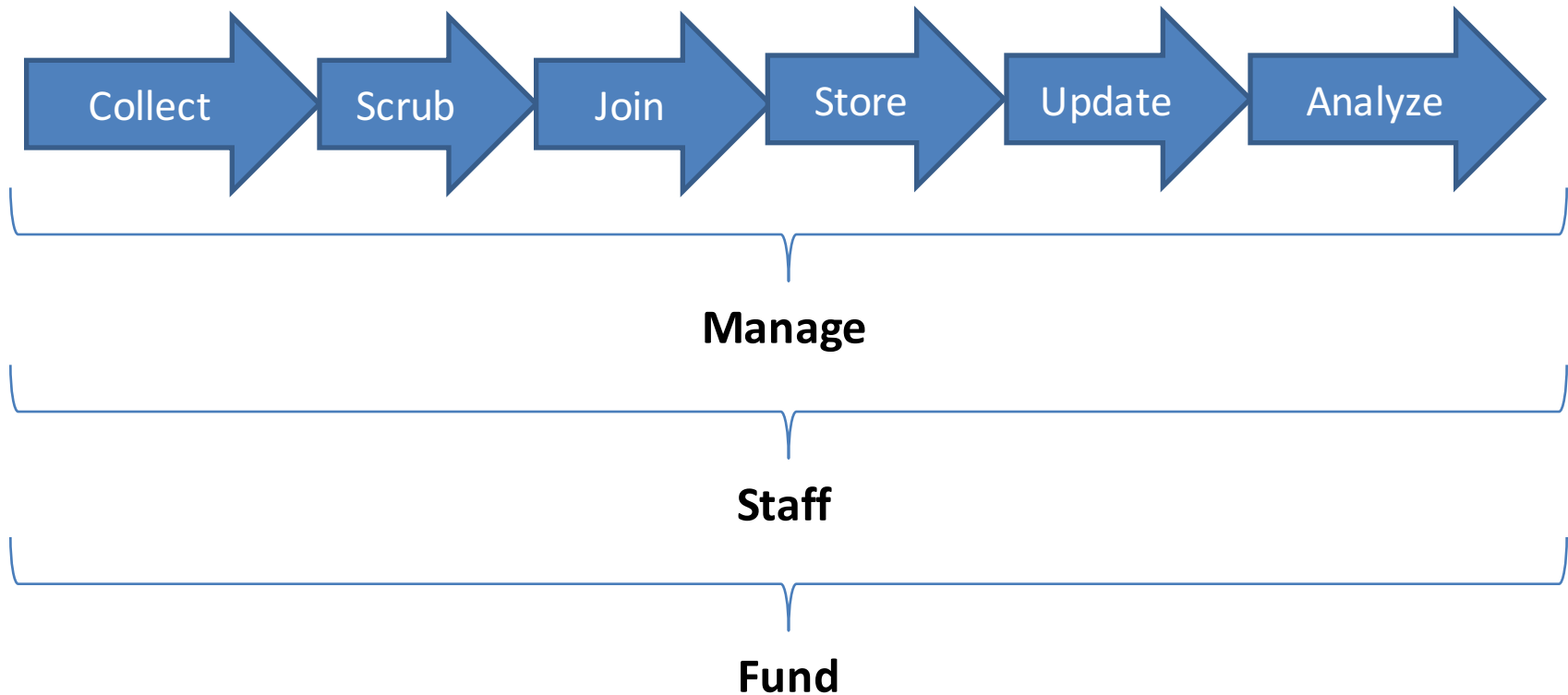


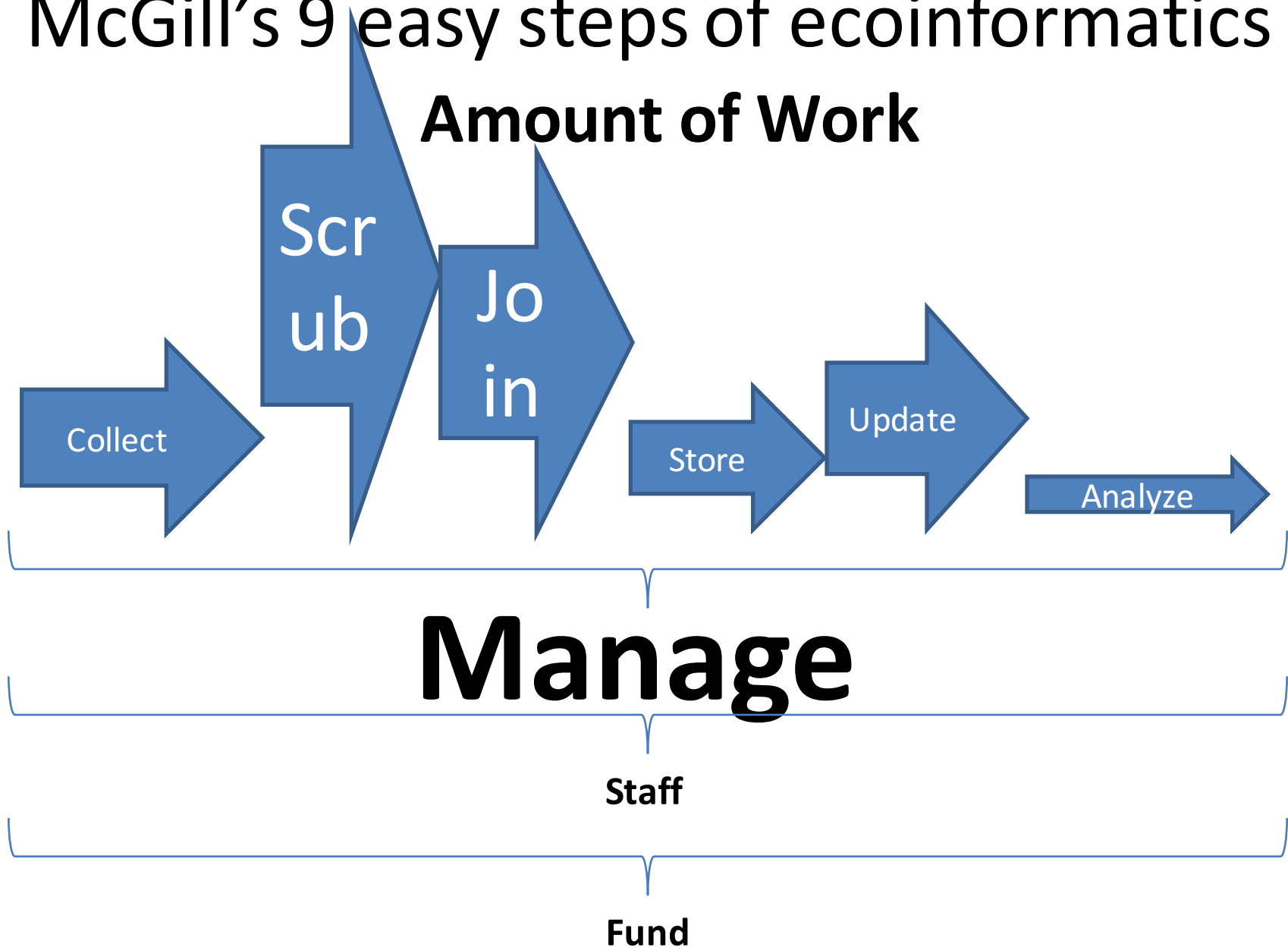
The joy of data cleaning

# McGill's 9 easy steps of ecoinformatics

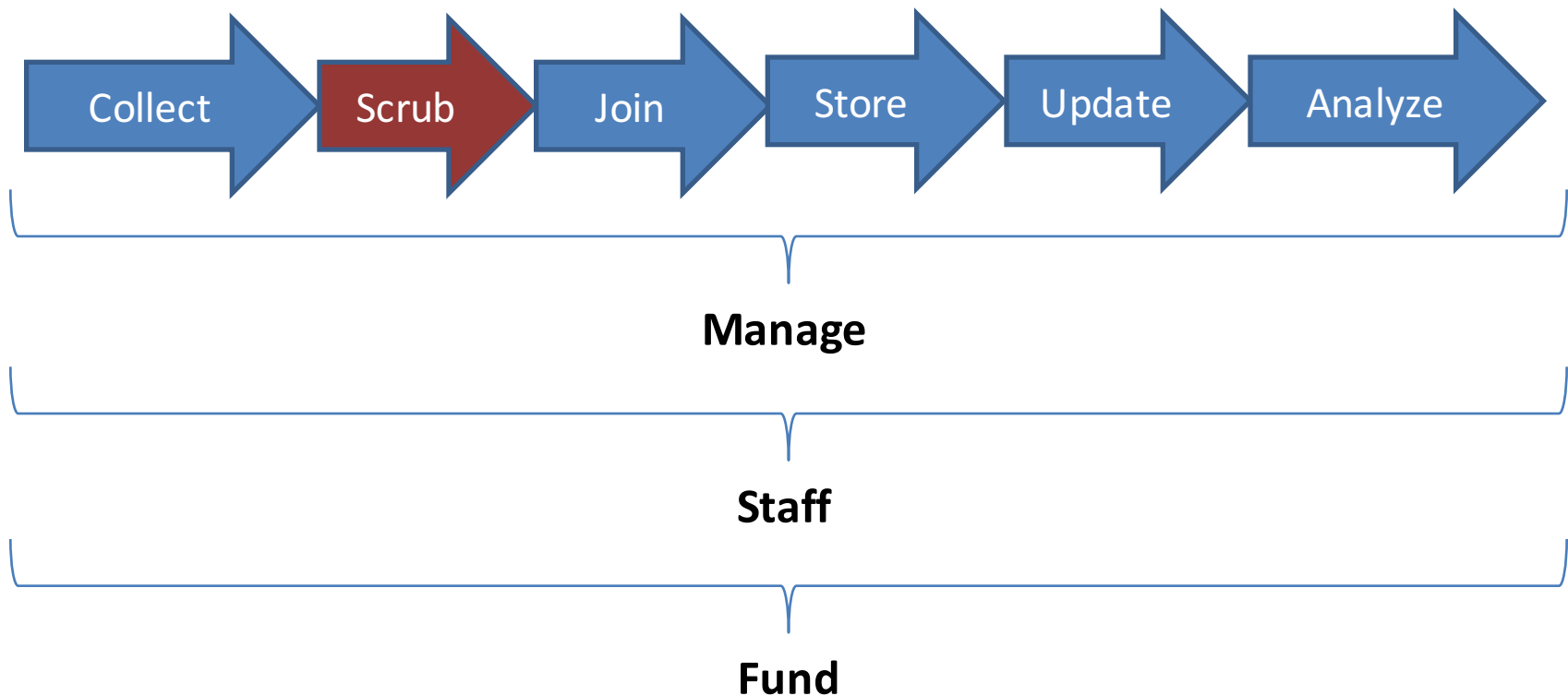


# McGill's 9 easy steps of ecoinformatics

**Amount of Work**



# McGill's 9 easy steps of ecoinformatics

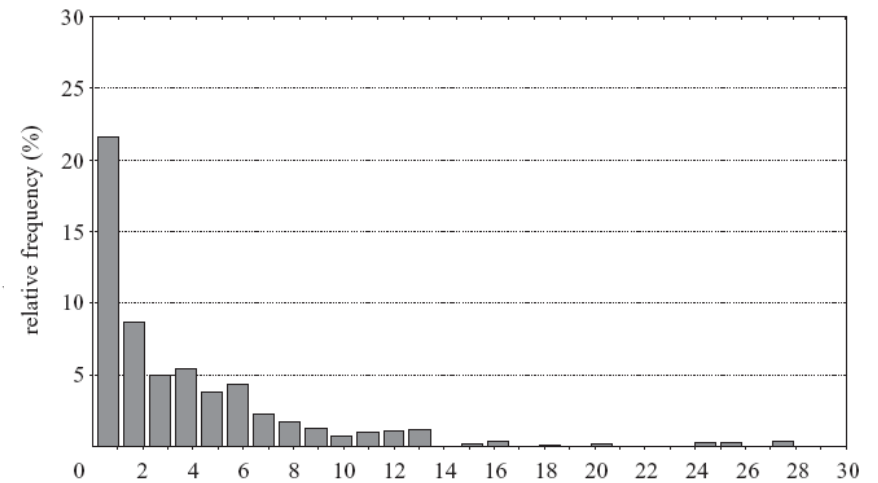
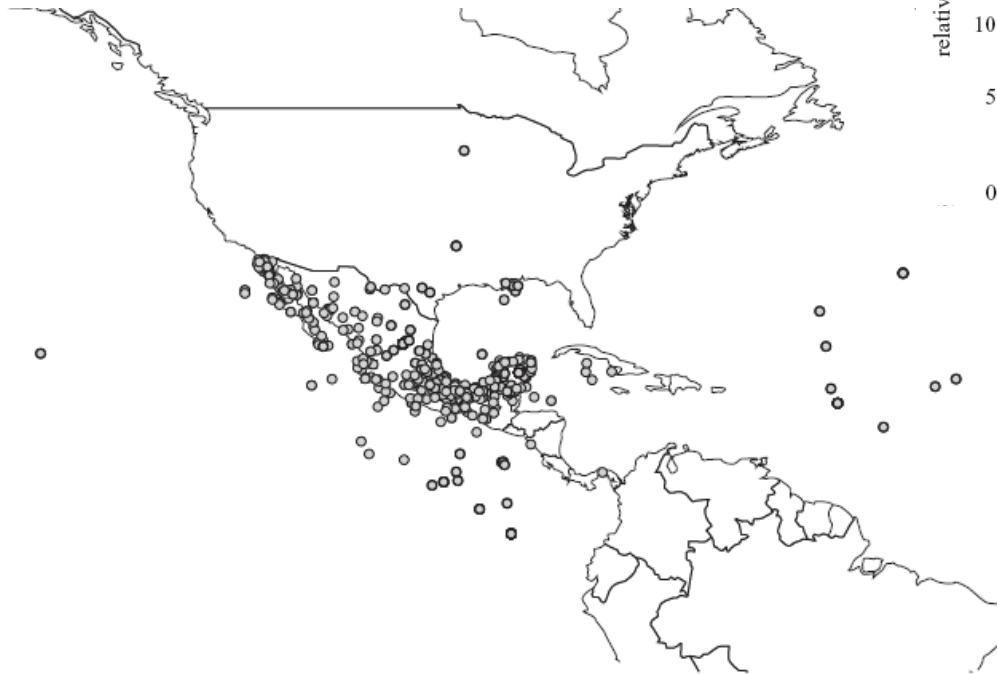


Gartner Group  
70% of datawarehousing  
is in data preparation

# 4 dimensions

- Values
  - 100 cm of rainfall yesterday
  - 0 for NA
  - 1.00 vs 10.0 (transcription errors)
  - Instrument errors
  - Data filling?
- Space
  - Geocoding (Convention center Baltimore → 39.2883N, 76.6181W)
  - Geoscrubbing
    - 42,100 for North America
    - 100, 42 for North America
    - 0,0
    - State centers
- Time
  - Best tools, but amazing how often 6/14/2015 vs 2015/6/14
- Taxonomy
  - Misspellings
  - Synonymy

# Synonyms and errors



Soberon & Peterson 2004

# Taxonomic Scrubbing in BIEN

- 2.5M records → 600,000 “species” in New World!
- 600,000 names → 300,000 standardized names after synonymy and misspelling (fuzzy matching)
- TNRS service

Boyle et al 2013



# Geoscrubbing - Synonymy

MEX	ISO 3166-1 alpha-3
MX	ISO 3166-1 alpha-2
Mexico	“official” geonames.org (and gadm.org) name
MEXICO	capitalization insensitive
México	geonames.org alternate name
MÃ©xico	recognizable misencoding of México
M&#233;xico	translatable HTML character code
Mexi	not matched

439 country “names”

62 (14%) unrecognizably misspelled

377 recognized

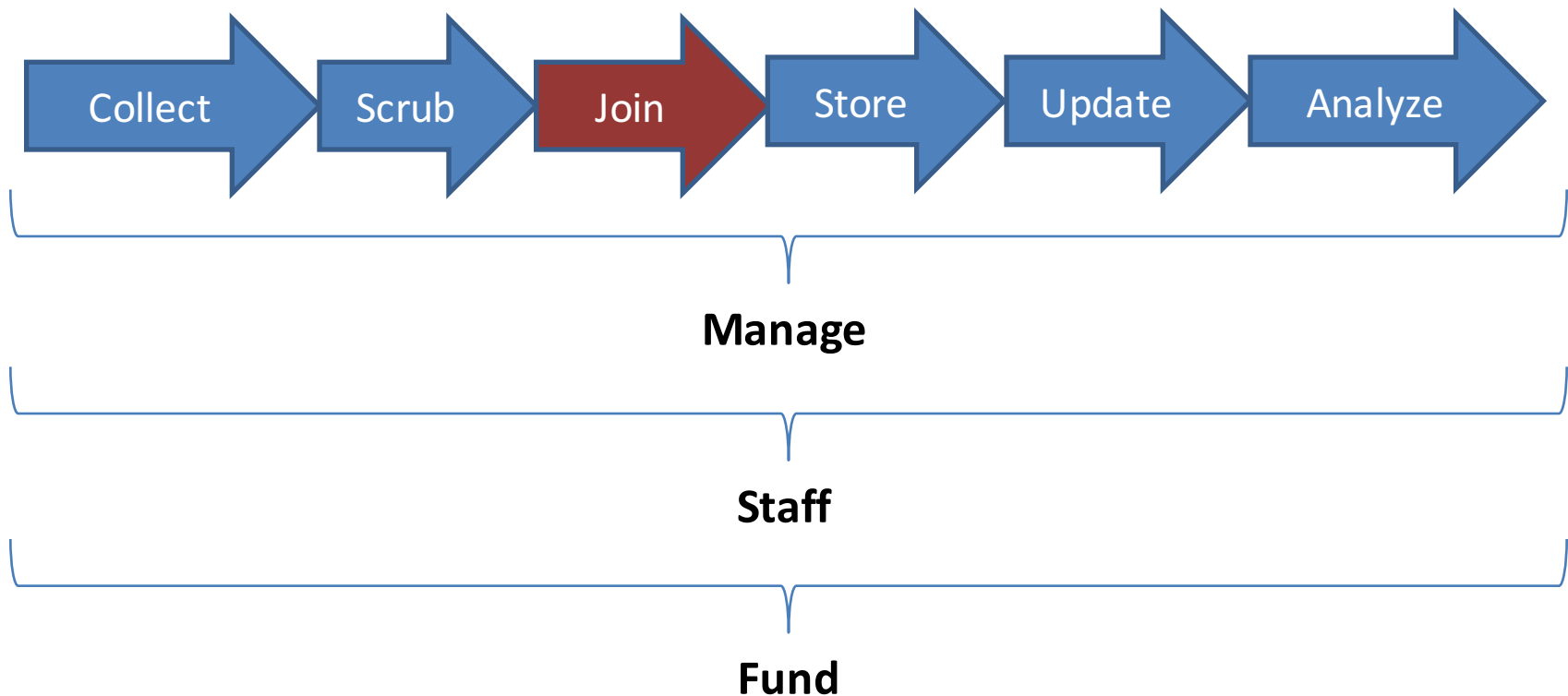
→ 193 recognized countries (49% synonyms)

43% canonical names

# GeoScrubbing in BIEN

- $\sim 1/3$  of records had no lat/lon (or 0/0)
- $>1/2$  had + longitude
- About 1% had other obvious lat/lon errors
- 15% not in the right country
- 25% not in the right state/province
- $67\% * 85\% * 75\% = 41\%$  correct!

# McGill's 9 easy steps of ecoinformatics



# Joining data

- Cleaning & synonyms
  - *Pinus strobus* in USFIA vs *Pinus strobus* L. in MOBOT
- Semantic joining
  - USFIA has # stems per 0.04 ha plot
  - MOBOT has a specimen card/occurrence
- Record connecting
  - The easy part – databases do this well

## Two laws of scrubbing & joining

- Gartner's law #1 – expect it to be 70% of your work
- McGill's law #2 – expect ~50% of the data to be wrong