

ONEMercury: Towards Automatic Annotation of Environmental Science Metadata

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DataONE is Foremost a Federation

Member Nodes (MNs)

- Heart of the federation
- Harness the power of local curation

Coordinating Nodes (CNs)

- Services to link Member Nodes

Investigator Toolkit (ITK)

- Tools for the whole data lifecycle



Deployed Infrastructure

Coordinating Nodes

- ORC: ORNL + UTK
- UCSB
- UNM

Investigator Toolkit

- Java and Python libs
- Command line
- ONEMercury
- (R plugin)
- (Morpho)
- (ONEDrive)

Member Nodes

Production

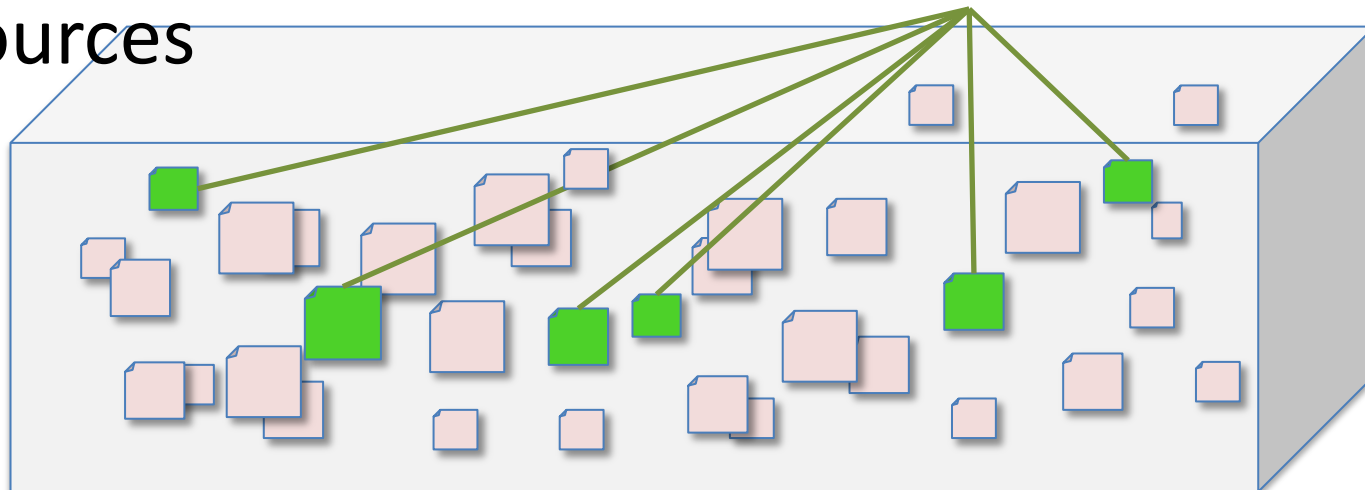
- KNB
- ESA
- SANParks
- USGS CSAS
- ORNL DAAC
- LTER
- CDL
- PISCO

Testing

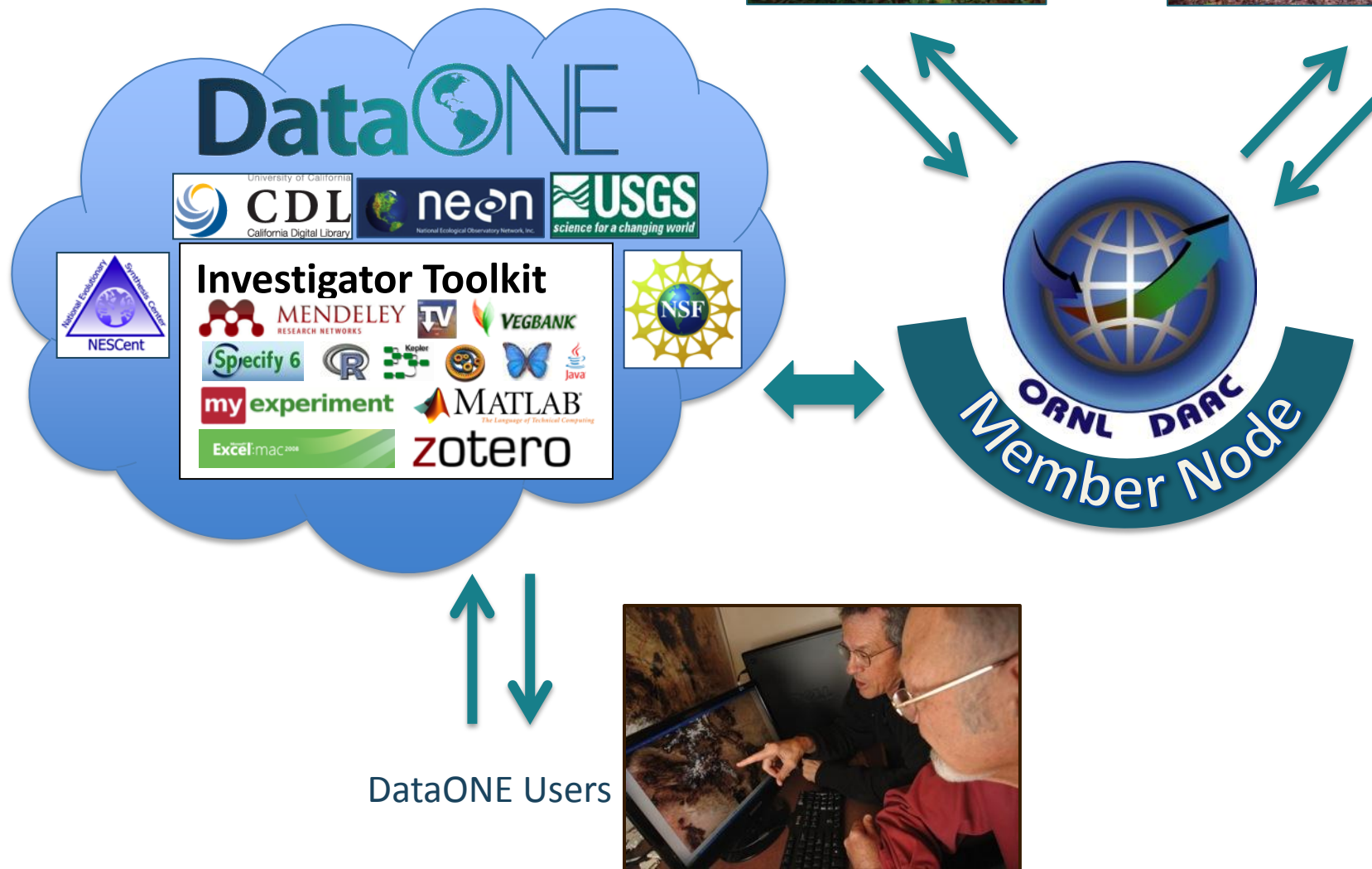
- AKN
- TFRI
- Dryad
- EDAC
- KUBI

Discovery Services

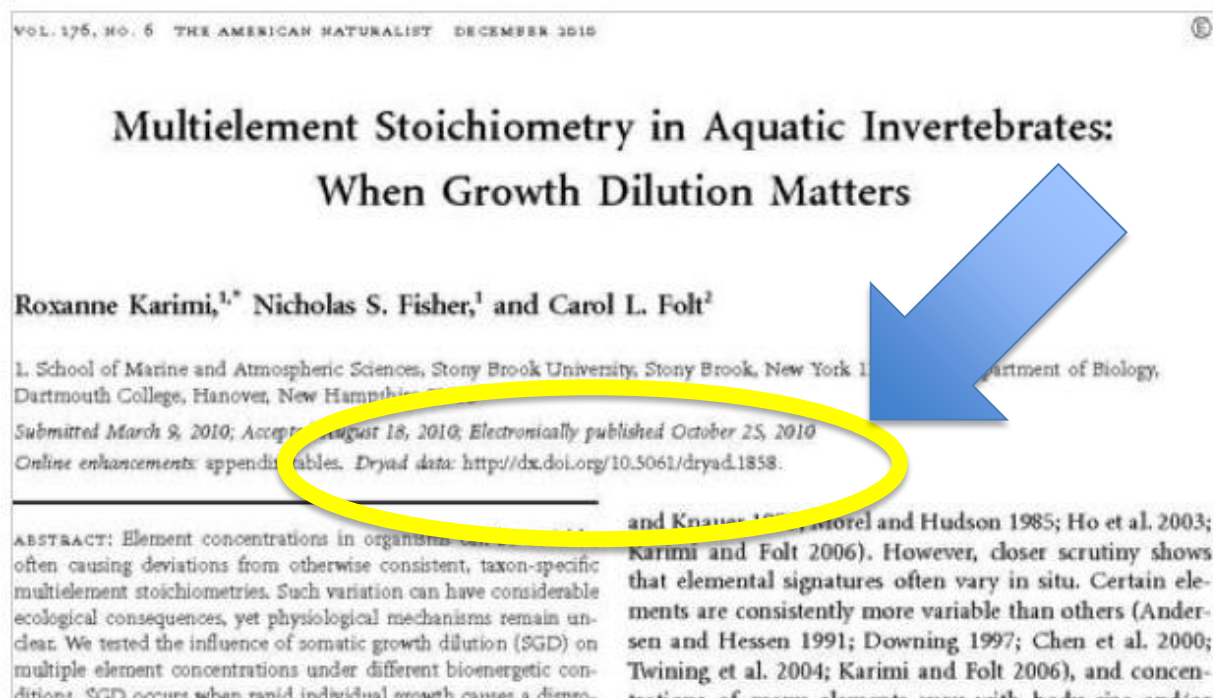
- Find the list of objects relevant to *some query*
- *Example: “Find data related to soil organic carbon concentration”*
 - Manual query: entered by user
 - Automated query: derived by navigation
 - Determined by client operation context
- Build a common index from heterogeneous sources



ORNL DAAC as a DataONE Member Node



Provide credit for data publication



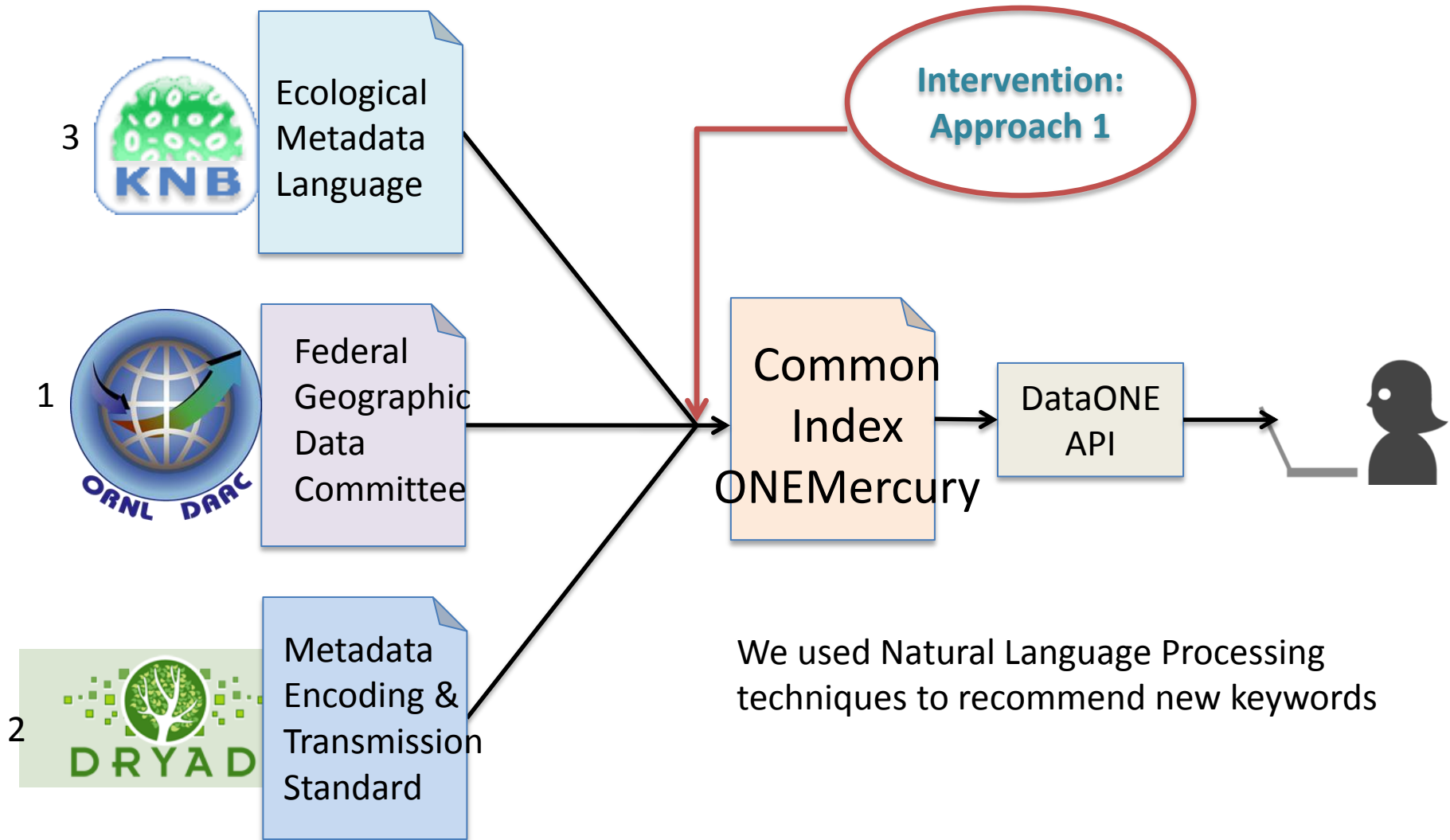
When using this data, please cite the original article:

Ally D, Ritland K, Otto SP (2008) Can clone size serve as a proxy for clone age? An exploration using microsatellite divergence in *Populus tremuloides*. *Molecular Ecology* 17(22): 4897–4911.
[doi:10.1111/j.1365-294X.2008.03962.x](https://doi.org/10.1111/j.1365-294X.2008.03962.x)

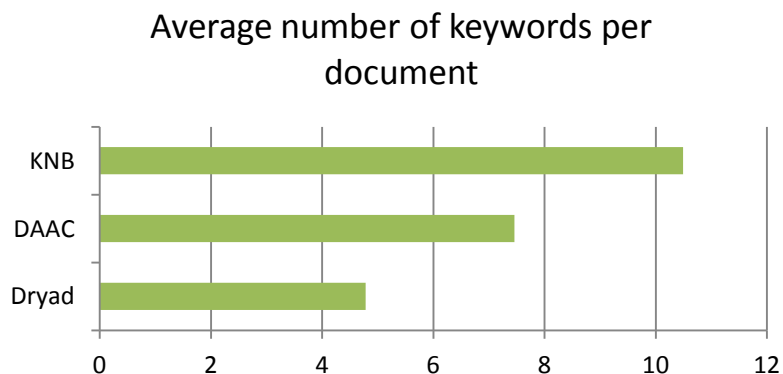
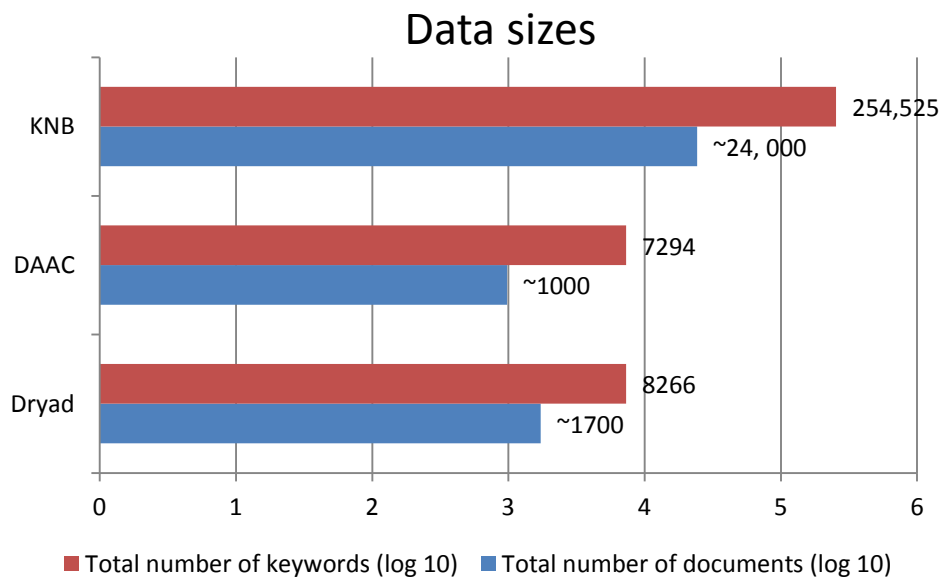
Additionally, please cite the Dryad data package:

Ally D, Ritland K, Otto SP (2008) Data from: Can clone size serve as a proxy for clone age? An exploration using microsatellite divergence in *Populus tremuloides*. Dryad Digital Repository. [doi:10.5061/dryad.7898](https://doi.org/10.5061/dryad.7898)

Automatic keyword recommendation

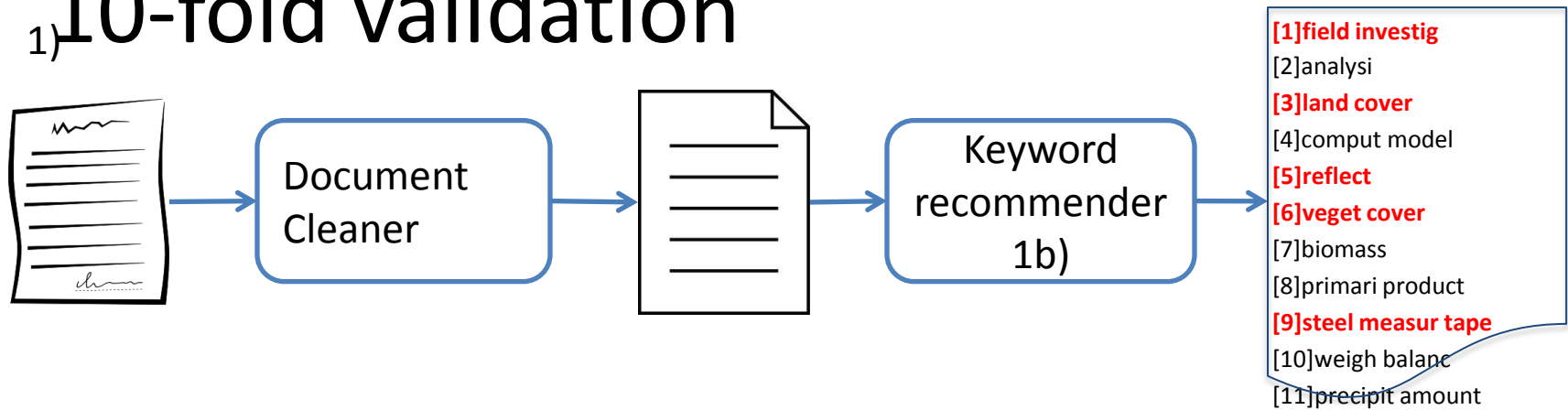


Data sizes



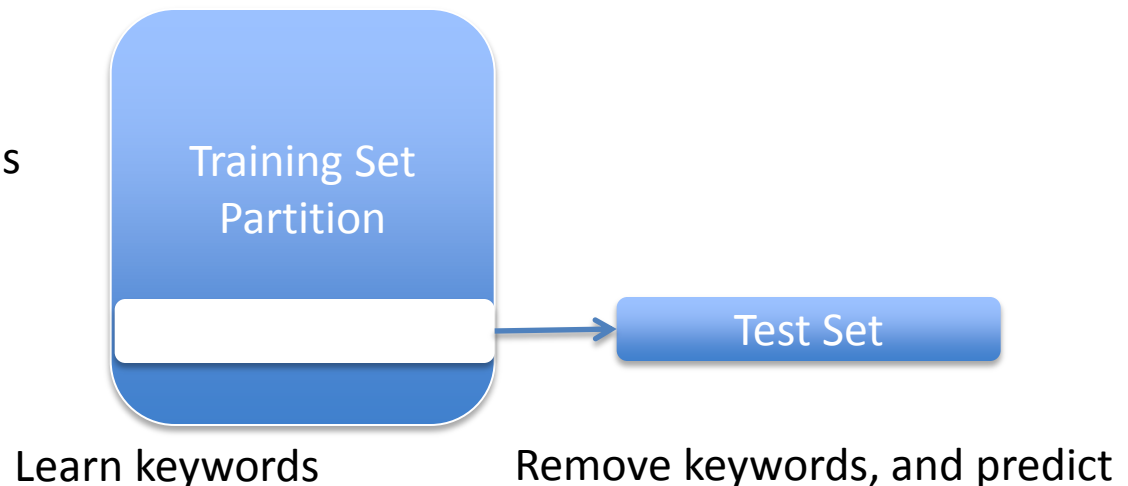
- Small, 175 MB ten-fold training set
- What matters:
 - Total number of documents
 - Total number of keywords
 - Number of topics in the training set
 - Evaluation method

Method details: Topic Model using Latent Dirichlet Allocation + 10-fold validation

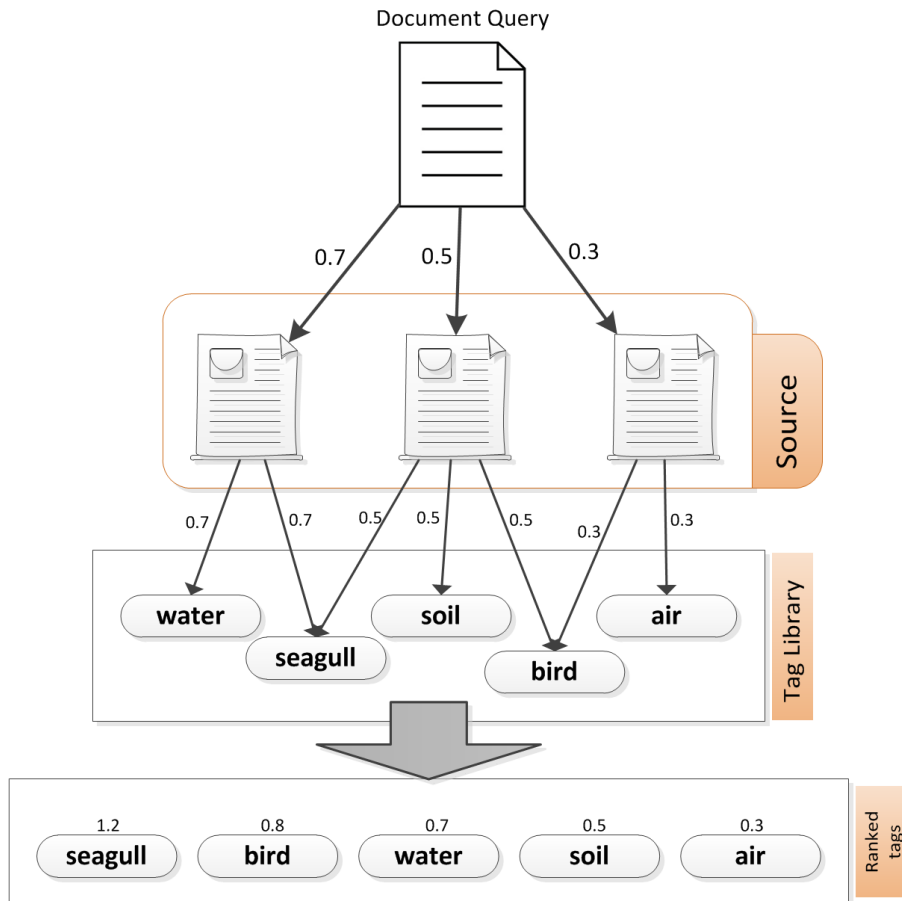


1b) Training set:
uses title, abstract,
description, keywords

Test set:
removes keywords
predict



System



Compute similarity scores between query and source documents.

Propagate the scores to tags.
If a tag receives multiple scores, sum the scores.

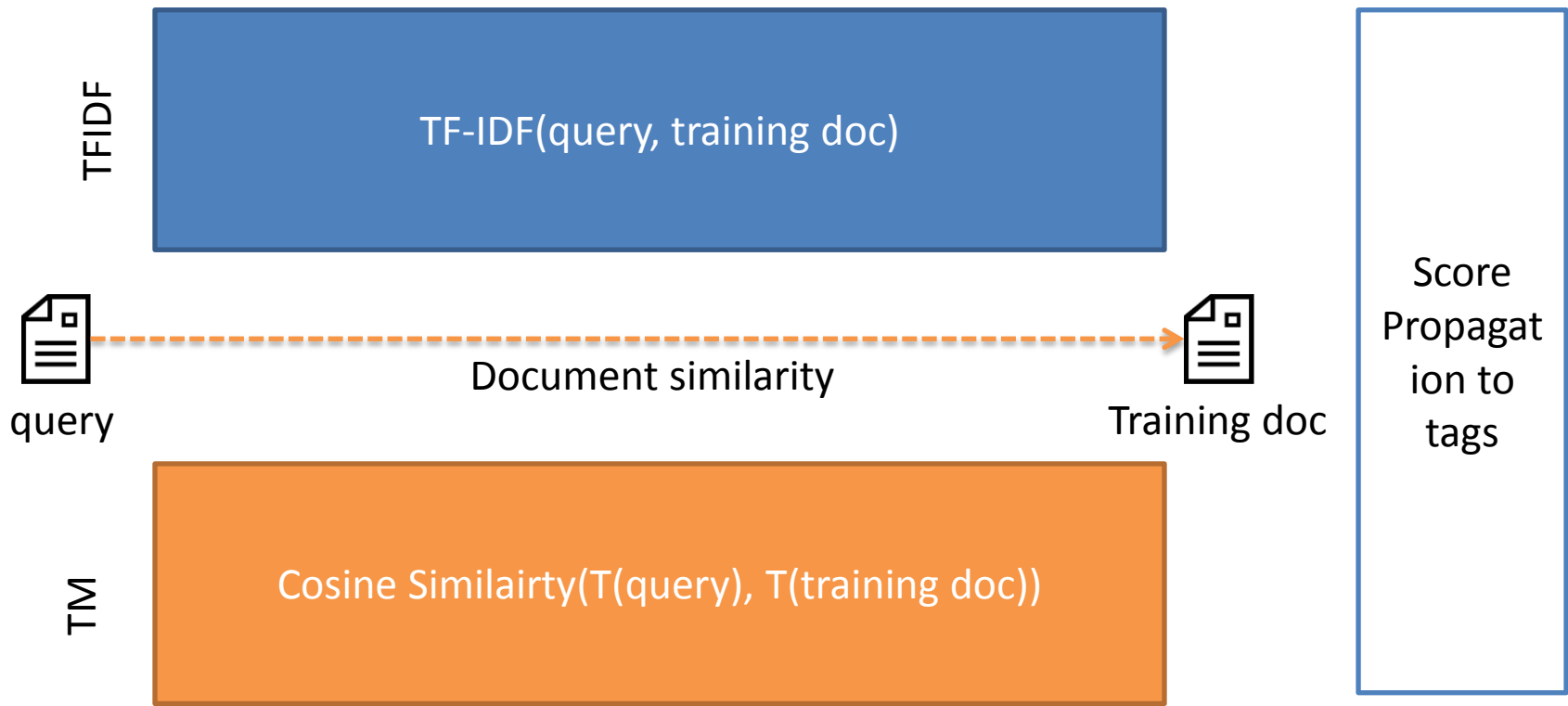
Rank and return top K tags.

Topic Model Based Approach (TM): Main Idea

- 1. Model topics from training corpus.
- 2. Calculate the topic similarity scores (using cosine similarity) between the query and each document in the training set.
- 3. Propagate the scores to the tags in each training document.

TFIDF vs TM

Basically, the similarity measures between the query and a training document



* $T(d)$ is a topic distribution of document d , representing by a vector of probability values.

Computing $T(d)$

- Ex. 3 topics are modeled from the training corpus (We use *LDA* algorithm to model topics)
- $T(d) = \langle t_1, t_2, t_3 \rangle$ where t_i is the probability that document d belongs to topic i .
- Note that $t_1 + t_2 + t_3 = 1.0$
- We use the inference algorithm proposed by Asuncion et al.* to find the topic distribution of a document.

* Asuncion, A., Welling, M., Smyth, P., & Teh, Y. W. (2009). On Smoothing and Inference for Topic Models. *Proceedings of the TwentyFifth Conference on Uncertainty in Artificial Intelligence*, 24(MI), 27–34. AUAI Press. Retrieved from <http://discovery.ucl.ac.uk/150501/>

Evaluation Metrics

- **Precision @ K**
- **Recall@ K**
- **Precision vs Recall**
- **F1 @ K**
- **MRR**
- **Bpref**
- **Training and Testing times**
- **Comparisons** between TFIDF and TM approaches (only self-recommendation) on each archive

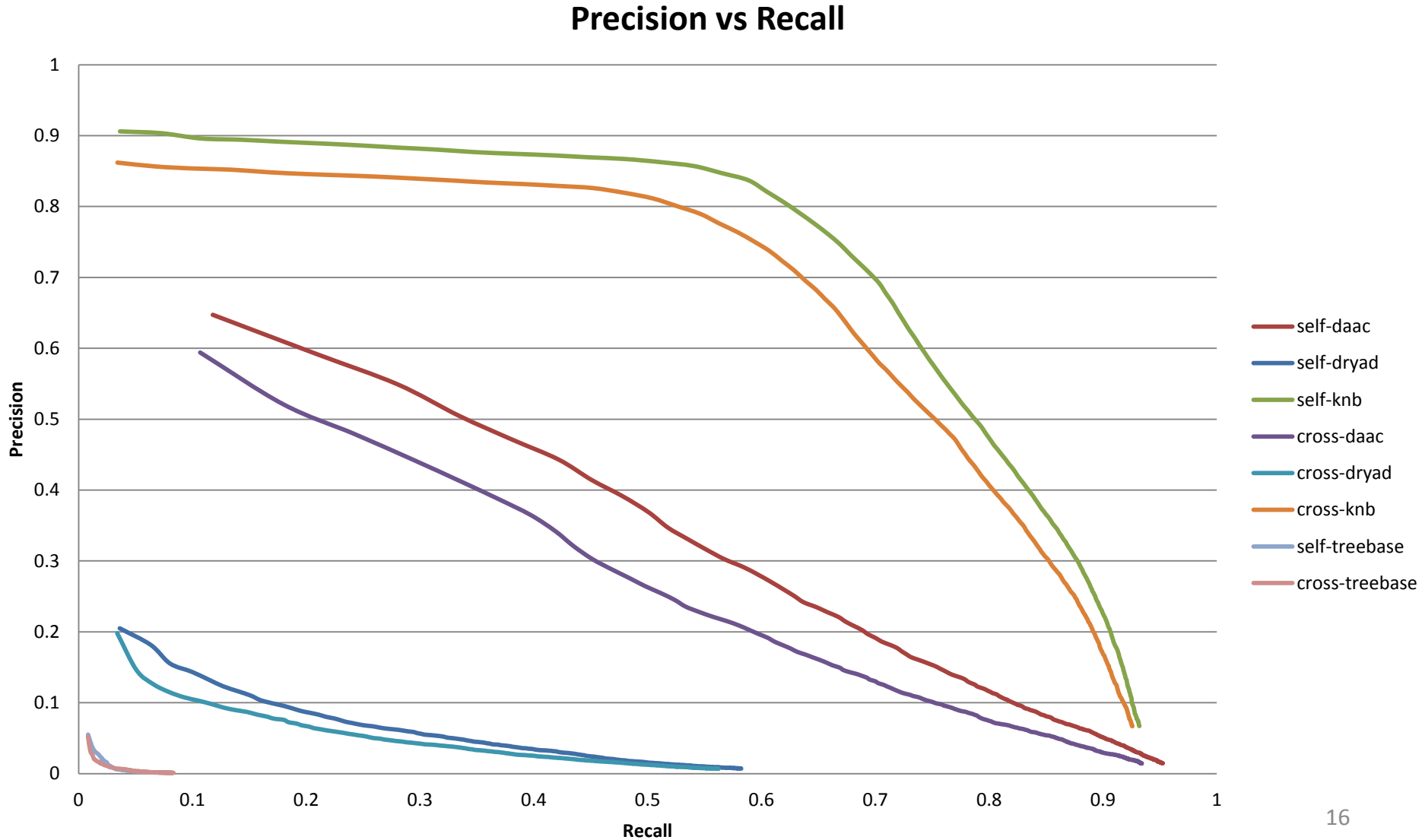
Precision and recall

	Actual Positive	Actual Negative
Predicted Positive	Tp	Fp
Predicted Negative	Fn	Tn

- Precision: $\frac{Tp}{Tp+Fp}$
- Recall: $\frac{Tp}{Tp+Fn}$

- Precision: the proportion of Actual positive in the recommended set
- Recall: the proportion of Actual that are recommended over the entire dataset

TM: Precision vs Recall



TFIDF vs TM: on Self-DAAC (record913.xml)

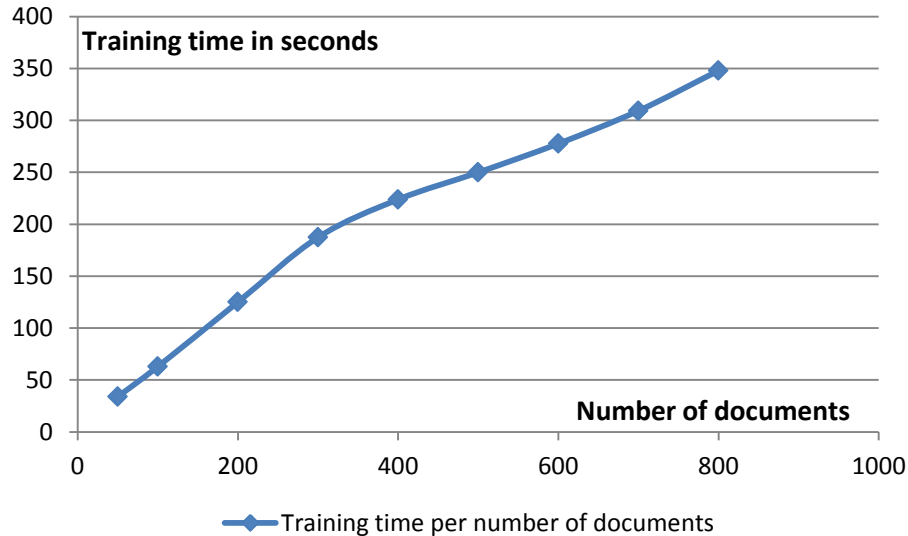
ISLSCP II IGBP DISCOVER AND SIB LAND COVER, 1992-1993

This data set describes the geographic distributions of 17 classes of land cover based on the International Geosphere-Biosphere DISCover land cover legend (Loveland and Belward 1997) and the 15 classes of the SiB model processed at the USGS EROS Data Center (EDC). Specifically, the resampled DISCover datasets were derived from the 1km DISCover data set compiled by the USGS. The 1km data sets for each classification scheme were aggregated to 1, 0.5 and 0.25 degree spatial resolutions for this ISLSCP II data collection. Each layer of the aggregated products corresponds to a single DISCover land cover category and the values represent the percentage of the coarse resolution cell (1 degree, etc) occupied by that land cover category. The dominant class data show the land cover category that occupies the majority of the cell and is derived from the percentage files for each cover type. The objective of this study was to create a land cover map derived from 1 kilometer AVHRR data using a full year of data (April 1992-March 1993). This thematic map was resampled to 0.25, 0.5 and 1.0 degree grids for the International Satellite Land Surface Climatology Project (ISLSCP) data initiative II. During this re-processing, the original EDC land cover type and fraction maps were adjusted to match the water/land fraction of the ISLSCP II land/water mask. These maps were generated for use by global modelers and others. This data set is one of the products of the International Satellite Land-Surface Climatology Project, Initiative II (ISLSCP II) data collection which contains 50 global time series data sets for the ten-year period 1986 to 1995. Selected data sets span even longer periods. ISLSCP II is a consistent collection of data sets that were compiled from existing data sources and algorithms, and were designed to satisfy the needs of modelers and investigators of the global carbon, water and energy cycle. The data were acquired from a number of U.S. and international agencies, universities, and institutions. The global data sets were mapped at consistent spatial (1, 0.5 and 0.25 degrees) and temporal (monthly, with meteorological data at finer (e.g., 3-hour)) resolutions and reformatted into a common ASCII format. The data and documentation have undergone two peer reviews. ISLSCP is one of several projects of Global Energy and Water Cycle Experiment (GEWEX) [<http://www.gewex.org/>] and has the lead role in addressing land-atmosphere interactions -- process modeling, data retrieval algorithms, field experiment design and execution, and the development of global data sets.

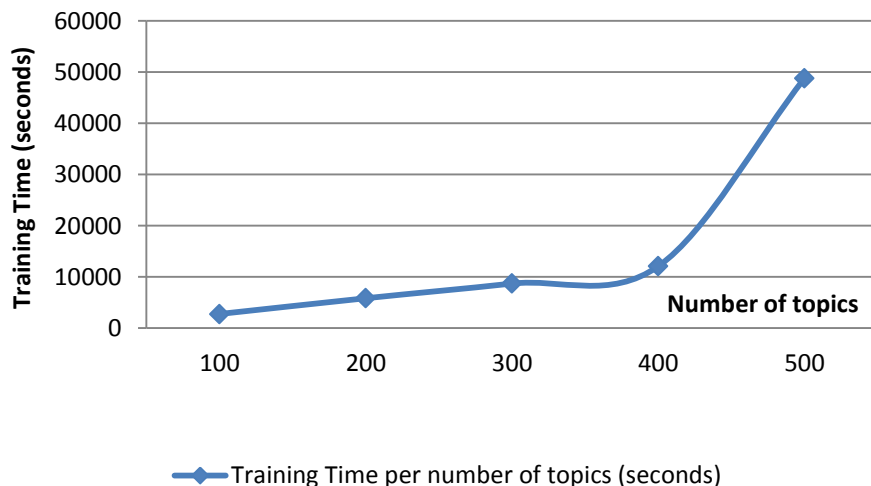
TFIDF vs TM on Self-DAAC (record913.xml)

Actual	TFIDF	TM
[1]albedo	[1]**field investig	[1]**land cover
[2]land cover	[2]analysi	[2]**modi moder resolut imag
[3]veget cover	[3]**land cover	spectroradiomet
[4]veget index	[4]comput model	[3]**terra morn equatori cross time
[5]leaf area meter	[5]**reflect	satellit
[6]terra morn equatori cross time	[6]**veget cover	[4]**field investig
satellit	[7]biomass	[5]**veget cover
[7]noaa nation ocean amp amp	[8]primari product	[6]**reflect
atmospher administr	[9]**steel measur tape	[7]**veget index
[8]plant characterist	[10]weigh balanc	[8]leaf characterist
[9]steel measur tape	[11]precipit amount	[9]**canopi characterist
[10]canopi characterist	[12]**canopi characterist	[10]**plant characterist
[11]modi moder resolut imag	[13]**leaf characterist	[11]**albedo
spectroradiomet	[14]water vapor	[12]**steel measur tape
[12]leaf characterist	[15]quadrat sampl frame	[13]**avhrr advanc high resolut
[13]avhrr advanc high resolut	[16]rain gaug	radiomet
radiomet	[17]surfac air temperatur	[14]**noaa nation ocean amp amp
[14]field investig	[18]air temperatur	atmospher administr
[15]reflect	[19]meteorolog station	[15]**leaf area meter
	[20]human observ	[16]analysi
	[21]**veget index	[17]comput model
	[22]soil core devic	[18]noaa
	[23]**plant characterist	[19]avhrr
	[24]surfac wind	[20]popul distribut
	[25]**modi moder resolut imag	[21]river stream
	spectroradiomet	[22]terrain elev
	[26]**albedo	[23]landsat
	[27]**terra morn equatori cross time	[24]landsat tm
	satellit	[25]primari product
	[28]**leaf area meter	[26]model analysi
	[29]**avhrr advanc high resolut	[27]photosynthet activ radiat
	radiomet	[28]topograph effect
	[30]pyranomet	[29]digit elev model
	[31]**noaa nation ocean amp amp	[30]agricultur land
	atmospher administr	[31]digit
	[32]avhrr	[32]biomass

Scalability issues



- Training time increases linearly with increasing number of documents and topics
- Above 400 topics, a memory issue appears



Questions?