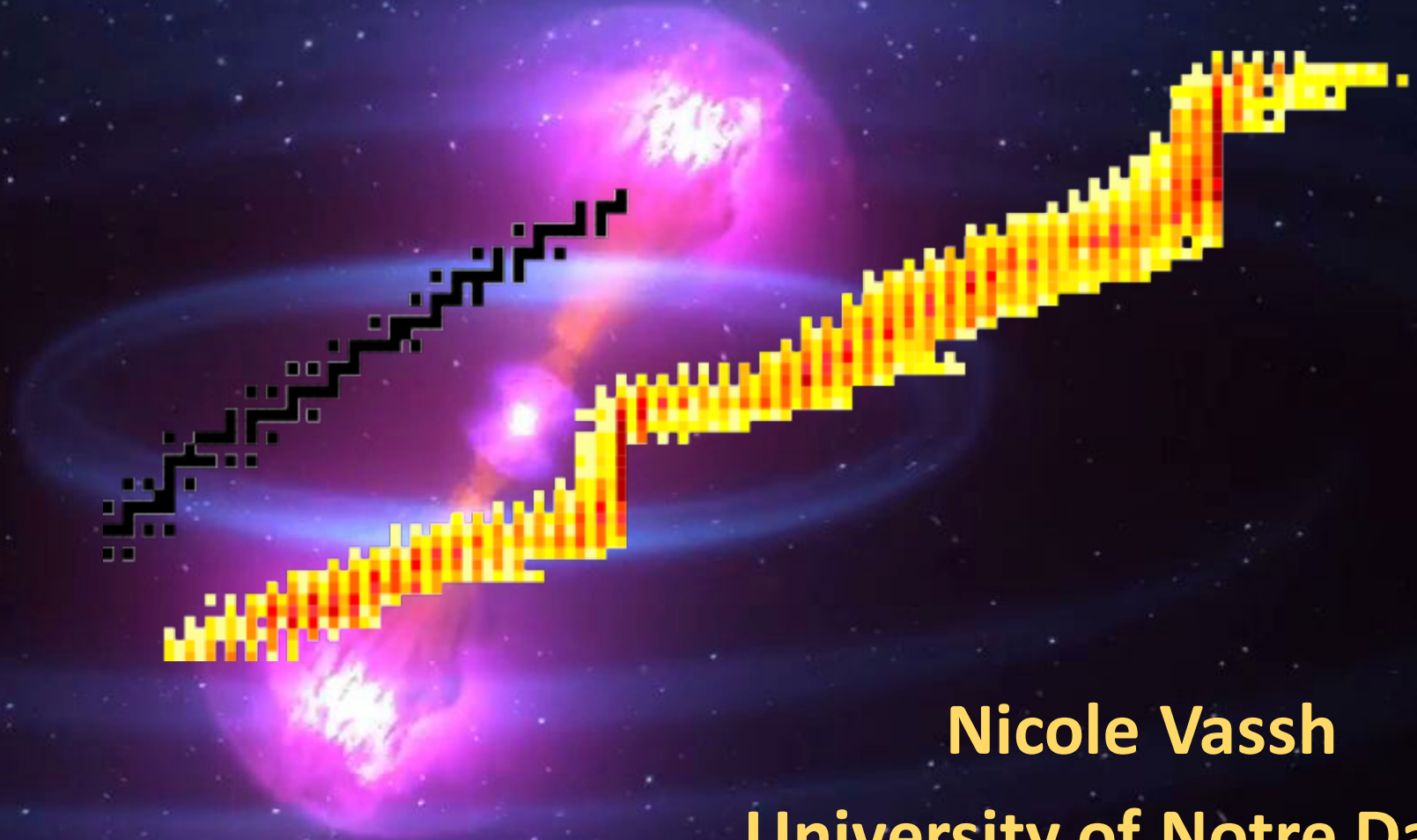


# Examining the Origin of the $r$ -process Rare-Earth Abundance Peak with Markov Chain Monte Carlo



**Nicole Vassh**

**University of Notre Dame**

ISNET-6 Conference, Oct. 9, 2018

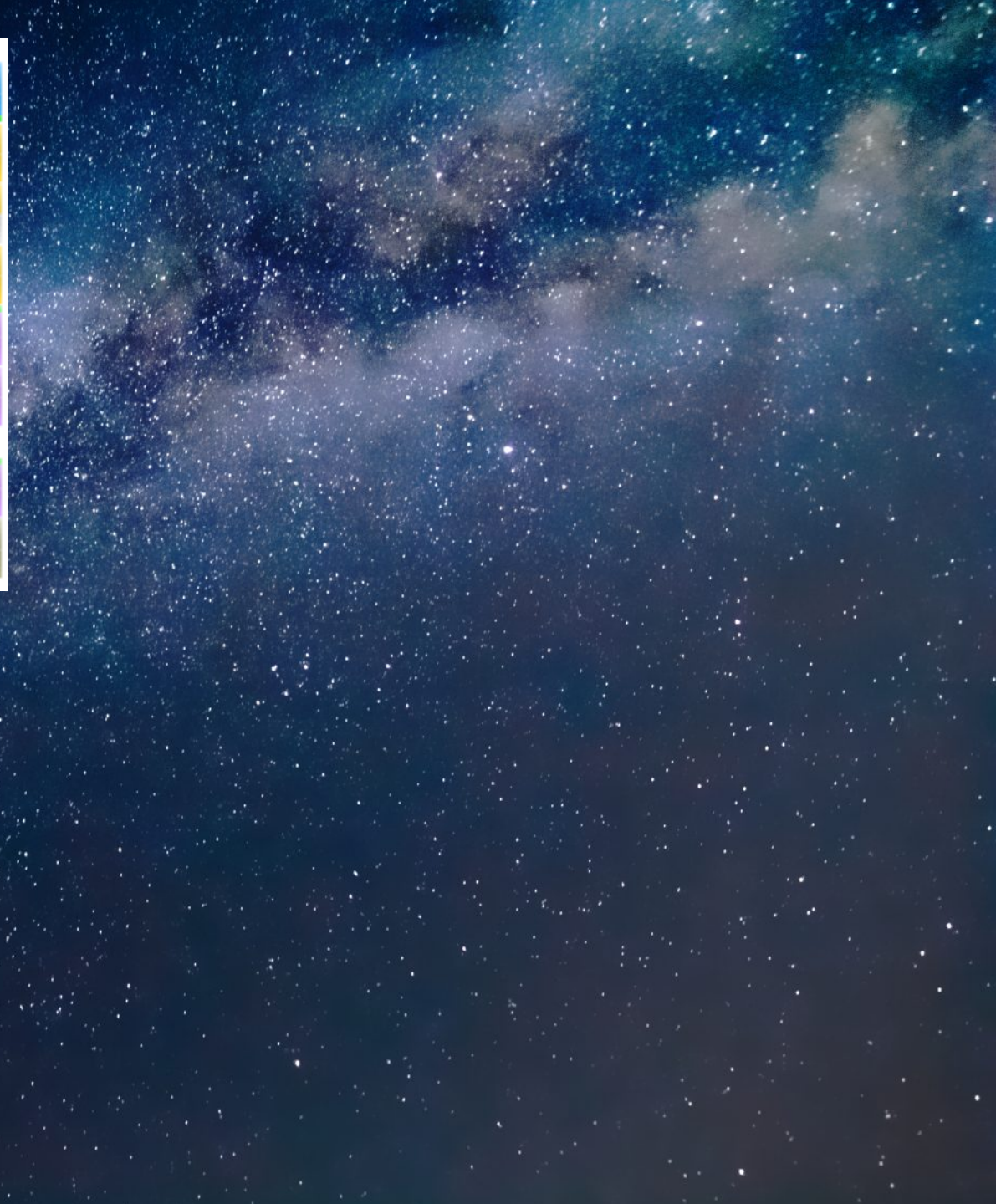
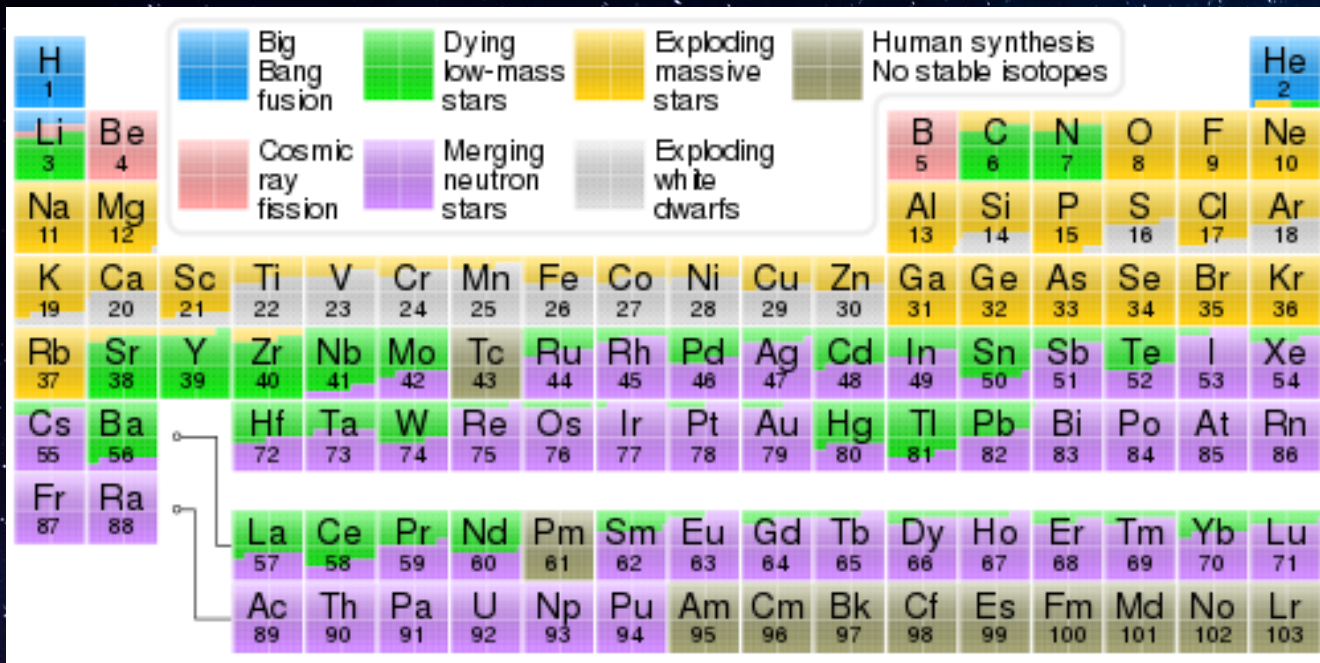


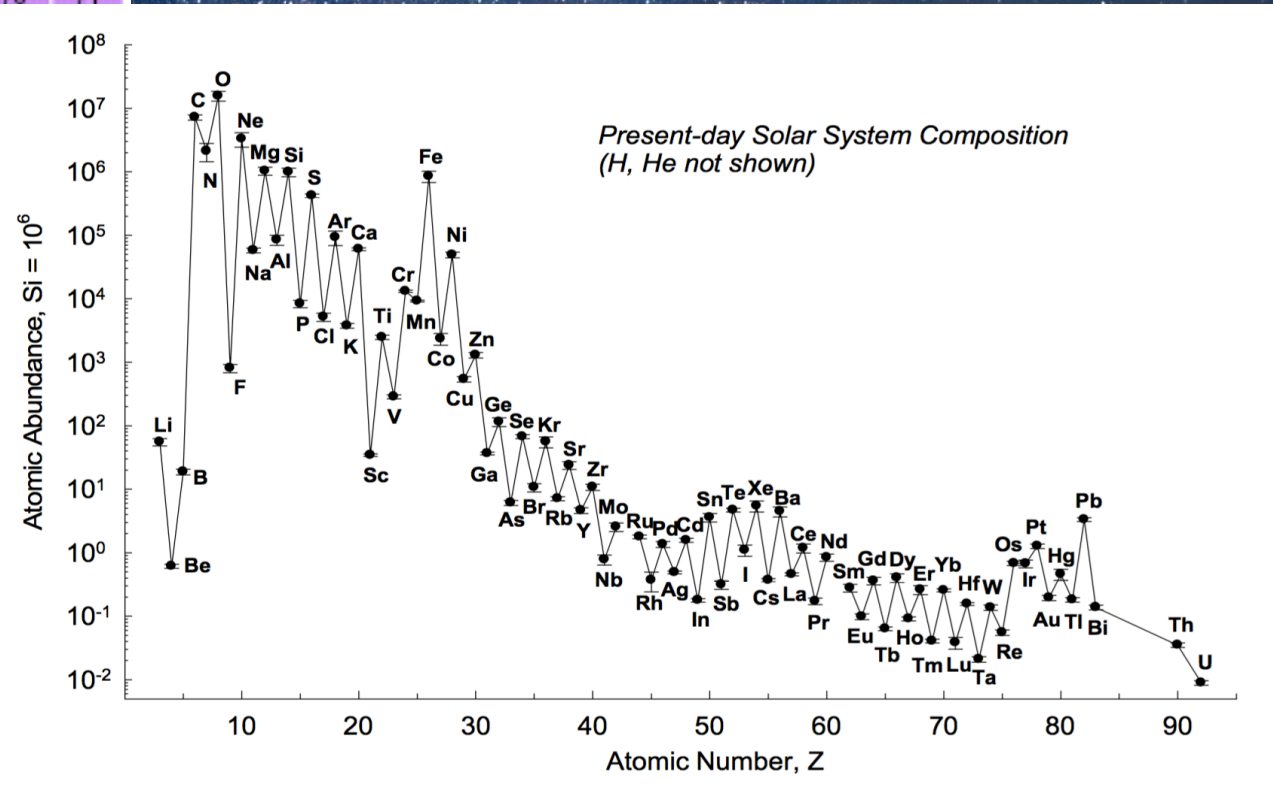
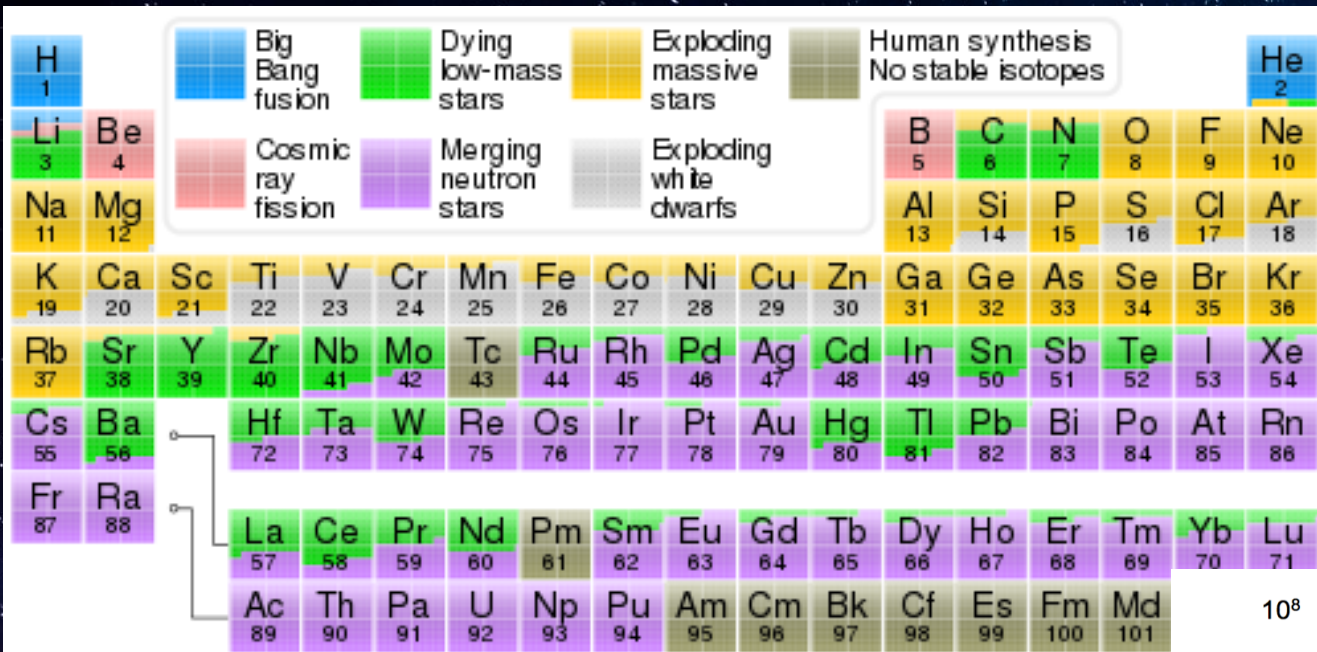
Fission In R-process  
Elements



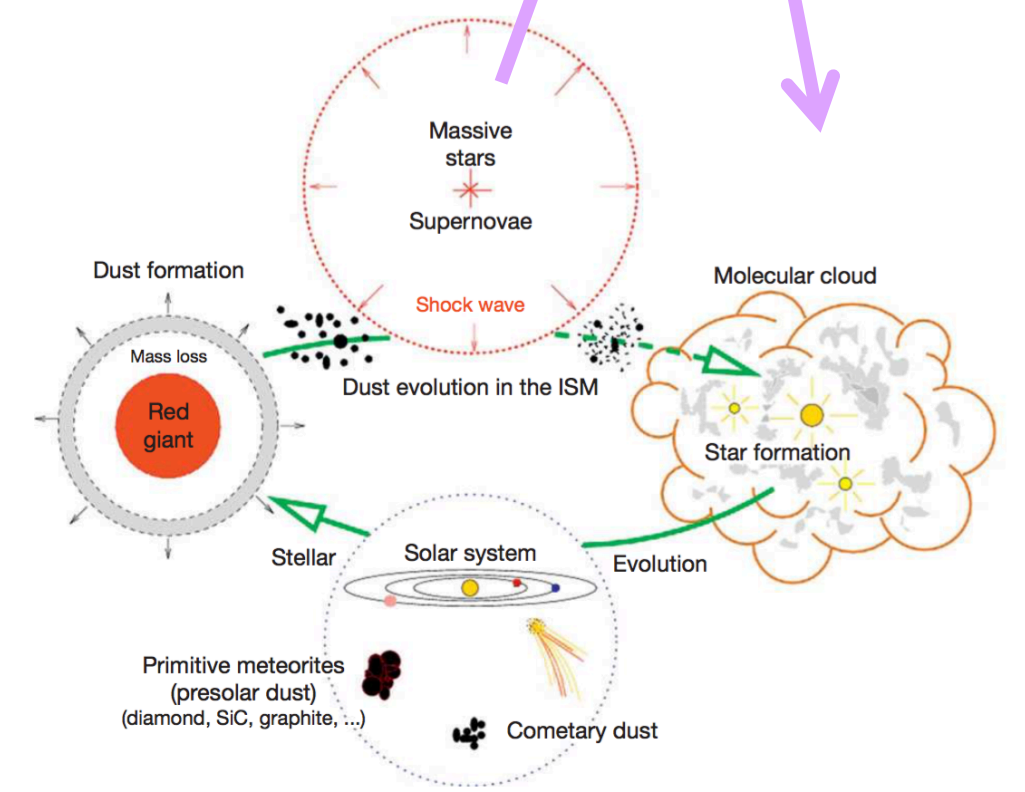
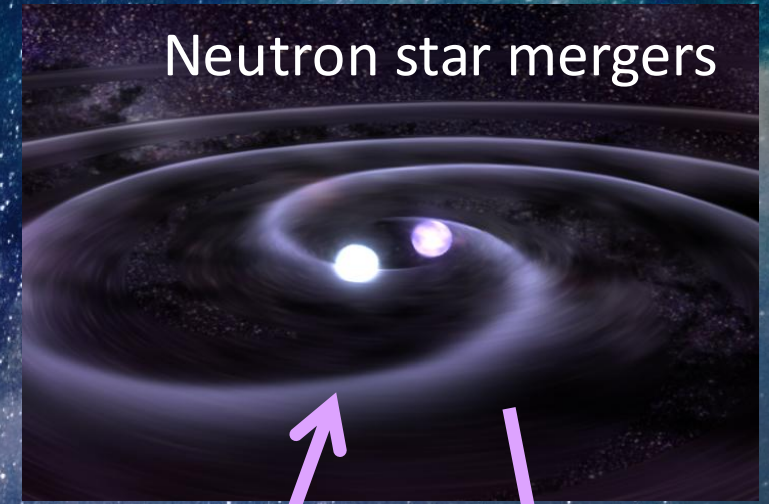
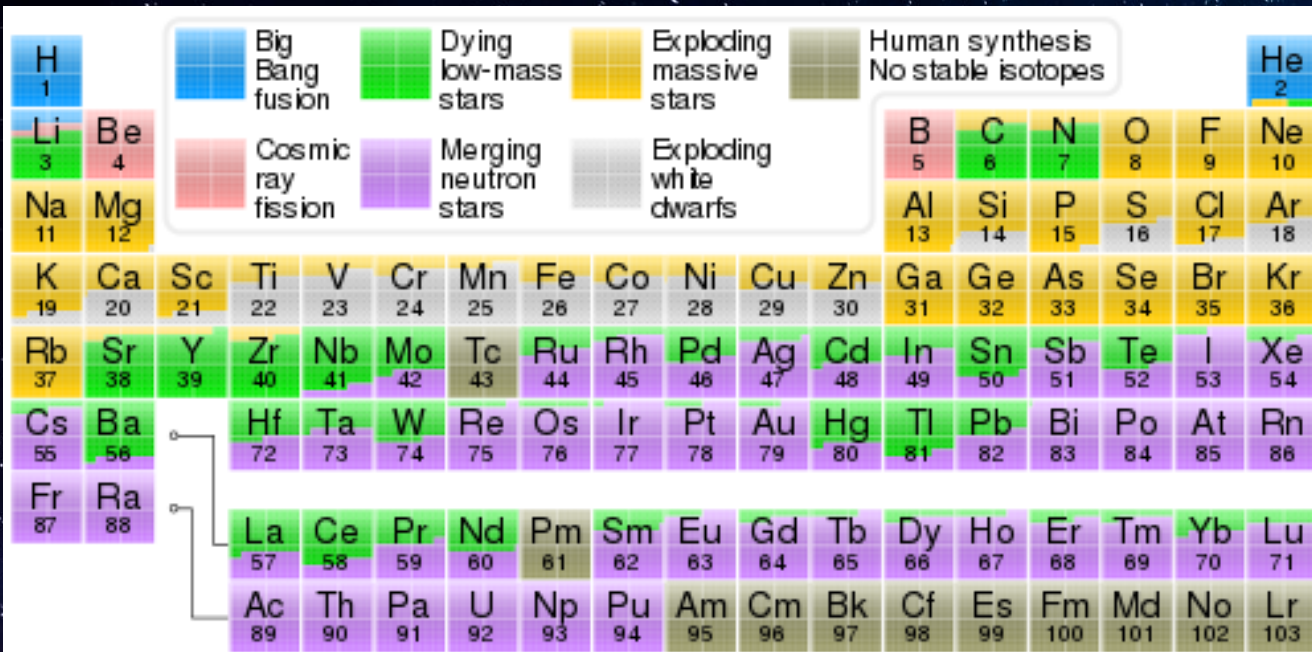
The physics problem:

heavy element nucleosynthesis via rapid neutron capture (*r*-process)



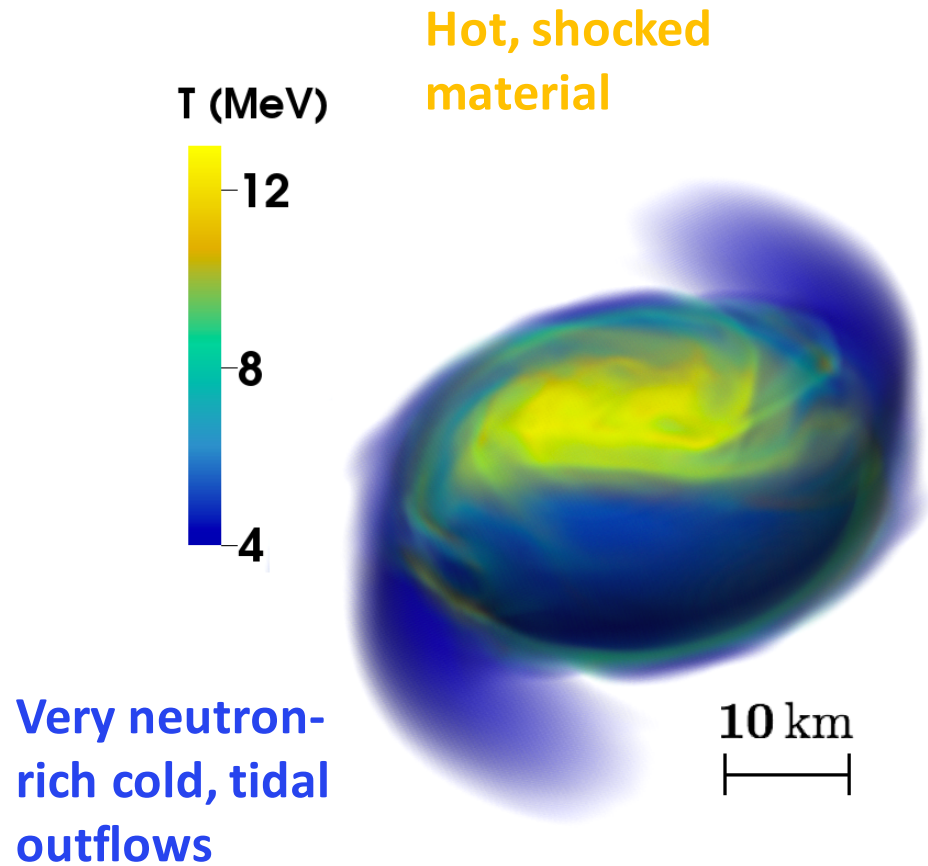


Lodders (2010)



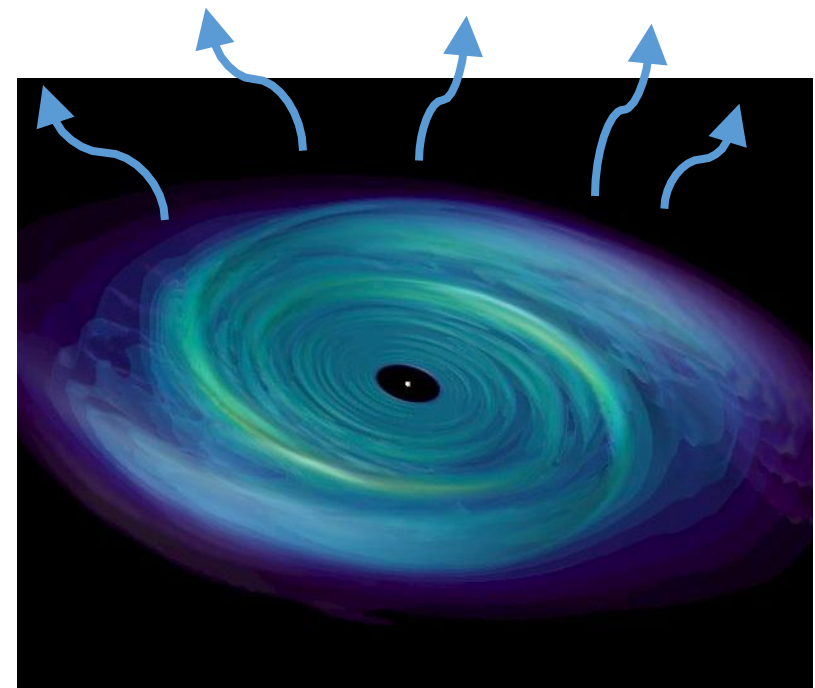
Palm, Lodders,  
Jones (2014)

# Sites of heavy element production in a Neutron Star Merger

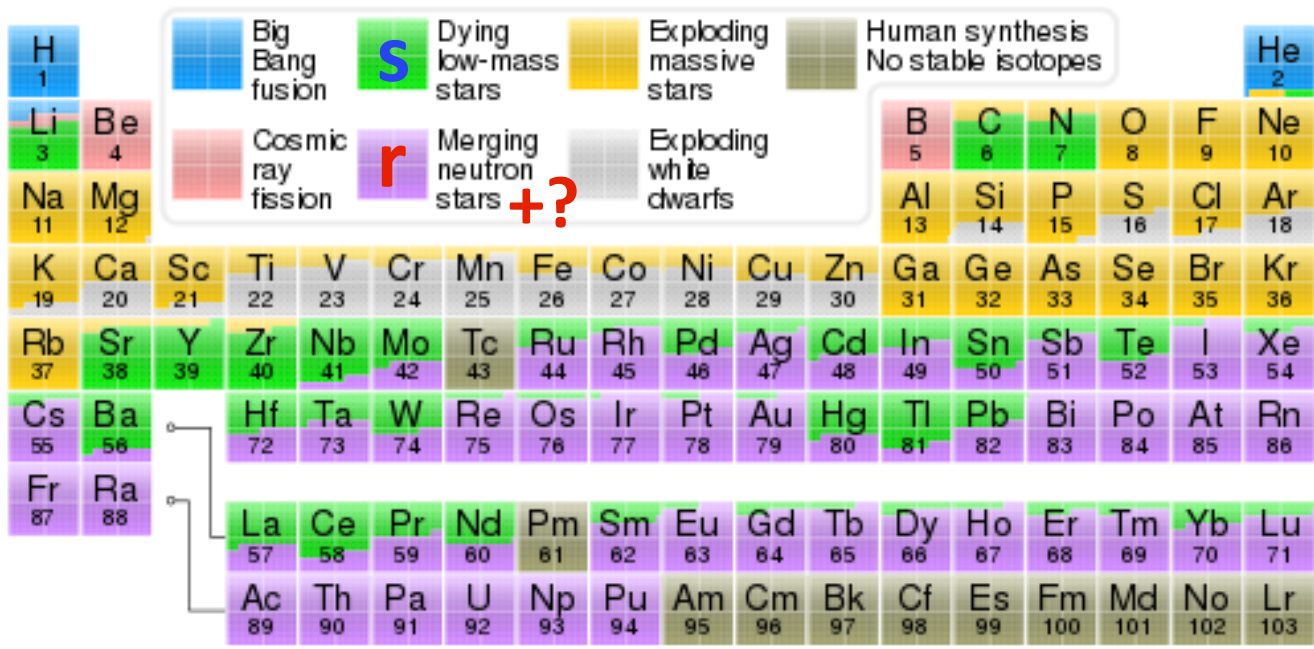


Foucart et al (2016)

**Accretion disk winds –  
exact driving mechanism  
and neutron richness varies**

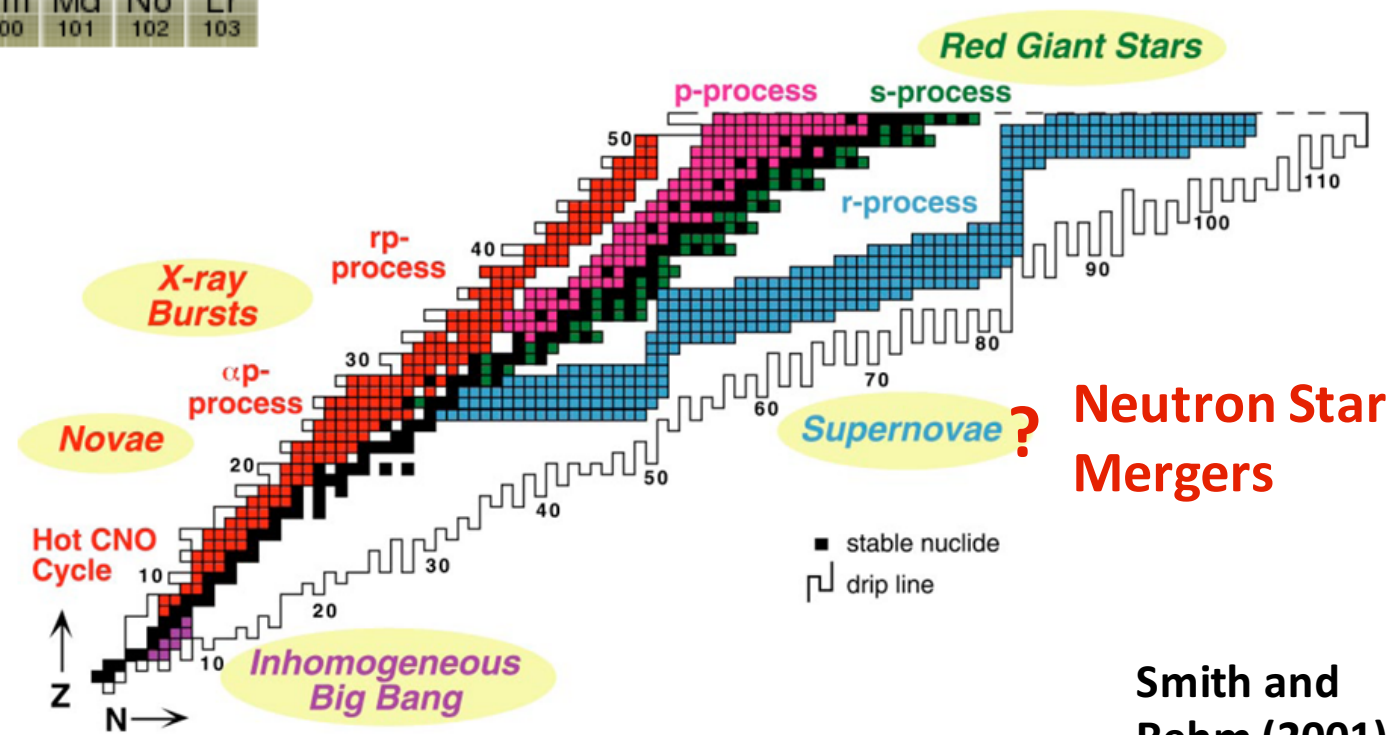


Owen and Blondin



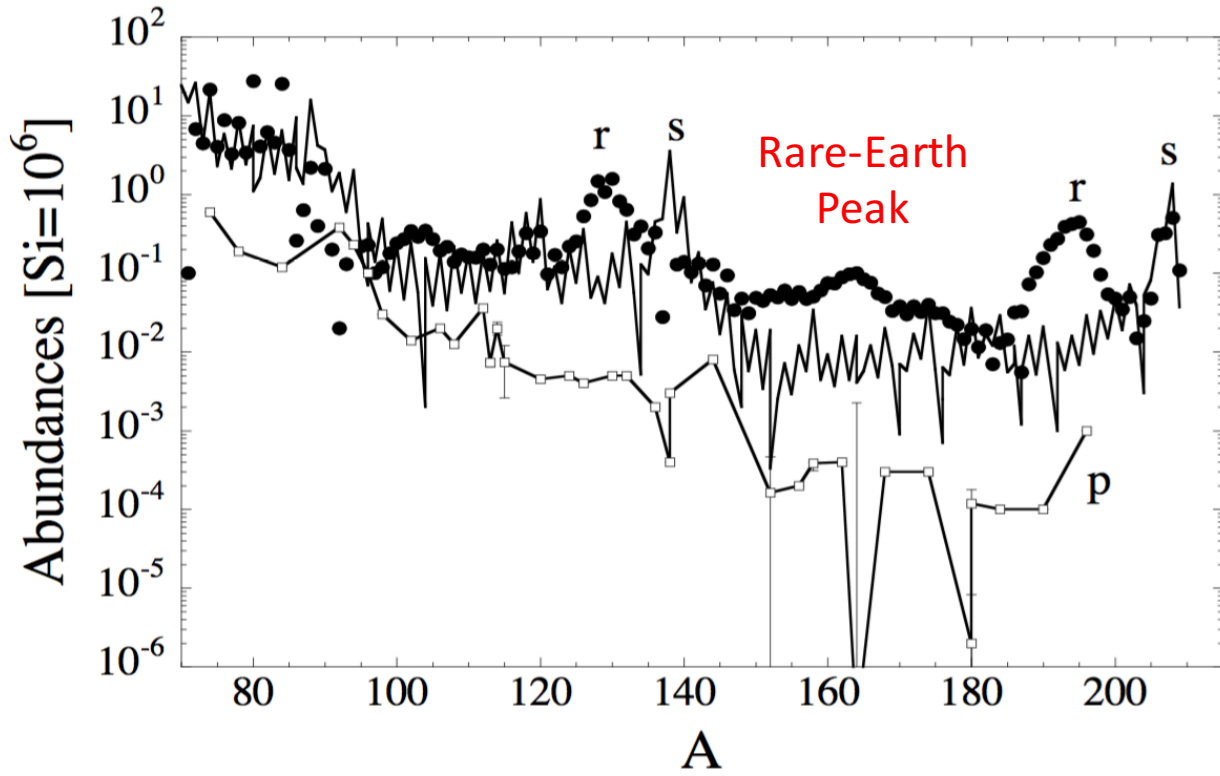
**r-process** - rapid neutron capture

**s-process** – slow neutron capture

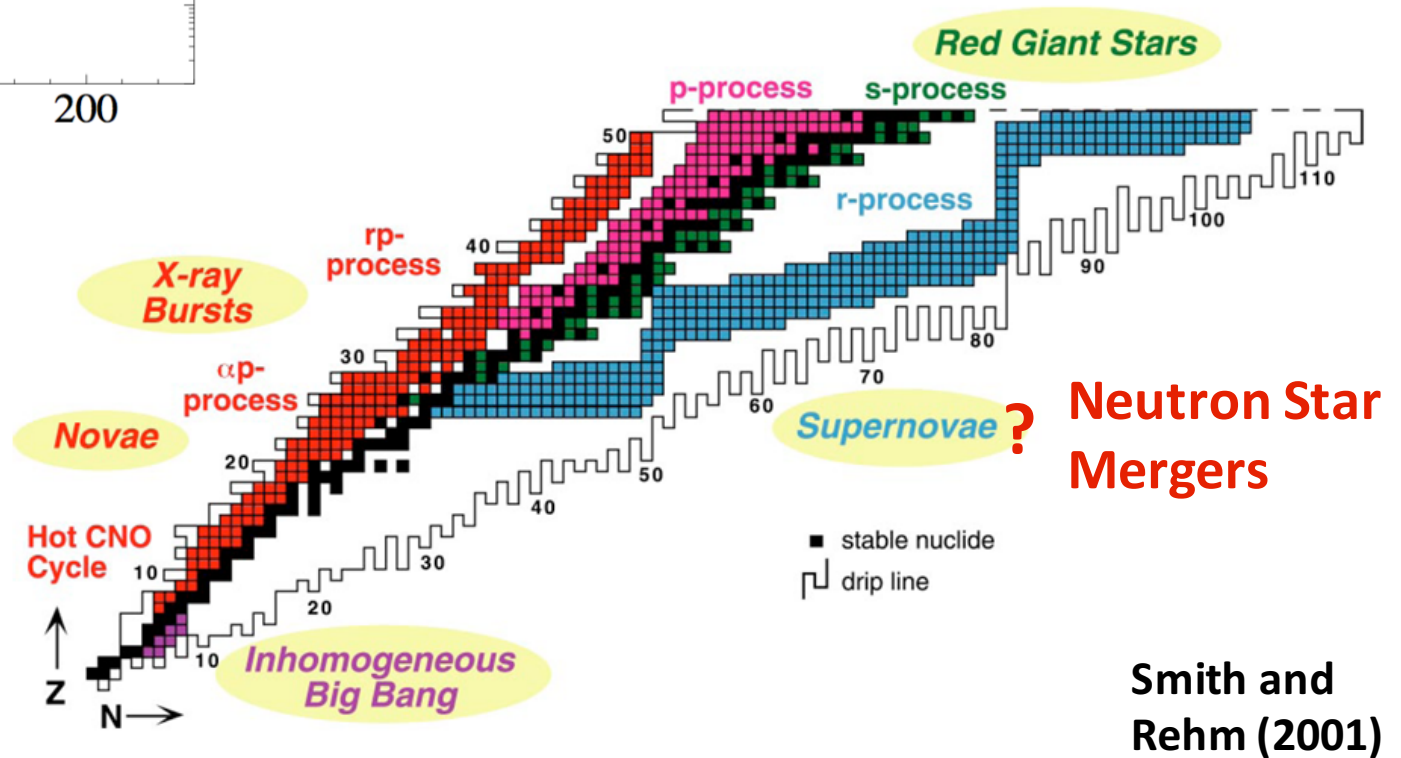


**Neutron Star Mergers**

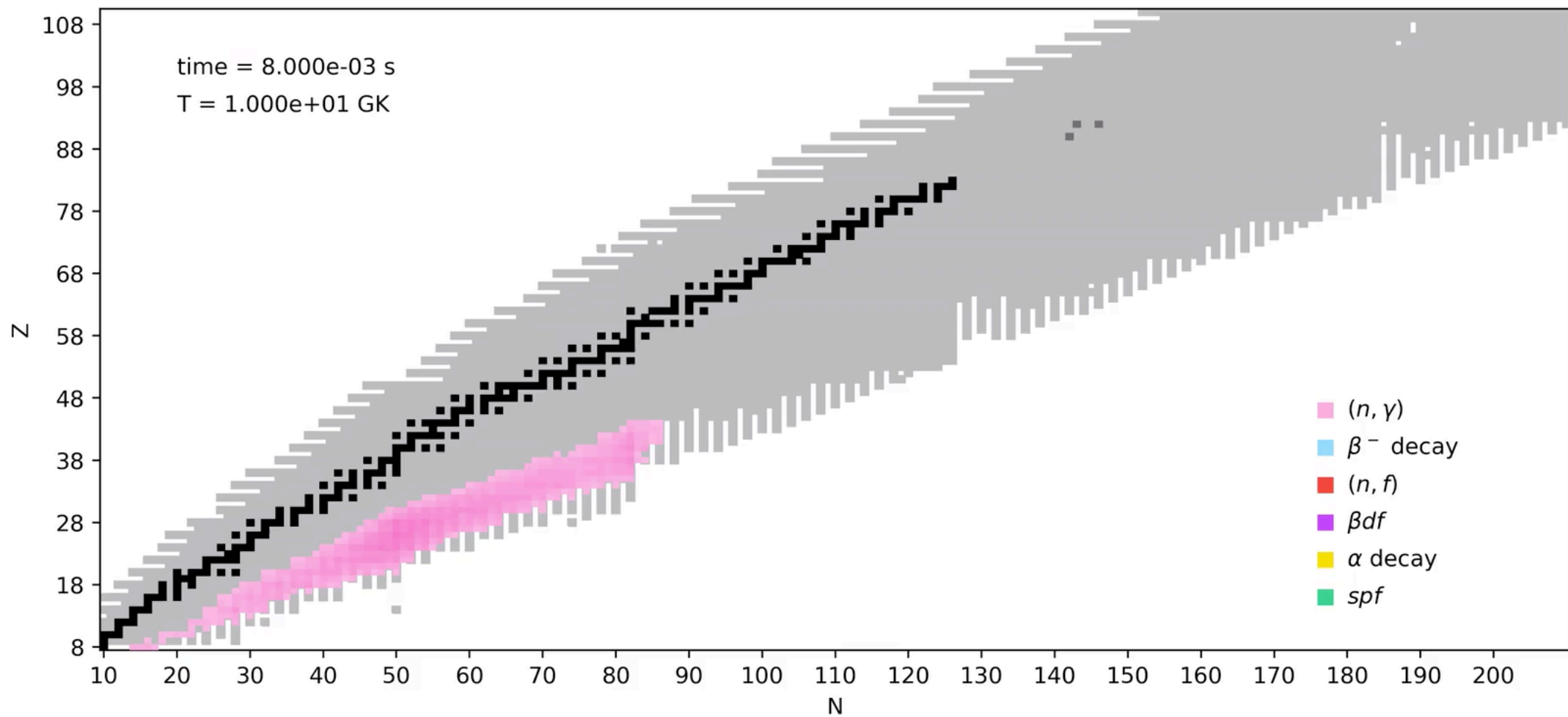
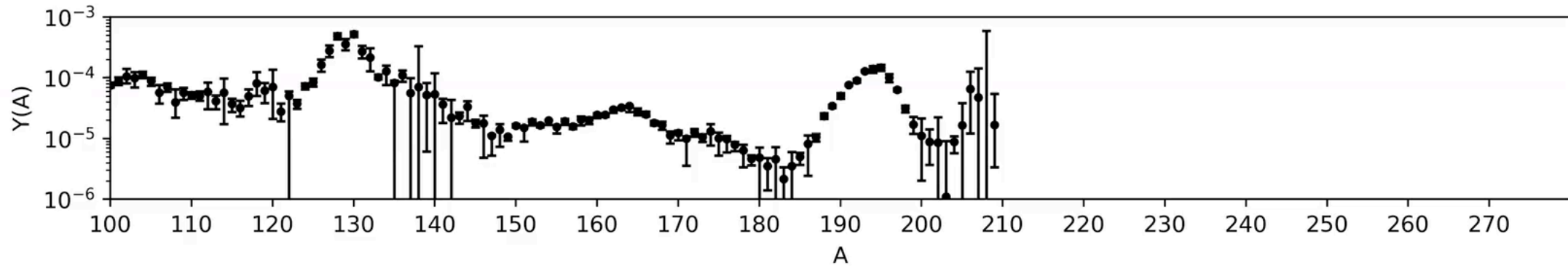
Smith and Rehm (2001)



Arnould,  
Goriely and  
Takahashi  
(2007)







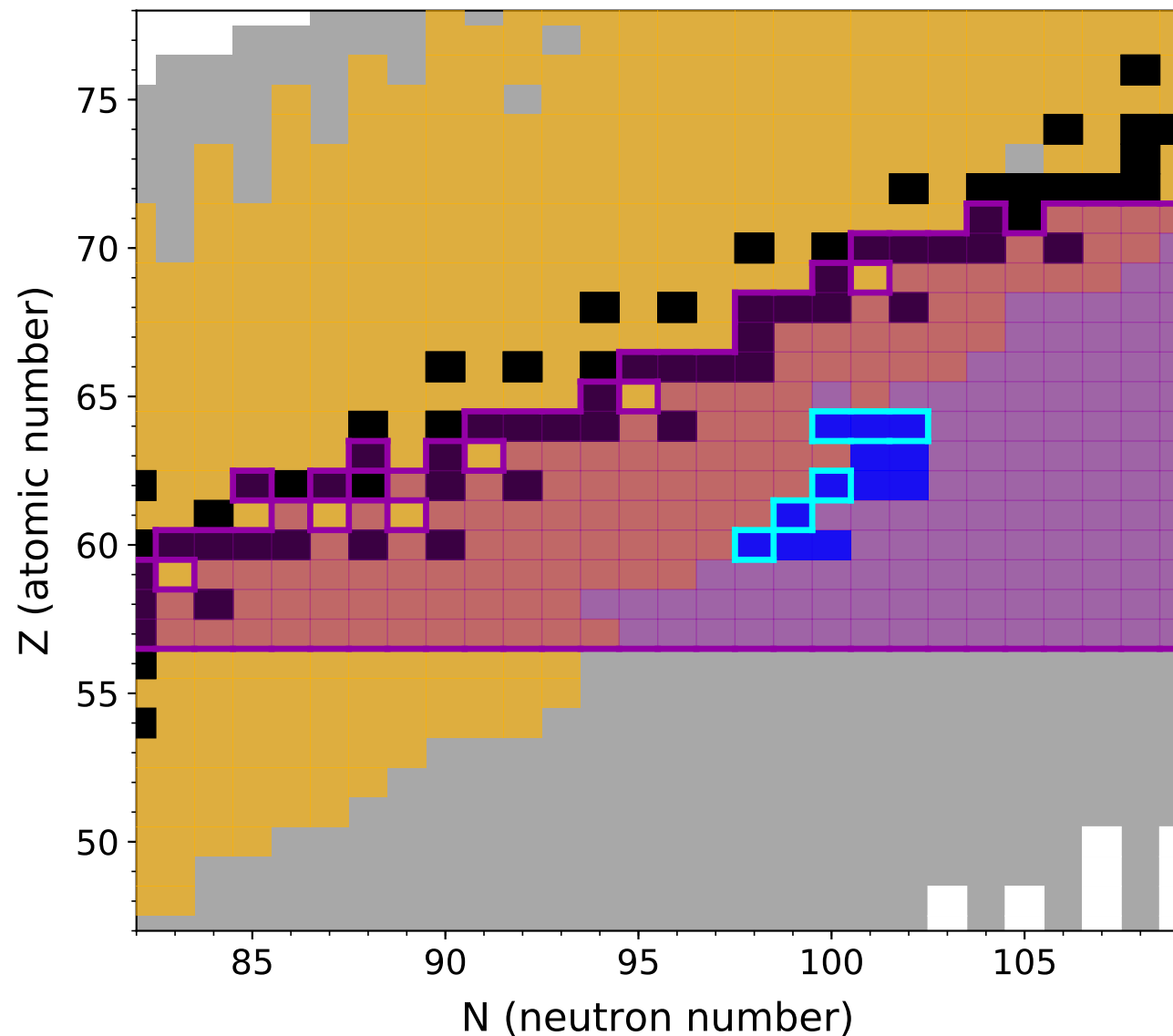
# Studying Rare-Earth Nuclei to Understand *r*-process Lanthanide Production

**Experimental Mass Measurements:**

AME 2016

Jyväskylä

CPT at CARIBU



# Studying Rare-Earth Nuclei to Understand *r*-process Lanthanide Production

## Experimental Mass Measurements:

AME 2016

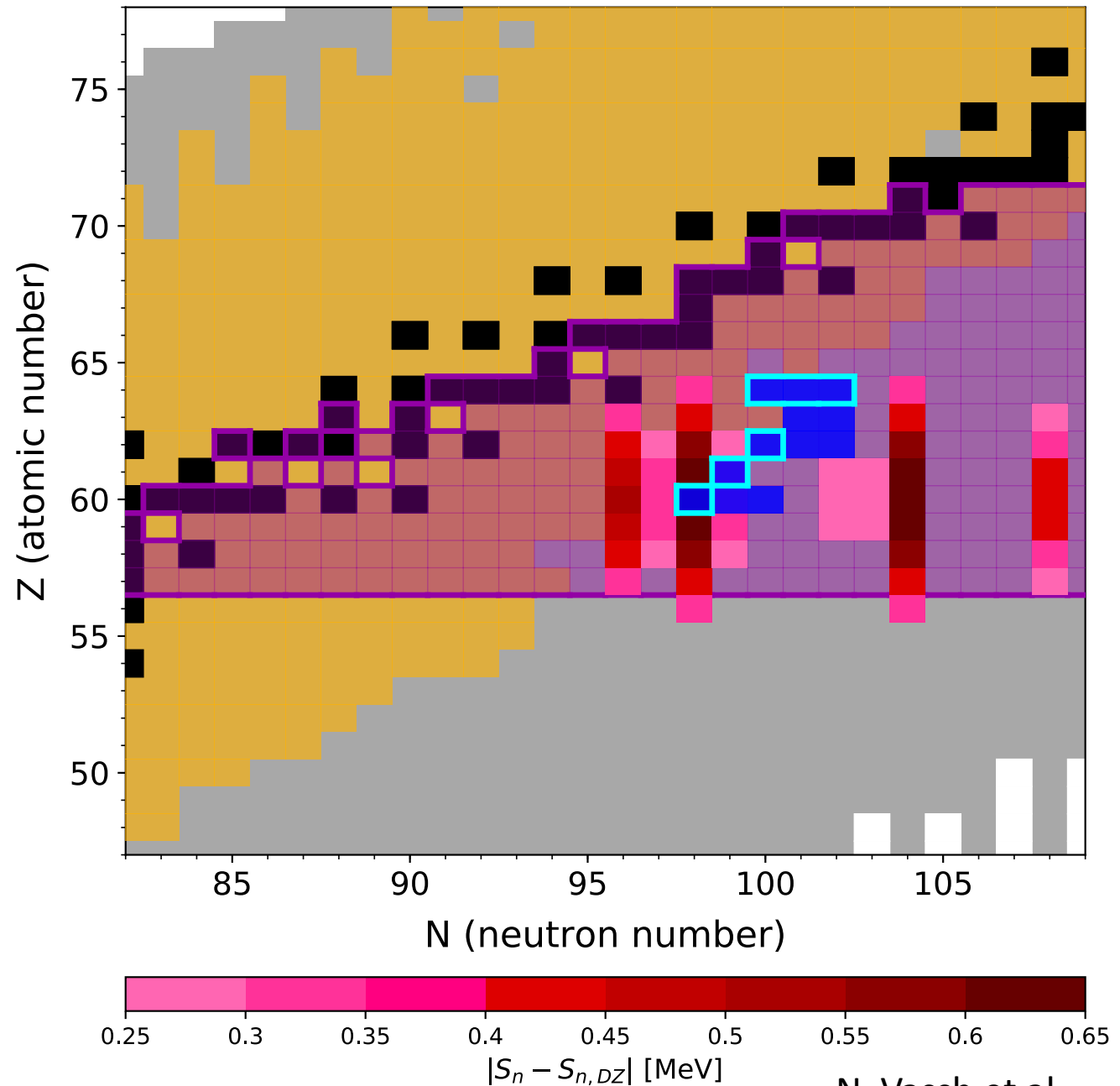
Jyväskylä

CPT at CARIBU

## Theory (ND, NCSU, LANL):

Markov Chain Monte Carlo Mass Corrections to the Duflo-Zuker Model which **reproduce the observed rare-earth abundance peak**

(right: result with  $s/k=30$ ,  $\tau=70$  ms,  $Y_e=0.2$ )



N. Vassh et al  
(in preparation)

The statistical method:

Markov Chain Monte Carlo + nucleosynthesis  
calculations

# Standard $r$ -process calculation

Astrophysical conditions

Fission Yields

Rates (n capture,  $\beta$ -decay, fission....)

Nuclear masses



Nucleosynthesis code  
(PRISM)



**Abundance  
prediction**

# Reverse Engineering $r$ -process calculation

Astrophysical conditions

Fission Yields

Rates (n capture,  $\beta$ -decay, fission....)



Nucleosynthesis code  
**(PRISM)**



Abundance  
prediction

**Nuclear masses**



Markov Chain Monte  
Carlo (MCMC)  
Likelihood function



# MCMC procedure

- Monte Carlo mass corrections

$$M(Z, N) = M_{DZ}(Z, N) + a_N e^{-(Z-c)^2/2f}$$

- Check:  $\sigma_{\text{rms}}^2(M_{\text{AME12}}, M) \leq \sigma_{\text{rms}}^2(M_{\text{AME12}}, M_{DZ})$

- Check:

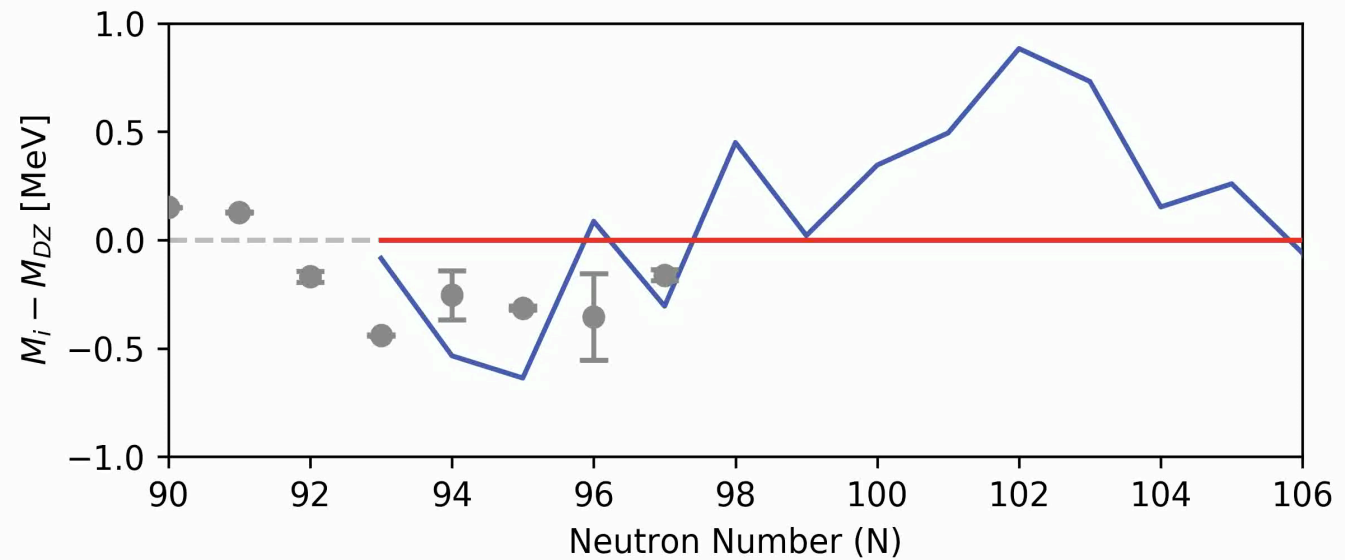
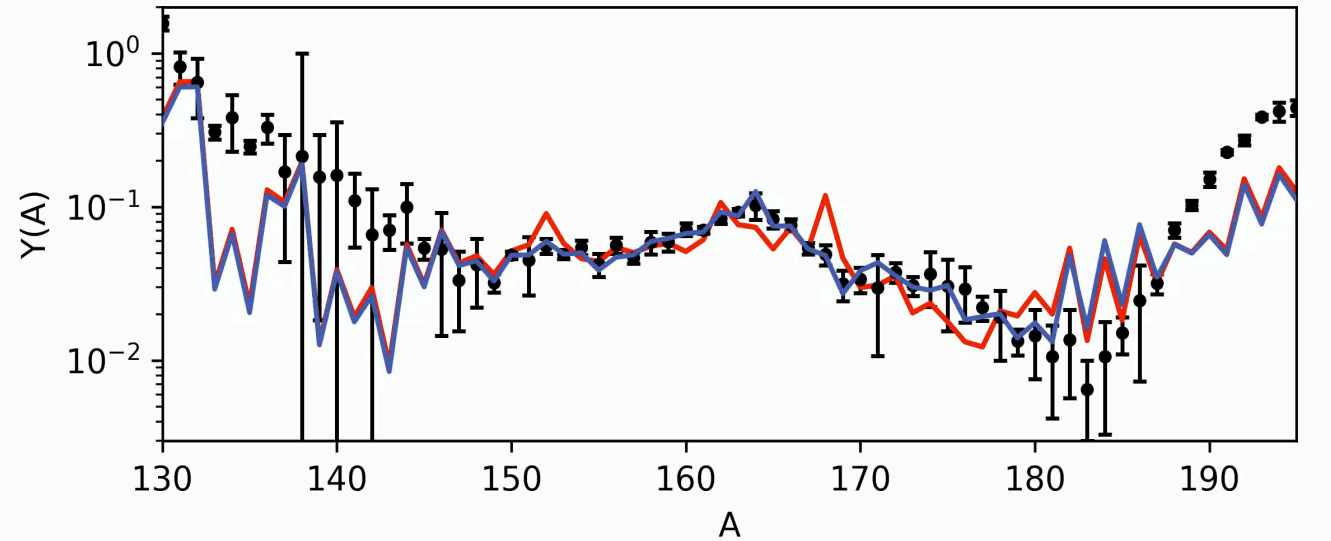
$$D_n(Z, A) = (-1)^{A-Z+1} (S_n(Z, A+1) - S_n(Z, A)) > 0$$

- Update nuclear quantities and rates
- Perform nucleosynthesis calculation

- Calculate  $\chi^2 = \sum_{A=150}^{180} \frac{(Y_{\odot,r}(A) - Y(A))^2}{\Delta Y(A)^2}$

- Update parameters OR revert to last success

$$\mathcal{L}(m) = \exp\left(-\frac{\chi^2(m)}{2}\right) \rightarrow \alpha(m) = \frac{\mathcal{L}(m)}{\mathcal{L}(m-1)}$$



**Black** – solar abundance data

**Grey** – AME 2012 data

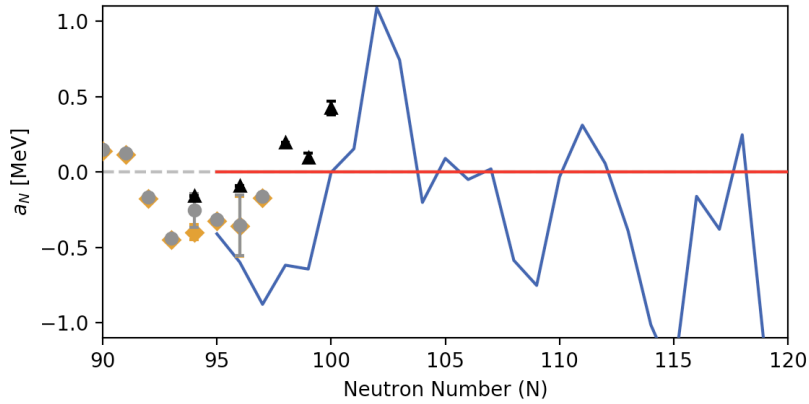
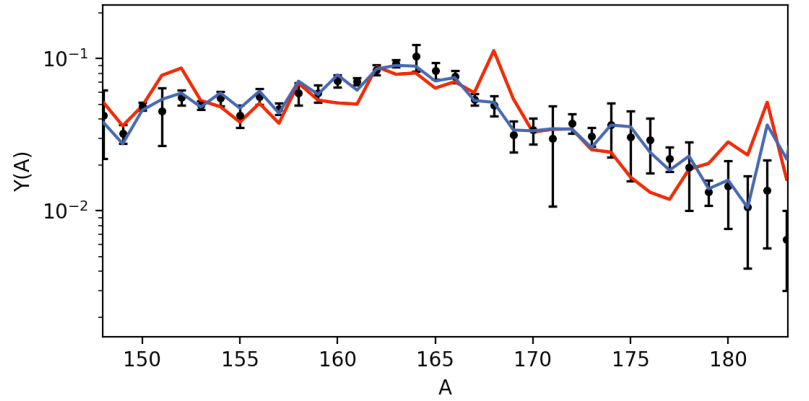
**Red** – values at current step

**Blue** – best step of entire run

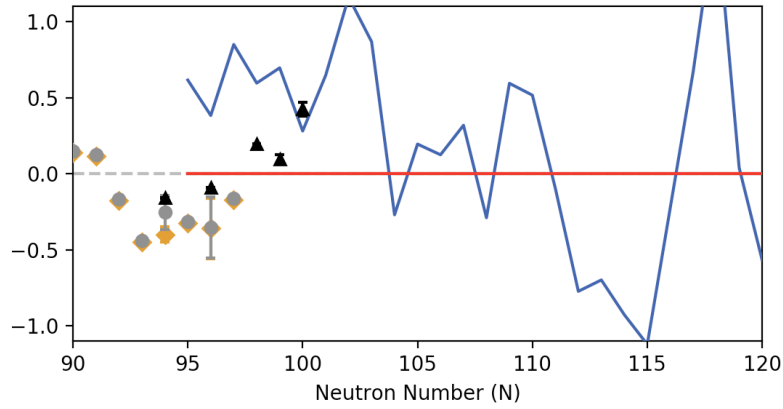
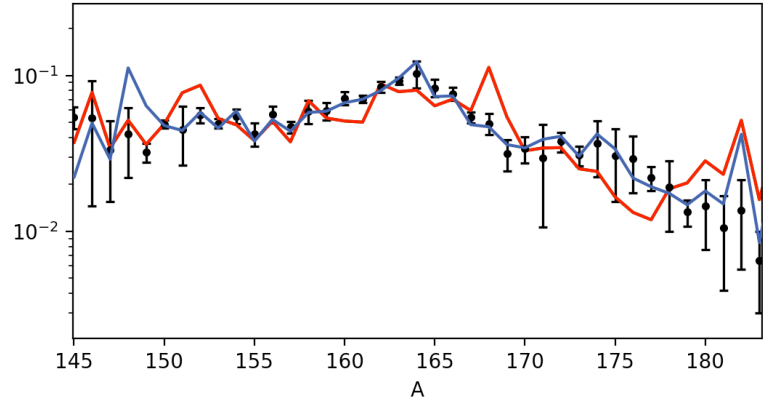
# Examples: before $\sigma_{\text{rms}}$ check

# after

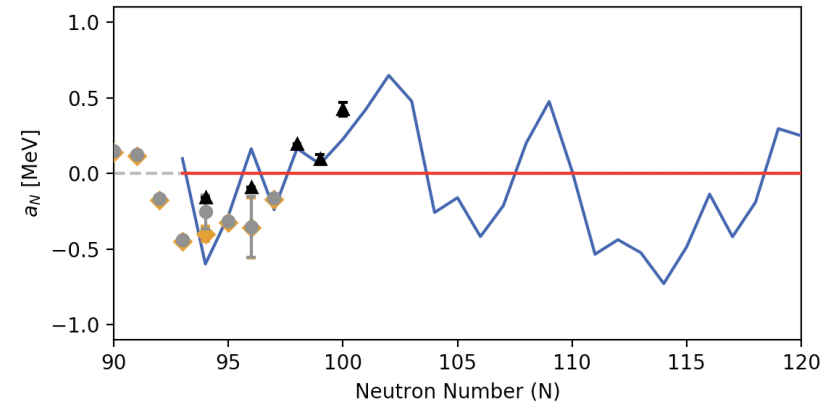
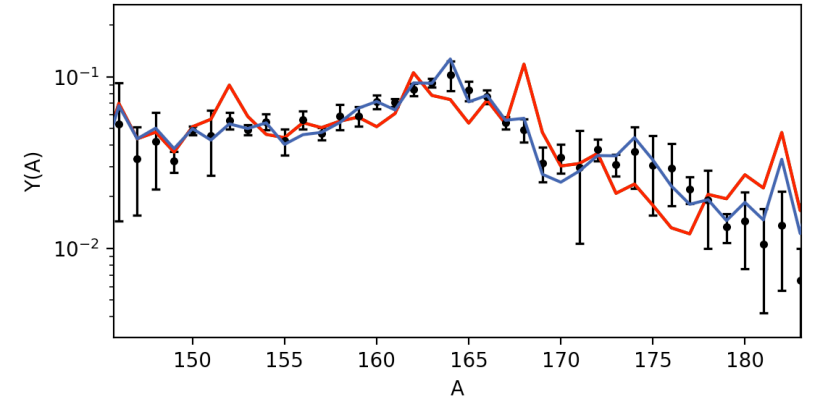
best  $\chi^2 = 11.0824707746$



best  $\chi^2 = 8.16359465143$

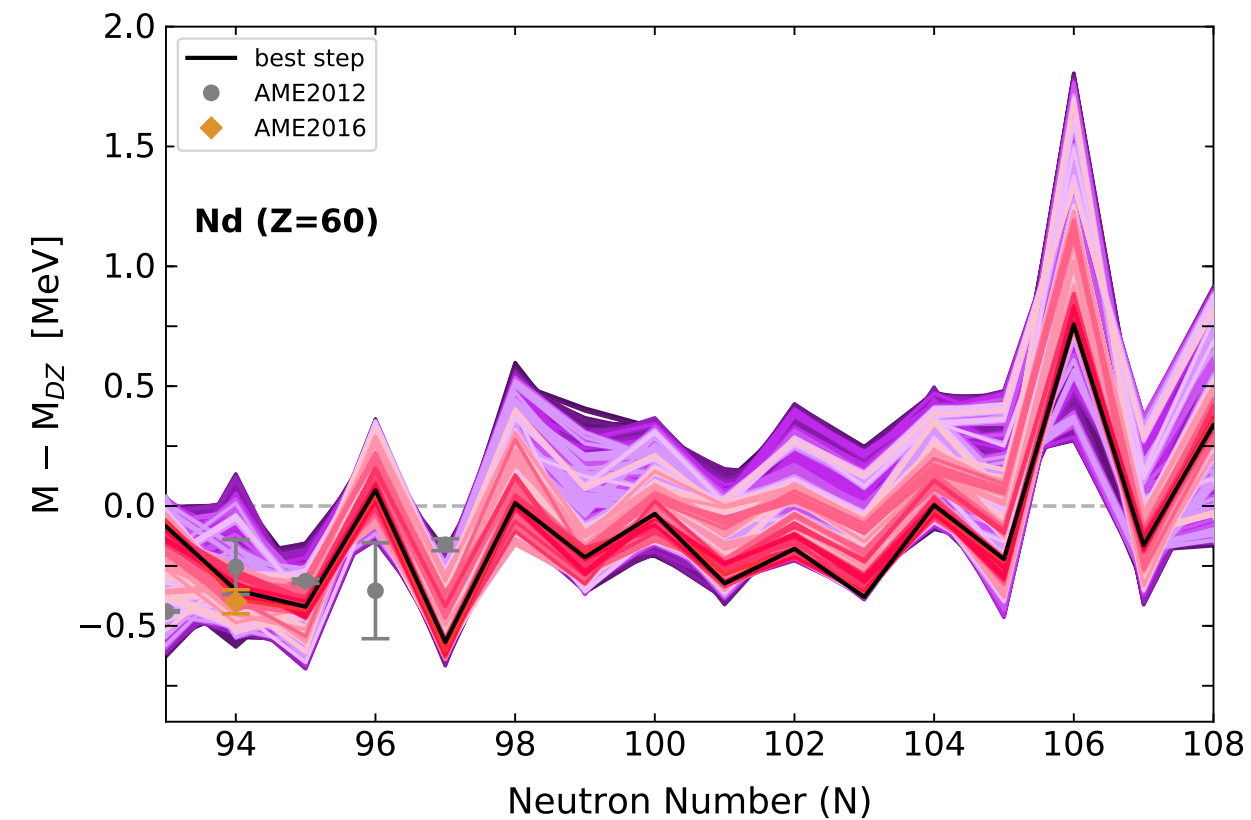


best  $\chi^2 = 18.6198468885$

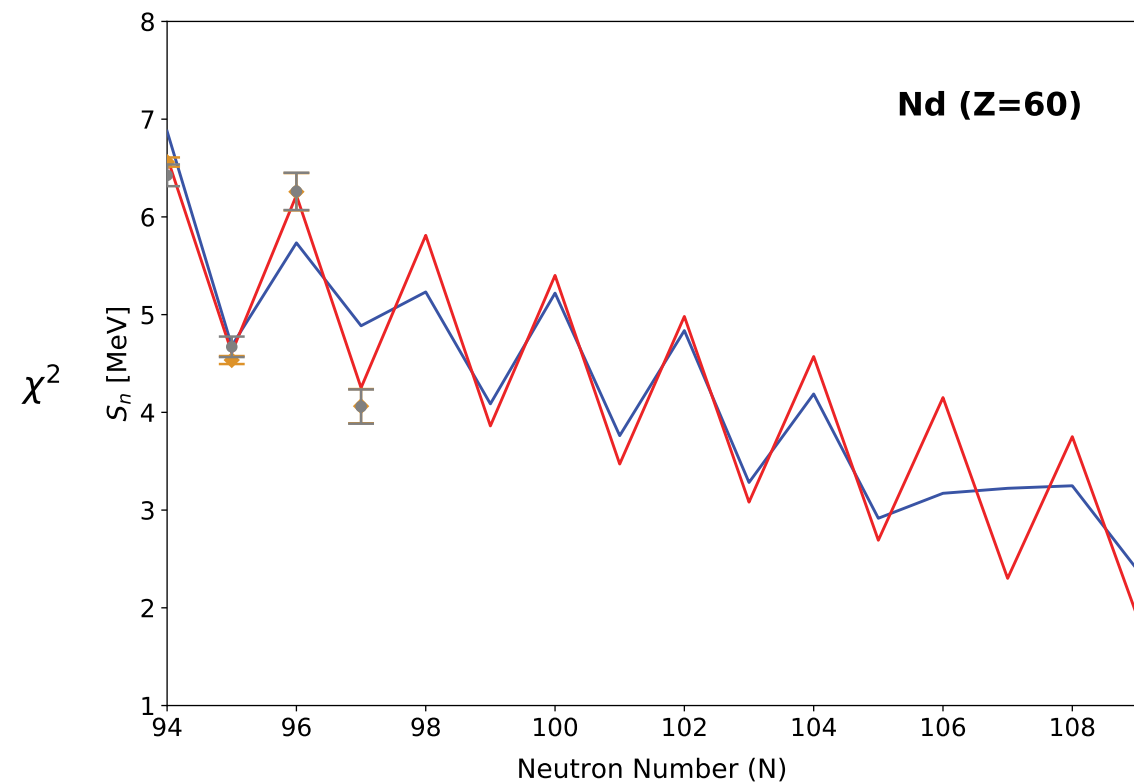




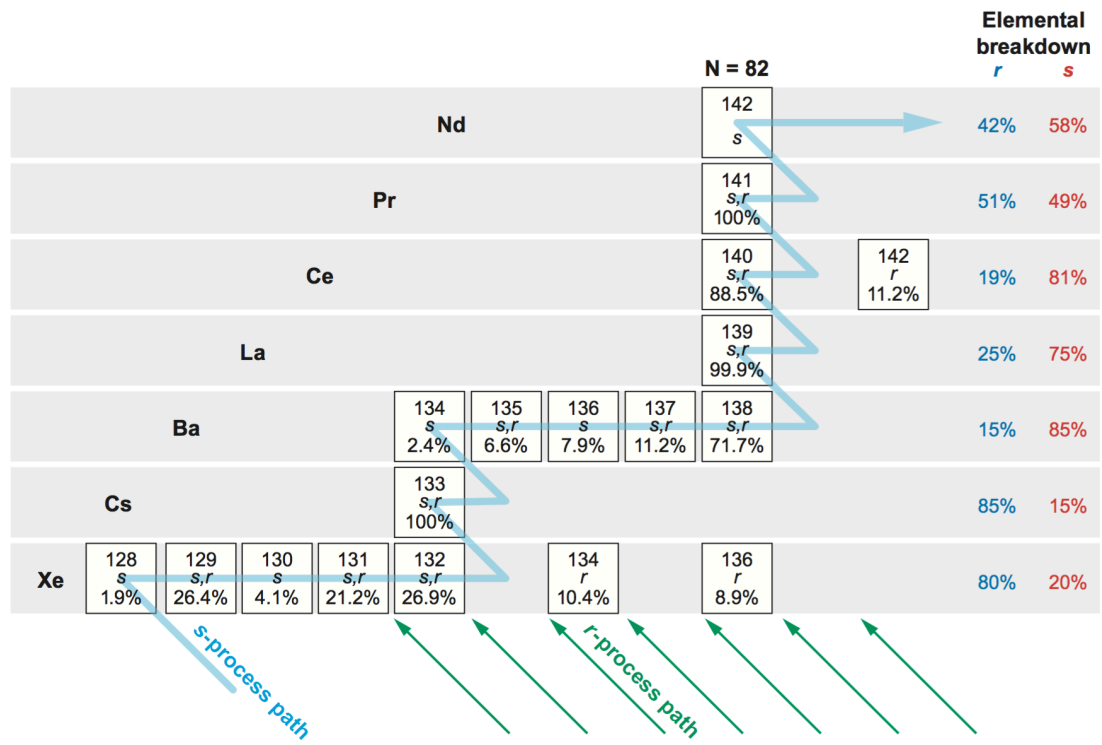
# Example of an unphysical solution: before $D_N$ check



Mass values for **all steps** of an example run

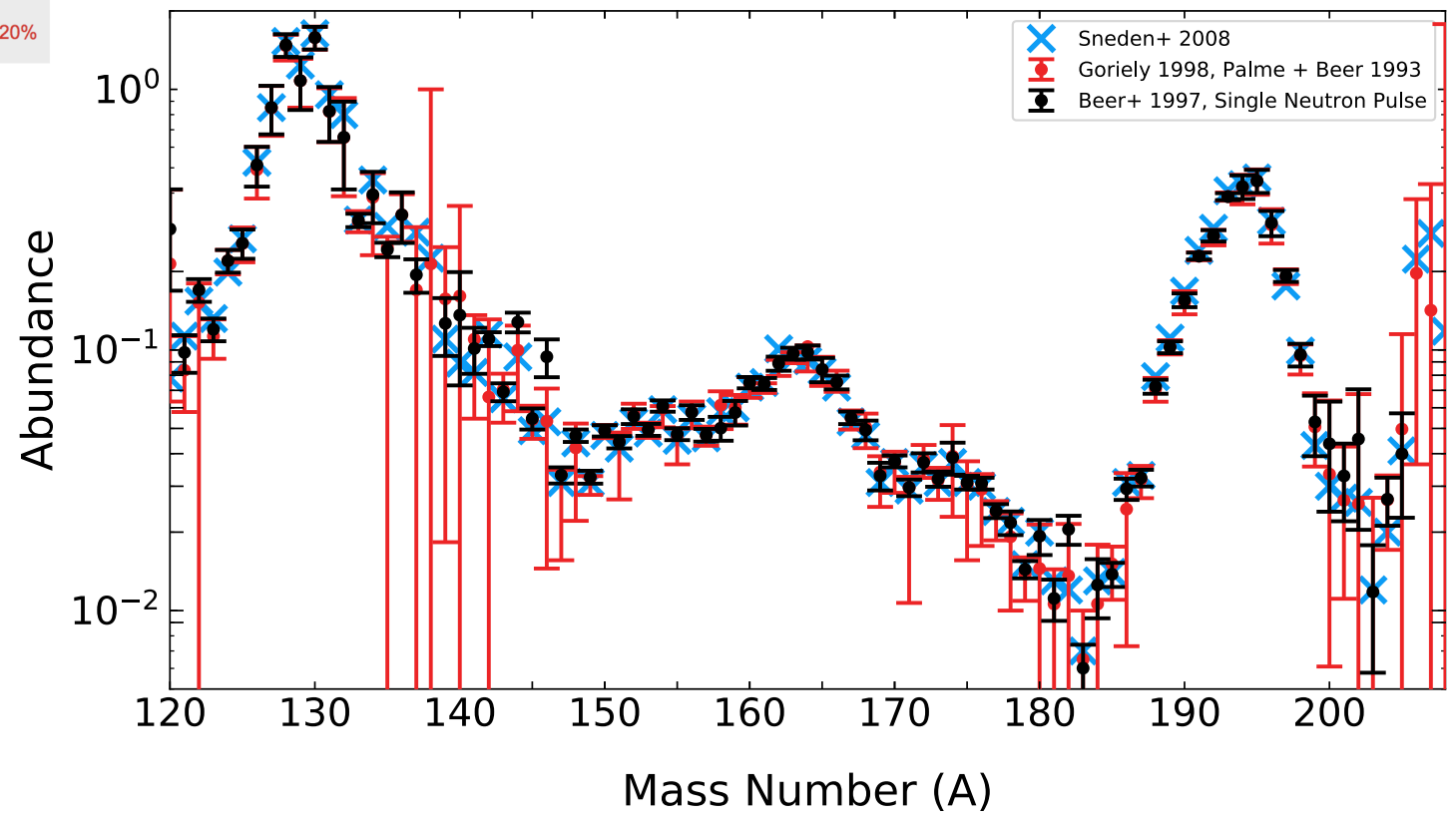


Vassh et al (in preparation)

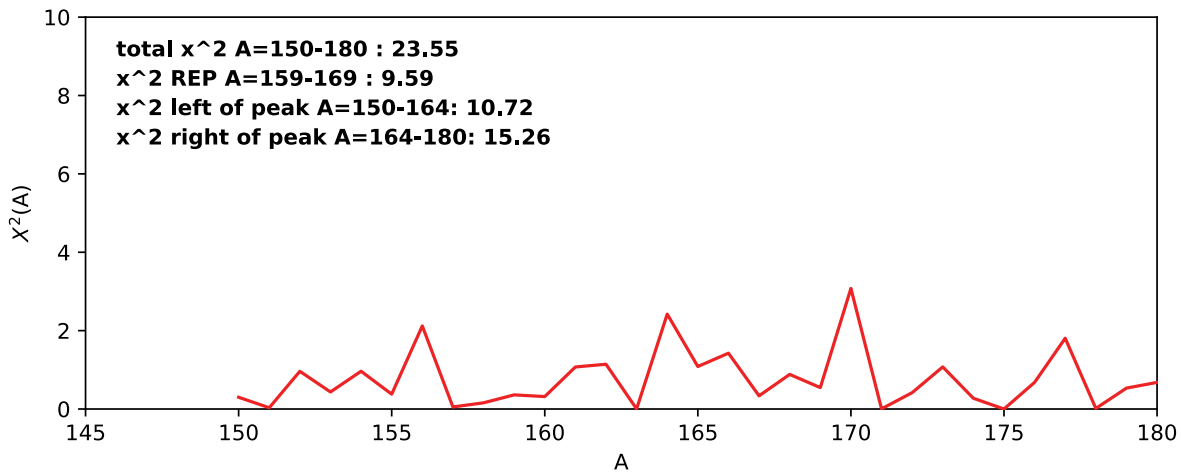
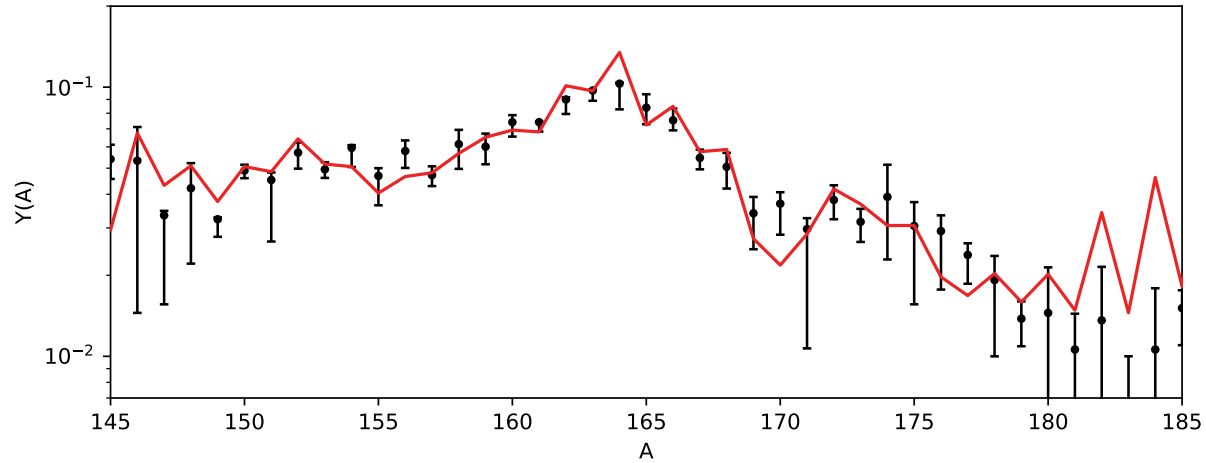


Sneden, Cowan, and Gallino (2008)

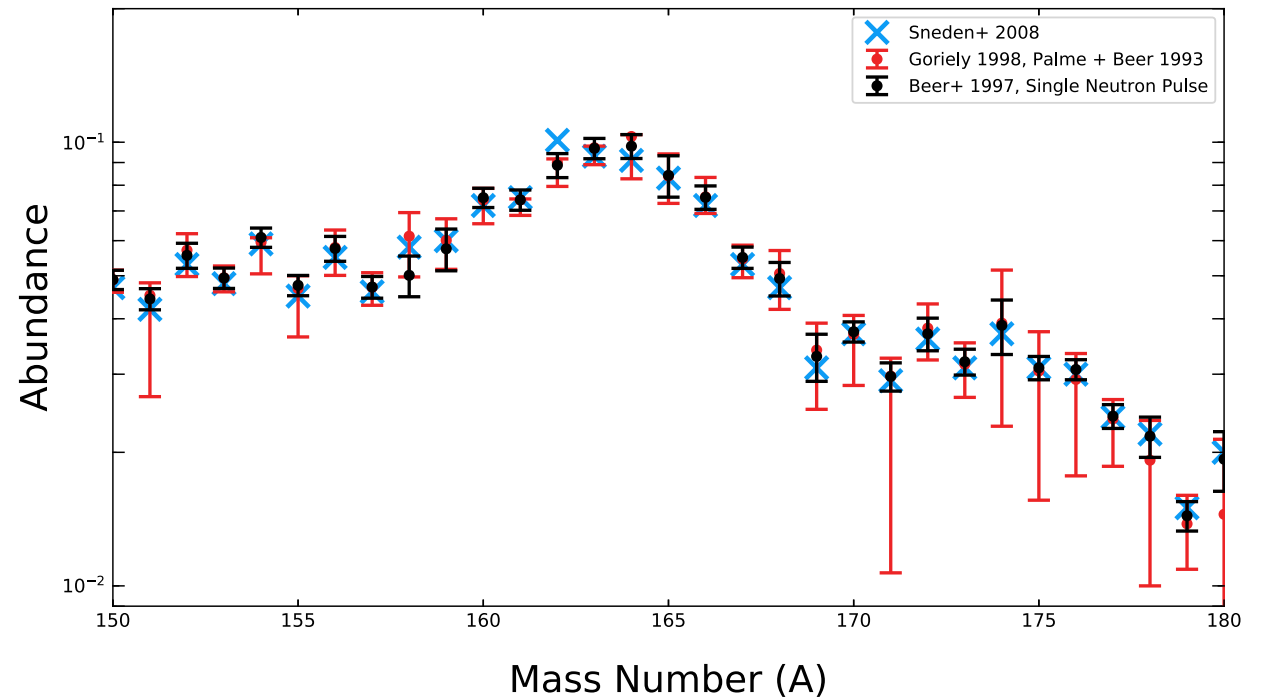
Sensitivity to Solar Data:  
uncertainty from the s-process  
subtraction



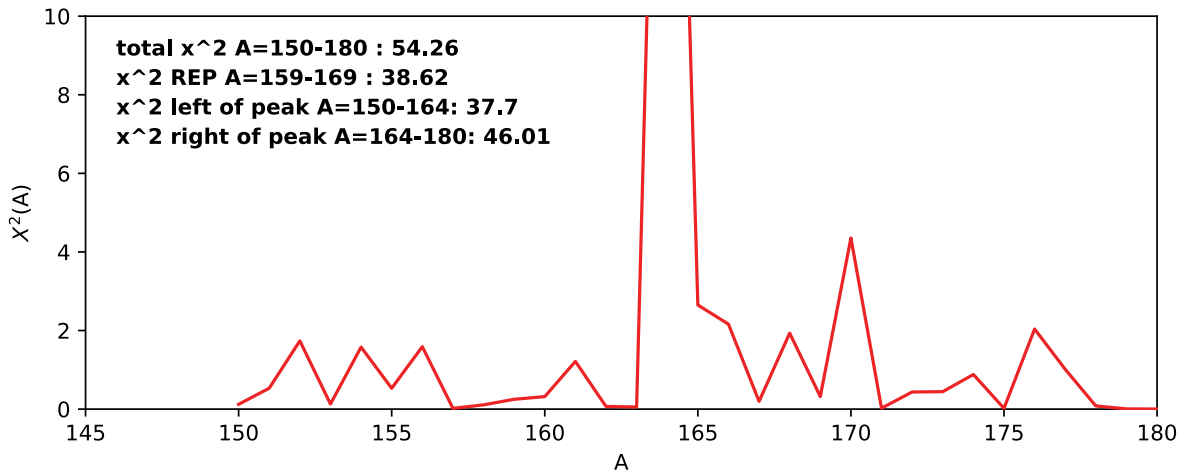
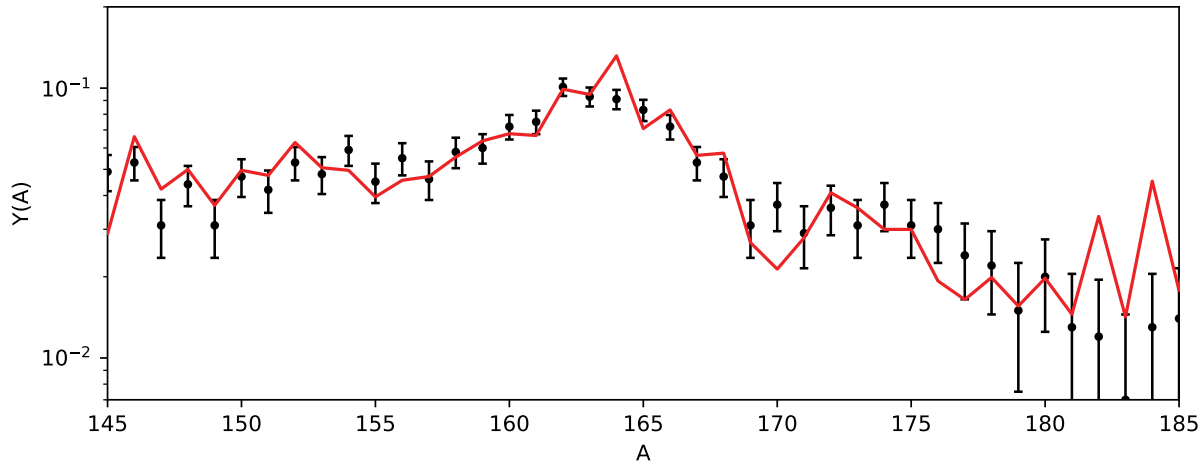
Goriely 1998 Solar Data (black), MCMC Solution (red)



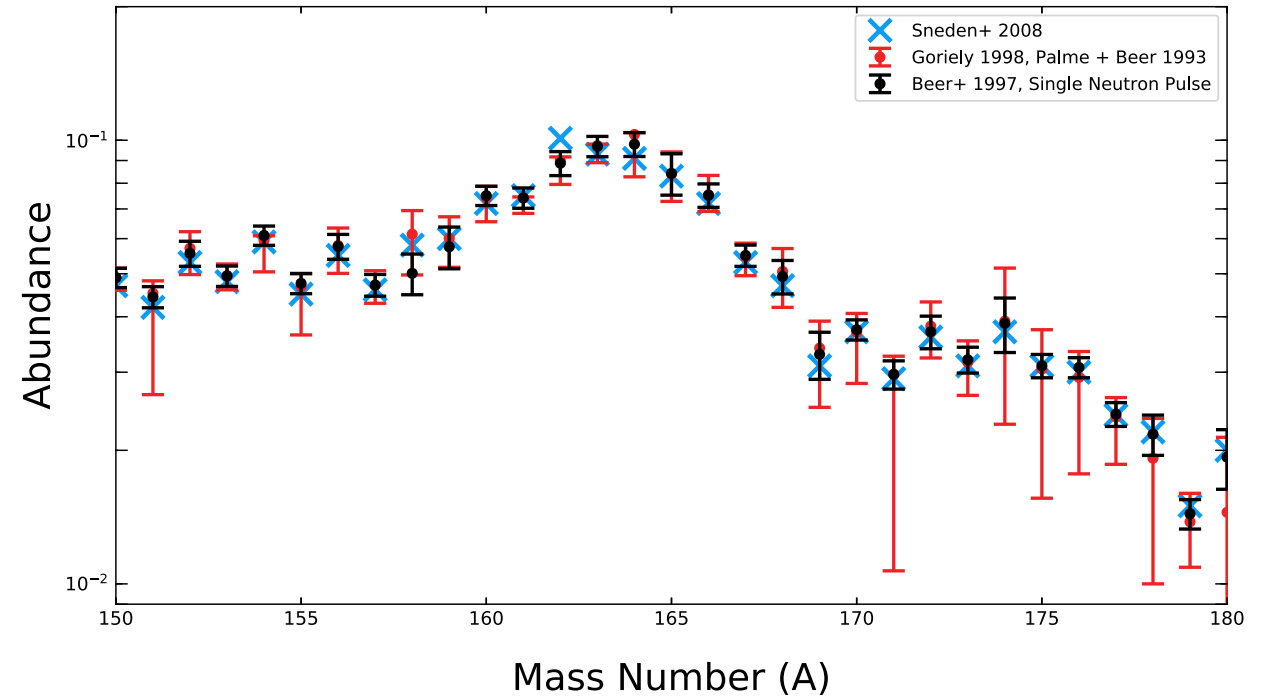
# Sensitivity to Solar Data: uncertainty from the s-process subtraction



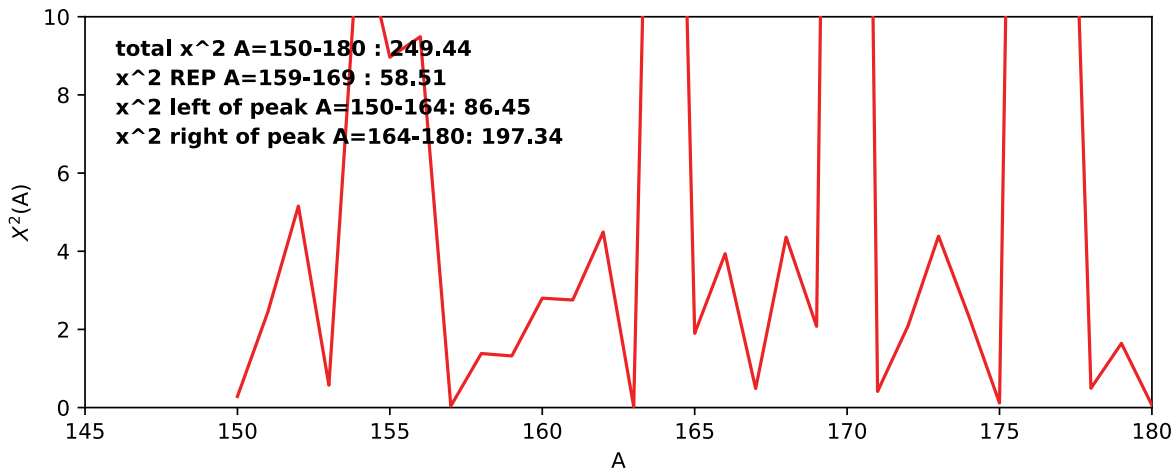
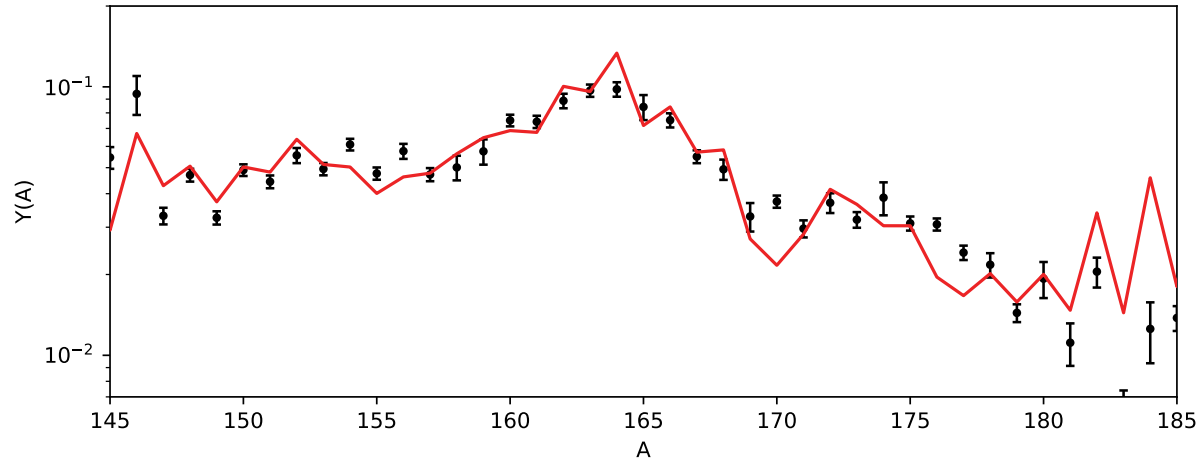
Sneden+ 2008 Solar Data (black), MCMC Solution (red)



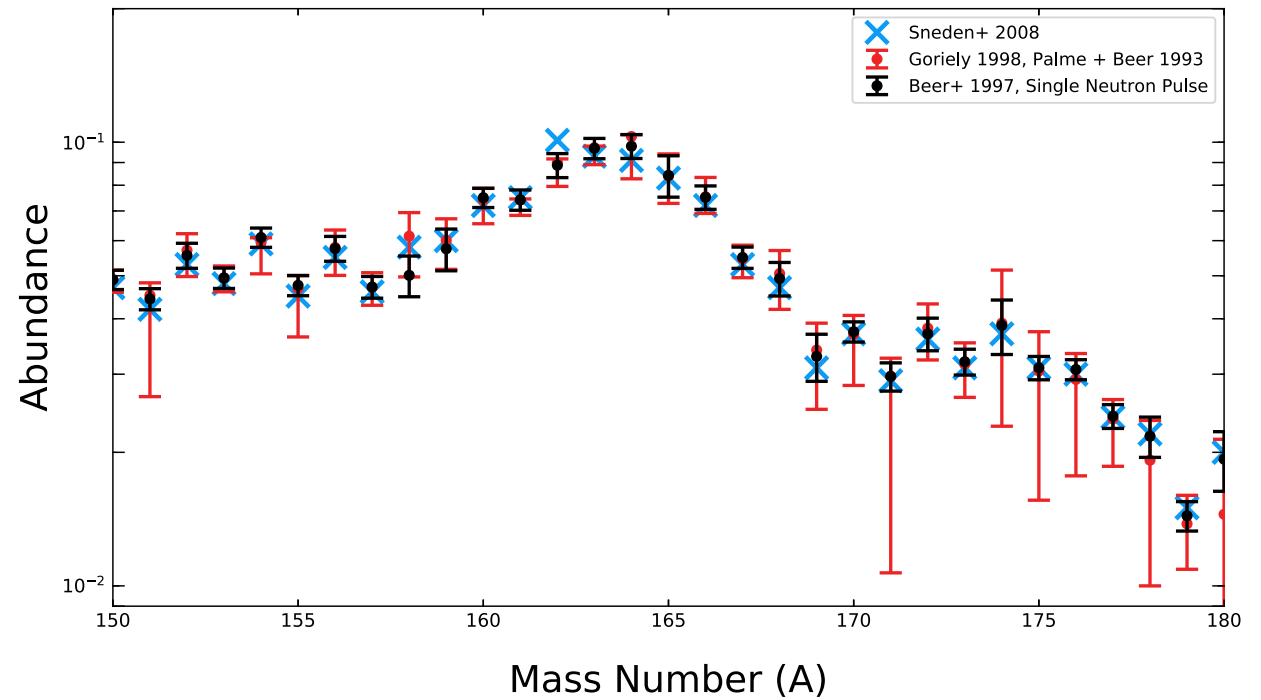
# Sensitivity to Solar Data: uncertainty from the s-process subtraction



Beer+ 1997 Solar Data (black), MCMC Solution (red)



# Sensitivity to Solar Data: uncertainty from the s-process subtraction



# Parallel Chains Method of MCMC

- Highly correlated parameters → long convergence time for a single run
- Multiple independent runs allow for a thorough search of parameter space
- Well-defined statistics when combine results from independent runs

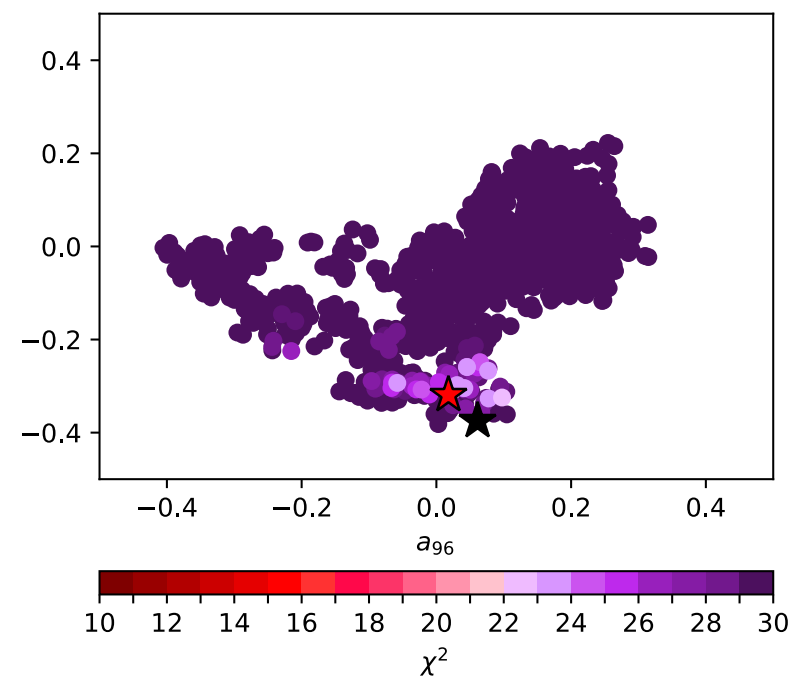
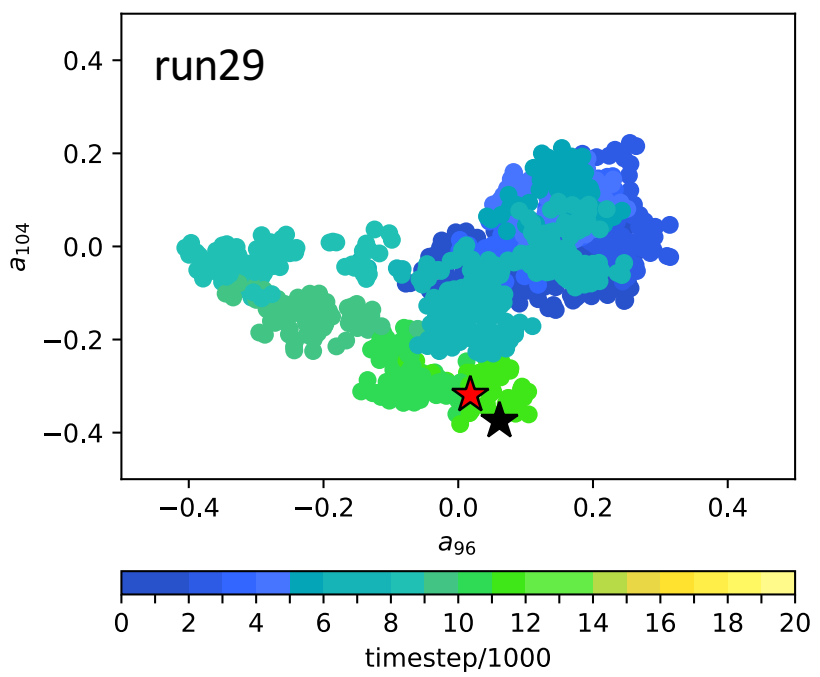
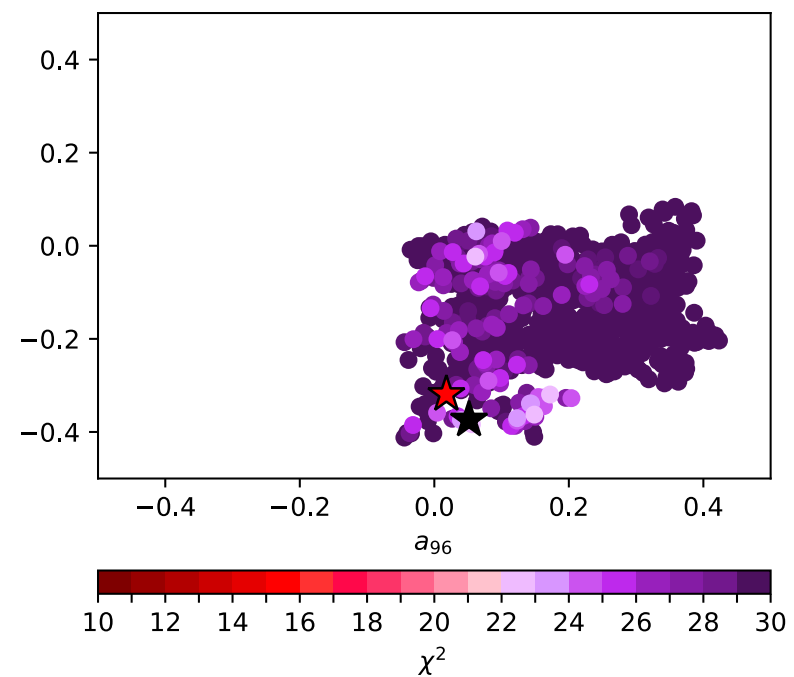
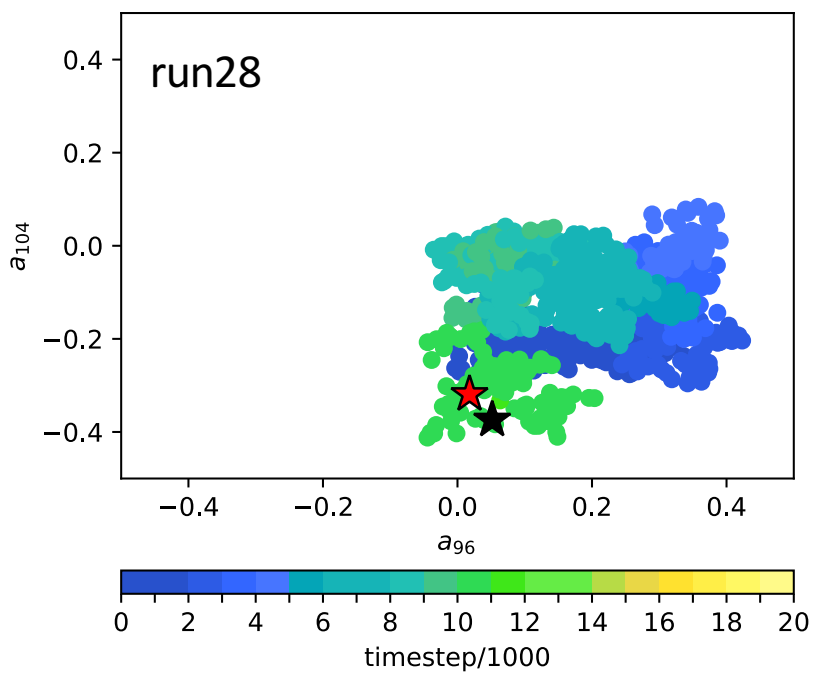


# Parallel Chains

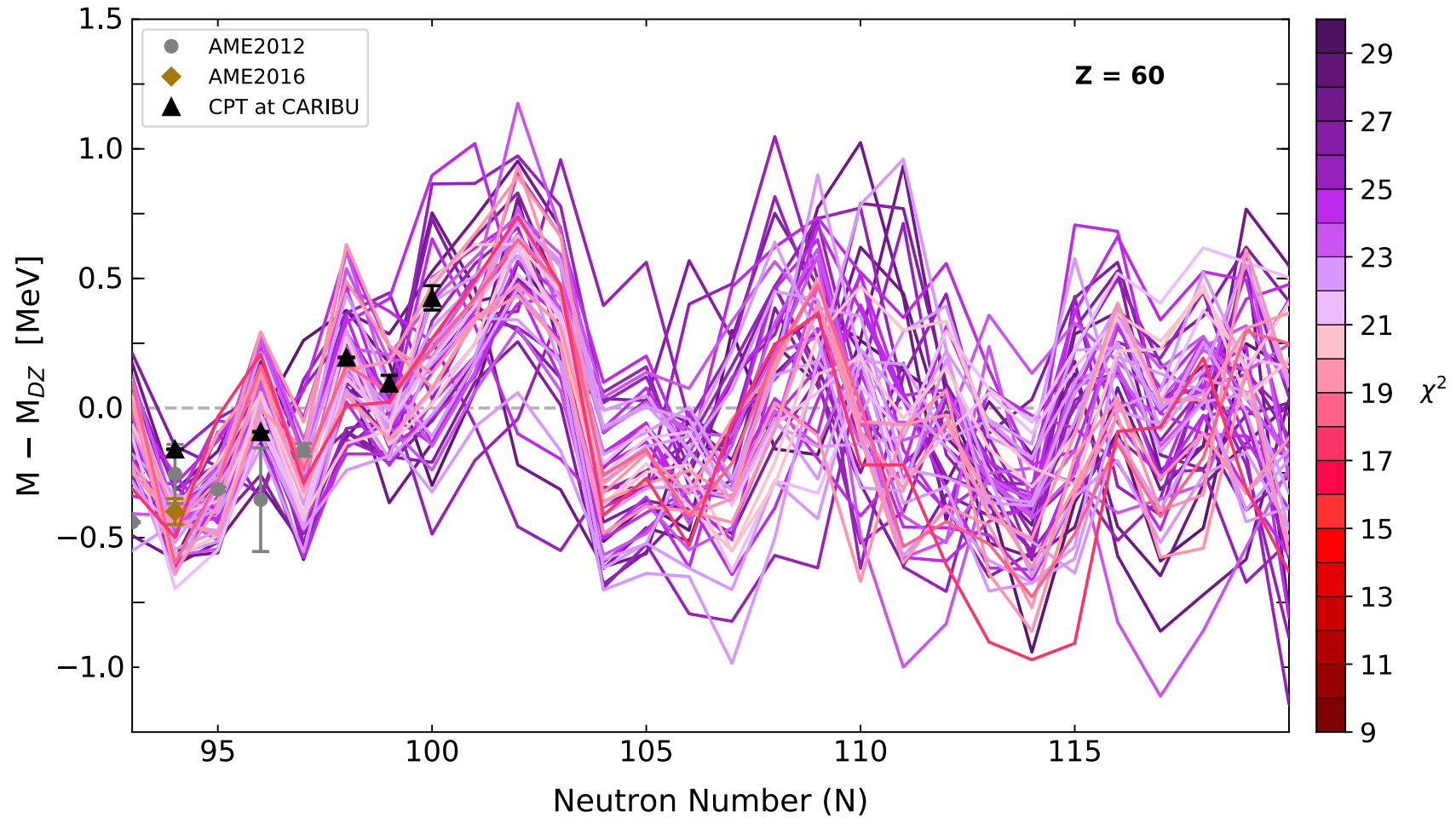
Method: searching parameter space

**Black star** – best step value for the run shown

**Red star** – average best values of 50 runs



# Parallel Chains Method: error bars



Mass values for **50 MCMC runs** given the same astro conditions



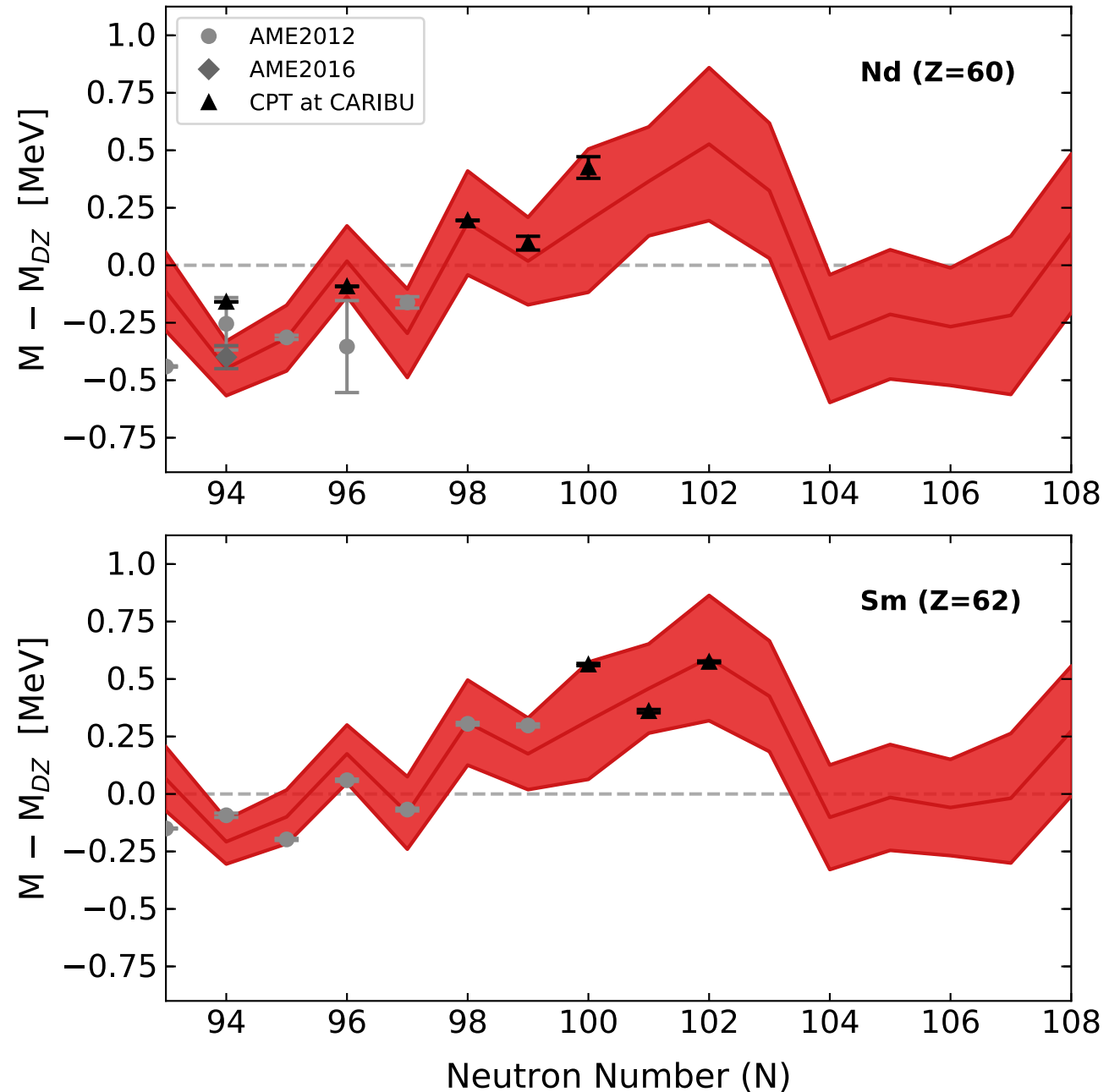
## Results:

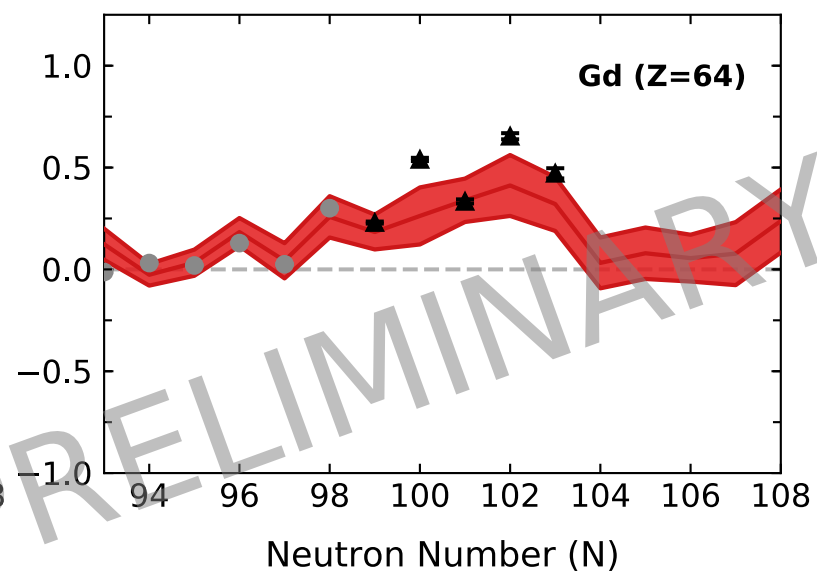
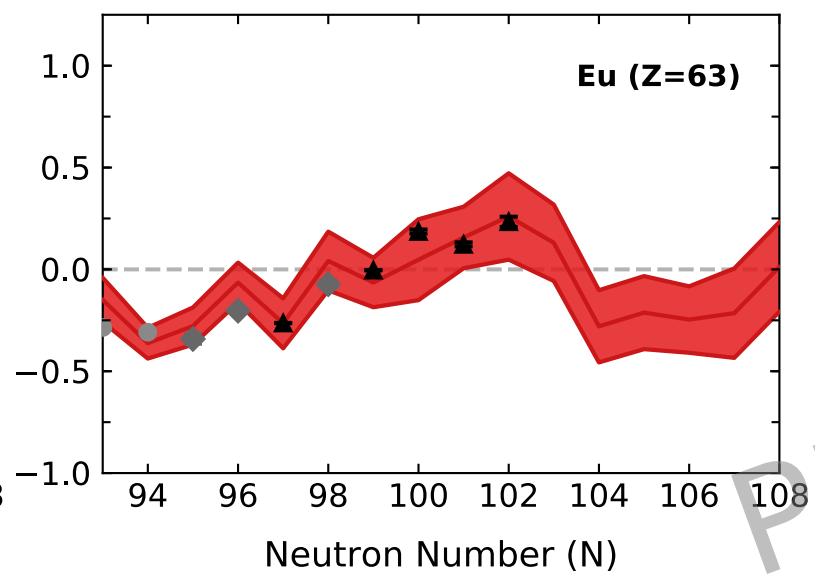
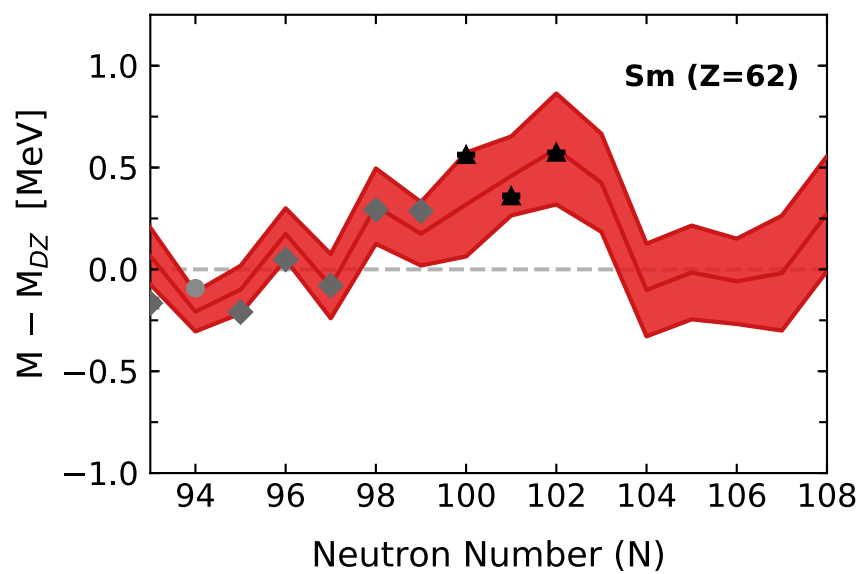
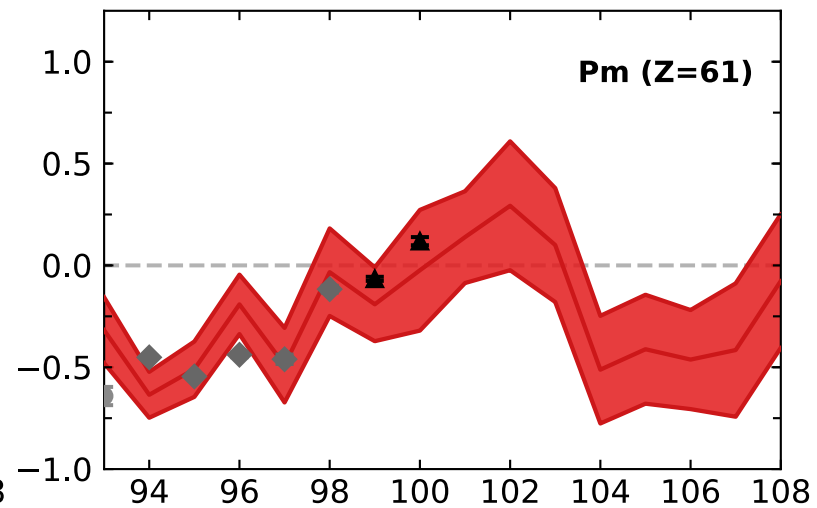
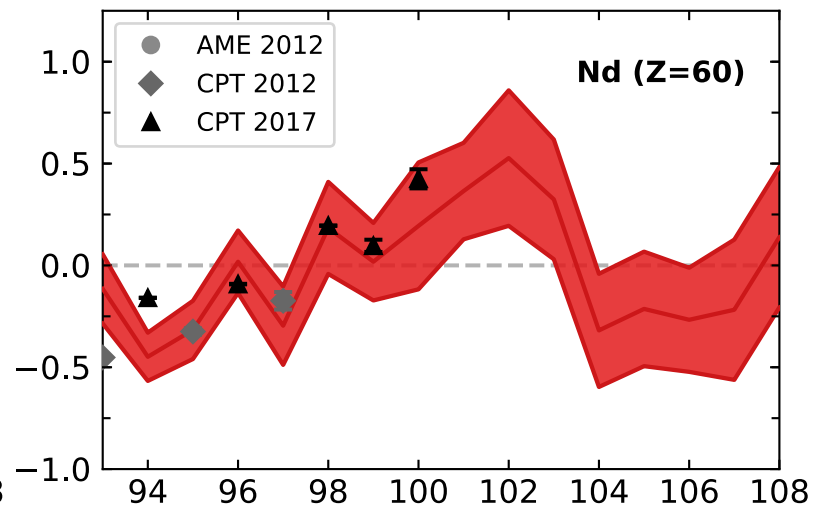
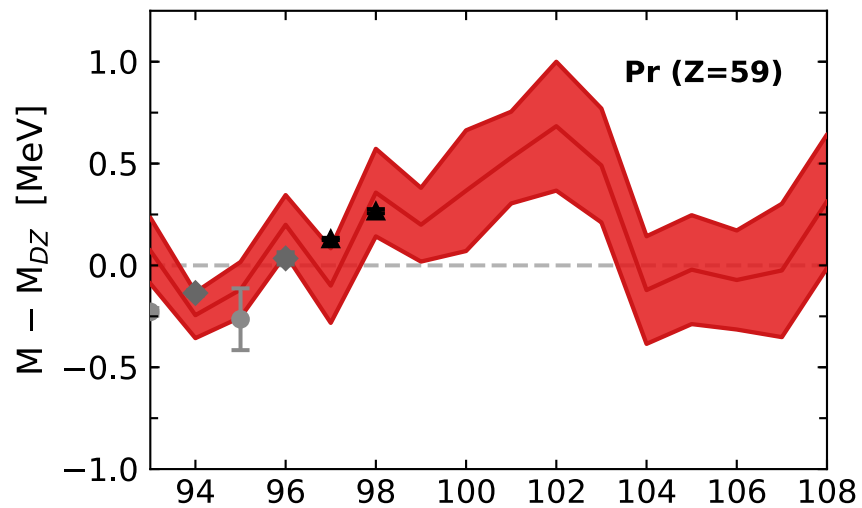
Neutron-rich nuclear masses found capable of peak formation

# Results

- Astrophysical trajectory:  
hot, low entropy **wind** as from a NSM  
accretion disk  
( $s/k=30$ ,  $\tau=70$  ms,  $Y_e=0.2$ )
- 50 parallel, independent MCMC runs;  
Average run  $\chi^2 \sim 23$

Orford, Vassh, Clark, McLaughlin, Mumpower,  
Savard, Surman, Aprahamian, Buchinger,  
Burkey, Gorelov, Hirsh, Klimes, Morgan,  
Nystrom, and Sharma  
(Phys. Rev. Lett. **120**, 262702 (2018))





PRELIMINARY

# Dynamic Mechanism Of Rare-Earth Peak Formation

Detailed balance implies

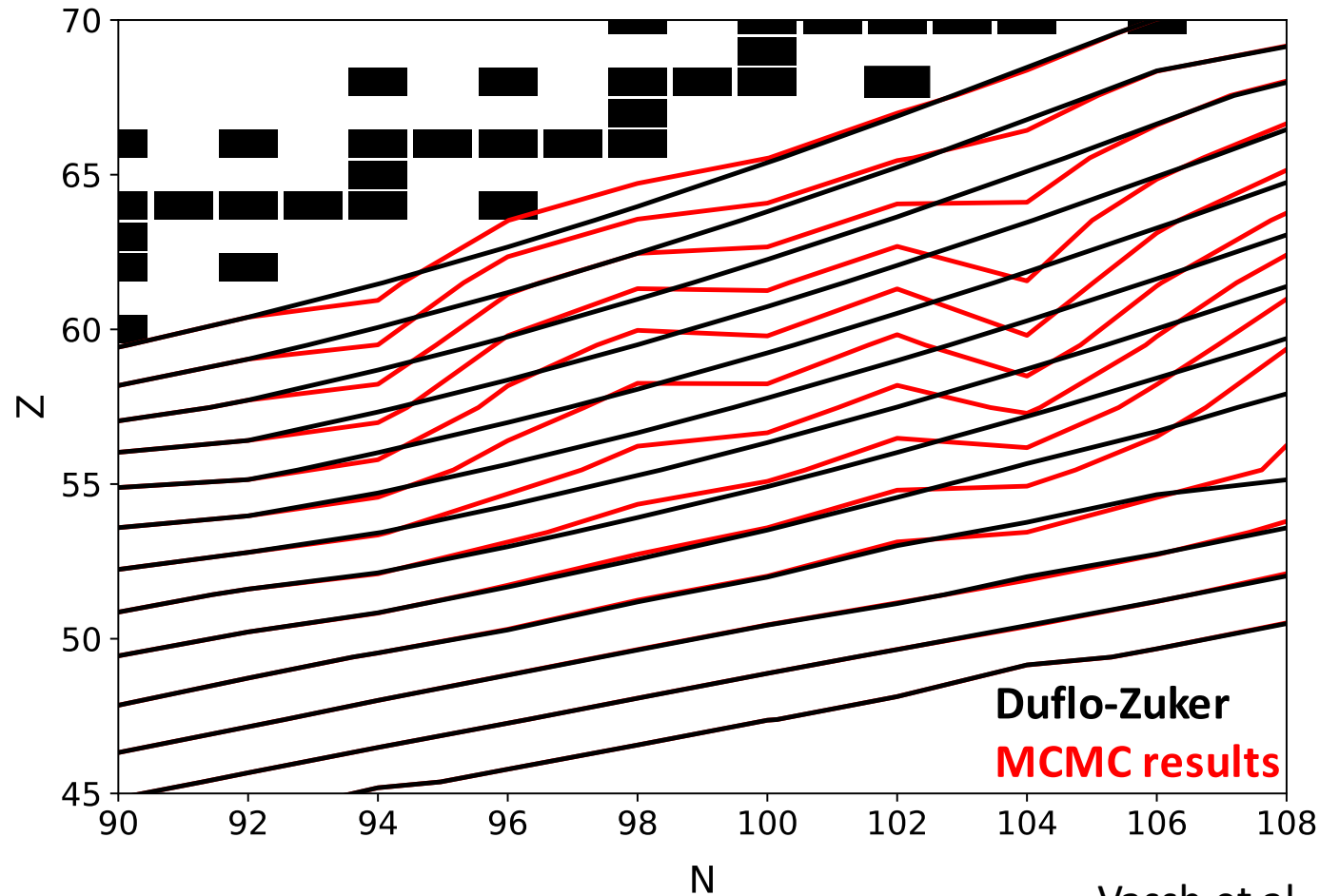
$$(\gamma, n) \propto e^{-S_n/kT}$$



*r*-process path tends to lie along contours of constant separation energy



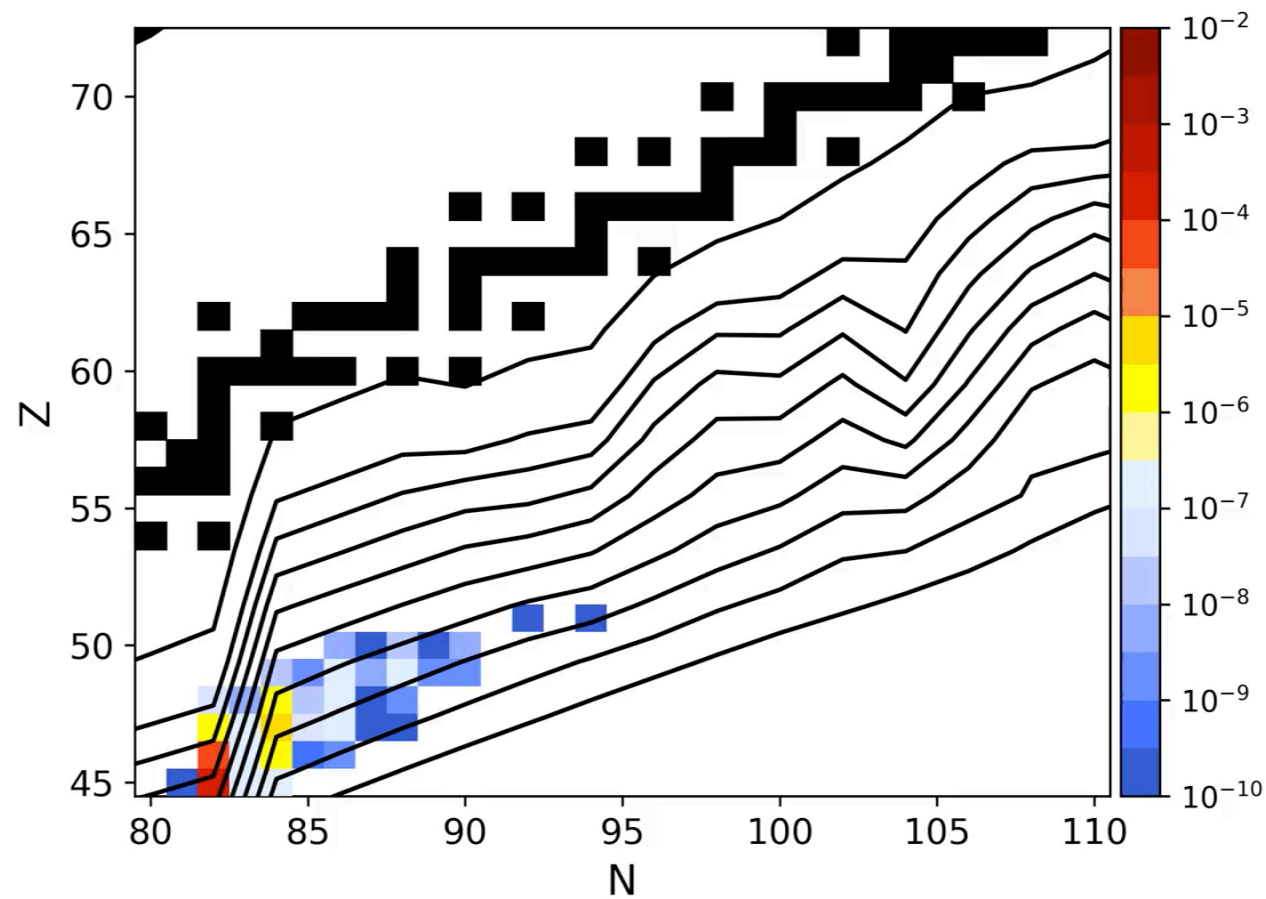
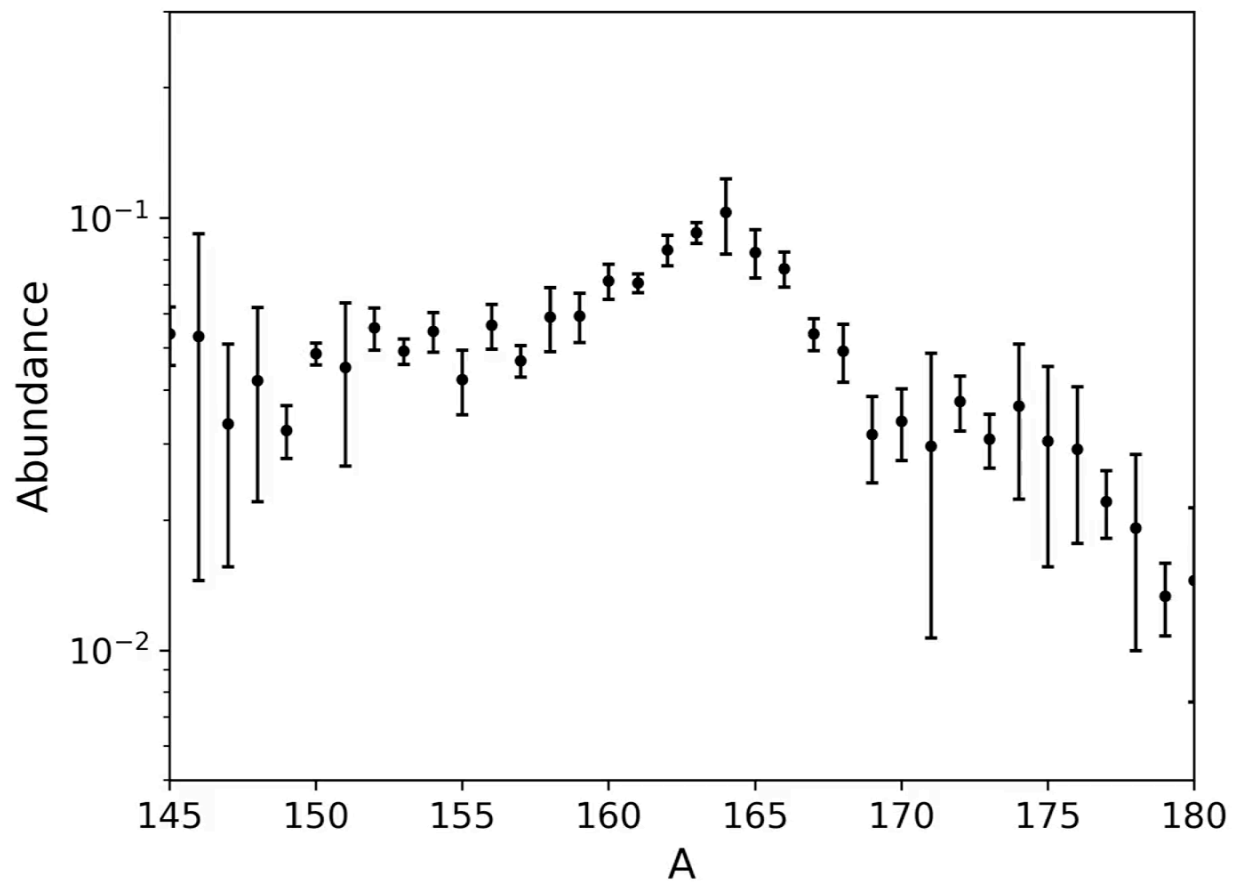
Pile-up of material at kinks



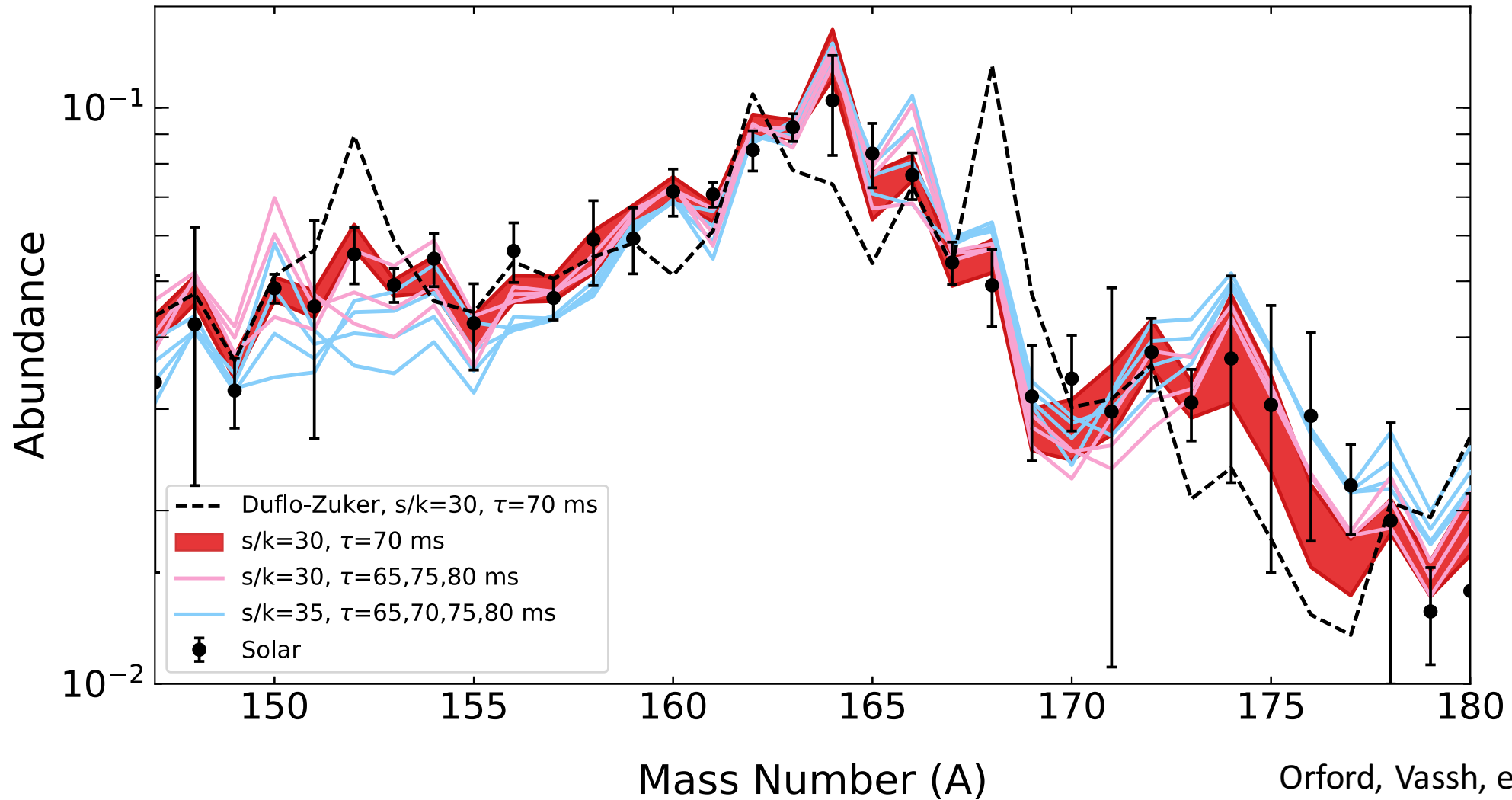
Vassh et al  
(in preparation)

**NOTE:** FISSION is the other possible means of REP formation

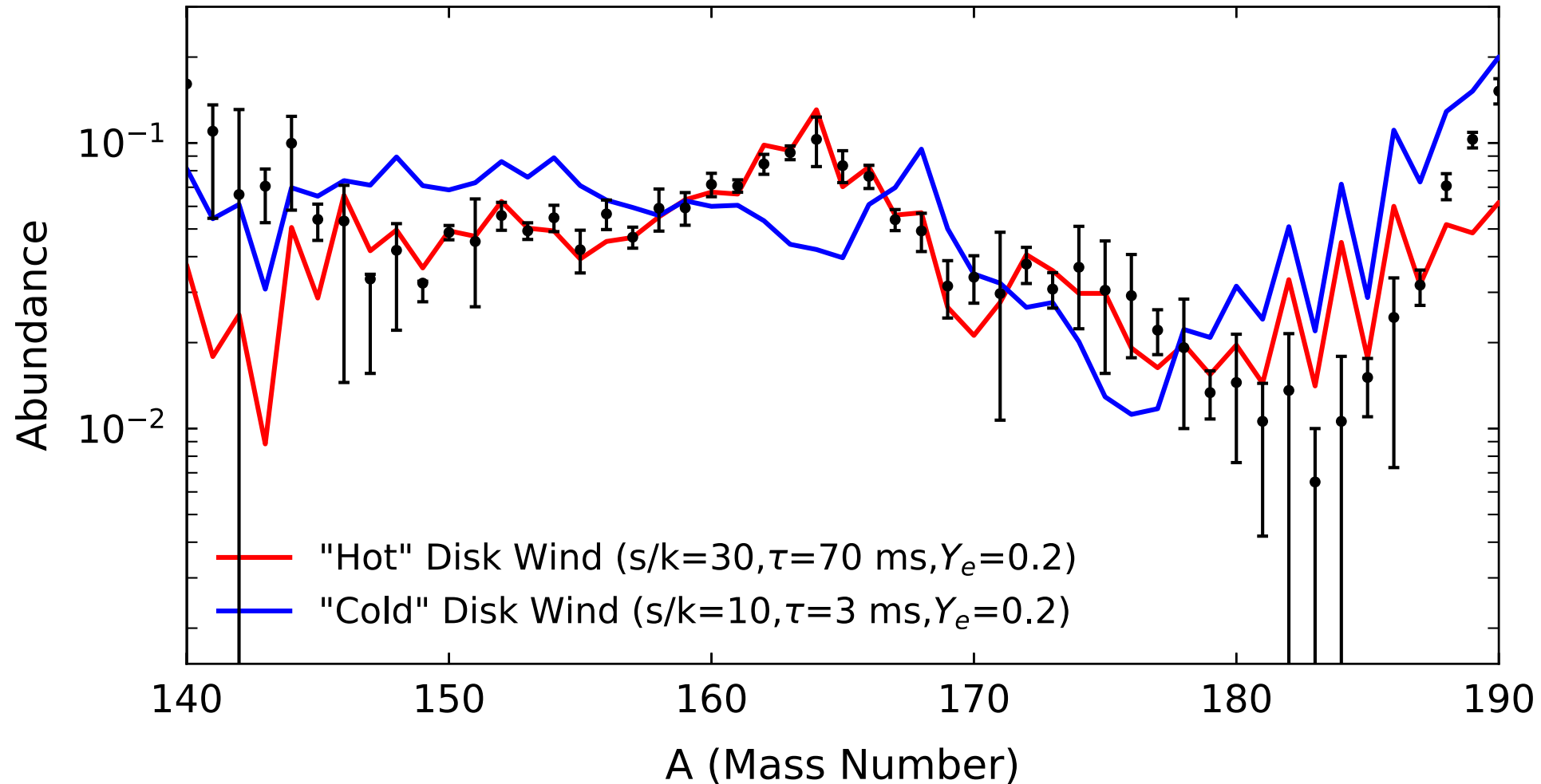
# Peak Formation with an MCMC Mass Solution



# Rare-Earth Peak with MCMC solution + similar astro conditions



# Rare-Earth Peak with MCMC solution + distinct astro conditions



# Nucleosynthesis in Neutron Star Mergers: Many Open Questions

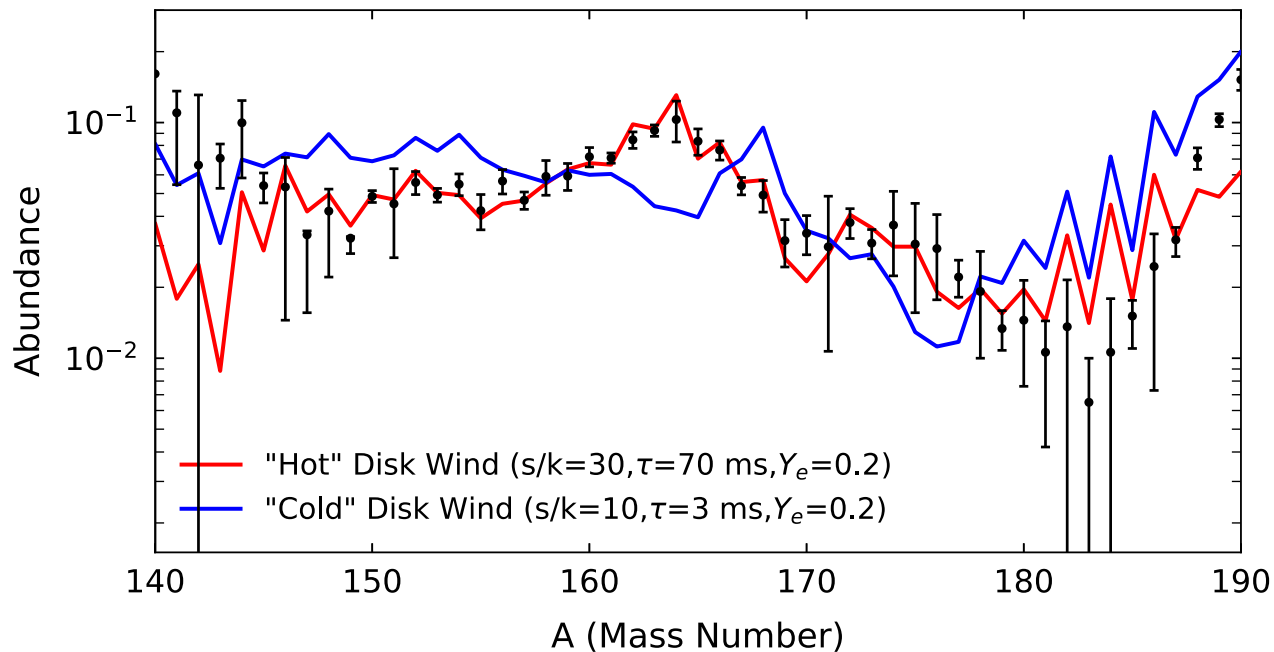
- Can mergers account for all the  $r$ -process material observed in the galaxy?
- Are precious metals such as gold produced in sufficient amounts?
- Are actinides produced?
- Where within the merger environment does nucleosynthesis occur and under what specific conditions?
- How does the rare-earth peak form?



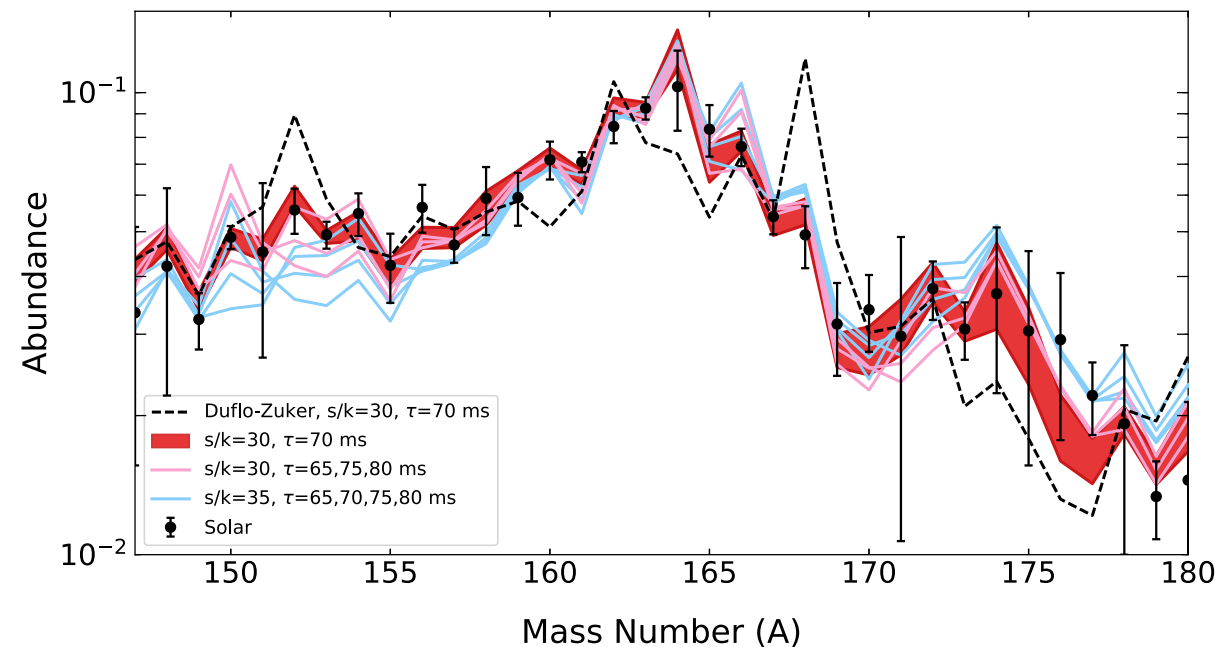
# Nucleosynthesis in Neutron Star Mergers: Many Open Questions

- Can mergers account for all the  $r$ -process material observed in the galaxy?
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- How does the rare-earth peak form?

Monte Carlo methods



Vassh et al (in preparation)

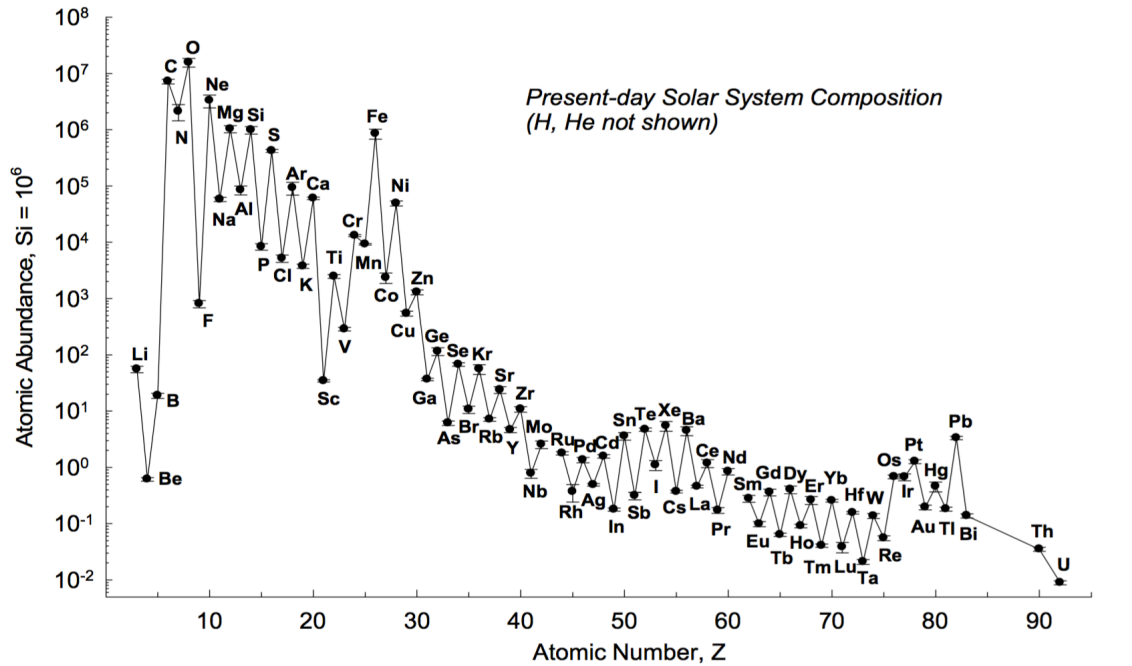


Orford, Vassh, et al (Phys. Rev. Lett. **120**, 262702 (2018))

Back-up Slides

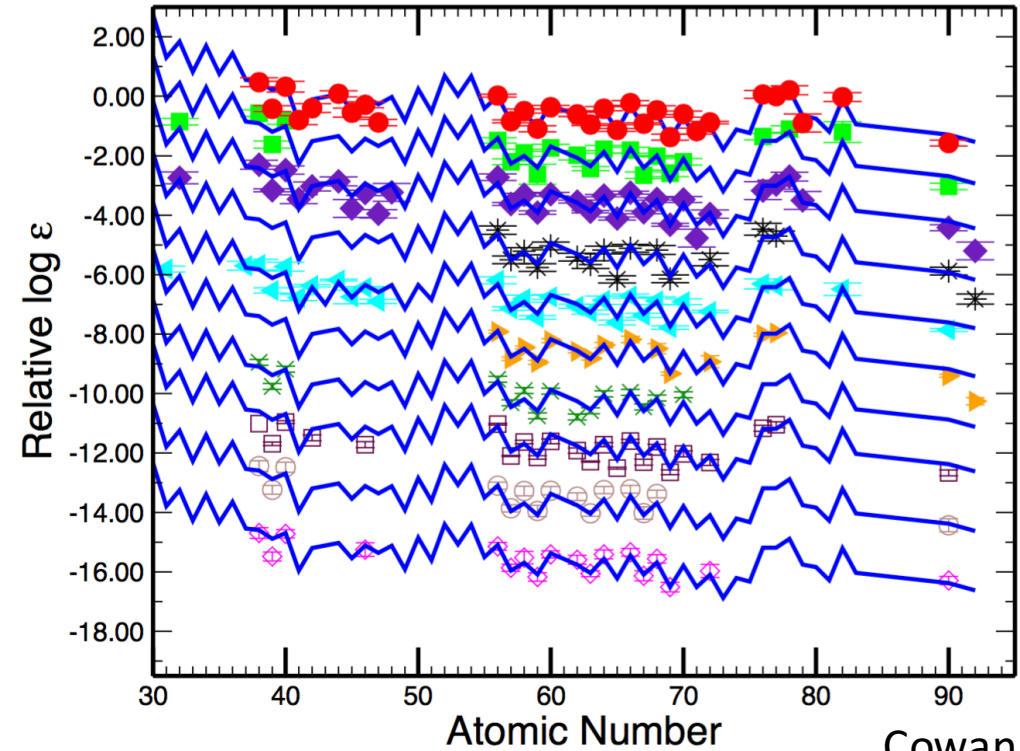
# Observed Elemental Abundances

## Solar System



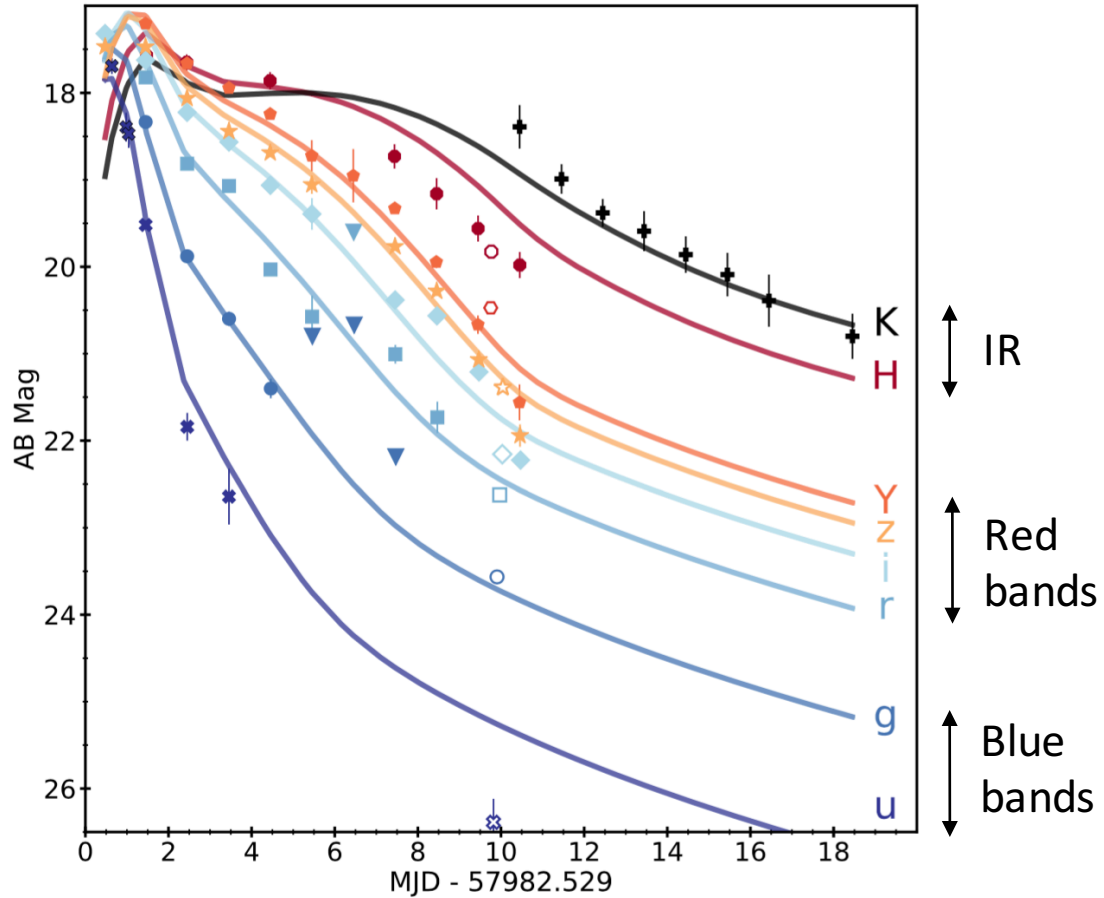
Lodders (2010)

## 10 *r*-process rich halo stars



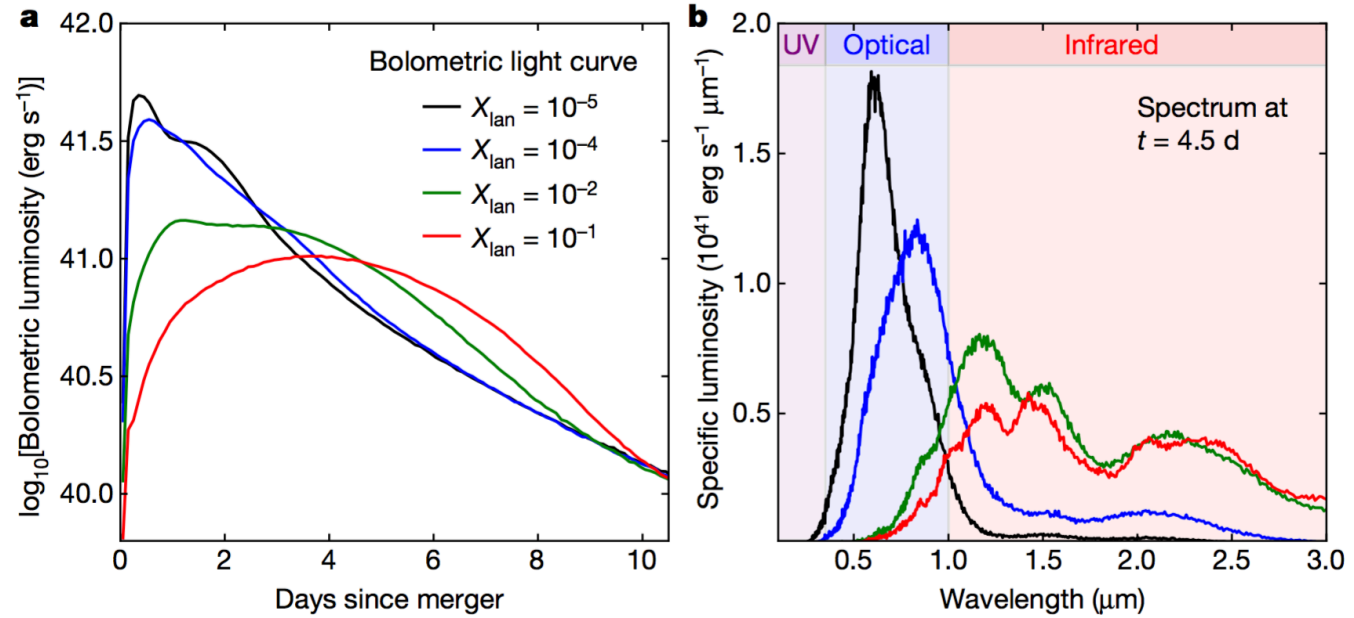
Cowan, Roederer,  
Snedden and Lawler  
(2011)

# Lanthanide production in GW170817: “red” kilonova



Cowperthwaite et al (ApJL 2017)

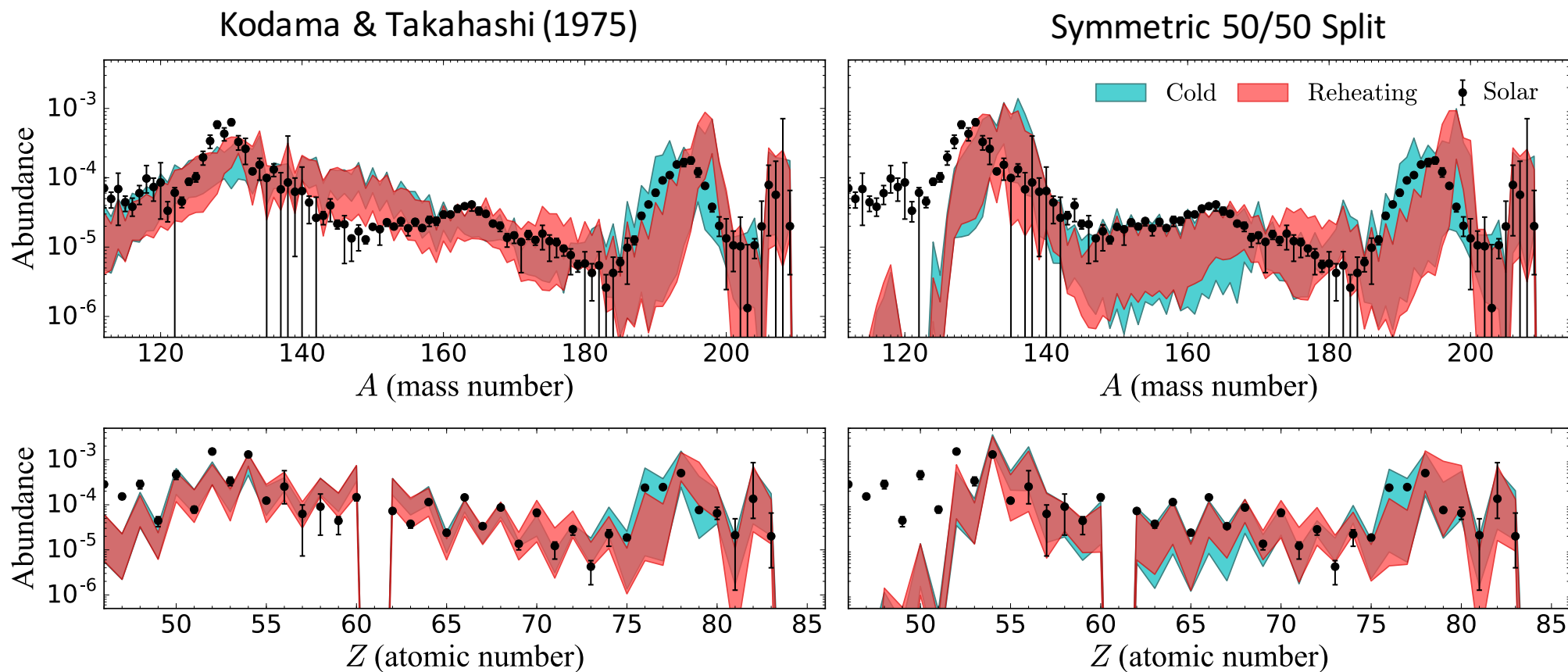
Lanthanide mass fraction  $\uparrow$ , opacity  $\uparrow$ , longer duration light curve shifted toward infrared



Kasen et al (*Nature* 2017)

# $r$ -process Sensitivity to Mass Model and Fission Yields

- 10 mass models: DZ33, FRDM95, FRDM12, WS3, KTUY, HFB17, HFB21, HFB24, SLY4, UNEDF0
- N-rich dynamical ejecta conditions: **Cold** (Just 2015), **Reheating** (Mendoza-Temis 2015)

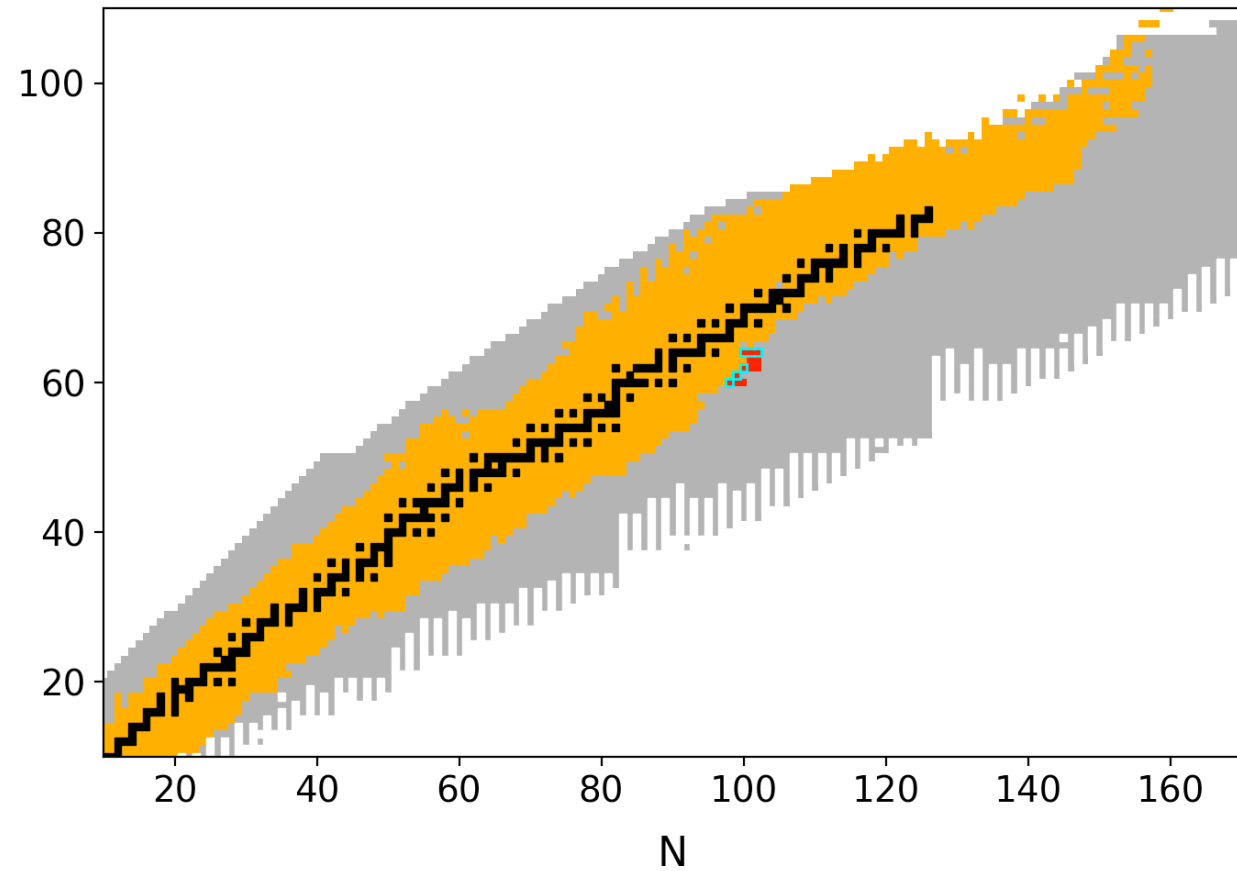
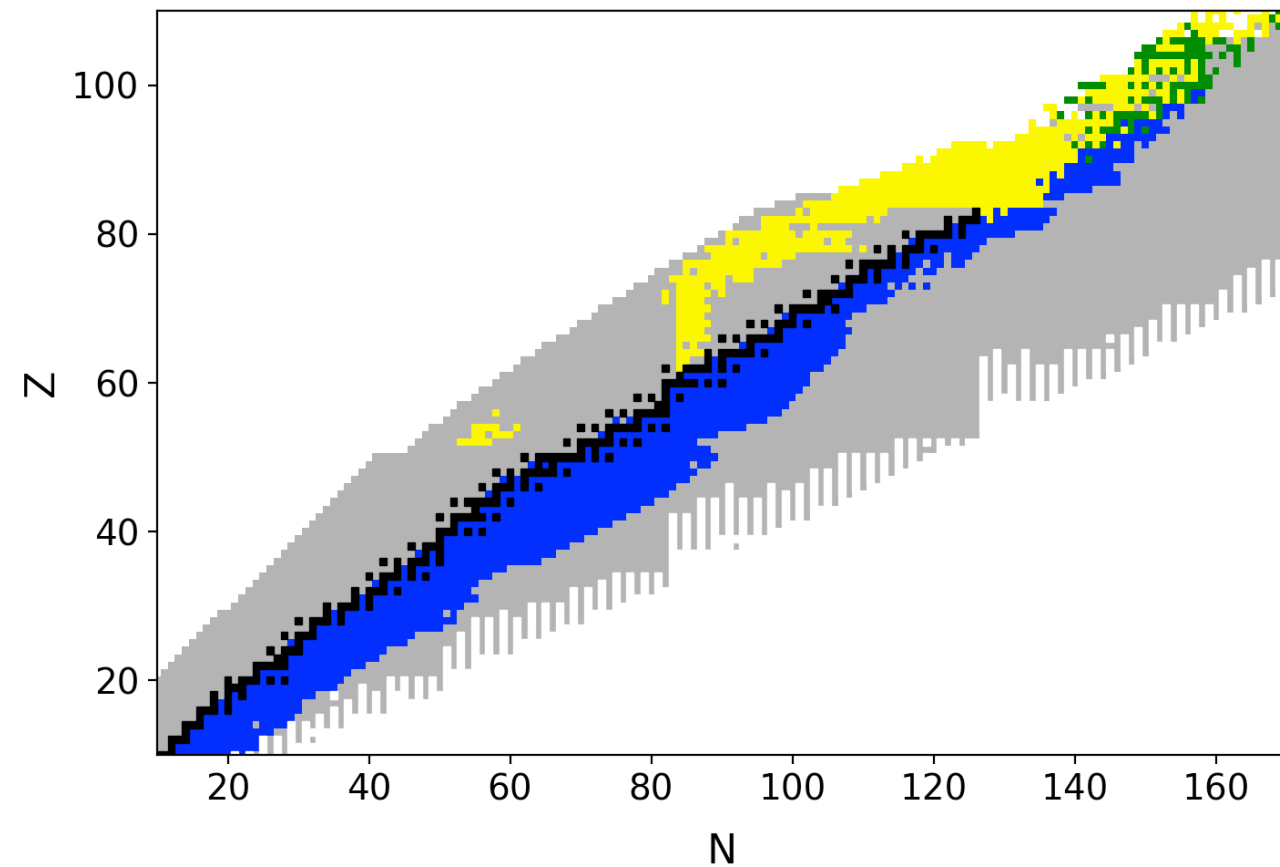


# Measured Decay Rates and Masses

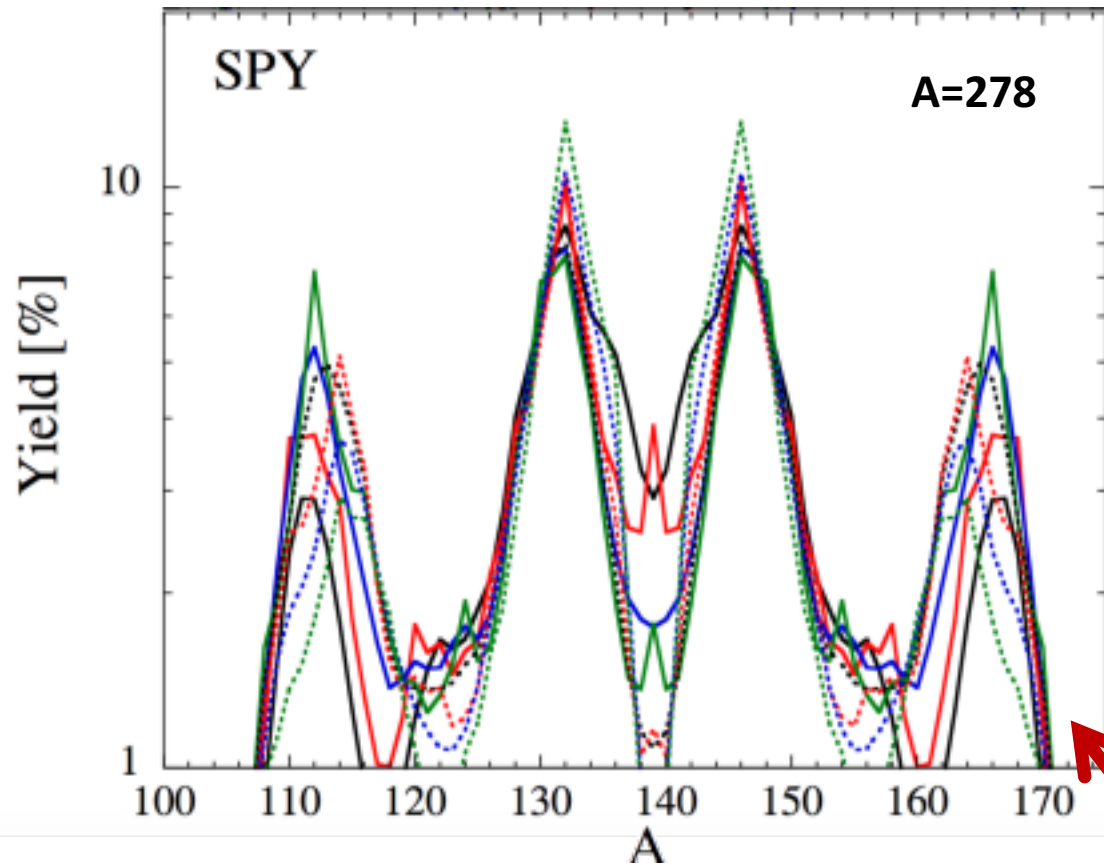
NUBASE 2016

$\beta$ -decay,  $\alpha$ -decay, and spontaneous fission

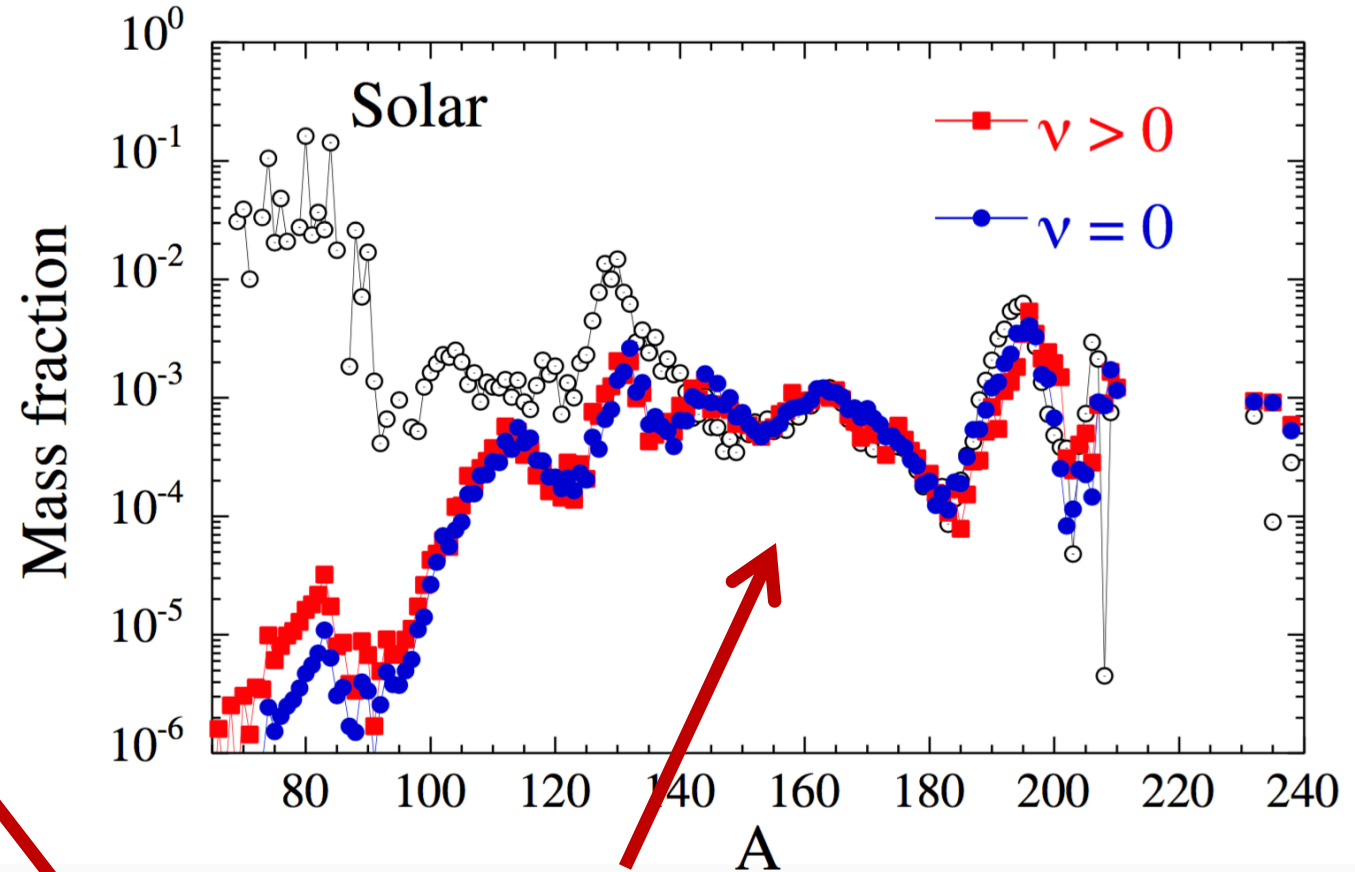
AME 2016 / Jyväskylä / CPT at CARIBU



# Dependence on the Fission Fragment Distribution



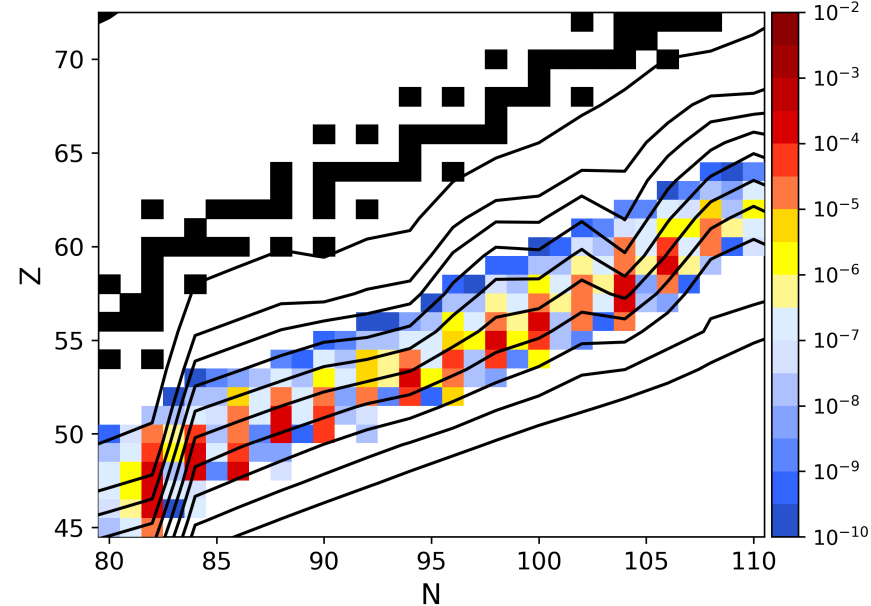
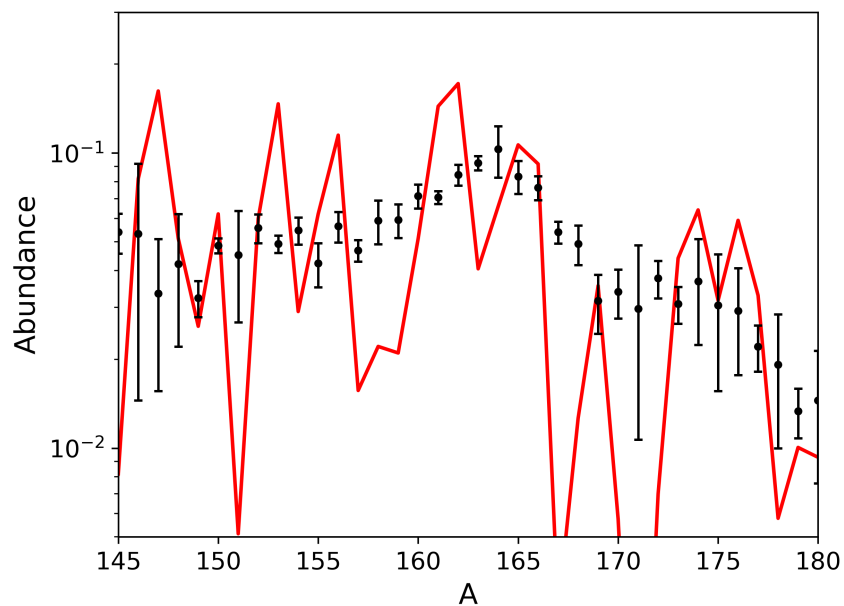
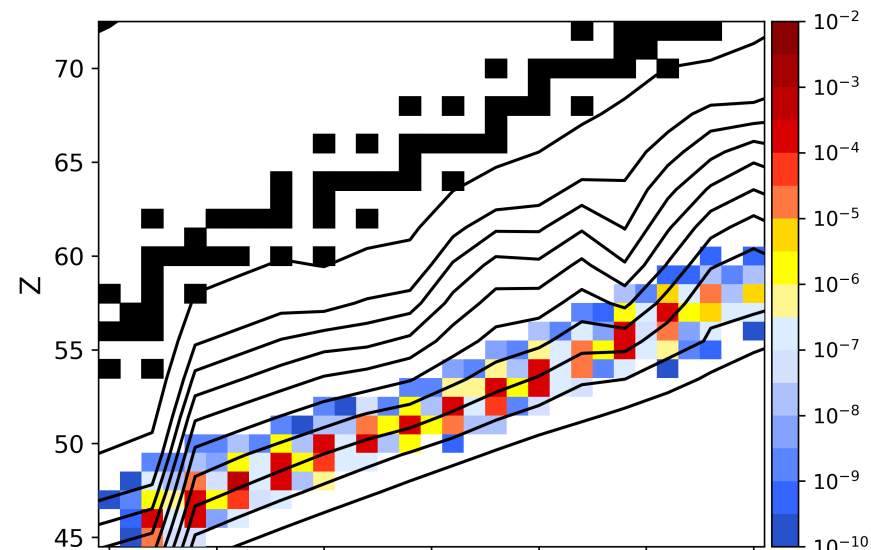
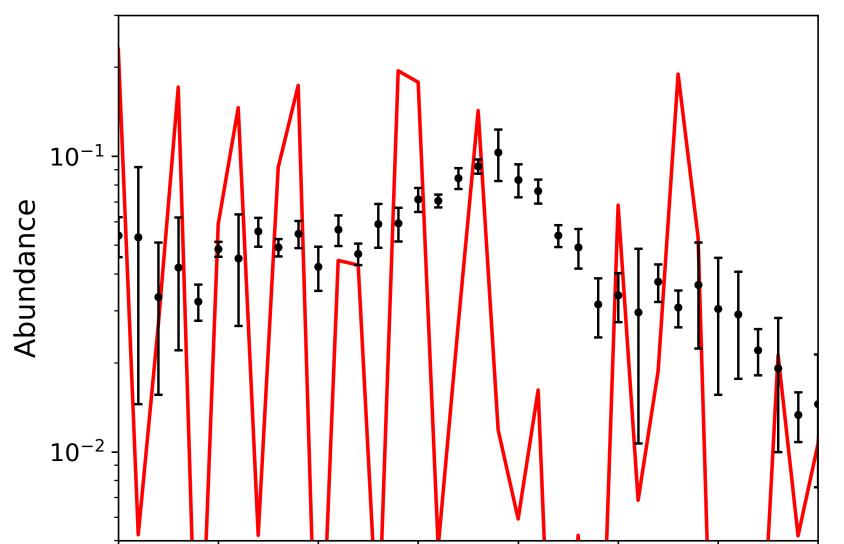
Z=95, Z=96, Z=97, Z=98, Z=99, Z=100,  
Z=101, Z=102 (dotted lines – larger Z)



Rare-earth peak can be populated by fission  
daughter products of n-rich nuclei

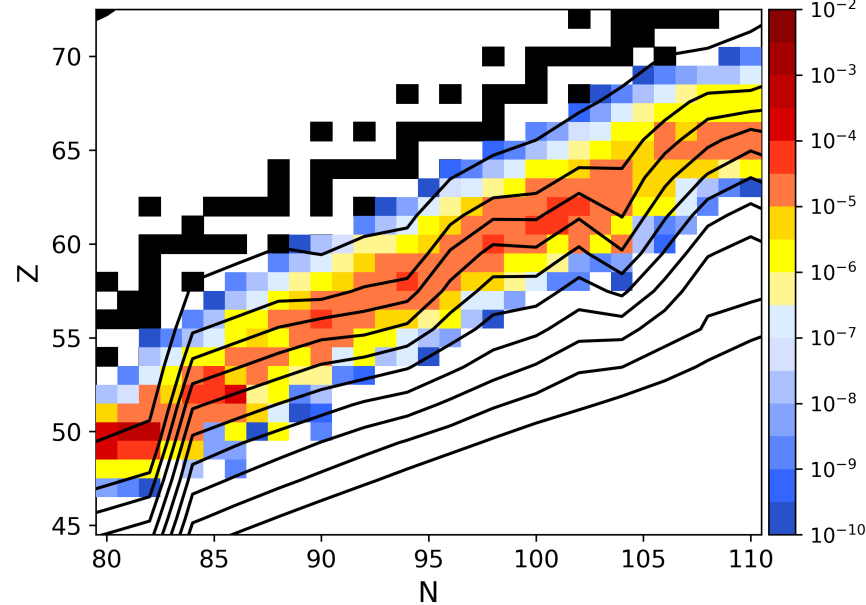
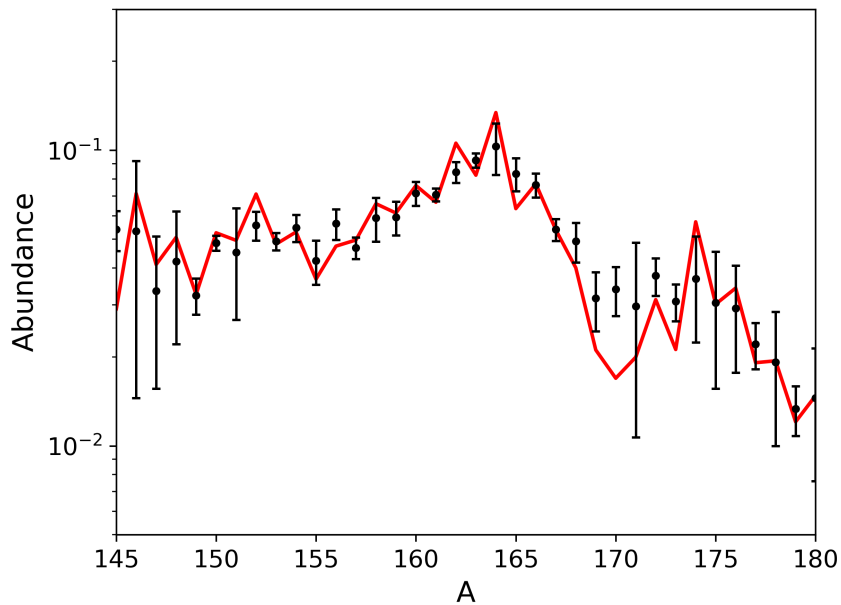
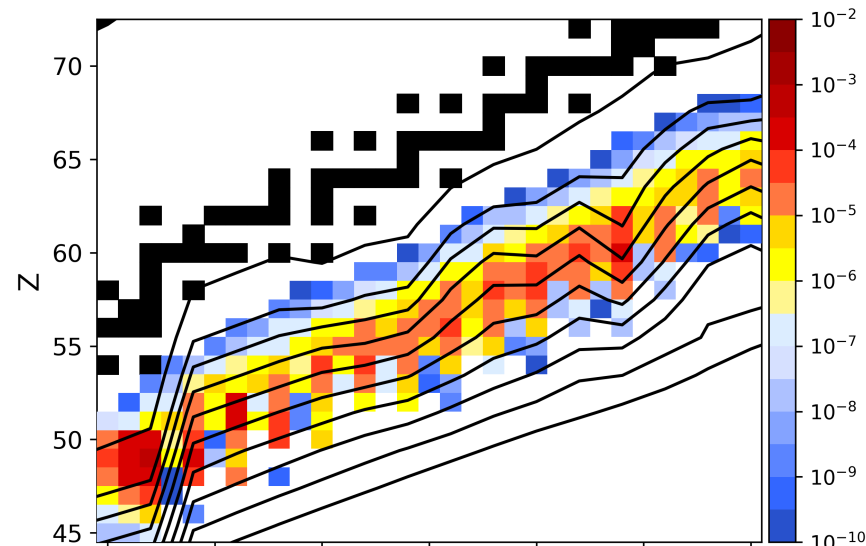
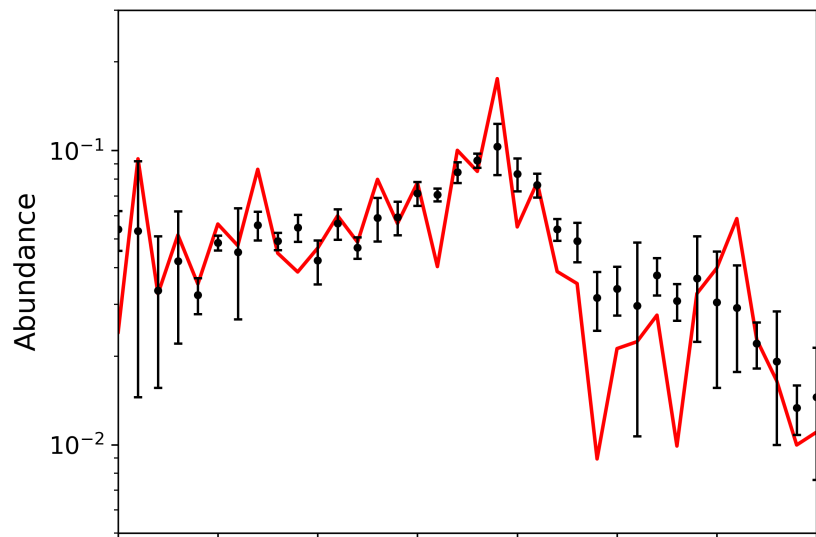
Goriely (2015)

# Peak Formation with an MCMC Mass Solution





# Peak Formation with an MCMC Mass Solution

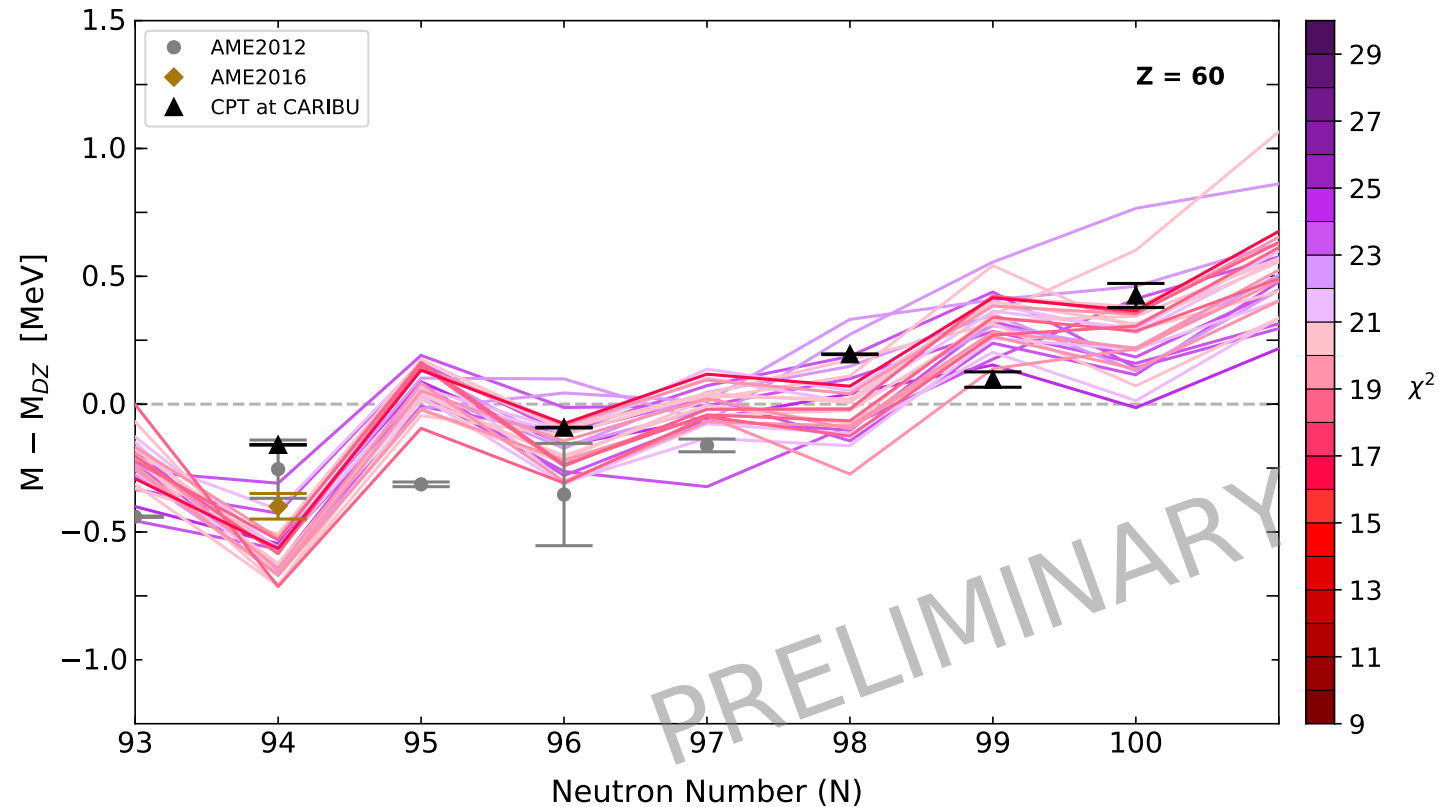


# Preliminary Results

- Astrophysical trajectory: n-rich NSM **dynamical** ejecta with nuclear reheating
- 50 independent MCMC runs complete



30 Runs (Best Step Colored by  $\chi^2$ )



Vassh et al  
(in preparation)