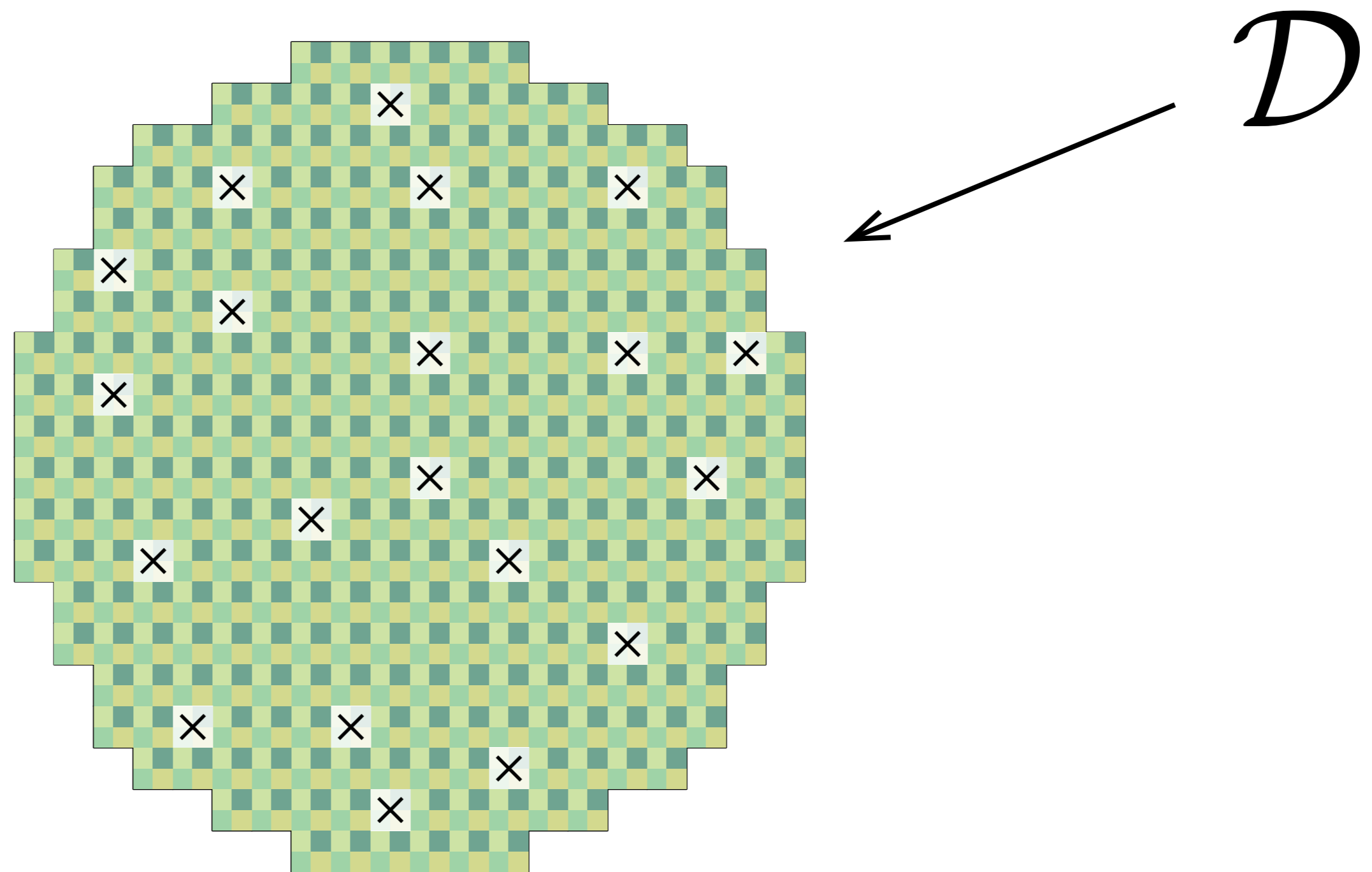
Our Solution



Our Solution



Our Solution



Our Solution

Our Solution

\mathcal{D}

Our Solution

\mathcal{D}

Indirect

Our Solution

\mathcal{D}

Indirect
Incomplete

Our Solution

\mathcal{D}

Indirect
Incomplete
Noisy

Our Solution

\mathcal{D}



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Indirect
Incomplete
Noisy

Our Solution



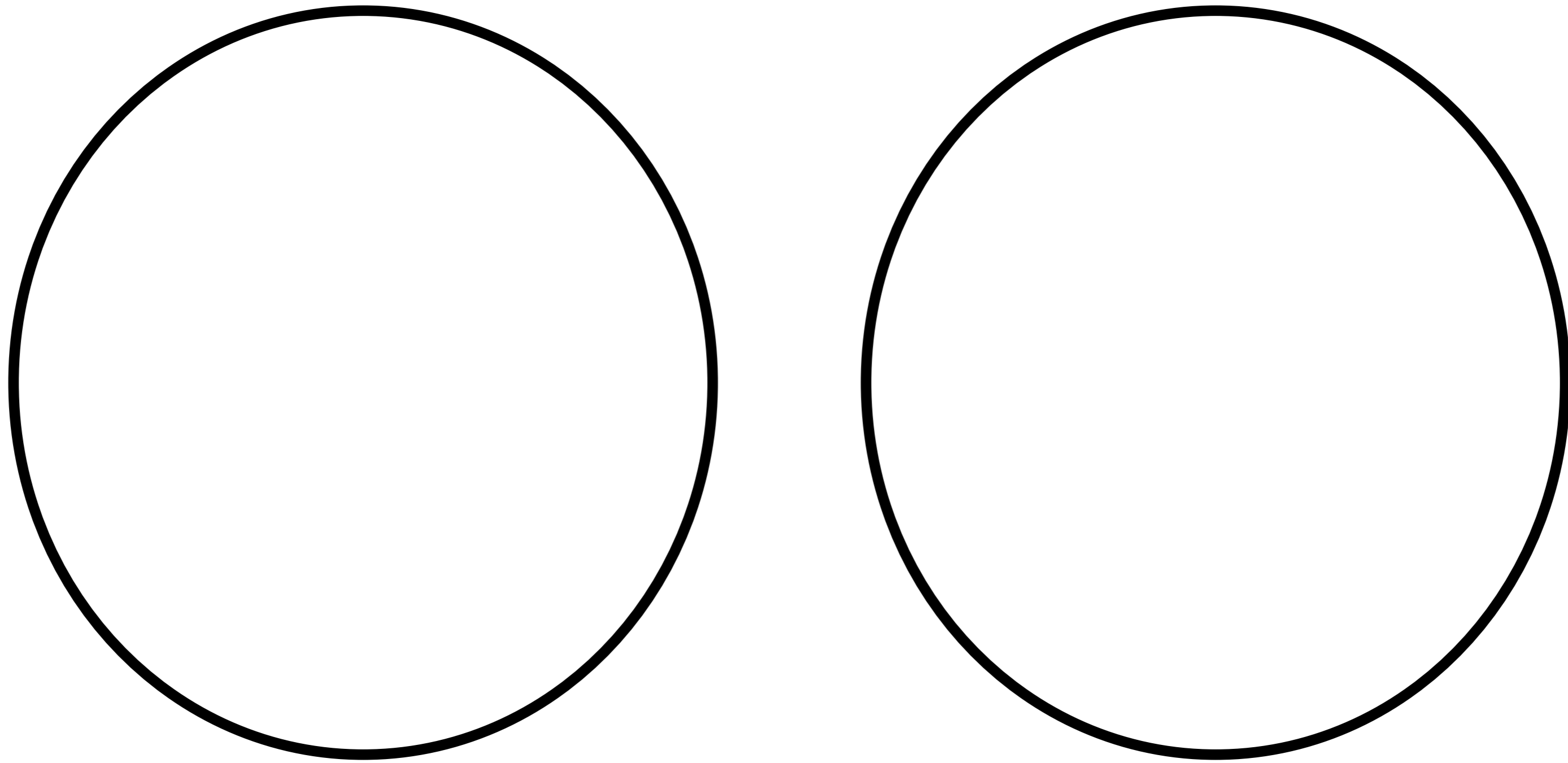
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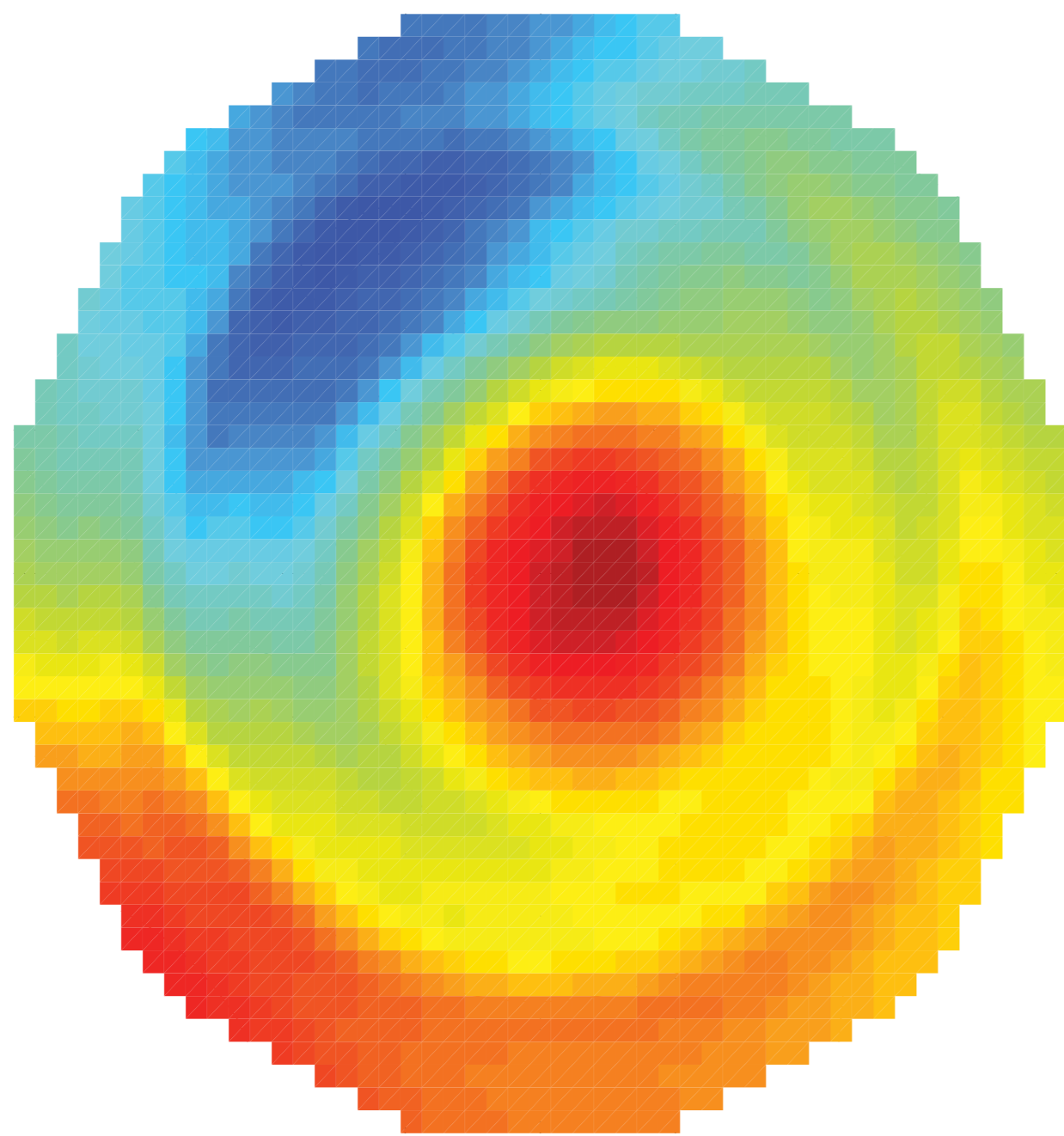
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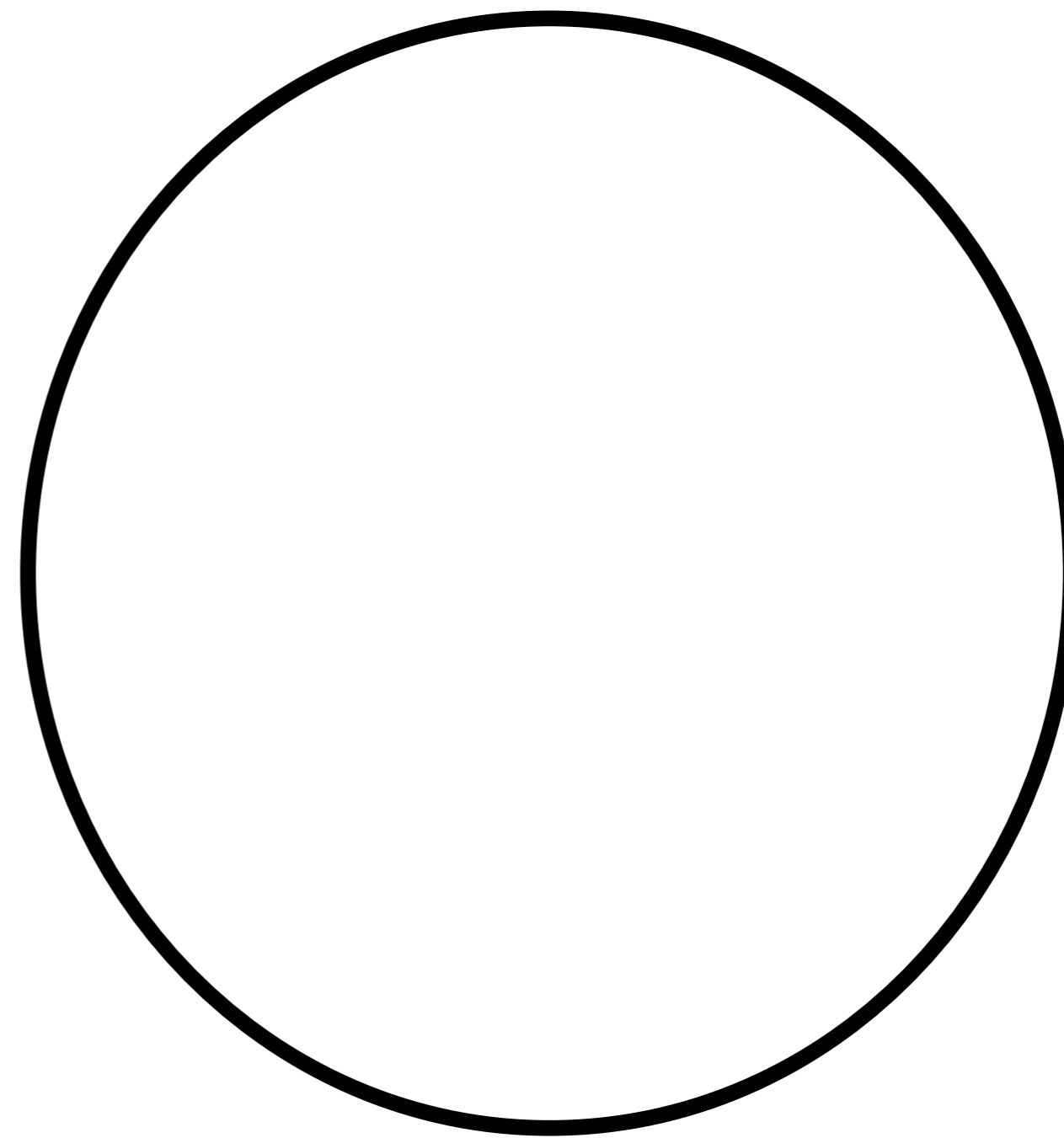
Illustration



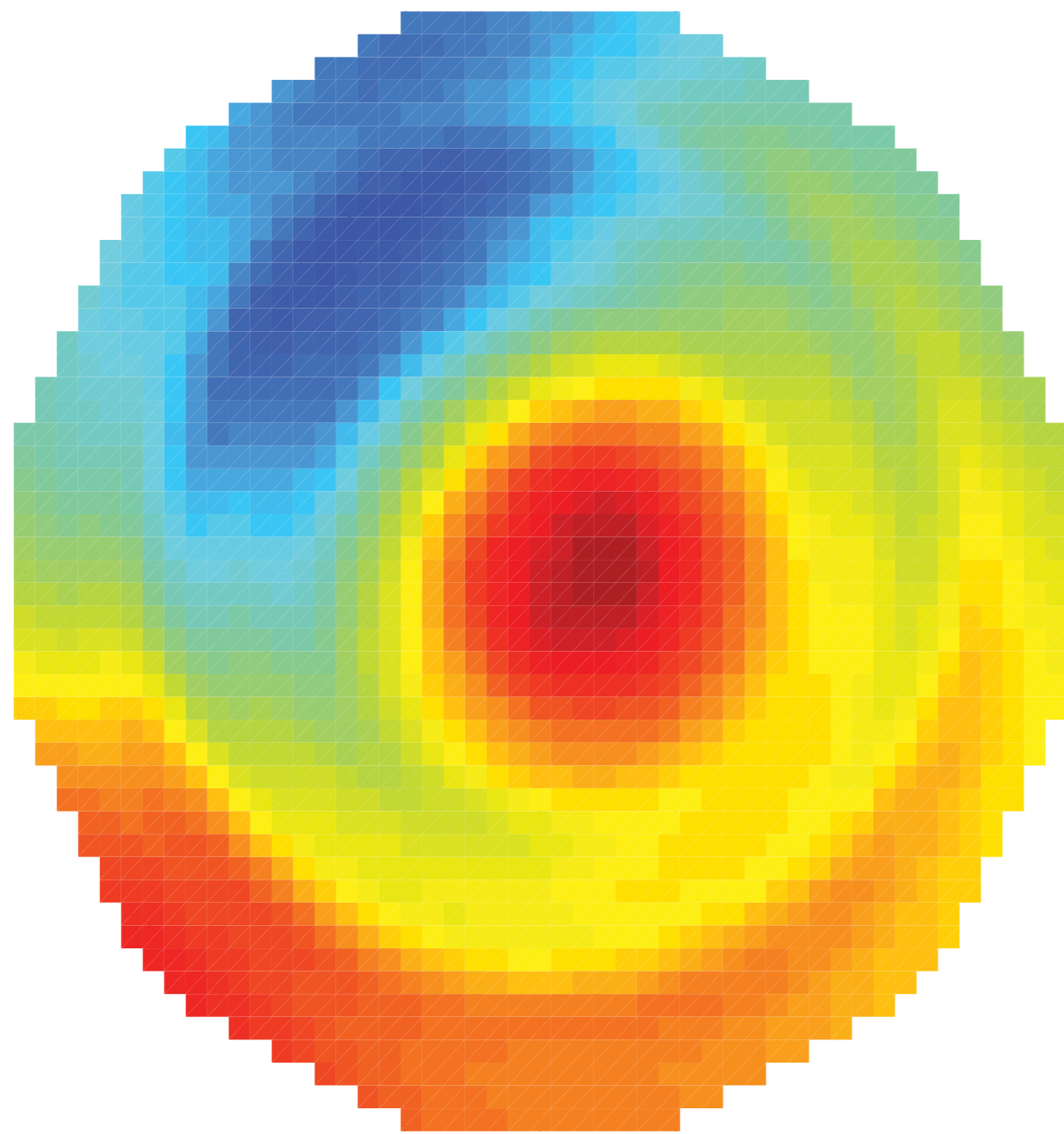
Illustration



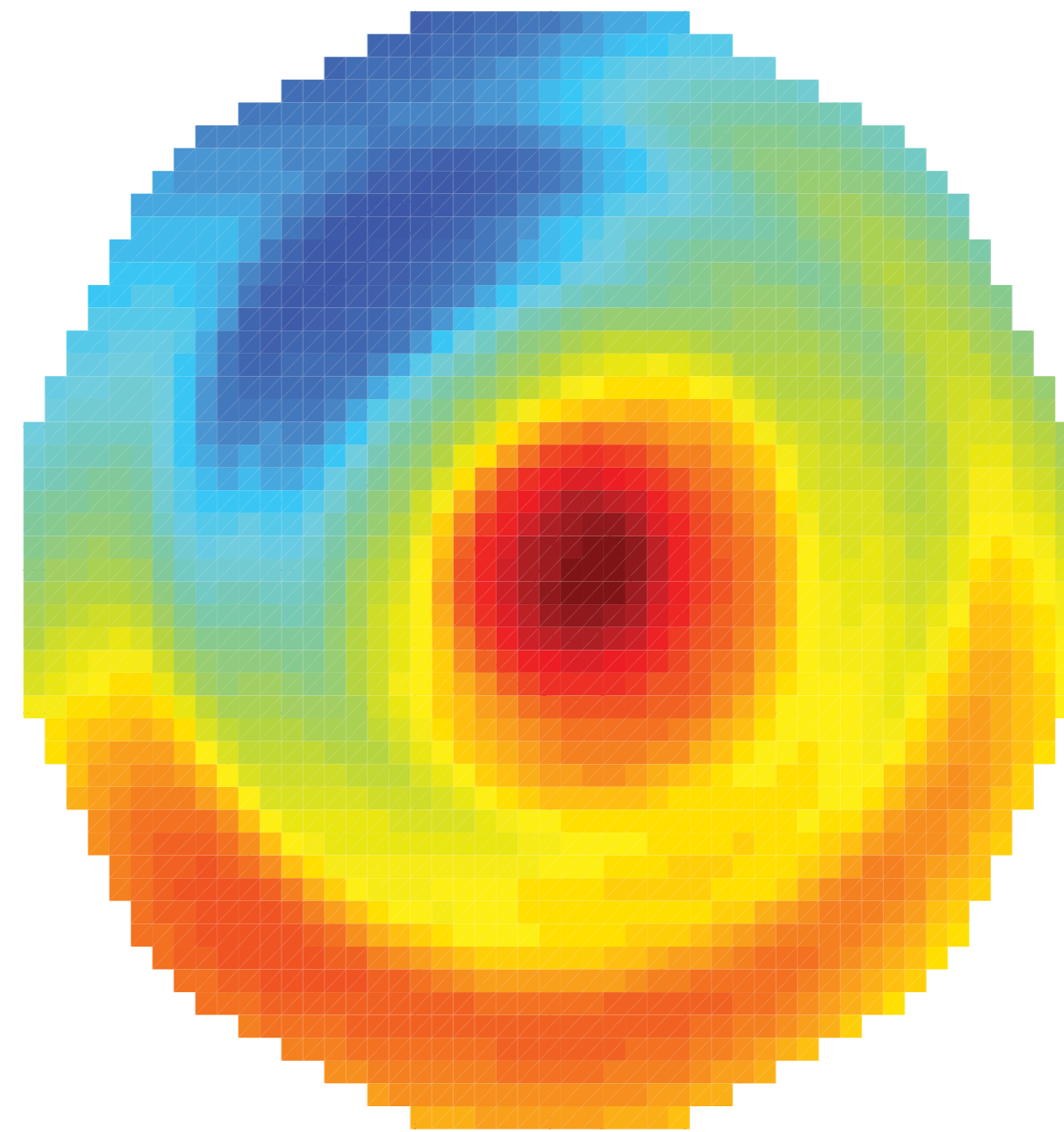
True



Illustration

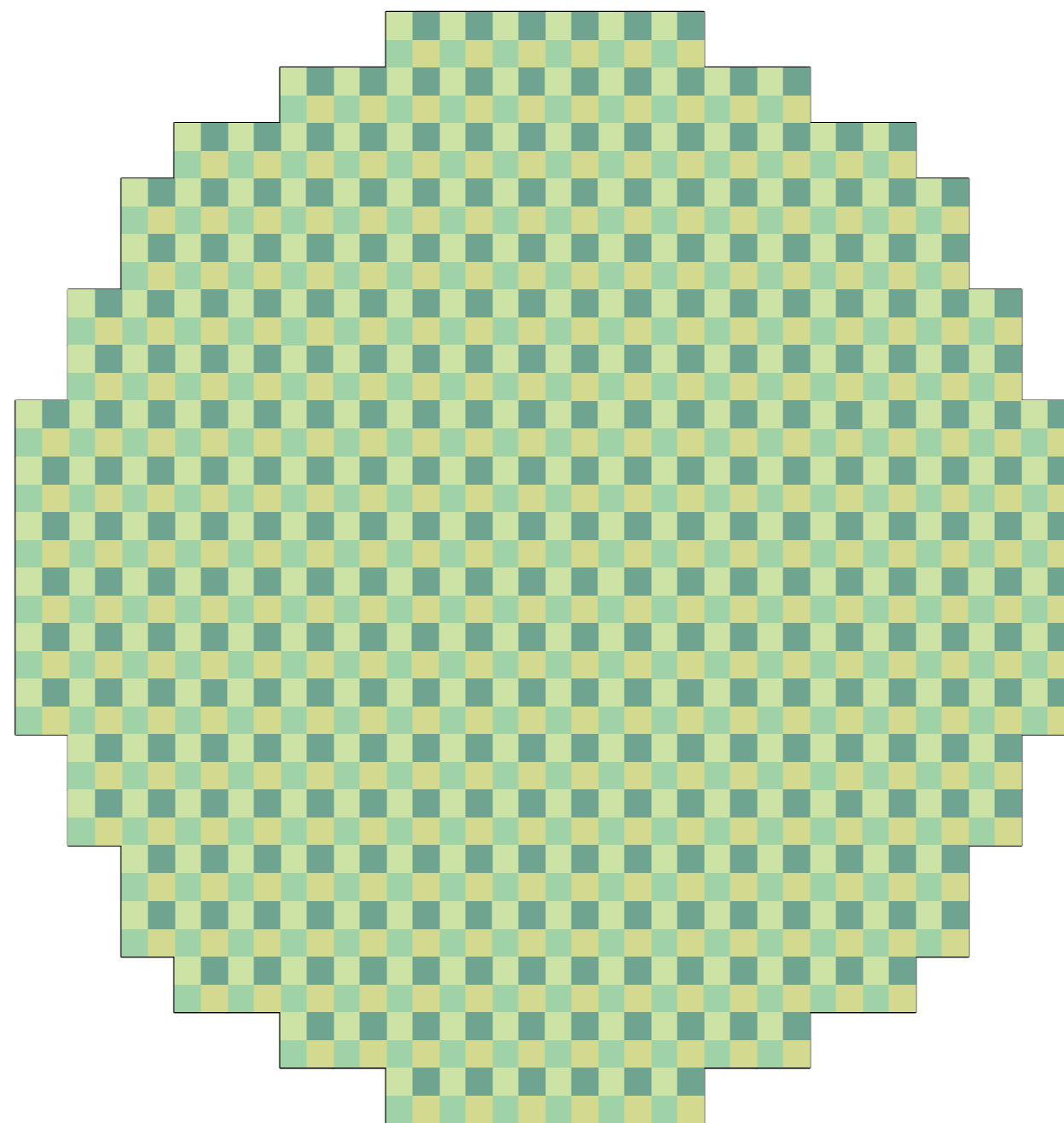


True

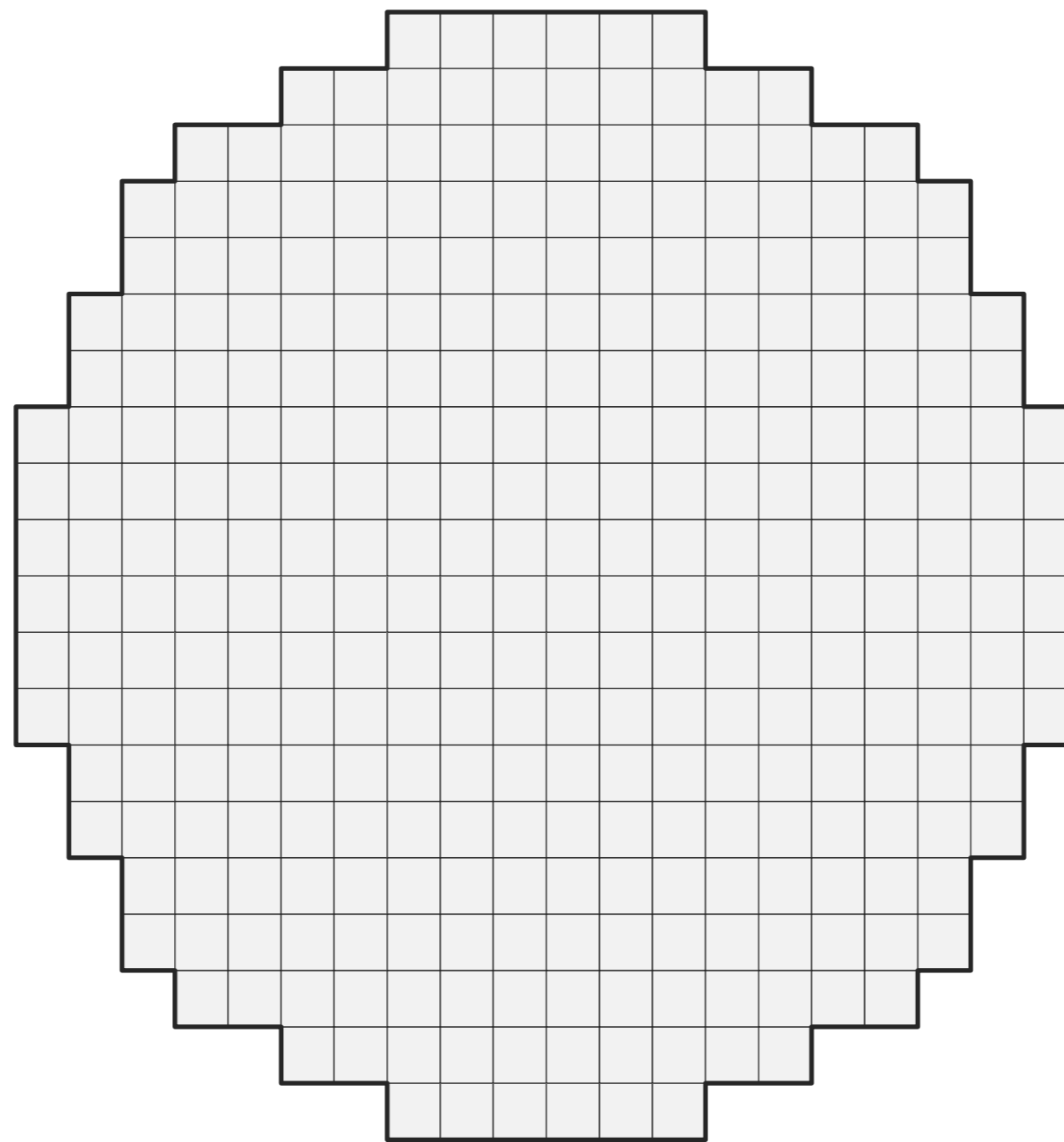


Our

Decision Making

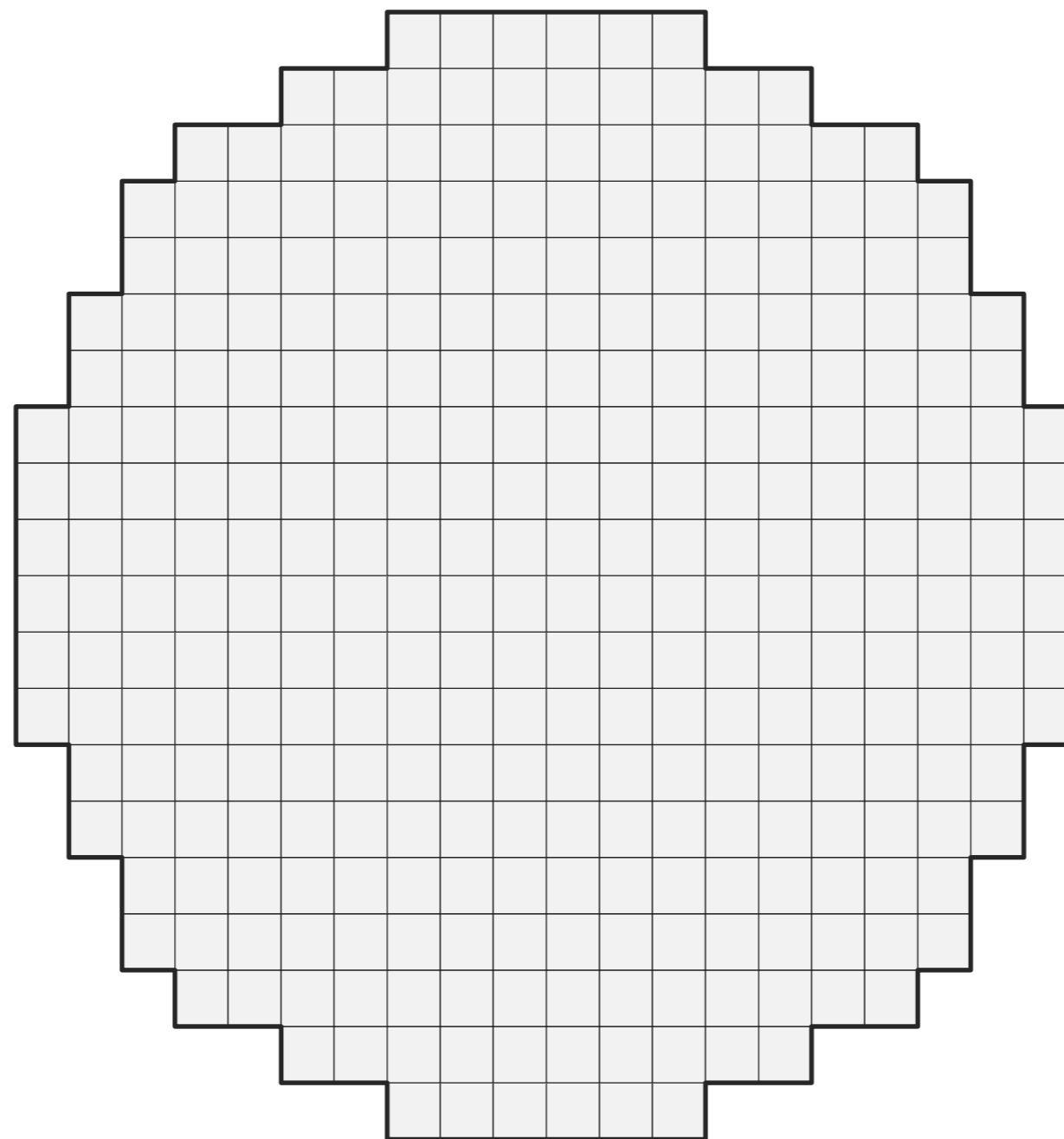


Decision Making



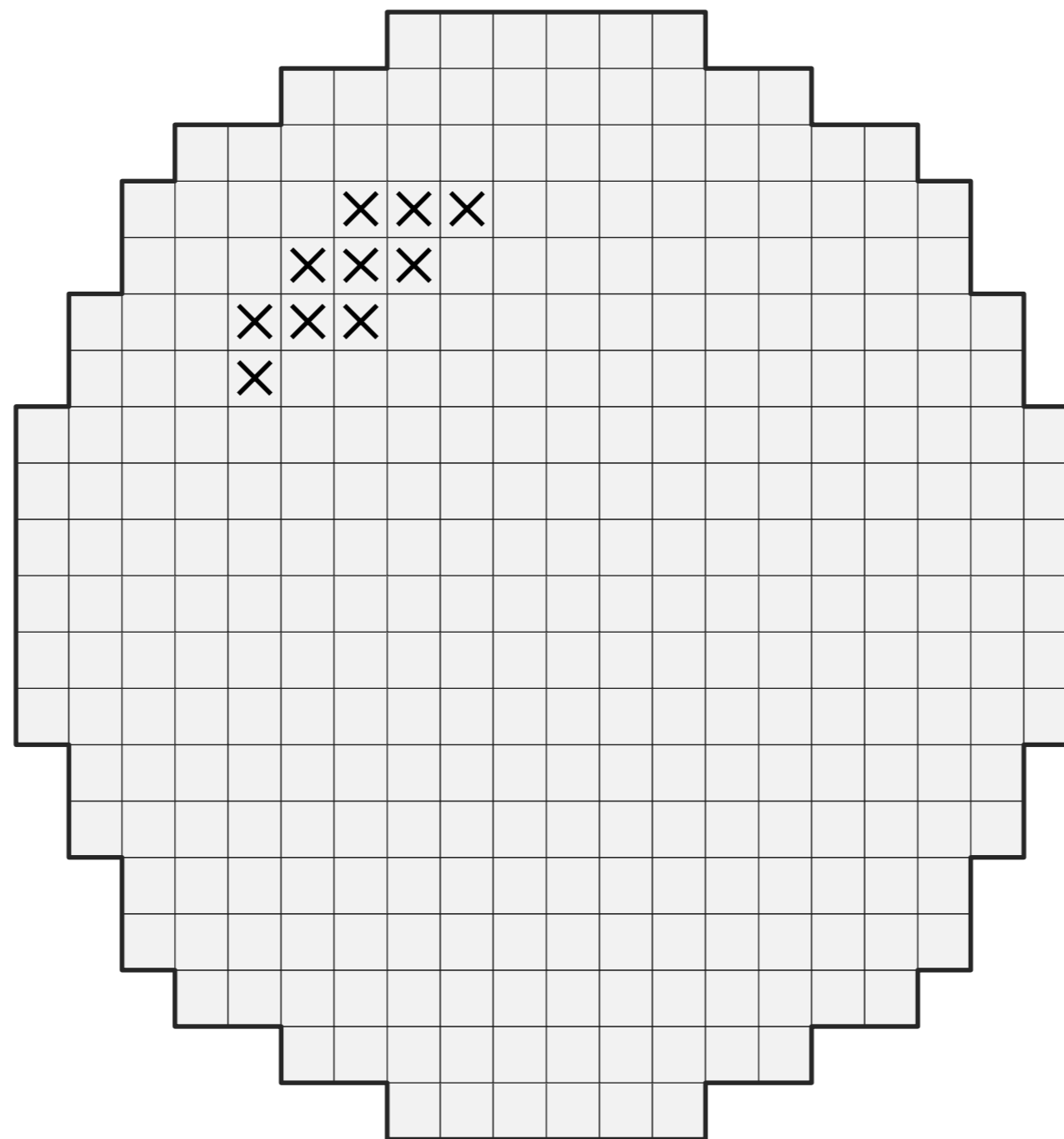
Decision Making

$$\theta < \theta_*$$



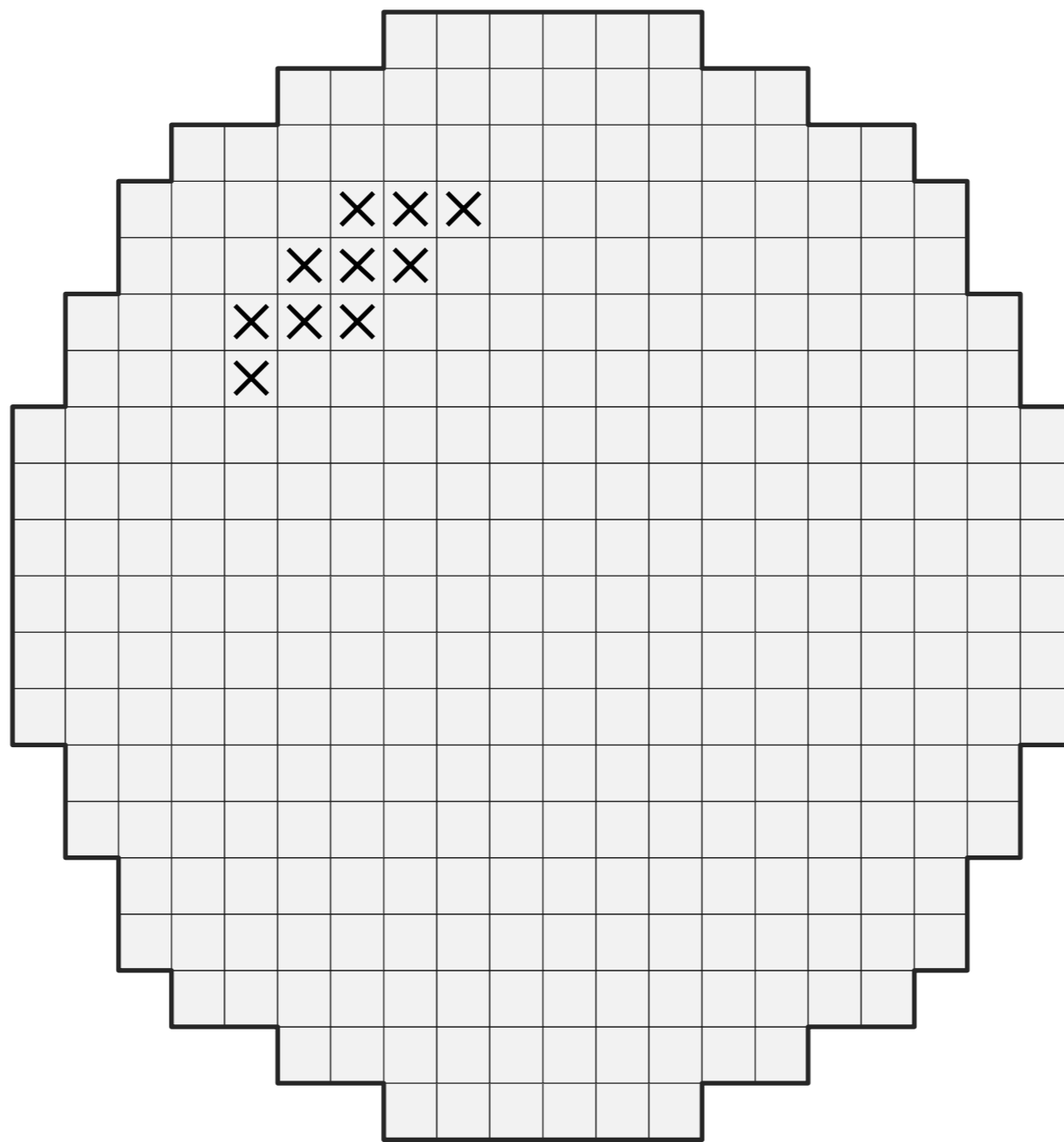
Decision Making

$$\theta < \theta_*$$



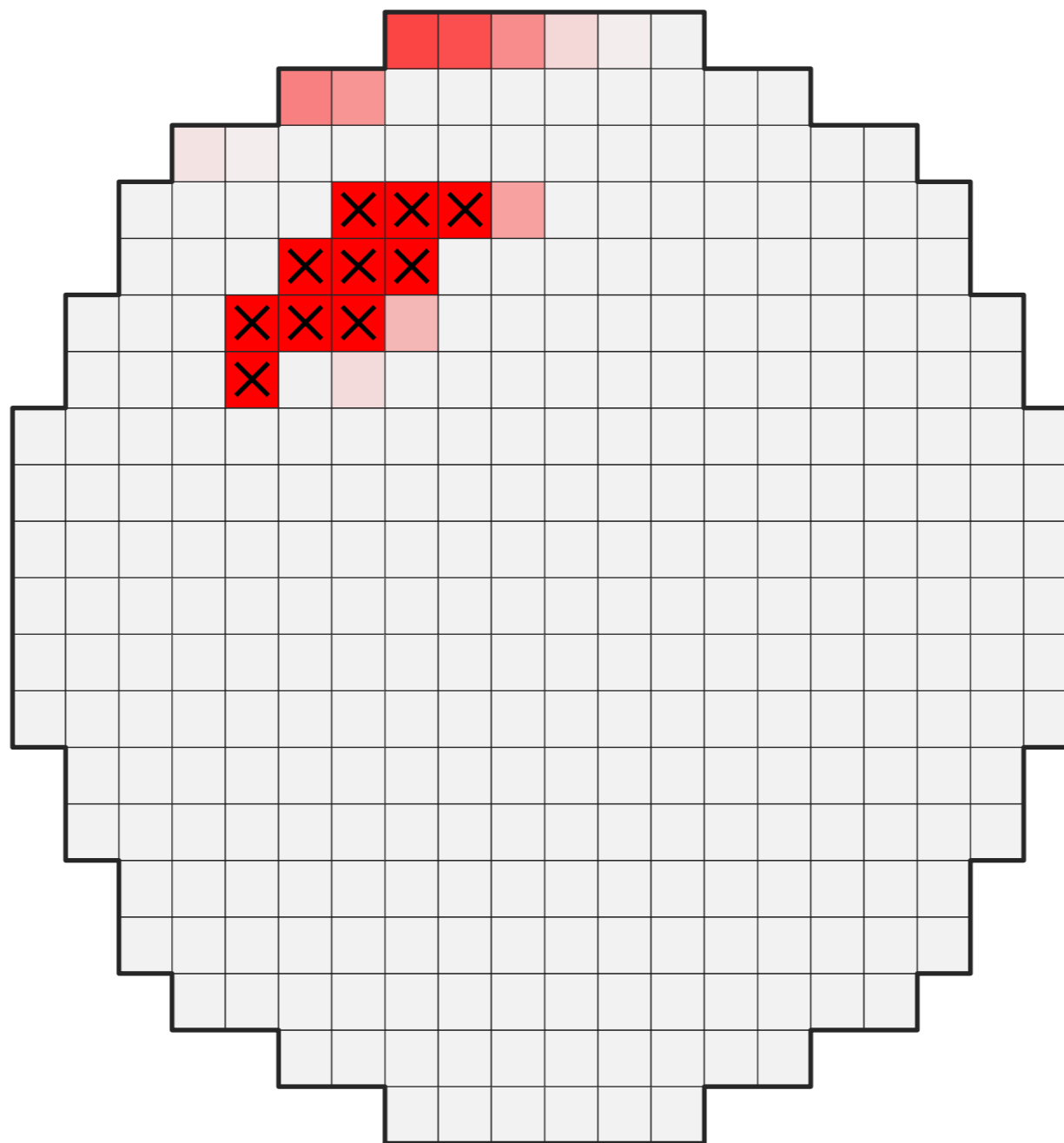
Decision Making

$$P(\theta < \theta_*) = ?$$



Decision Making

$$P(\theta < \theta_*) = ?$$



Performance

Performance

$< 7\%$
of dies

Performance

$< 7\%$
of dies

$< 4\%$
of error

Performance

$< 7\%$
of dies

$< 4\%$
of error

$< 4\text{m}$
of waiting

Performance

$< 14\%$
of dies

Performance

$< 14\%$

of dies

$< 1\%$

of error

Performance

< 14%

of dies

< 1%

of error

< 10m

of waiting

Bayesian Inference

Bayesian Inference

A

B

Bayesian Inference

A

B

$P(A)$

$P(B)$

Bayesian Inference

$$P(A|B) = ?$$

Bayesian Inference

$$P(A|B) \propto P(B|A) \times P(A)$$

Bayesian Inference

Posterior

Likelihood

Prior

$$P(A|B) \propto P(B|A) \times P(A)$$

Bayesian Inference

Posterior

Likelihood

Prior

$$P(\theta|\mathcal{D}) \propto P(\mathcal{D}|\theta) \times P(\theta)$$

Bayesian Inference

Likelihood

$$P(\mathcal{D}|\theta)$$

Prior

$$P(\theta)$$

Markov Chain Monte Carlo



Thank you!

