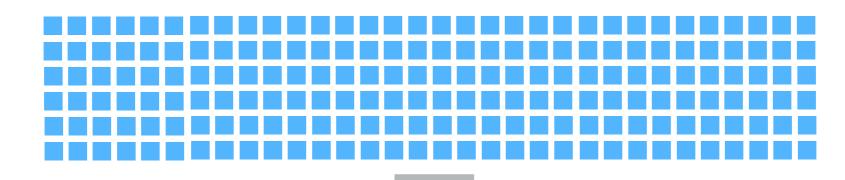
## Programming Kathryn S. McKinley Uncertain <T>hings

Programs perform (probabilistic) inference, even if they don't realize it

They use **evidence** to draw **conclusions** 

```
GeoCoordinate Loc = GPS.GetLocation ();
if (GPS.Distance (Loc, Home) < 200) Evidence
OpenGarageDoor (); Conclusion
```

## What do probabilistic programs mean?



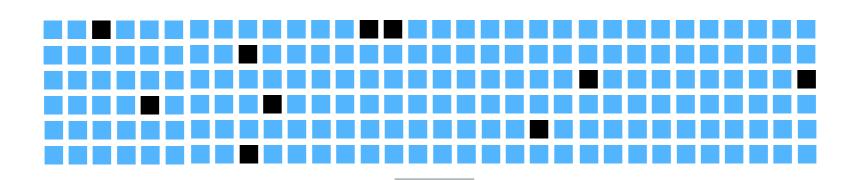
probabilistic program

```
float obfuscated(float n) {
  return n + gaussian(0.0, 1000.0);
}
float average_salary(float* salaries) {
  total = 0.0;
  for (int i = 0; i < COUNT; ++i)
    total += obfuscated(salaries[i]);
  avg = total / len(salaries);
  p_avg = ...;

passert e, p, C
}</pre>
```

?

## What if we could identify inputs that cause bad outputs?



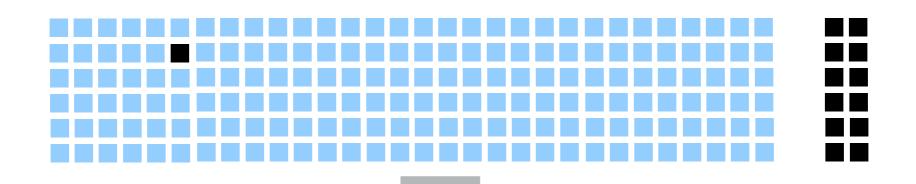
probabilistic program

```
float obfuscated(float n) {
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}
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   total = 0.0;
   for (int i = 0; i < COUNT; ++i)
        total += obfuscated(salaries[i]);
   avg = total / len(salaries);
   p_avg = ...;

passert e, p, C
}</pre>
```

?

## Identifying when things go bad



probabilistic program

```
float obfuscated(float n) {
  return n + gaussian(0.0, 1000.0);
}
float average_salary(float* salaries) {
  total = 0.0;
  for (int i = 0; i < COUNT; ++i)
    total += obfuscated(salaries[i]);
  avg = total / len(salaries);
  p_avg = ...;

passert e, p, C
}</pre>
```

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