

Making Data Make Sense

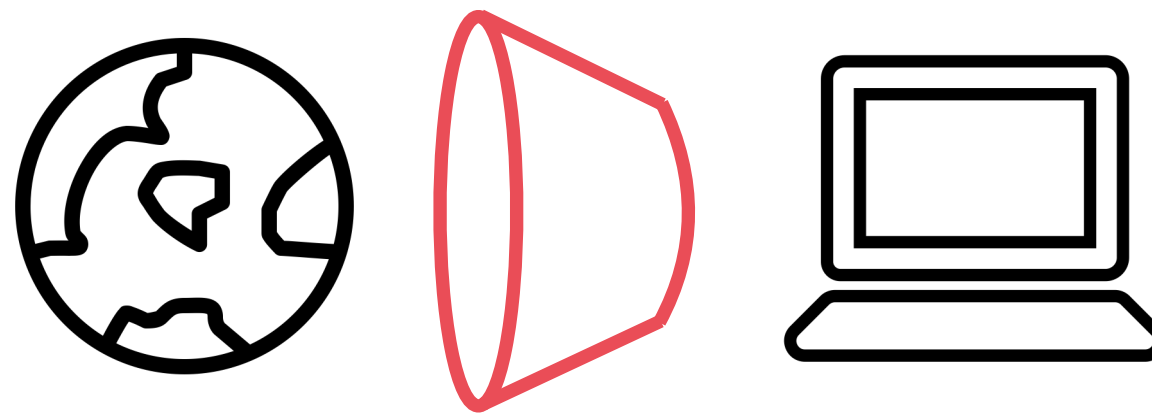
RACHAEL MILLER



I want to tell you why I care about this.



We added a whole new dimension of
understanding.



DATA

- All of our observations, quantified
- Usually comes in numbers
- High-dimensional
- Noisy

DATA — EXAMPLE

| ELEVATION | LATITUDE | LONGITUDE | DATE | reportType | HourlySkyCo | HourlyVisibi | HourlyPreser | HourlyDryBt | HourlyDryBt | HourlyWetBt | HourlyWetBt | HourlyDewP | HourlyDewP | HourlyRelati | HourlyWindS | HourlyWindD | HourlyWindS | HourlyStation | HourlyPressu | HourlyPressu | HourlySeaLe | HourlySeaLe |
|-----------|----------|-----------|--------------|------------|-------------|--------------|--------------|-------------|-------------|-------------|-------------|------------|------------|--------------|-------------|-------------|-------------|---------------|--------------|--------------|-------------|-------------|
| 201.8 | 41.995 | -87.9336 | 3/1/14 0:51 | FM-15 | SCT:04 70 O | 10 | | 30 | -1.1 | 26 | -3.4 | 16 | -8.9 | 56 | 9 | 330 | | 29.28 | | | 30.02 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 1:51 | FM-15 | OVC:08 50 | 10 | | 30 | -1.1 | 26 | -3.3 | 17 | -8.3 | 58 | 0 | 0 | | 29.27 | | | 30.02 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 2:51 | FM-15 | OVC:08 29 | 6 | -SN:03 SN:7 | 29 | -1.7 | 26 | -3.2 | 21 | -6.1 | 72 | 8 | 330 | | 29.28 | 1 | -0.03 | 30.02 | 0 |
| 201.8 | 41.995 | -87.9336 | 3/1/14 3:51 | FM-15 | VV:09 9 | 0.75 | -SN:03 SN:7 | 28 | -2.2 | 26 | -3.3 | 23 | -5 | 81 | 0 | 0 | | 29.29 | | | 30.04 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 4:51 | FM-15 | OVC:08 8 | 10 | | 26 | -3.3 | 24 | -4.5 | 20 | -6.7 | 78 | 11 | 350 | | 29.32 | | | 30.06 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 5:51 | FM-15 | BKN:07 10 C | 10 | | 25 | -3.9 | 22 | -5.3 | 17 | -8.3 | 72 | 11 | 360 | | 29.35 | 3 | -0.07 | 30.09 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 6:51 | FM-15 | BKN:07 12 C | 5 | HZ:7 FU:05 | 23 | -5 | 21 | -6.4 | 15 | -9.4 | 72 | 7 | 360 | | 29.37 | | | 30.12 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 7:51 | FM-15 | BKN:07 14 C | 10 | | 21 | -6.1 | 18 | -7.5 | 12 | -11.1 | 68 | 11 | 360 | | 29.42 | | | 30.17 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 8:51 | FM-15 | OVC:08 27 | 9 | | 21 | -6.1 | 18 | -7.6 | 11 | -11.7 | 65 | 9 | 360 | | 29.45 | 2 | -0.09 | 30.19 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 9:51 | FM-15 | SCT:04 27 O | 10 | | 21 | -6.1 | 18 | -7.7 | 10 | -12.2 | 62 | 9 | 360 | | 29.46 | | | 30.21 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 10:51 | FM-15 | BKN:07 35 C | 10 | | 21 | -6.1 | 18 | -7.8 | 9 | -12.8 | 59 | 11 | 340 | | 29.49 | | | 30.24 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 11:51 | FM-15 | SCT:04 45 B | 10 | | 21 | -6.1 | 18 | -8 | 7 | -13.9 | 54 | 9 | 360 | | 29.49 | 1 | -0.04 | 30.24 | T |
| 201.8 | 41.995 | -87.9336 | 3/1/14 12:51 | FM-15 | BKN:07 45 E | 10 | | 22 | -5.6 | 18 | -7.6 | 6 | -14.4 | 50 | 10 | 340 | | 29.5 | | | 30.25 | T |
| 201.8 | 41.995 | -87.9336 | 3/1/14 13:51 | FM-15 | BKN:07 55 E | 10 | | 22 | -5.6 | 19 | -7.5 | 8 | -13.3 | 55 | 8 | 10 | | 29.47 | | | 30.22 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 14:51 | FM-15 | FEW:02 25 E | 10 | -SN:03 SN:7 | 20 | -6.7 | 17 | -8.2 | 10 | -12.2 | 65 | 13 | 350 | | 29.51 | 3 | -0.01 | 30.26 | T |
| 201.8 | 41.995 | -87.9336 | 3/1/14 15:51 | FM-15 | BKN:07 18 C | 6 | -SN:03 SN:7 | 18 | -7.8 | 16 | -9.1 | 9 | -12.8 | 68 | 14 | 360 | | 29.5 | | | 30.25 | T |
| 201.8 | 41.995 | -87.9336 | 3/1/14 16:51 | FM-15 | SCT:04 12 B | 5 | -SN:03 SN:7 | 16 | -8.9 | 14 | -9.9 | 9 | -12.8 | 74 | 9 | 360 | | 29.53 | | | 30.29 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 17:51 | FM-15 | VV:09 10 | 0.5 | SN:03 SN:72 | 15 | -9.4 | 13 | -10.5 | 8 | -13.3 | 74 | 9 | 10 | | 29.54 | 0 | -0.01 | 30.3 | 0 |
| 201.8 | 41.995 | -87.9336 | 3/1/14 18:51 | FM-15 | VV:09 11 | 1 | -SN:03 SN:7 | 14 | -10 | 12 | -10.9 | 8 | -13.3 | 77 | 9 | 350 | | 29.56 | | | 30.32 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 19:51 | FM-15 | OVC:08 17 | 1.5 | -SN:03 SN:7 | 13 | -10.6 | 11 | -11.5 | 6 | -14.4 | 74 | 9 | 360 | | 29.56 | | | 30.32 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 20:51 | FM-15 | OVC:08 25 | 2 | -SN:03 SN:7 | 12 | -11.1 | 11 | -11.9 | 6 | -14.4 | 77 | 11 | 350 | | 29.59 | 3 | -0.04 | 30.35 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 21:51 | FM-15 | VV:09 15 | 0.75 | -SN:03 SN:7 | 11 | -11.7 | 10 | -12.5 | 5 | -15 | 77 | 13 | 350 | | 29.59 | | | 30.35 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 22:51 | FM-15 | BKN:07 20 C | 2 | -SN:03 SN:7 | 11 | -11.7 | 9 | -12.6 | 4 | -15.6 | 73 | 10 | 350 | | 29.57 | | | 30.34 | |
| 201.8 | 41.995 | -87.9336 | 3/1/14 23:51 | FM-15 | OVC:08 34 | 2.5 | -SN:03 SN:7 | 11 | -11.7 | 9 | -12.7 | 3 | -16.1 | 70 | 11 | 360 | | 29.57 | 8 | 0.01 | 30.33 | 0 |
| 201.8 | 41.995 | -87.9336 | 3/1/14 23:59 | SOD | | | | | | | | | | | | | | | | | | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 0:51 | FM-15 | OVC:08 15 | 1.5 | -SN:03 SN:7 | 10 | -12.2 | 8 | -13.1 | 3 | -16.1 | 73 | 10 | 340 | | 29.62 | | | 30.38 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 1:51 | FM-15 | FEW:02 18 S | 4 | -SN:03 SN:7 | 10 | -12.2 | 8 | -13.2 | 2 | -16.7 | 69 | 9 | 10 | | 29.59 | | | 30.35 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 2:51 | FM-15 | SCT:04 23 O | 2 | -SN:03 SN:7 | 10 | -12.2 | 8 | -13.1 | 3 | -16.1 | 73 | 8 | 360 | | 29.59 | 6 | 0.03 | 30.35 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 3:51 | FM-15 | OVC:08 45 | 4 | -SN:03 SN:7 | 9 | -12.8 | 7 | -13.7 | 1 | -17.2 | 70 | 14 | 350 | | 29.59 | | | 30.36 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 4:51 | FM-15 | FEW:02 25 C | 9 | -SN:03 SN:7 | 9 | -12.8 | 7 | -14 | -3 | -19.4 | 58 | 10 | 350 | | 29.6 | | | 30.37 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 5:51 | FM-15 | OVC:08 60 | 9 | | 8 | -13.3 | 6 | -14.5 | -4 | -20 | 57 | 10 | 350 | | 29.6 | 0 | -0.01 | 30.37 | T |
| 201.8 | 41.995 | -87.9336 | 3/2/14 6:51 | FM-15 | OVC:08 65 | 10 | | 7 | -13.9 | 5 | -15 | -5 | -20.6 | 57 | 13 | 340 | | 29.6 | | | 30.38 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 7:51 | FM-15 | OVC:08 65 | 10 | | 7 | -13.9 | 5 | -15 | -5 | -20.6 | 57 | 14 | 350 | 21 | 29.62 | | | 30.39 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 8:51 | FM-15 | OVC:08 60 | 10 | | 8 | -13.3 | 6 | -14.5 | -4 | -20 | 57 | 14 | 330 | 22 | 29.63 | 3 | -0.04 | 30.4 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 9:51 | FM-15 | OVC:08 60 | 10 | | 9 | -12.8 | 7 | -14 | -4 | -20 | 55 | 10 | 330 | | 29.63 | | | 30.41 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 10:51 | FM-15 | BKN:07 60 | 10 | | 10 | -12.2 | 8 | -13.5 | -3 | -19.4 | 55 | 13 | 340 | | 29.63 | | | 30.4 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 11:51 | FM-15 | SCT:04 60 B | 10 | | 12 | -11.1 | 10 | -12.5 | -1 | -18.3 | 56 | 8 | 350 | | 29.63 | 8 | 0 | 30.4 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 12:51 | FM-15 | FEW:02 60 E | 10 | | 13 | -10.6 | 10 | -12 | -1 | -18.3 | 54 | 14 | 340 | | 29.6 | | | 30.38 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 13:51 | FM-15 | FEW:02 30 S | 10 | | 12 | -11.1 | 9 | -12.5 | -2 | -18.9 | 53 | 11 | 330 | | 29.6 | | | 30.37 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 14:51 | FM-15 | FEW:02 30 S | 10 | | 12 | -11.1 | 9 | -12.5 | -2 | -18.9 | 53 | 14 | 340 | | 29.6 | 5 | 0.02 | 30.38 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 15:51 | FM-15 | FEW:02 30 S | 10 | | 11 | -11.7 | 8 | -13.1 | -4 | -20 | 51 | 9 | 350 | | 29.6 | | | 30.38 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 16:51 | FM-15 | FEW:02 29 S | 10 | | 9 | -12.8 | 7 | -14.1 | -5 | -20.6 | 52 | 11 | 330 | | 29.62 | | | 30.39 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 17:51 | FM-15 | FEW:02 30 E | 10 | | 7 | -13.9 | 5 | -15.1 | -8 | -22.2 | 50 | 13 | 330 | | 29.62 | 3 | -0.02 | 30.4 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 18:51 | FM-15 | FEW:02 30 E | 10 | | 6 | -14.4 | 4 | -15.6 | -11 | -23.9 | 45 | 13 | 340 | | 29.64 | | | 30.42 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 19:51 | FM-15 | BKN:07 250 | 10 | | 5 | -15 | 3 | -16.1 | -13 | -25 | 42 | 14 | 340 | | 29.65 | | | 30.43 | |
| 201.8 | 41.995 | -87.9336 | 3/2/14 20:51 | FM-15 | BKN:07 250 | 10 | | 4 | -15.6 | 2 | -16.7 | -15 | -26.1 | 40 | 9 | 330 | | 29.65 | 1 | -0.03 | 30.43 | |

INFORMATION

- Data, but only the accurate and interesting parts
- Comes as a collection of facts
- Extraneous detail removed

| | |
|----------------|------|
| Anchorage | 50°F |
| Phoenix | 84°F |
| Los Angeles | 72°F |
| San Francisco | 70°F |
| Denver | 34°F |
| Washington DC | 86°F |
| Miami | 77°F |
| Atlanta | 85°F |
| Honolulu | 84°F |
| Chicago | 78°F |
| Indianapolis | 83°F |
| New Orleans | 82°F |
| Boston | 92°F |
| Detroit | 87°F |
| Minneapolis | 52°F |
| Las Vegas | 69°F |
| New York | 87°F |
| Philadelphia | 89°F |
| Dallas | 90°F |
| Houston | 84°F |
| Salt Lake City | 51°F |

KNOWLEDGE

- Information, but only the useful parts
- Not very easy to quantify
- Comes in the form of an answer to a question

“IT’S COLD OUTSIDE.”

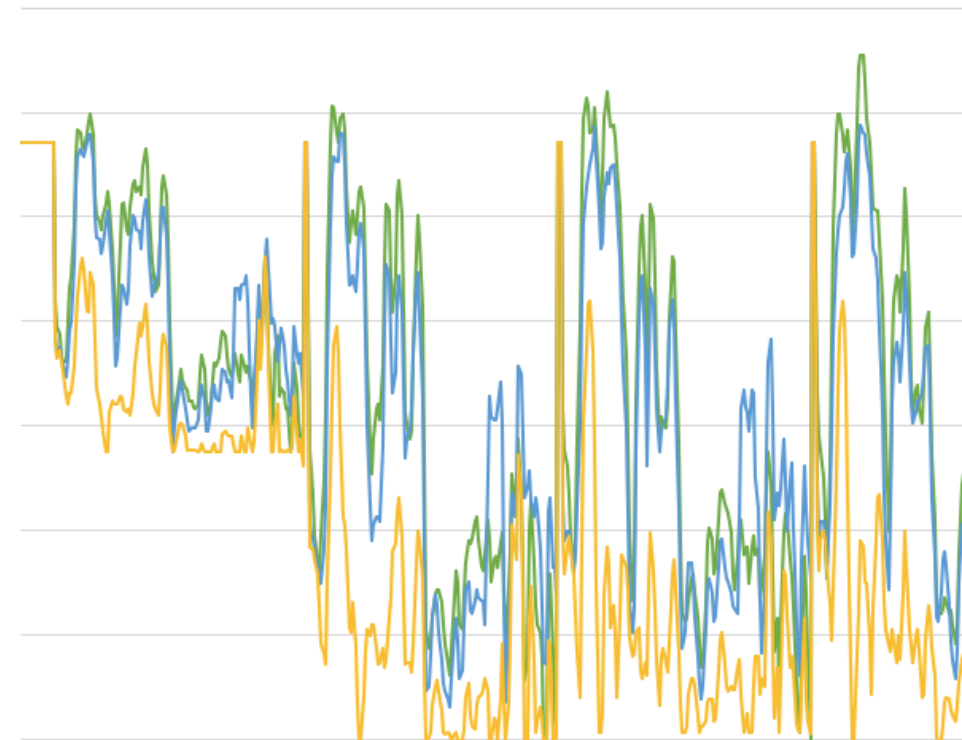
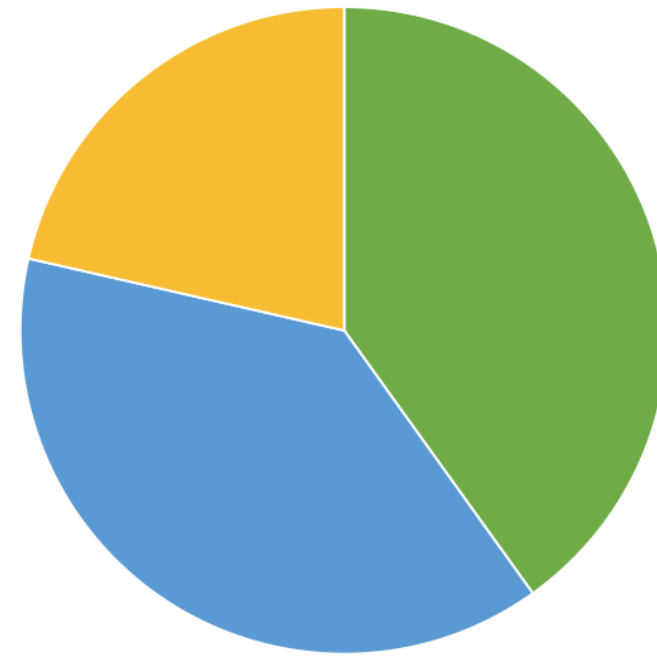
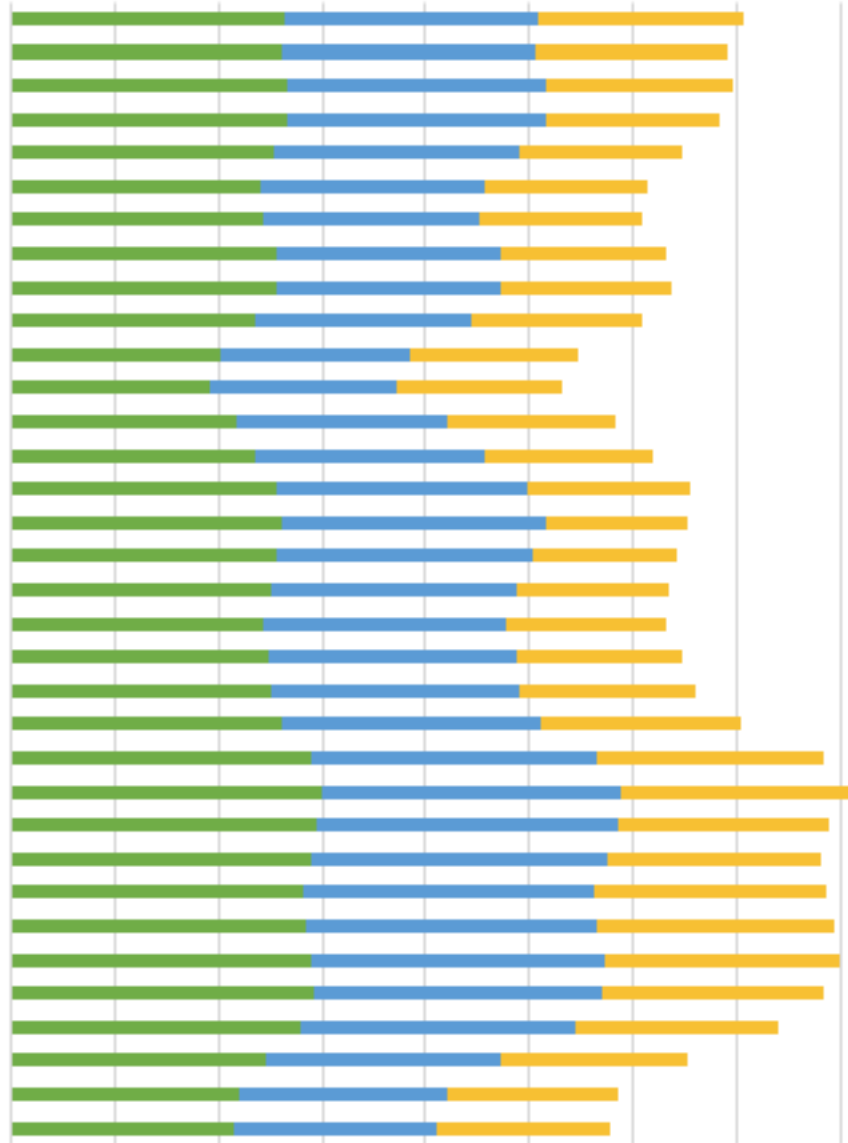


I. MAKING INFORMATION HUMAN-SHAPED

ENCODING INFORMATION

- How much
- How big
- Which one
- When
- Where
- ...What?

PATTERNFINDING



PATTERNFINDING



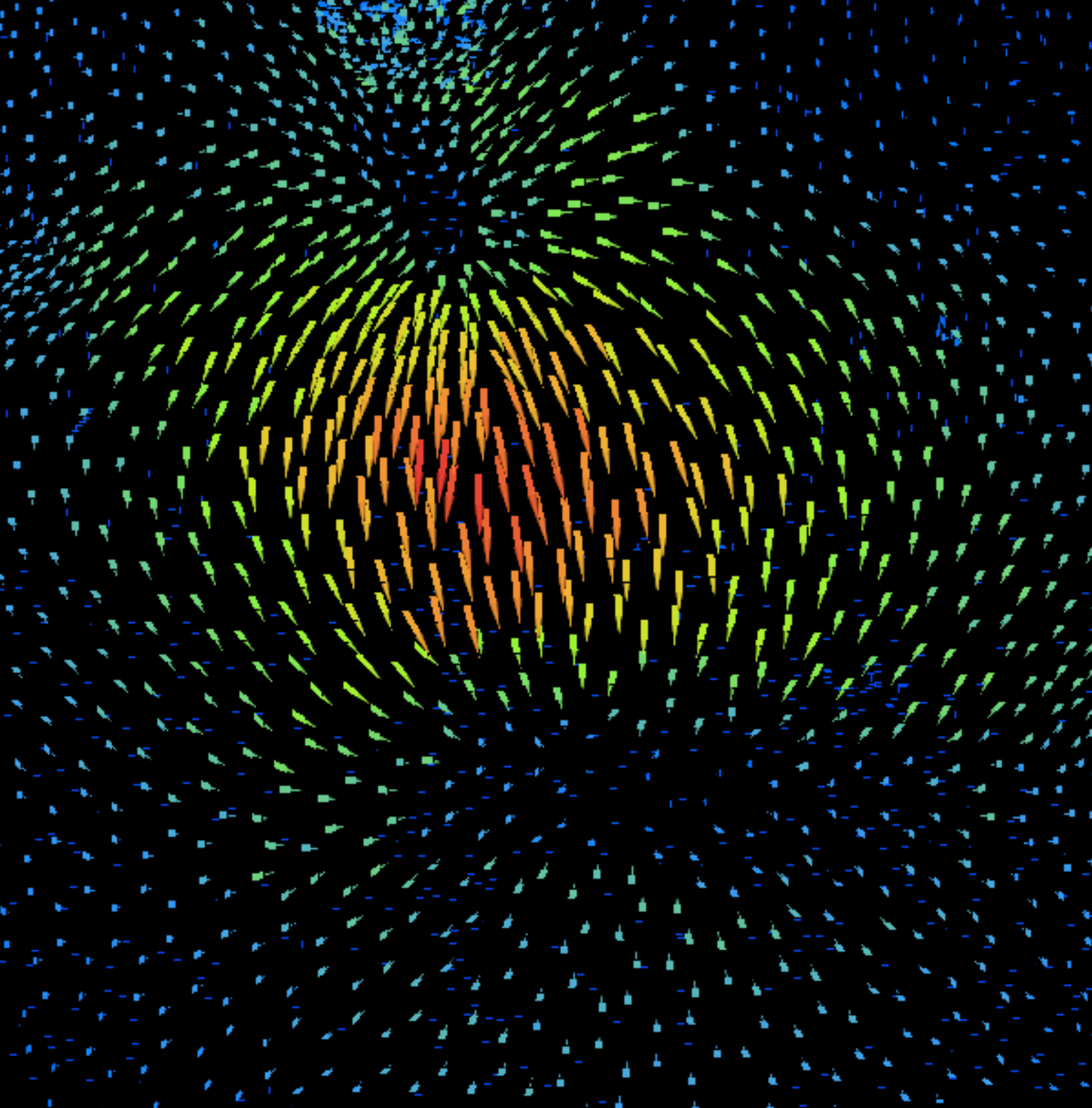
MAPPINGS

A mapping is the way the we encode information so that we can better spot patterns in it.



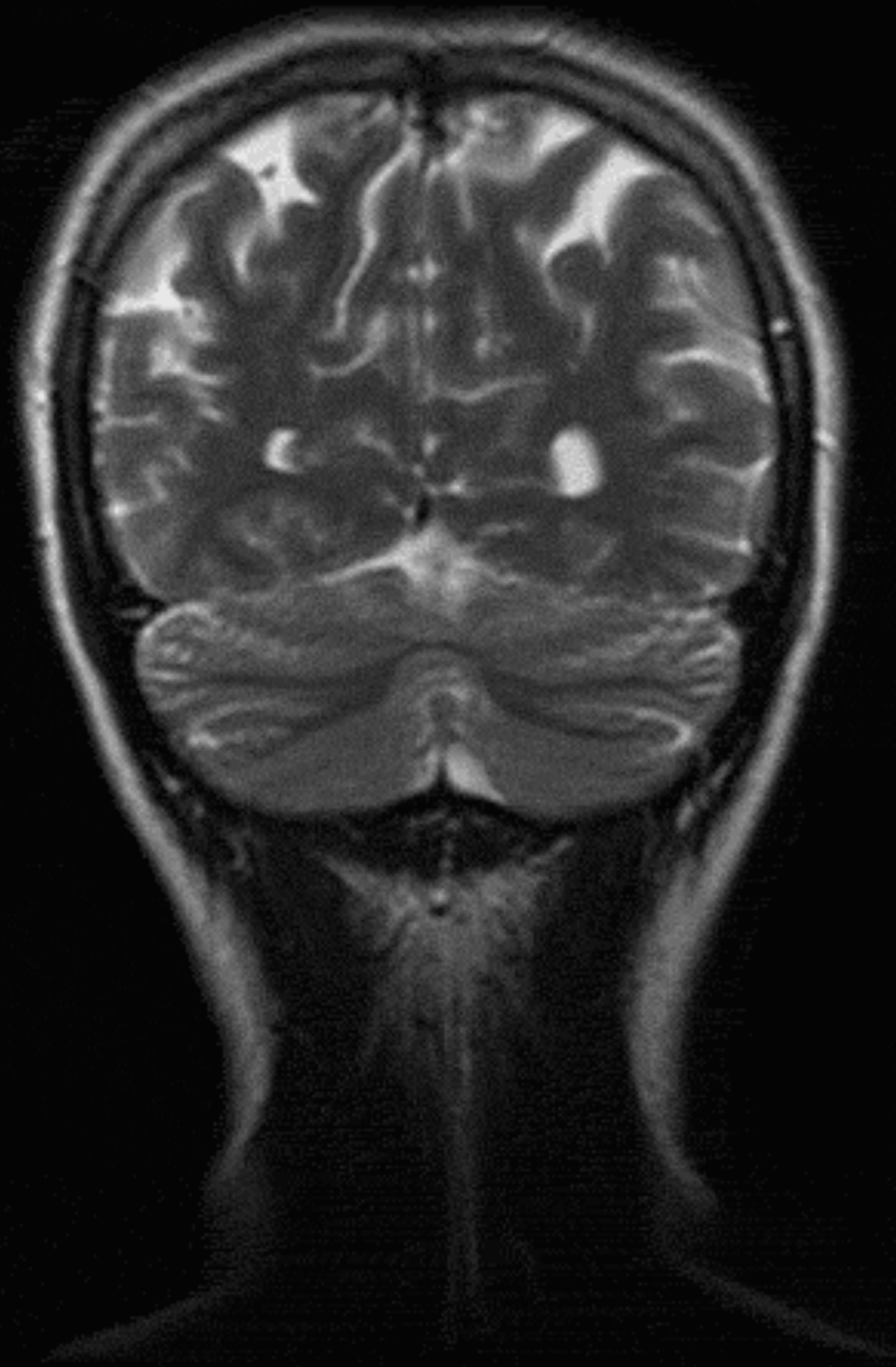
COLOR

CONTINUOUS
CHANGE
BETWEEN
EXTREMES



GLYPHS

MOVEMENT,
ENUMERATED
TYPES



ANIMATION

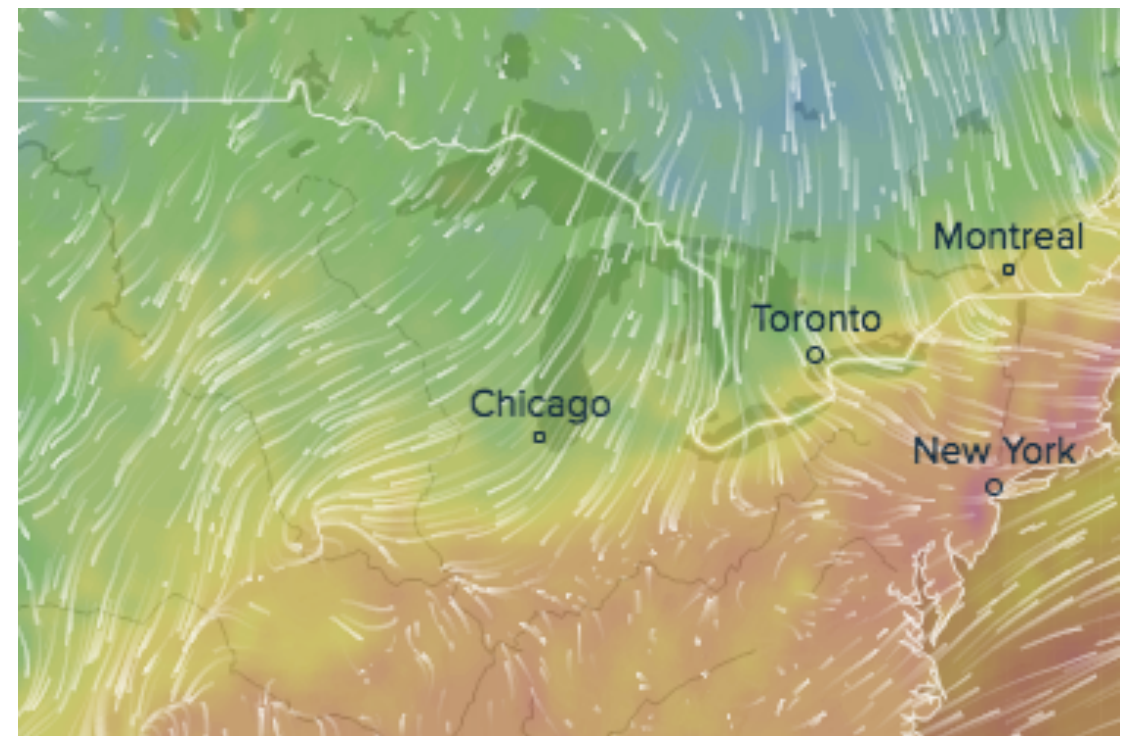
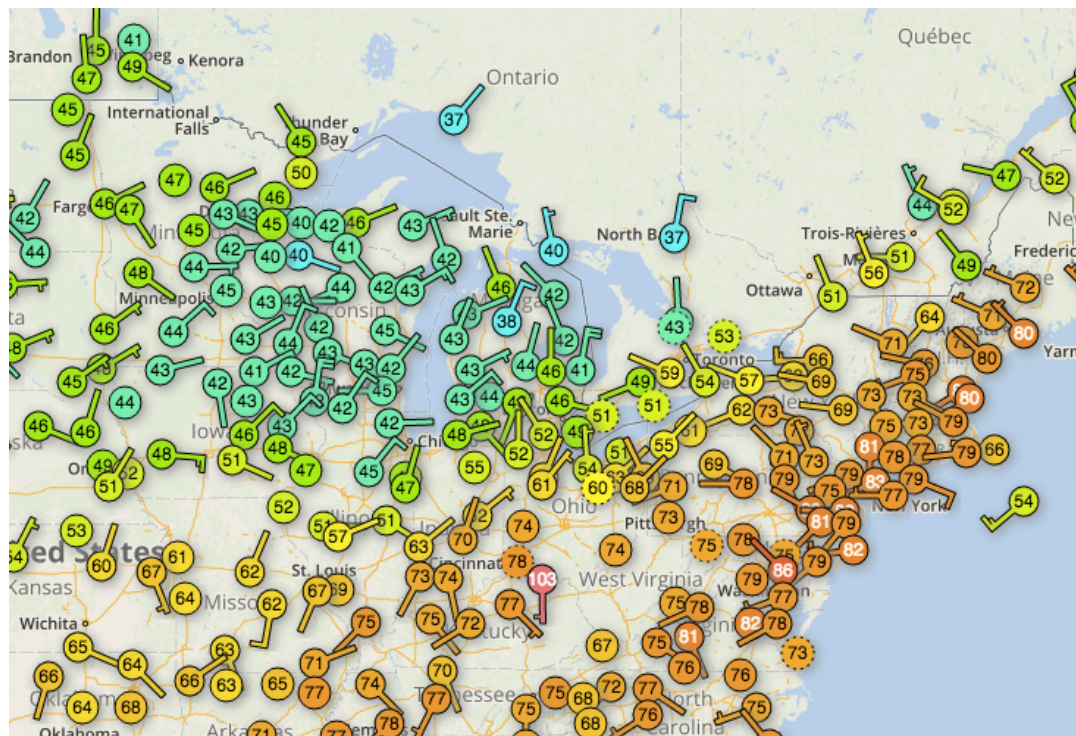
TEMPORAL
CHANGES, EXTRA
DIMENSIONS

MENTAL LEAPS

How many transformations does the viewer need to make to get the information?

Shape -> Flag type -> Key -> Speed -> Intensity

Opacity -> Intensity





DIMENSIONS

There's a whole lot more to data than just the x and the y.

II. CRAMMING INFORMATION INTO YOUR BRAIN

PATTERNFINDING [AGAIN]



INFORMATION CHANNELS

Information channels are the way that information gets from one “brain” to another.

- Images
- Video
- Presentations
- Sound
- Interactive systems

ATTRIBUTES OF A CHANNEL

- Resolution
- Bandwidth
- Distance

ATTRIBUTES OF A CHANNEL

- Resolution
- Bandwidth
- Distance

How much detail
this channel can
capture

ATTRIBUTES OF A CHANNEL

- Resolution
- Bandwidth
- Distance

The amount of
information that
can be encoded in
this channel at
once

ATTRIBUTES OF A CHANNEL

- Resolution
- Bandwidth
- Distance

How many mental leaps it takes to absorb information on this channel

III. SQUEEZING KNOWLEDGE OUT OF INFORMATION

TURNING INFORMATION INTO KNOWLEDGE

- Ask a question
- Identify the information needed
- Find & consume a piece of information
- Contextualize it with regard to your environment
- Answer the question

EXAMPLE: WEATHER

- Question: What should I wear today?
- Data source: NOAA
- Data: ...

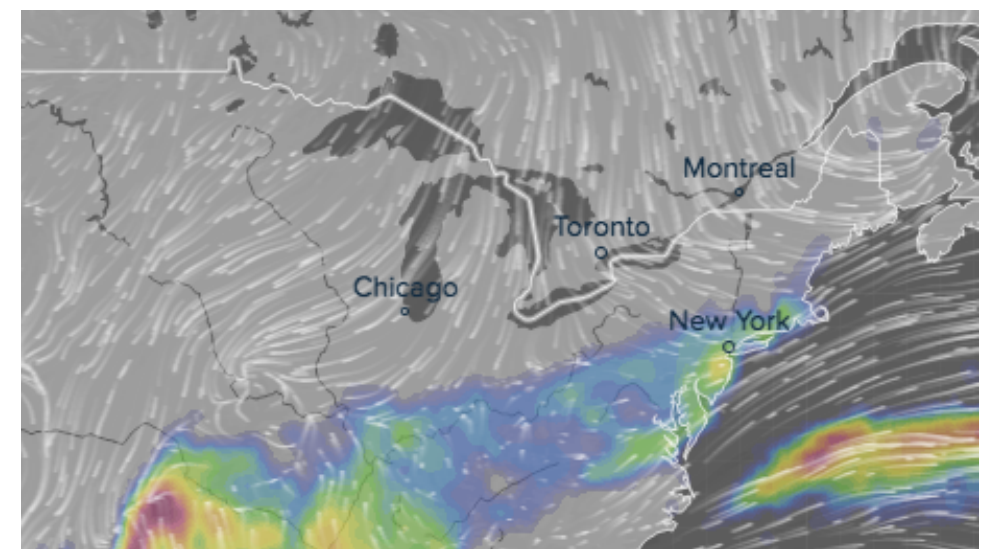
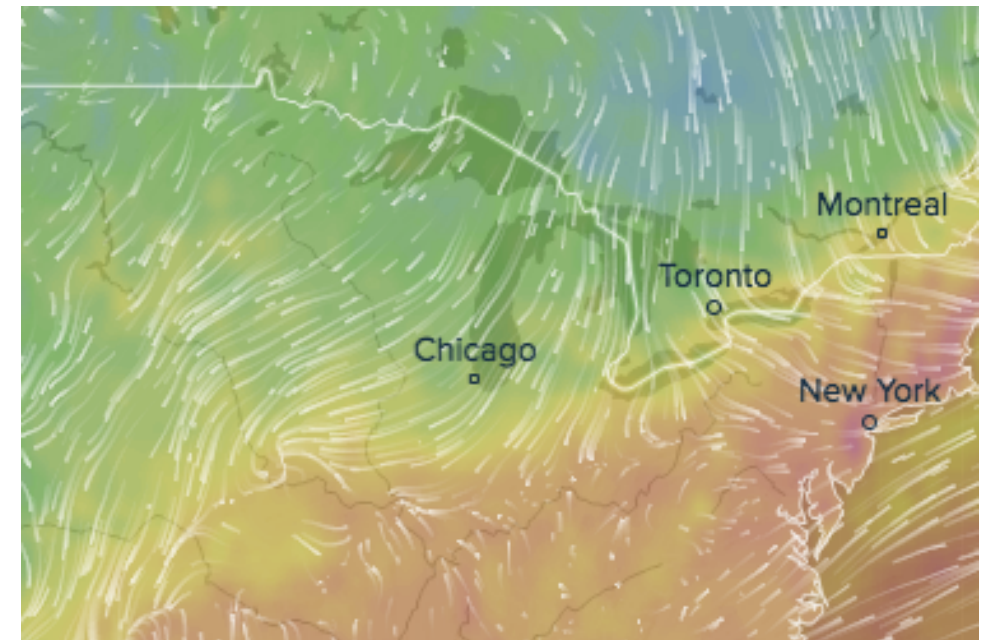
TURNING INFORMATION INTO KNOWLEDGE

- Ask a question
- **Identify the information needed**
- Find & consume a piece of information
- Contextualize it with regard to your environment
- Answer the question

EXPLORING

“What’s interesting about the weather today?”

- Resolution – Low
- Bandwidth – High
- Distance – Low
- Interactive, ideally low-latency
- Explorable



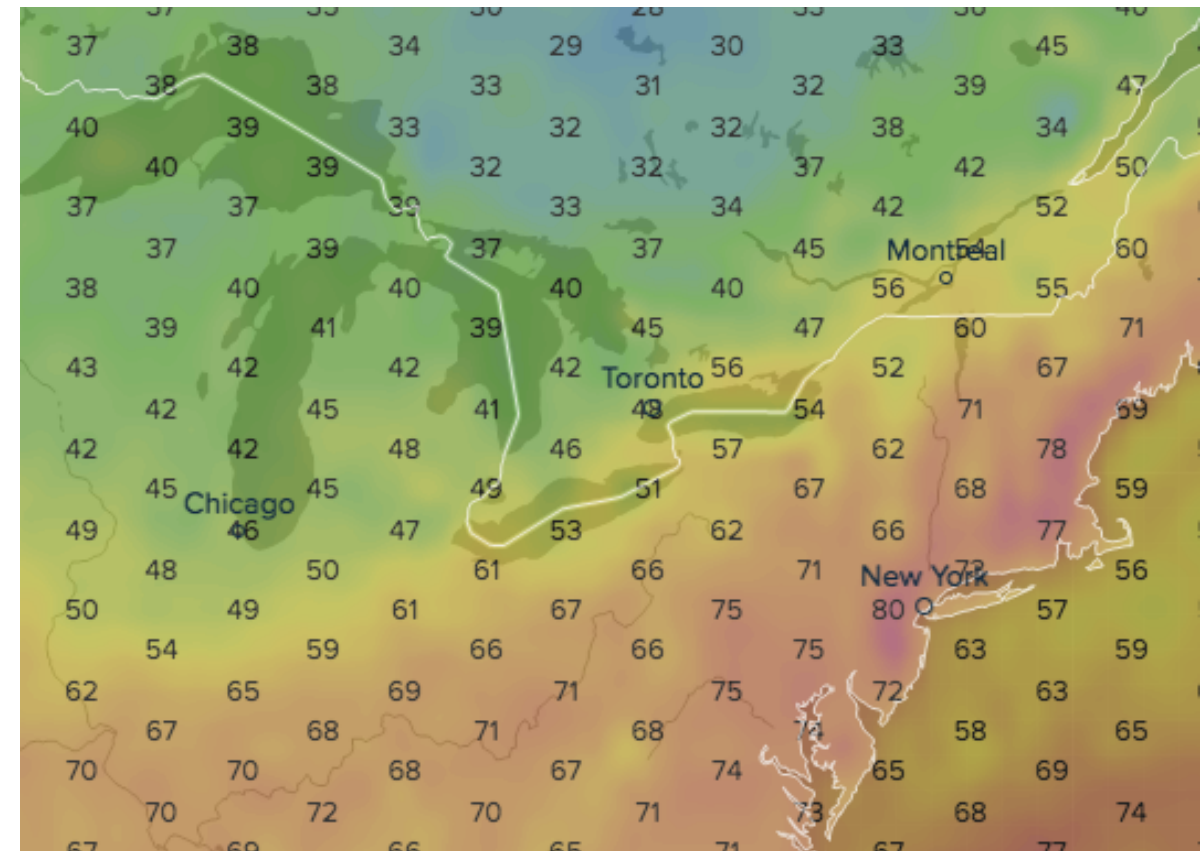
TURNING INFORMATION INTO KNOWLEDGE

- Ask a question
- Identify the information needed
- **Find & consume a piece of information**
- Contextualize it with regard to your environment
- Answer the question

INTERPRETING

“How cold is it? How windy? Will that change?”

- Resolution – High
- Bandwidth – Low
- Distance – Medium
- Precision and detail



TURNING INFORMATION INTO KNOWLEDGE

- Ask a question
- Identify the information needed
- Find & consume a piece of information
- **Contextualize it with regard to your environment**
- Answer the question

PRESENTING

“What should I wear?”

- Resolution – Low
- Bandwidth – Low
- Distance – Medium
- Minimal detail
- As close to knowledge as possible

 **45° Overcast.**

Light rain this evening.

Next Hour: Overcast. No precipitation anywhere in the area.

ANSWERING QUESTIONS



SOURCES

<http://um3d.dc.umich.edu/new-discoveries-exploring-renal-gene-clusters/>

<https://68.media.tumblr.com/0b8038b1469ad0148be57709f637bbce/>

[tumblr_nkfuy7DTfd1saxfomo1_500.gif](#)

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<http://3-byte.com/blog/2013/3/29/kinect-cheap-key>

Kelleher, C., Wagener, T., Ten guidelines for effective data visualization in scientific publications,

Environmental Modelling & Software (2011), doi: 10.1016/j.en- vsoft.2010.12.006

planet earth by Amiryshakiel from the Noun Project