

Preparing Yale's material cycles
data for global distribution:
An overview of the Yale STAF Database

Yale

Center for Industrial Ecology

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An abundance of data...

Graedel research group (1997 -)

17+ years of material cycles (2000 -)

7+ years of criticality assessments (2010 -)

H																	He
Li	Be											B	C	N	O	F	Ne
Na	Mg											Al	Si	P	S	Cl	Ar
K	Ca	Sc	Ti	V	Cr	Mn	Fe	Co	Ni	Cu	Zn	Ga	Ge	As	Se	Br	Kr
Rb	Sr	Y	Zr	Nb	Mo	Tc	Ru	Rh	Pd	Ag	Cd	In	Sn	Sb	Te	I	Xe
Cs	Ba	*	Hf	Ta	W	Re	Os	Ir	Pt	Au	Hg	Tl	Pb	Bi	Po	At	Rn
Fr	Ra	**	Rf	Db	Sg	Bh	Hs	Mt	Ds	Rg	Cn	Nh	Fl	Mc	Lv	Ts	Og

35 Non-primordial radioactive elements

20 No data

31 Material cycle data

33 Criticality data

29 Criticality and Material cycle data

* Lanthanides	La	Ce	Pr	Nd	Pm	Sm	Eu	Gd	Tb	Dy	Ho	Er	Tm	Yb	Lu
** Actinides	Ac	Th	Pa	U	Np	Pu	Am	Cm	Bk	Cf	Es	Fm	Md	No	Lr

Yale STAF Database

Unifying ~20 years of material cycle and criticality data generated by Tom Graedel's research group (Yale) into a database, including:

H																	He
Li	Be											B	C	N	O	F	Ne
Na	Mg											Al	Si	P	S	Cl	Ar
K	Ca	Sc	Ti	V	Cr	Mn	Fe	Co	Ni	Cu	Zn	Ga	Ge	As	Se	Br	Kr
Rb	Sr	Y	Zr	Nb	Mo	Tc	Ru	Rh	Pd	Ag	Cd	In	Sn	Sb	Te	I	Xe
Cs	Ba	*	Hf	Ta	W	Re	Os	Ir	Pt	Au	Hg	Tl	Pb	Bi	Po	At	Rn
Fr	Ra	**	Rf	Db	Sg	Bh	Hs	Mt	Ds	Rg	Cn	Nh	Fl	Mc	Lv	Ts	Og

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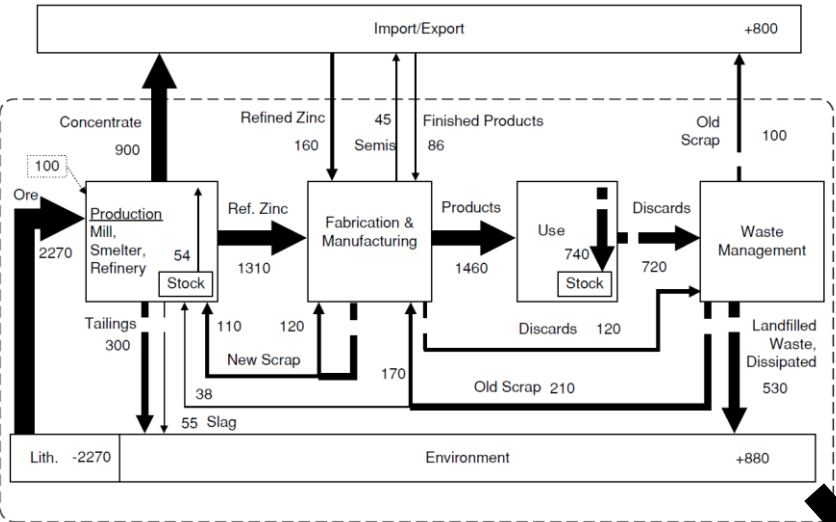
1 Material cycle data

33 Criticality data

29 Criticality and Material cycle data

* Lanthanides	La	Ce	Pr	Nd	Pm	Sm	Eu	Gd	Tb	Dy	Ho	Er	Tm	Yb	Lu
** Actinides	Ac	Th	Pa	U	Np	Pu	Am	Cm	Bk	Cf	Es	Fm	Md	No	Lr

Material cycles



Material criticality

H																			He
Li	Be									B	C	N	O	F					Ne
Na	Mg									Al	Si	P	S	Cl					Ar
K	Ca	Sc	Ti	V	Cr	Mn	Fe	Co	Ni	Cu	Zn	Ga	Ge	As	Se			Br	Kr
Rb	Sr	Y	Zr	Nb	Mo	Tc	Ru	Rh	Pd	Ag	Cd	In	Sn	Sb	Te			I	Xe
Cs	Ba	*	Hf	Ta	W	Re	Os	Ir	Pt	Au	Hg	Tl	Pb	Bi	Po			At	Rn
Fr	Ra	**	Rf	Db	Sg	Bh	Hs	Mt	Ds	Rg	Cn	Nh	Fl	Mc	Lv			Ts	Og

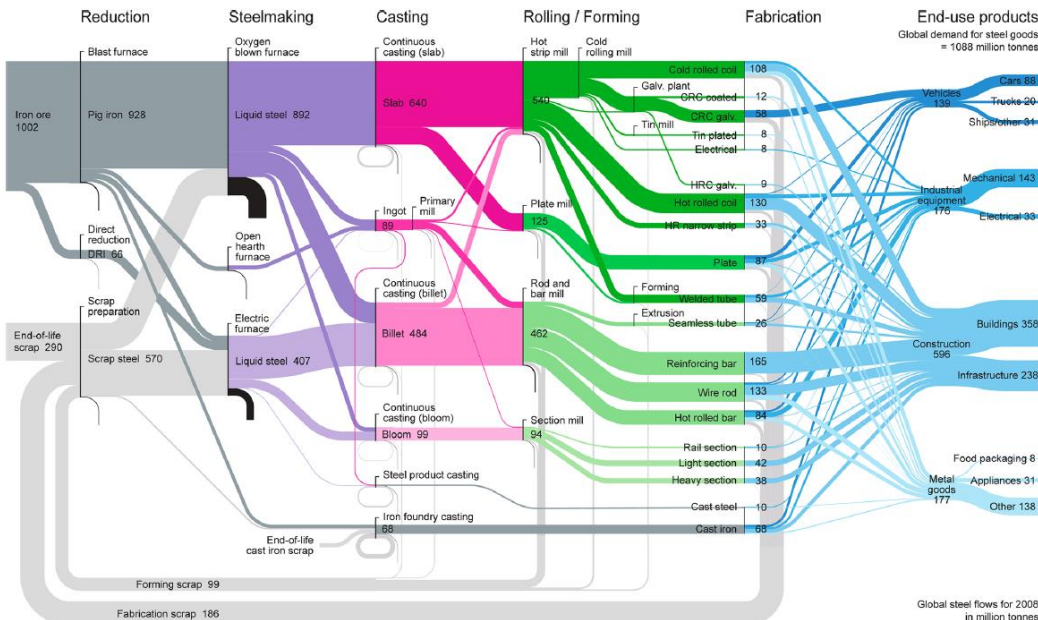
* Lanthanides	La	Ce	Pr	Nd	Pm	Sm	Eu	Gd	Tb	Dy	Ho	Er	Tm	Yb	Lu
** Actinides	Ac	Th	Pa	U	Np	Pu	Am	Cm	Bk	Cf	Es	Fm	Md	No	Lr

Supply risk (global, until ~2050)
 0 25 50 75 100

Non-primordial radioactive elements



Unified data structure for material cycles



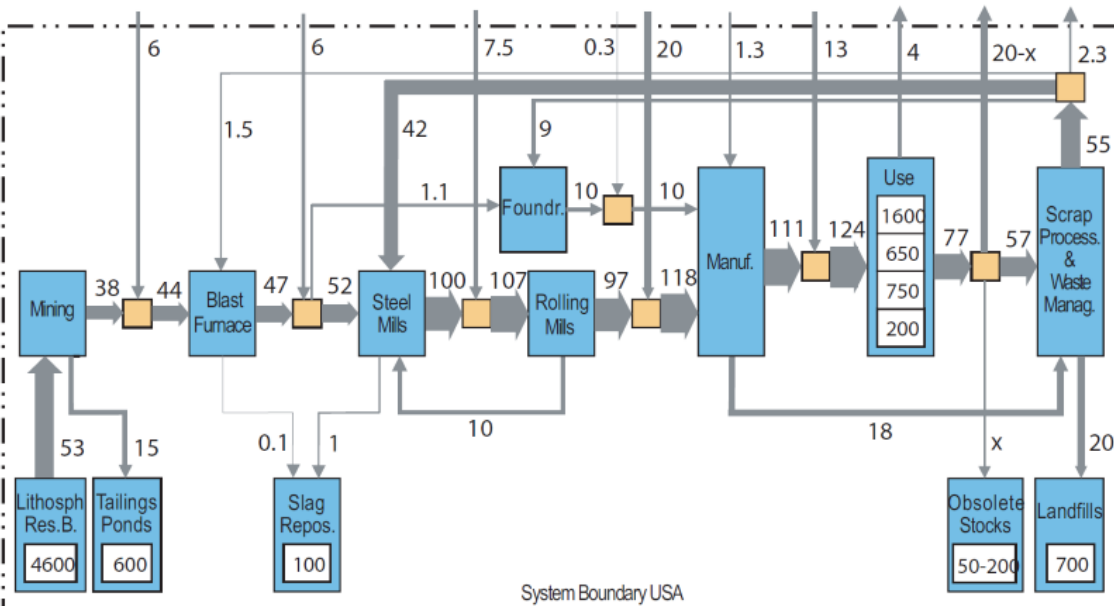
Messy for complex data analysis

No standardized visual labeling system

Additional logic needed to translate visualization into computational data structure

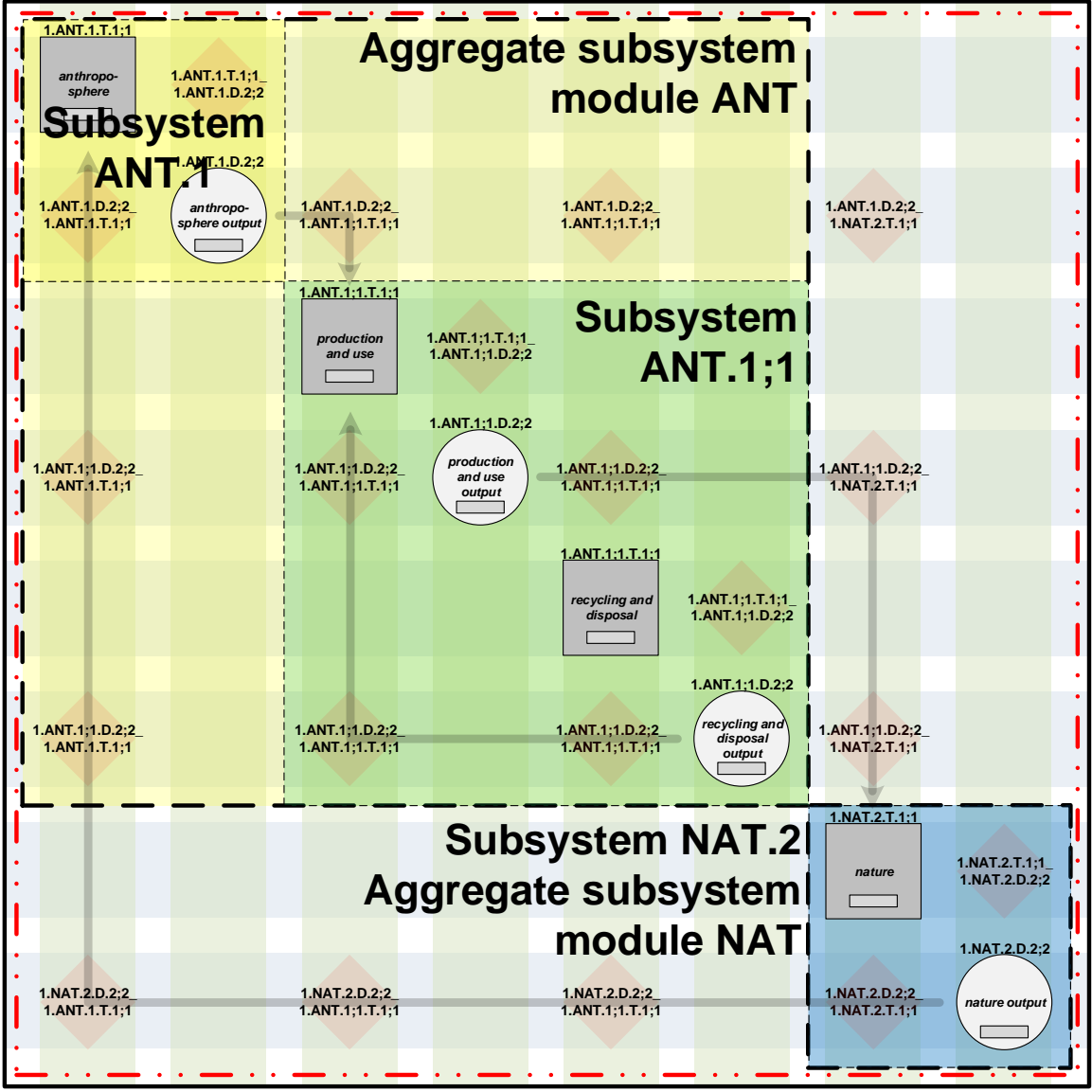
Cullen et al., *Environ. Sci. Technol.*, 2012, 46, 13048-13055

- Individual datasets**
- Typically inconsistently formatted**
- Often incompletely documented**
- Rarely describe multiple data types (kg, \$, ...)**



Müller et al., *Proc. Natl. Acad. Sci. USA*, 2006, 103(44), 16111-16116

Unified Material Information System (UMIS)

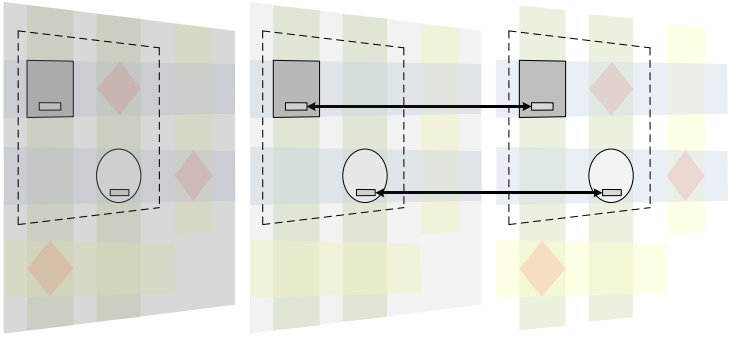


Myers et al., *J. Ind. Ecol.*, under review;

1 invited presentation/1 presentation/1 panel at the ISIE-ISSST 2017 Conference (25-29 June)

UMIS: key components

Metadata layer (metadata) Processes and flows (multi-regional)



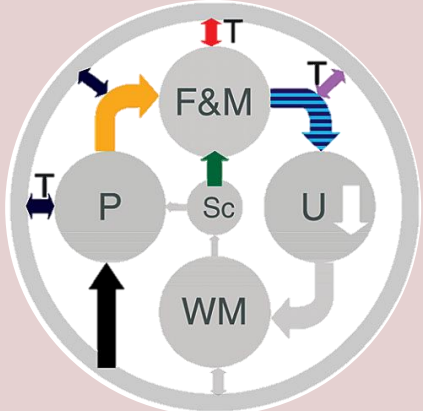
Virtual reservoir (stocks)

Metadata

Material reservoir (virtual) - stocks

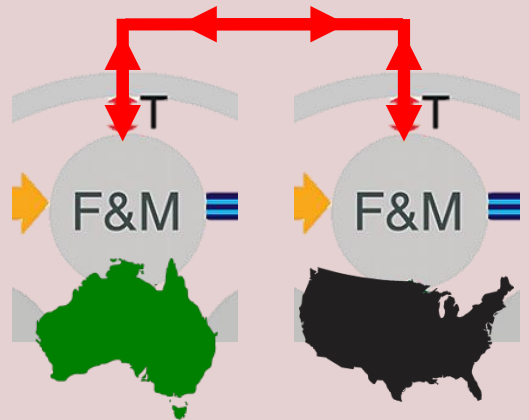
Spatial boundaries - trade

(Life) cycle stages – processes & flows



F&M = fabrication & manufacturing
 U = use
 ...

Material hierarchy for each process/flow



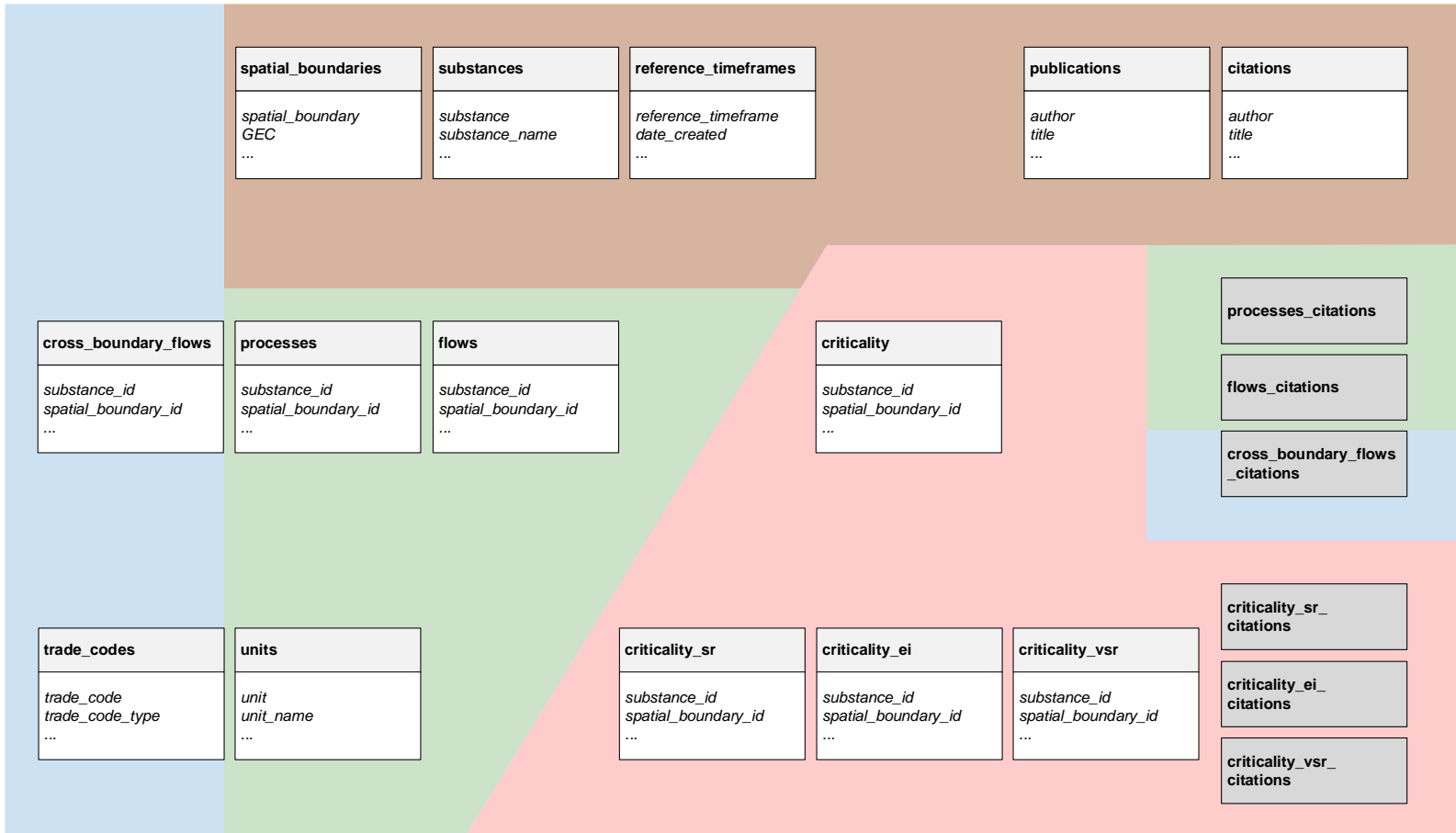
Data table: flows

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O
	substance_id	spatial_boundary_id	reference_timeframe_id	system_boundary_origin	system_boundary_destination	aggregate_subsystem_module_origin	aggregate_subsystem_module_destination	subsystem_origin	subsystem_destination	flow_label	material	quantity	quantity_uncertainty	quantity_reliability	concentration
1	13	4	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
2	13	10	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		168	\N	\N	
3	13	13	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		946	\N	\N	
4	13	14	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
5	13	246	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
6	13	30	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		36	\N	\N	
7	13	39	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		724	\N	\N	
8	13	44	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		5118	\N	\N	
9	13	45	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		708	\N	\N	
10	13	247	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		1194	\N	\N	
11	13	49	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		3	\N	\N	
12	13	62	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		38	\N	\N	
13	13	67	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
14	13	76	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
15	13	77	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
16	13	83	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
17	13	86	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
18	13	101	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		39	\N	\N	
19	13	102	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		1165	\N	\N	
20	13	103	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		149	\N	\N	
21	13	107	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
22	13	108	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
23	13	110	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		1	\N	\N	
24	13	114	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
25	13	129	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
26	13	138	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		414	\N	\N	
27	13	144	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		8	\N	\N	
28	13	150	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
29	13	152	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
30	13	159	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		0	\N	\N	
31	13	166	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		622	\N	\N	
32	13	167	101	outside	inside	environment	production o	\N	\N	RM0601_F unclassifi		27	\N	\N	

Yale STAF Database structure

Material cycles (multiple spatial boundaries)

Material cycles & criticality (single & multiple spatial boundaries)



Material cycles (single & multiple spatial boundaries)

Criticality

Summary

Developing a database to archive Yale's material cycle and criticality data (63 elements, >100,000 data entries)

To do so, we have developed a general and comprehensive data structure for materials cycles data, the Unified Materials Information System (UMIS)

Published data are transformed into the UMIS structure using 'templates', which are then archived into the database (MySQL), and will eventually be freely available (USGS)



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