



# Searching for Complex Organic Molecules in Space

Kevin H. Knuth and Duane F. Carbon

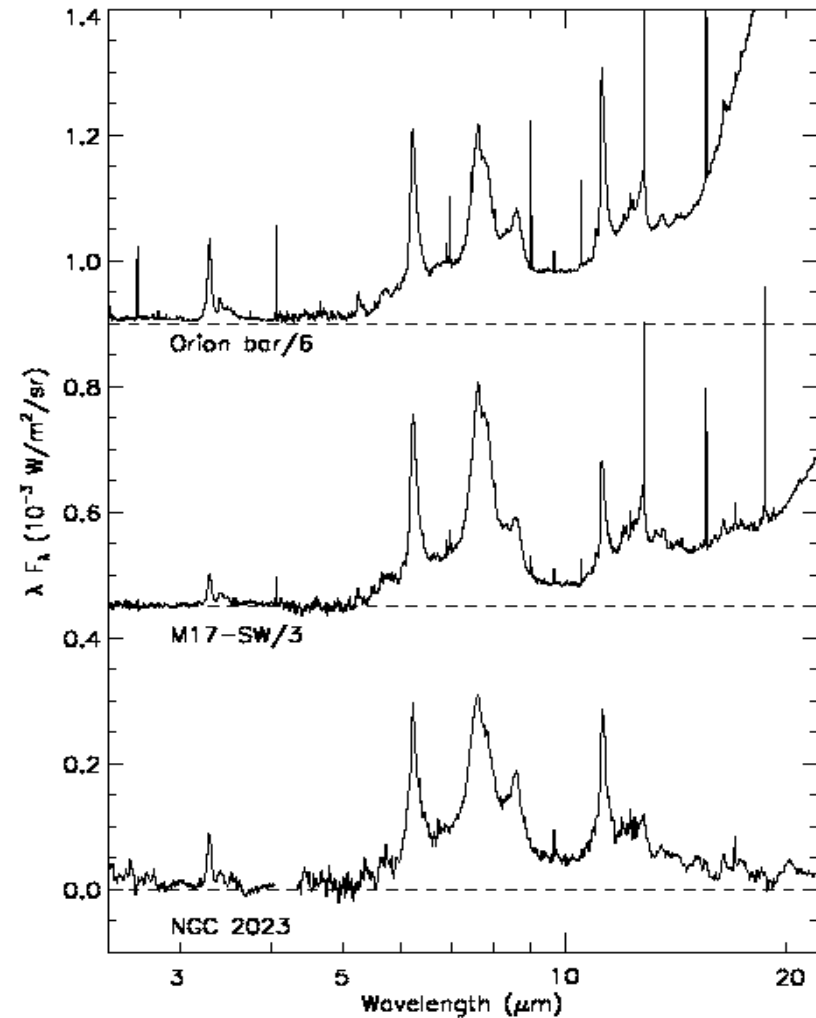
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NASA Ames  
Moffett Field CA

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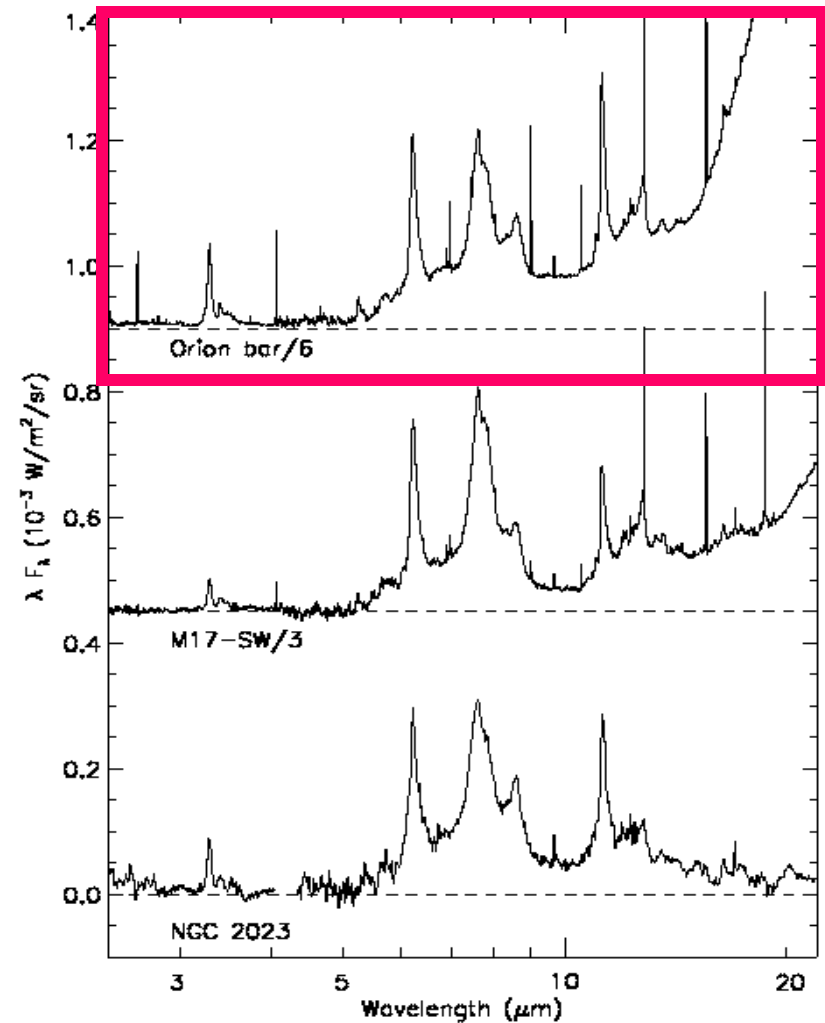
# Unidentified InfraRed (UIR) Emission

- UIR emission when there is UV-lit dust
- emission **near** 3.3, 6.2, 7.7, 8.6 and 11.2  $\mu\text{m}$ .
- dying stars, forming stars/planetary systems, ISM
- other galaxies,  $z = 2.8$



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# Orion



Photo Credit: Matthew Spinelli

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# Orion Nebula

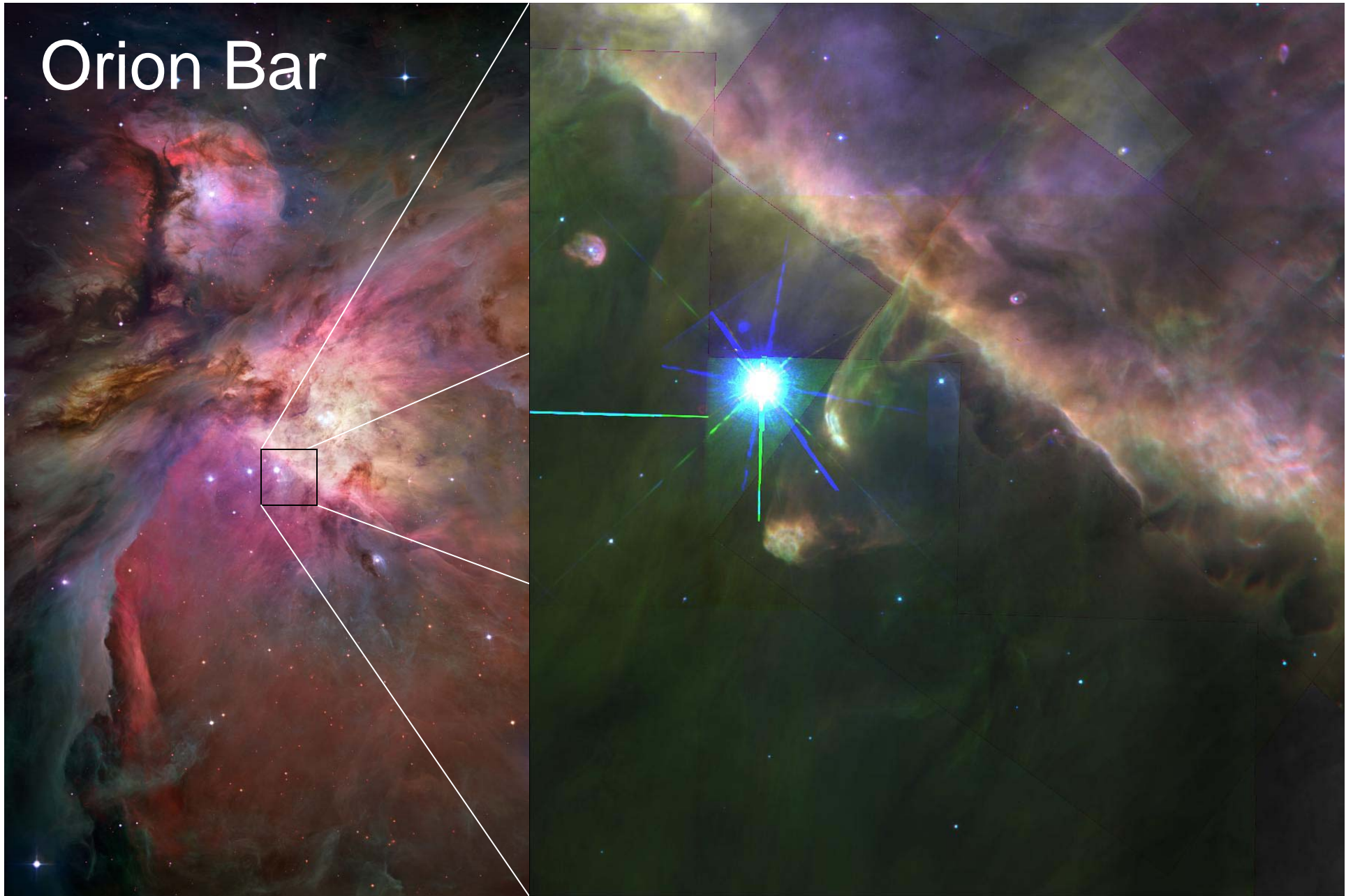


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# Orion Bar



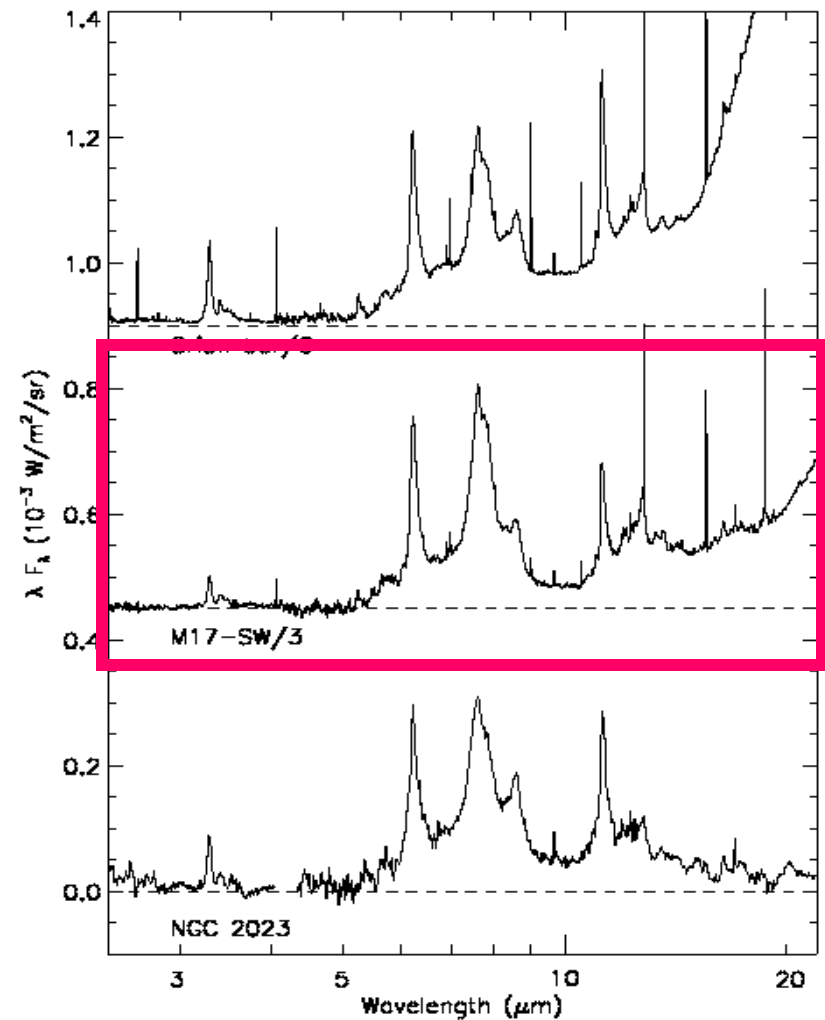
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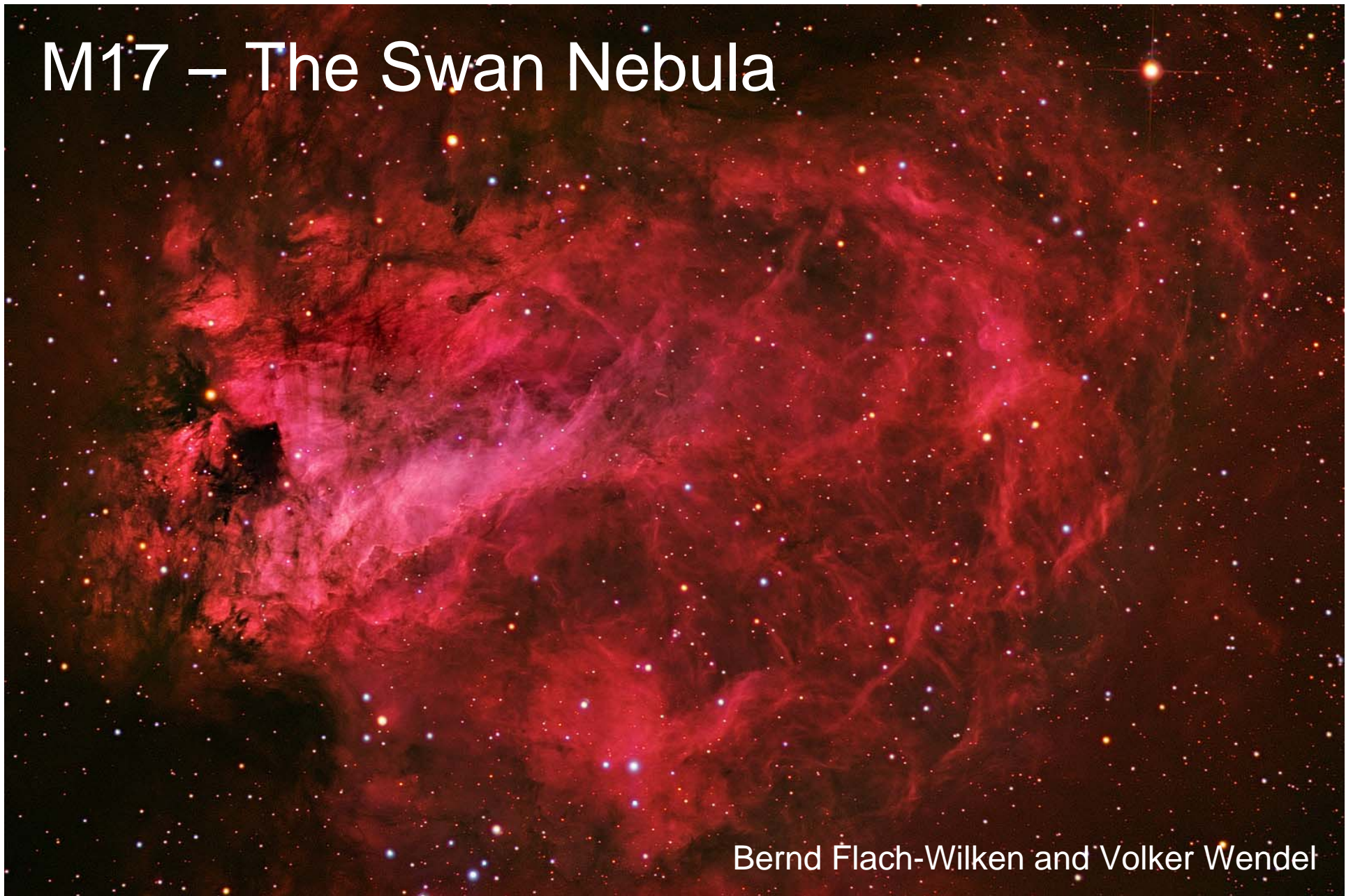
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# M17 – The Swan Nebula



Bernd Flach-Wilken and Volker Wendel

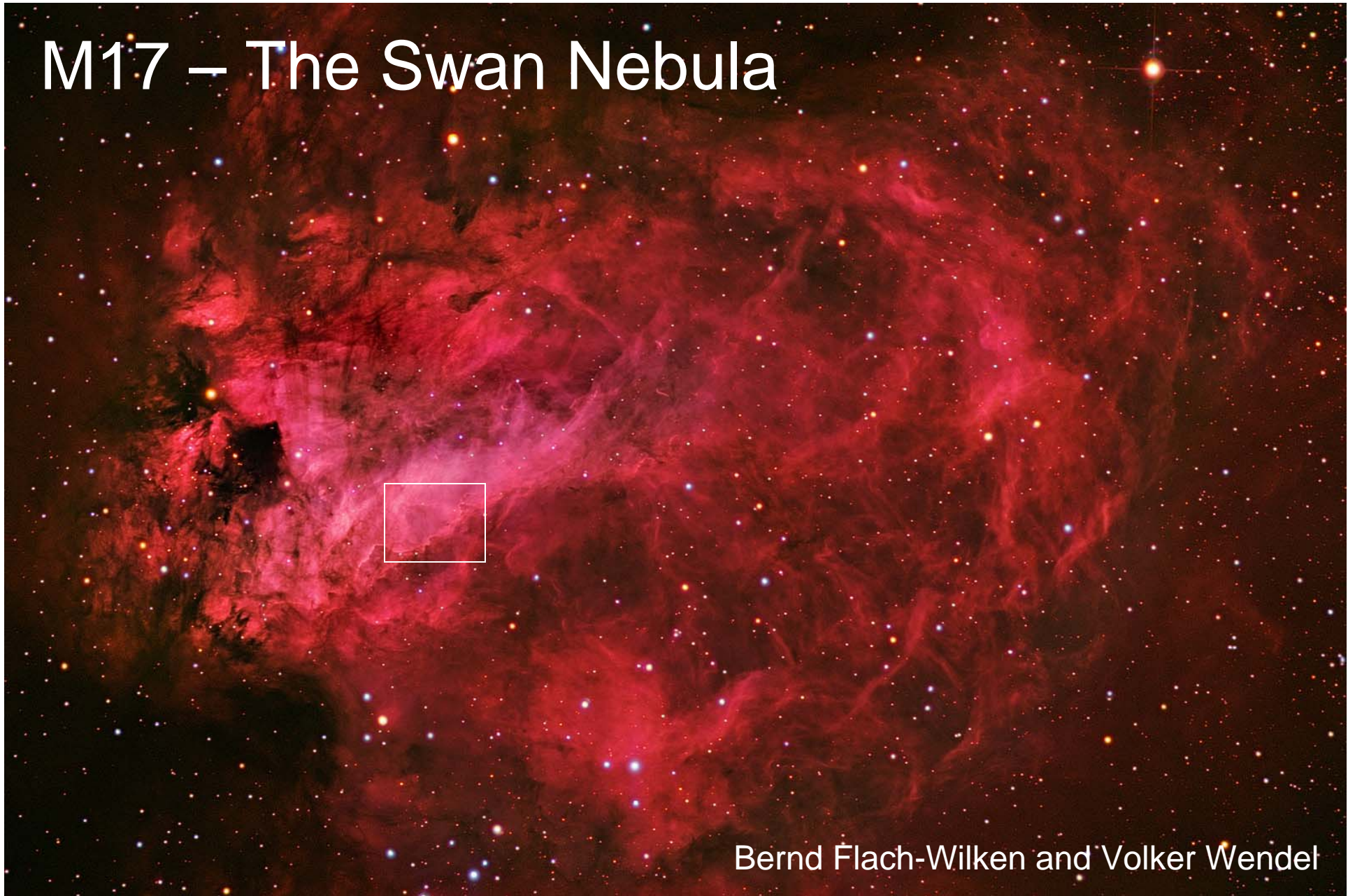
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M17



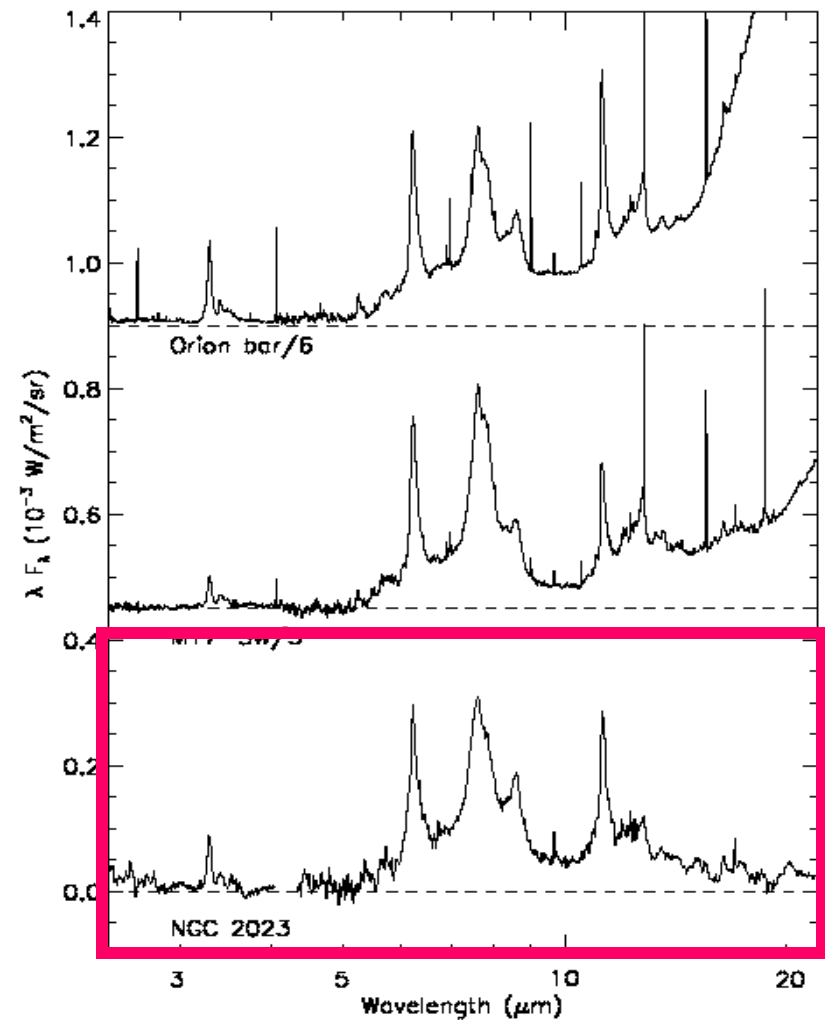
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NGC 2023



Russell Croman

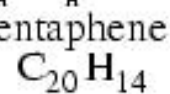
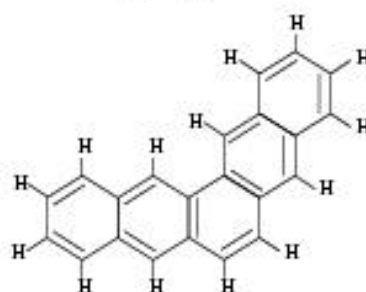
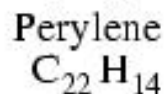
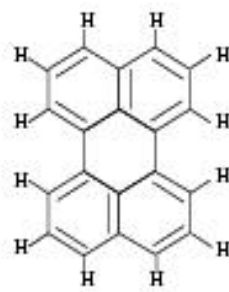
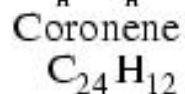
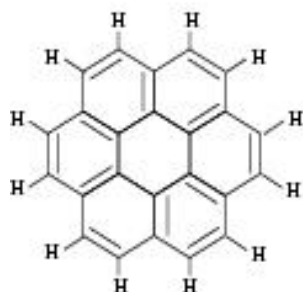
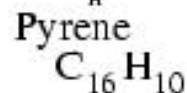
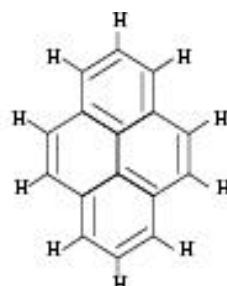
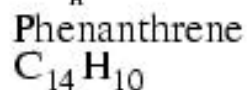
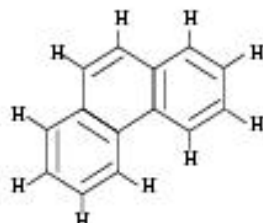
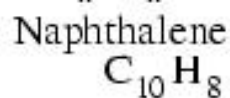
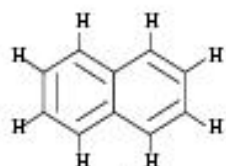
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# PAHs: Source of the UIR Emission?

## Polycyclic Aromatic Hydrocarbons



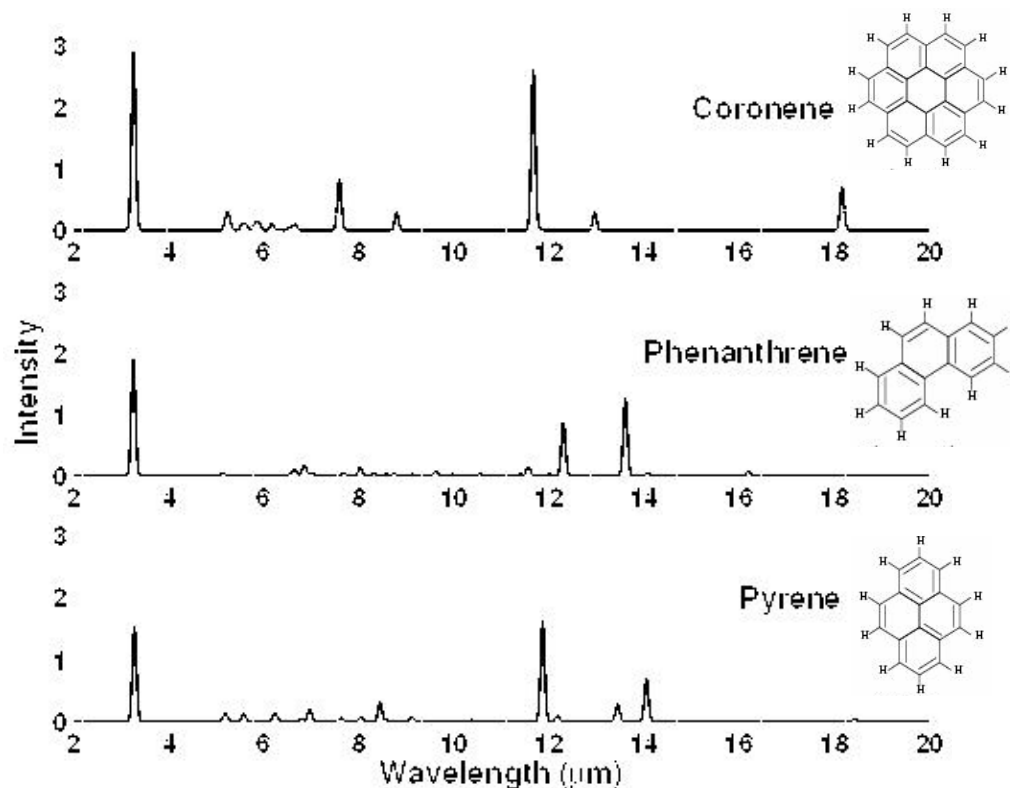
- Molecular bands near correct wavelengths
- Reasonable physical model for UV-driven IR emission

# Every PAH is an Individual

Spectra for ~1000 PAH species known from lab or theoretical work

- neutral, ions, and D, N, Fe, Mg-substituted

Each PAH has unique spectral features



# Why are PAHs so Interesting?

10-20% of all carbon atoms in the Interstellar Medium (ISM) are in PAH molecules

For this reason, PAH emissions are found in almost every cosmic environment in which there are concentrations of dust illuminated by ultraviolet radiation

They could be used to characterize the conditions of the ISM, and could be used as a tracer of star formation in the Milky Way

PAHs now appear to be important molecules on the pathway to life

# The PAH Identification Problem

**No** astrophysical source shows the unique signature of any identifiable **known** PAH

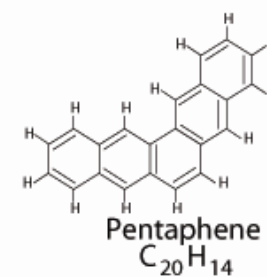
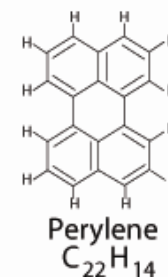
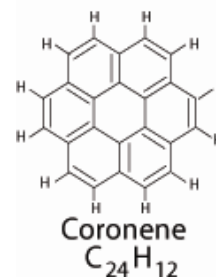
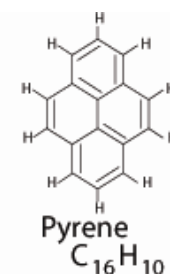
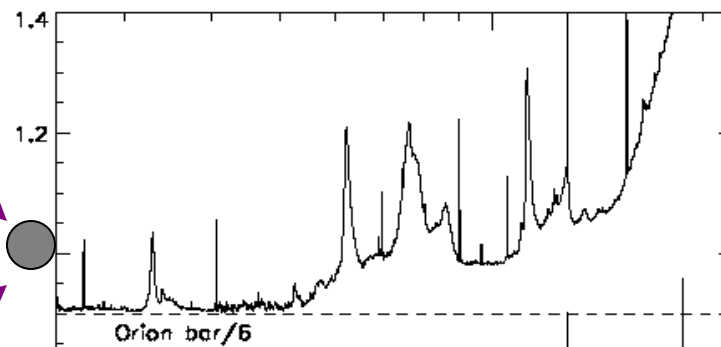
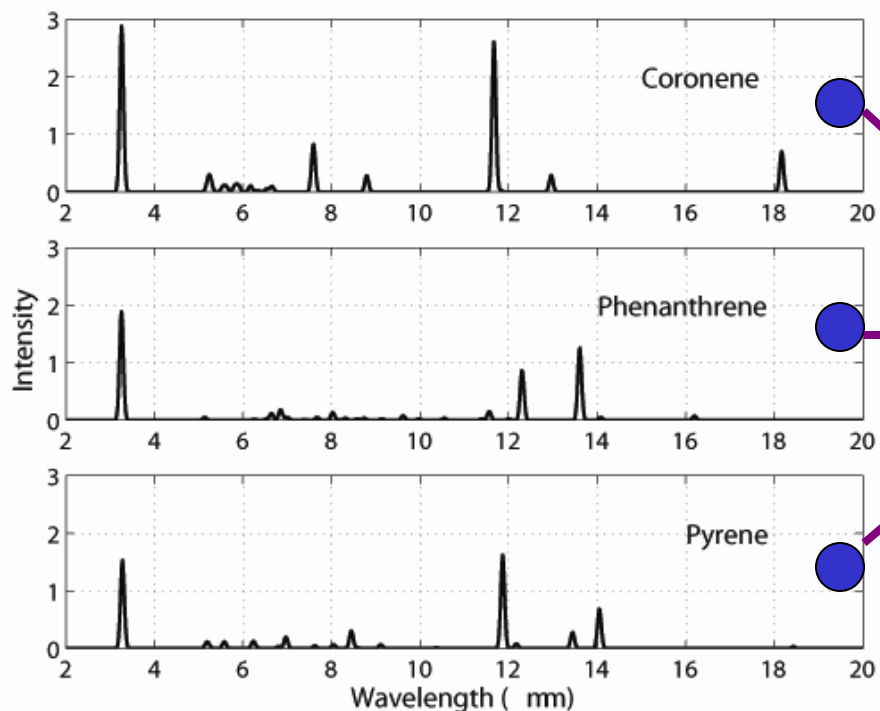
Astrophysical sources appear to have:

- multiple PAH species present
- different PAH-species concentrations depending on:
  - UV-intensity, temperature, and composition



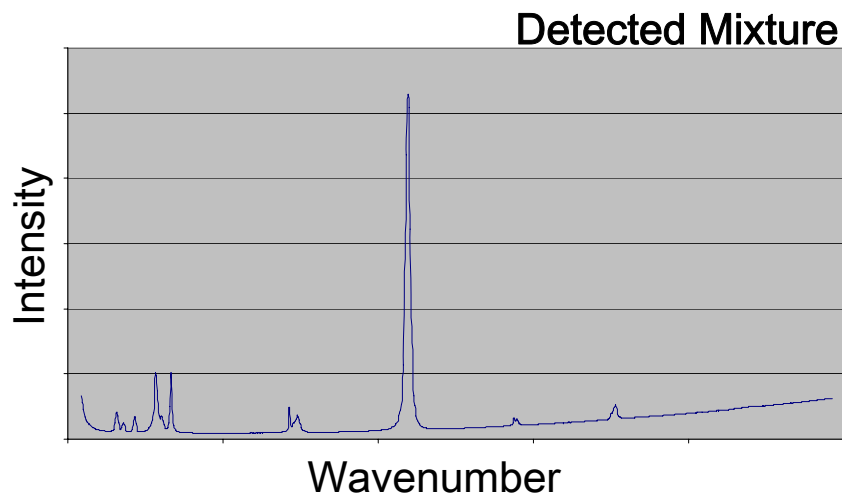
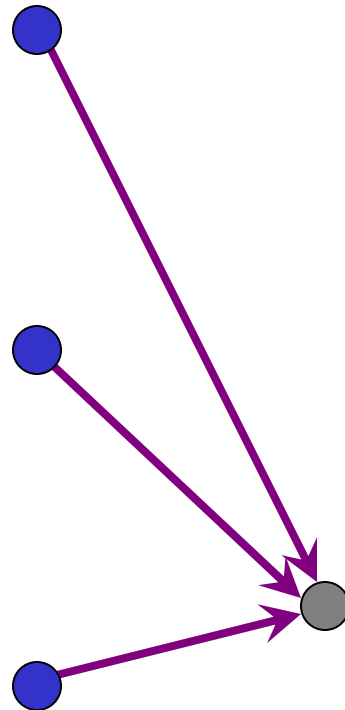
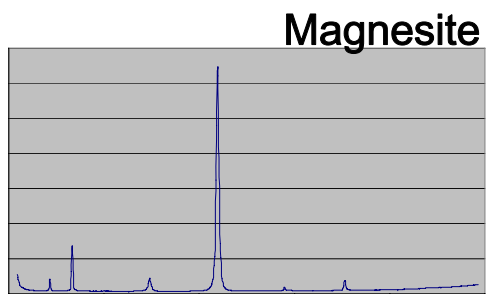
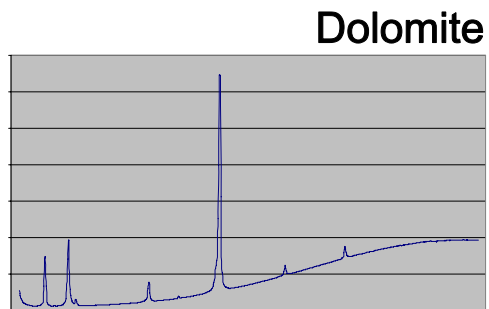
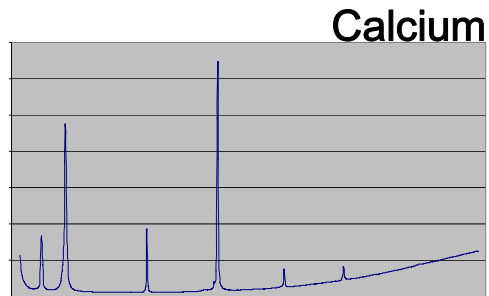
# Source Separation of Spectra

# Numerous PAH Species



Any number of thousands of PAH species can contribute to an observed spectrum.

# Numerous Applications



Data from: Mary Garland, University of Toronto  
Raman Spectrum Excitation: 514 nm argon ion laser.  
<http://minerals.gps.caltech.edu/files/raman/toronto/toronto.htm>

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# PAHs Pose Unique Difficulties

Most source separation problems consist of multiple mixtures and a handful of unknown sources with unknown contributions.

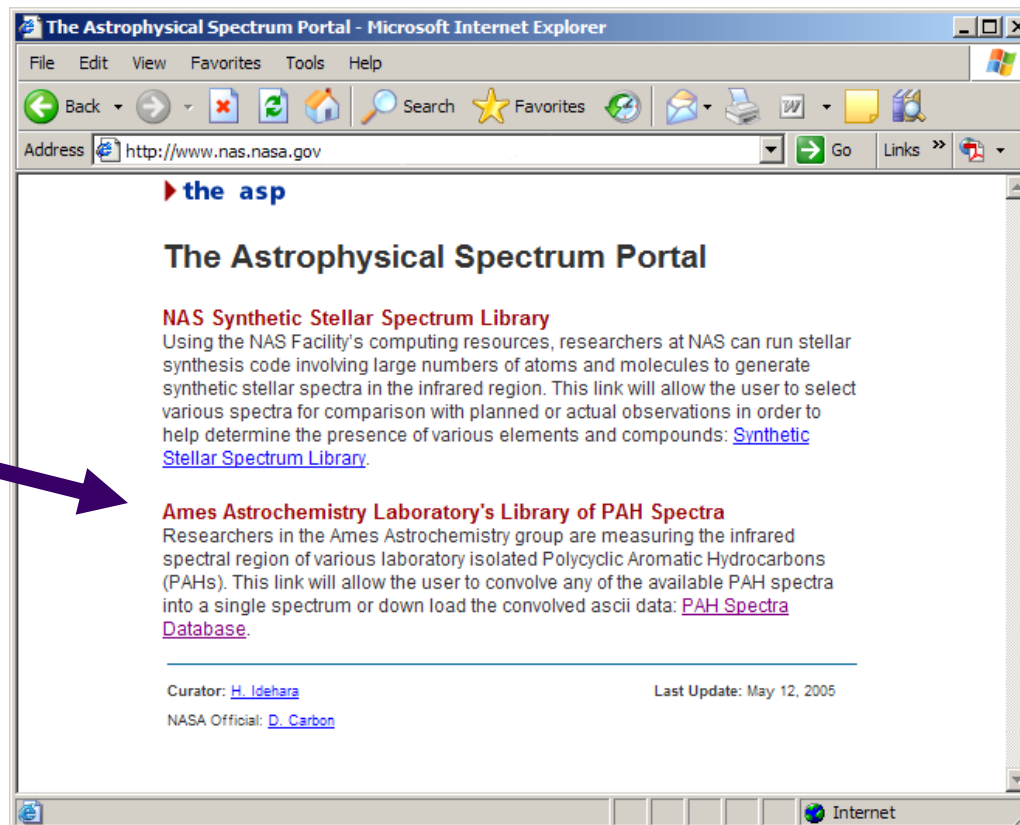
PAH spectral source separation consists of one mixture and numerous known sources with unknown contributions (and even some unknown sources).

There are potentially 100s to 1000s of species present.

- How do we tell which ones?
- How do we deal with the large number of spectra?

# Astrophysical Spectrum Portal

The PAH spectra database at NASA Ames Research Center will contain ~1000 PAH spectra



# Three Approaches

**1) *Hand-fitting by eye***

*- widely applied*

**2) *Non-Negative Least Squares***

*- two applications to PAHs ( $N < 12$ )*

**3) *Bayesian Source Separation with Sampling***

*- work in progress*

# A Straightforward PAH Model

$$F_{\text{mod}}(\lambda) = \sum_{i=1}^N c_i s_i(\lambda) + \phi(\lambda)$$

The diagram illustrates the components of the PAH model equation. Blue arrows indicate the following relationships:

- A double-headed arrow connects  $F_{\text{mod}}(\lambda)$  and "modeled IR flux".
- A single-headed arrow points from  $c_i$  to "Contribution from the  $i^{\text{th}}$  PAH".
- A single-headed arrow points from  $s_i(\lambda)$  to "source spectrum of the  $i^{\text{th}}$  PAH".
- A single-headed arrow points from  $\lambda$  to "wavelength".
- A single-headed arrow points from  $\phi(\lambda)$  to "flux noise".

ignores line-of-sight variations and various thermal and radiative effects

# Non-Negative Least Squares

**Minimize:**  $\chi^2$   
**Subject to:**  $c_i > 0$

$$\chi^2 = \sum_{l=1}^L \left( F_{\text{obs}}(\lambda_l) - F_{\text{mod}}(\lambda_l) \right)^2$$

$$\chi^2 = \sum_{l=1}^L \left( F_{\text{obs}}(\lambda_l) - \sum_i c_i s_i(\lambda_l) \right)^2$$

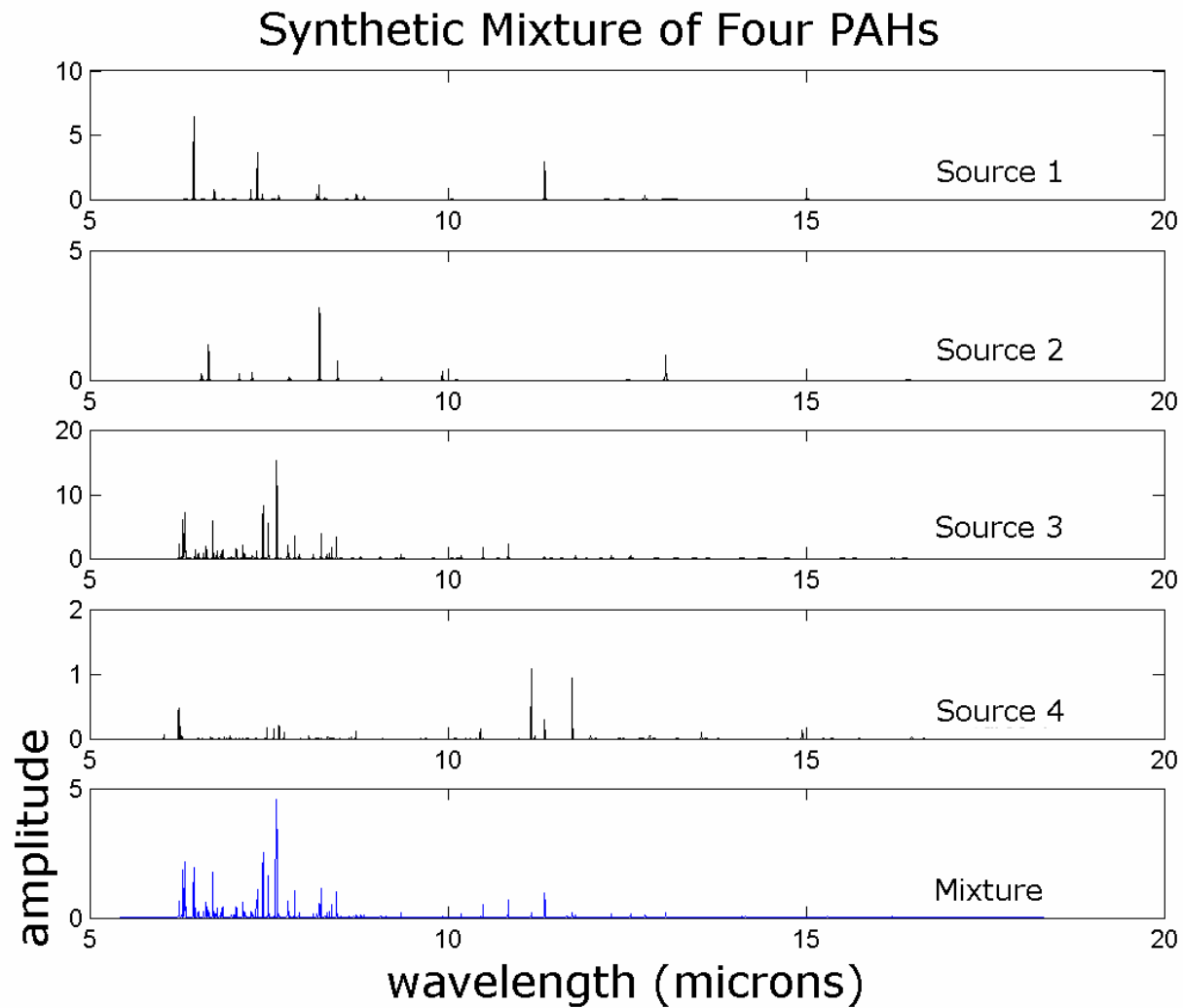
Estimate PAH  
contributions



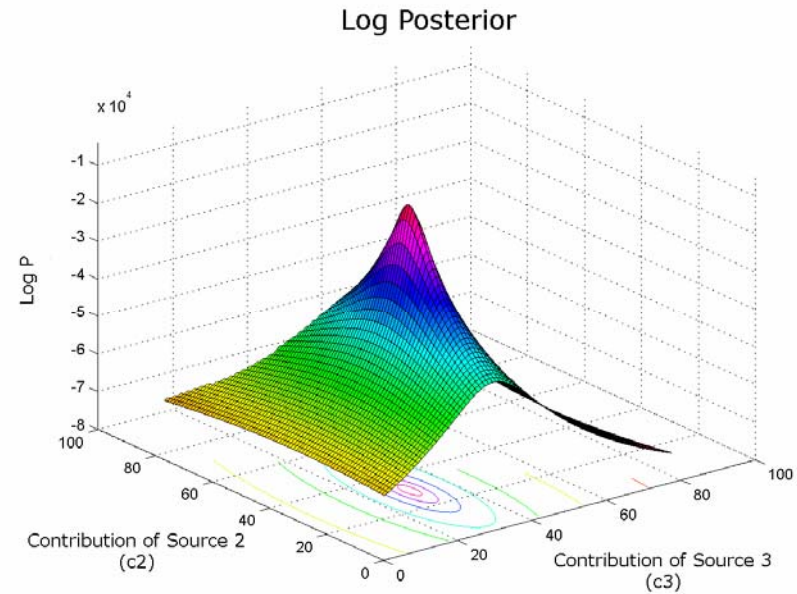
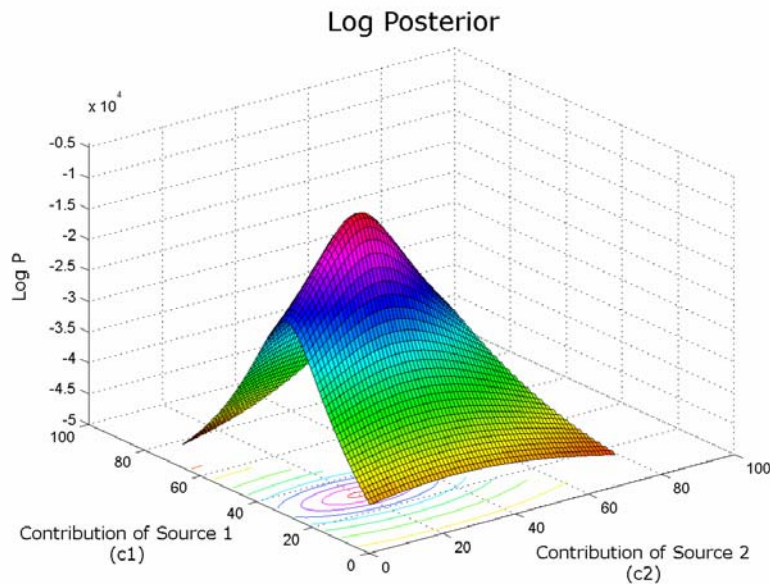
Works alright, but with only small numbers of PAHs and with little spectral overlap.



# Mixing Four PAHs



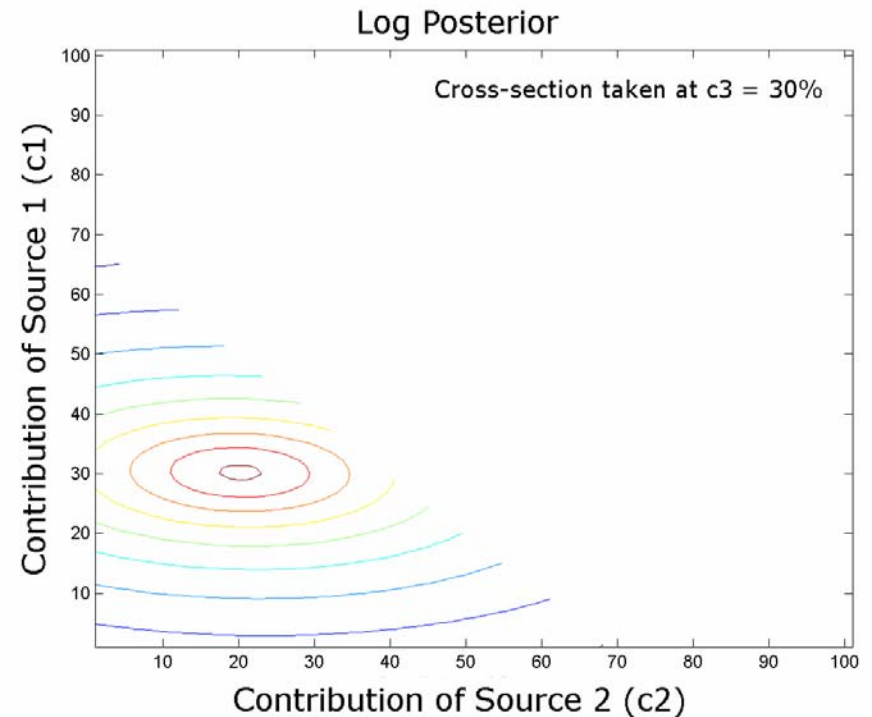
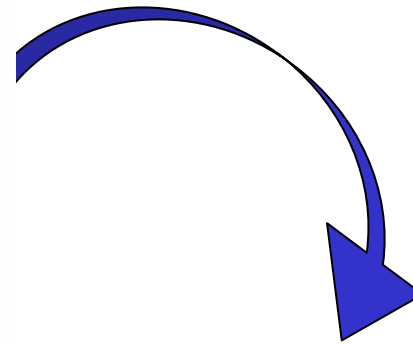
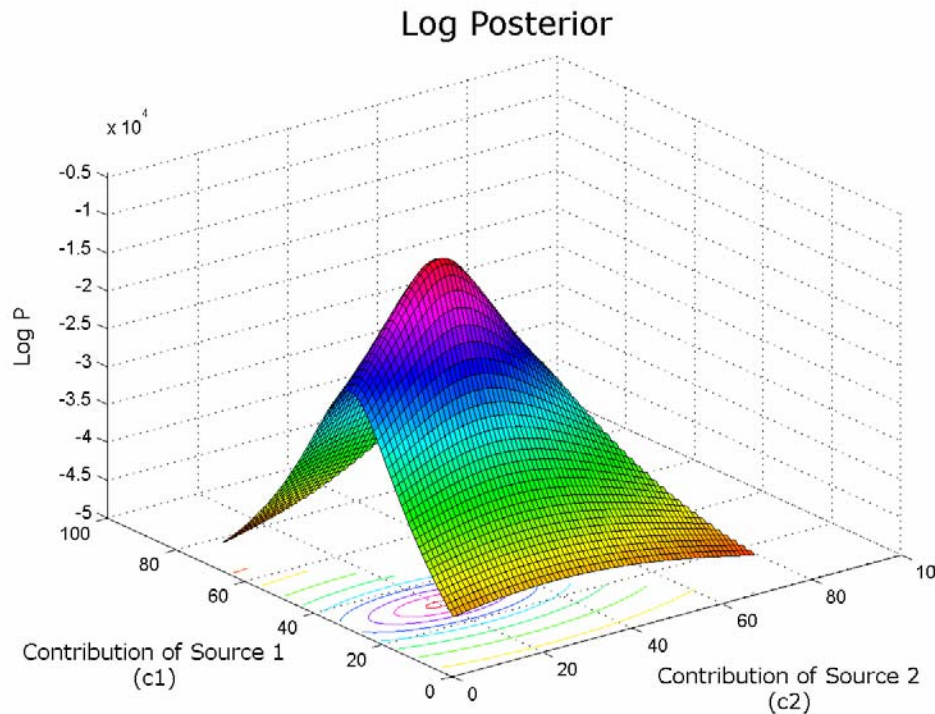
# Slices Through the Space



These are cross-sections of a three-dimensional probability space with  $c_1$ ,  $c_2$ ,  $c_3$  being the three variables.  $c_4$  is constrained by  $c_4 = 1 - (c_1 + c_2 + c_3)$

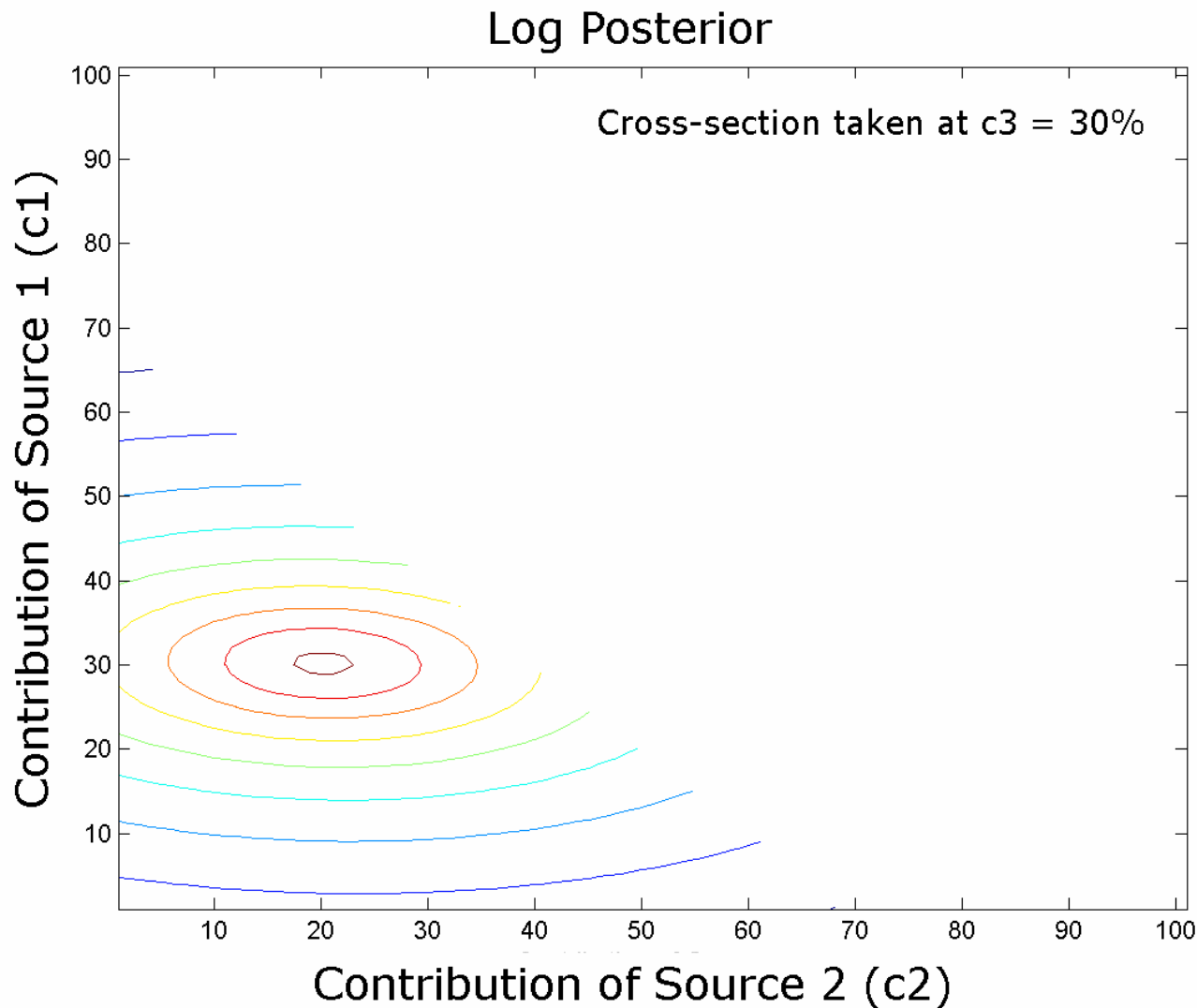
Note the variations in the ellipsoidal contour eccentricities

# Cross-Section for c1 and c2



This cross-section showing the probabilities for c1 and c2 was taken at the correct value for c3 = 0.3

# Why is c1 More Accurate?



The ratio of the semi-minor to semi-major axes is related to the relative accuracy to which we can estimate the contributions.

In this case:

$$w_1/w_2 = 0.4722$$

The best predictor seems to be the inverse of the ratio of the number of lines in the spectrum

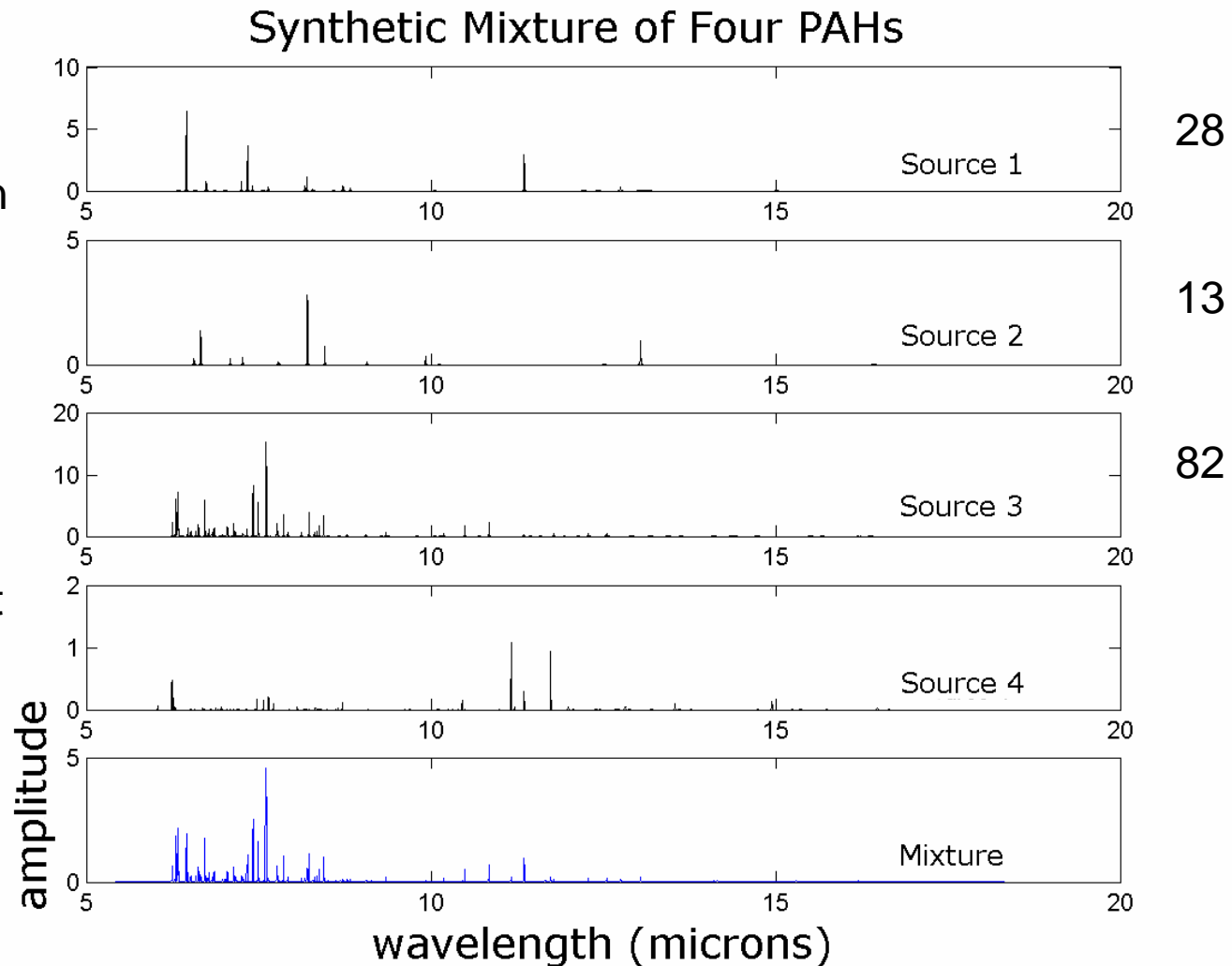
$$\begin{aligned} L_2/L_1 &= 13/28 \\ &= 0.4643 \end{aligned}$$

# Comparing Spectral Lines

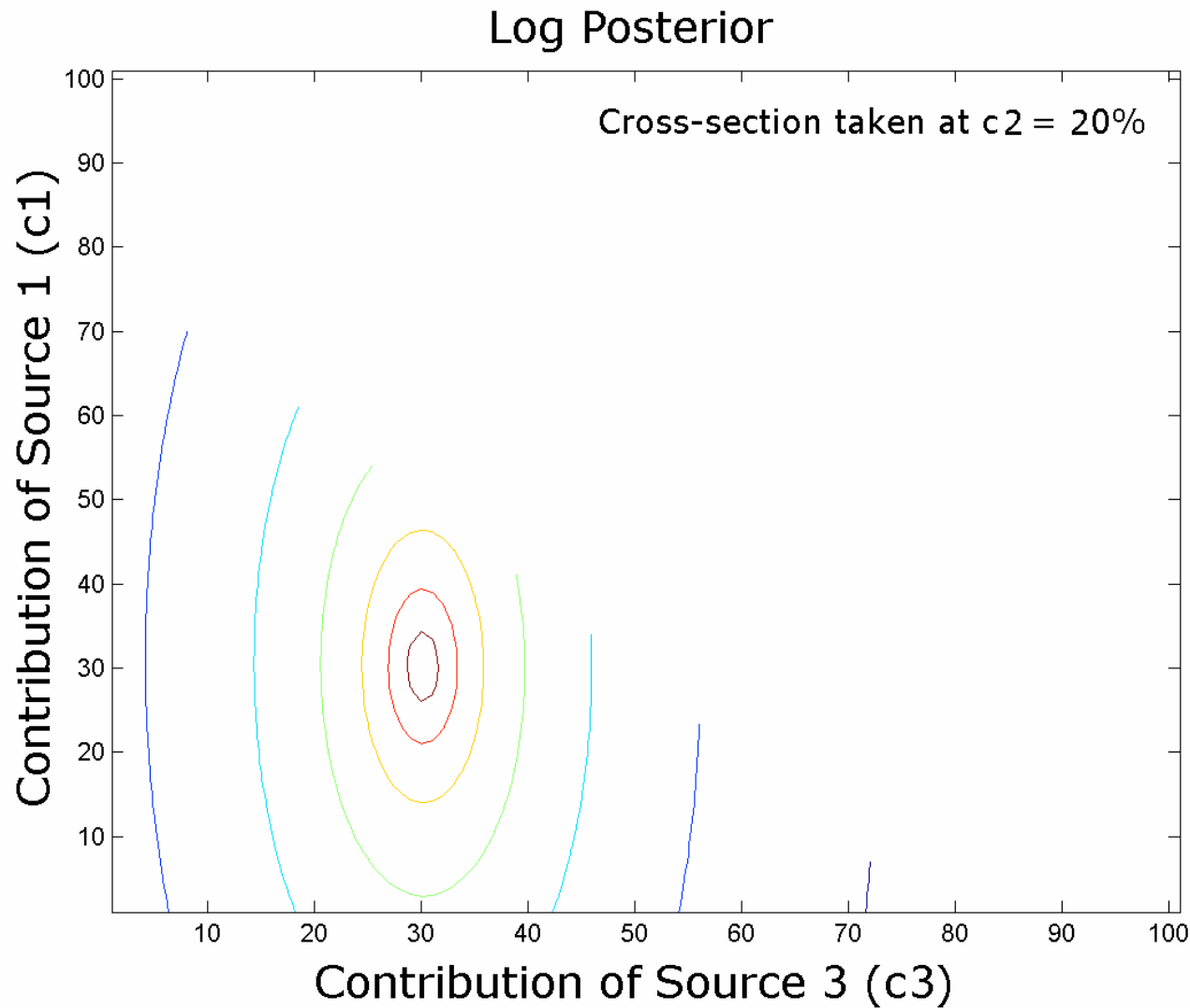
PAH 1 has about twice as many spectral lines than PAH 2.

It is thus two times more quantifiable.

We should expect the PAH 3 estimate of c3 to be very accurate.



# Cross-Section for c1 and c3



Here

$$w3/w1 = 0.3538$$

The best predictor seems to be the inverse of the ratio of the number of lines in the spectrum

$$\begin{aligned} L1/L3 &= 28/82 \\ &= 0.3415 \end{aligned}$$

# Early Findings and Expectations

Non-negative least squares always assigns a positive value for the PAH contribution in even mild noise conditions.

Non-contributing PAHs steal spectral energy from contributing PAHs.

The accuracy to which we are able to detect PAH contributions is roughly related to the number of unique spectral lines.

This is expected to break down as many PAHs superimpose.

# Nested Sampling



# Nested Sampling with ON/OFF

$$F(\lambda) = \sum_{i=1}^N \delta_i c_i s_i(\lambda) + \text{bkgnd}(\lambda) + \phi(\lambda)$$

ON/OFF

contribution

Implementing a Nested Sampling algorithm utilizing ON/OFF switches.

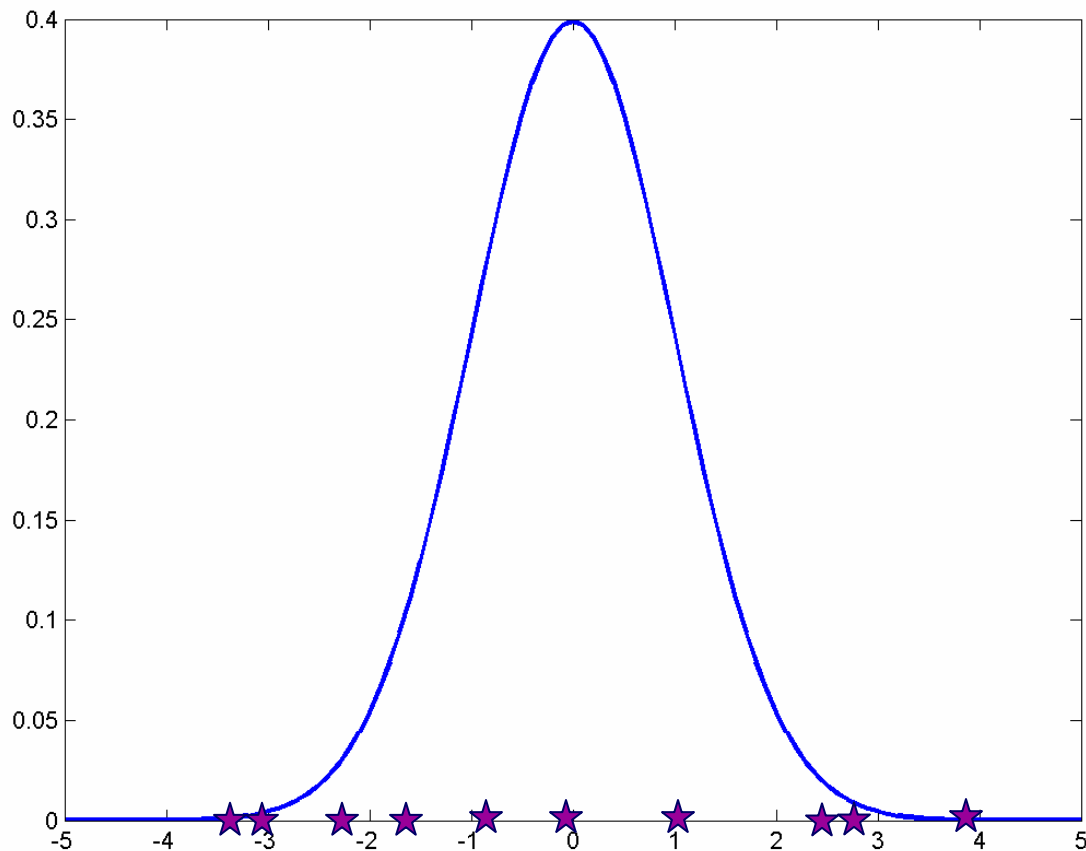
Estimate contribution independently from the probability the PAH is present or not present

Compute the evidence that the data provides about the PAH contributions

At worst we expect to be able to rule out classes of PAHs or identify classes (eg. mass, ionization, etc)

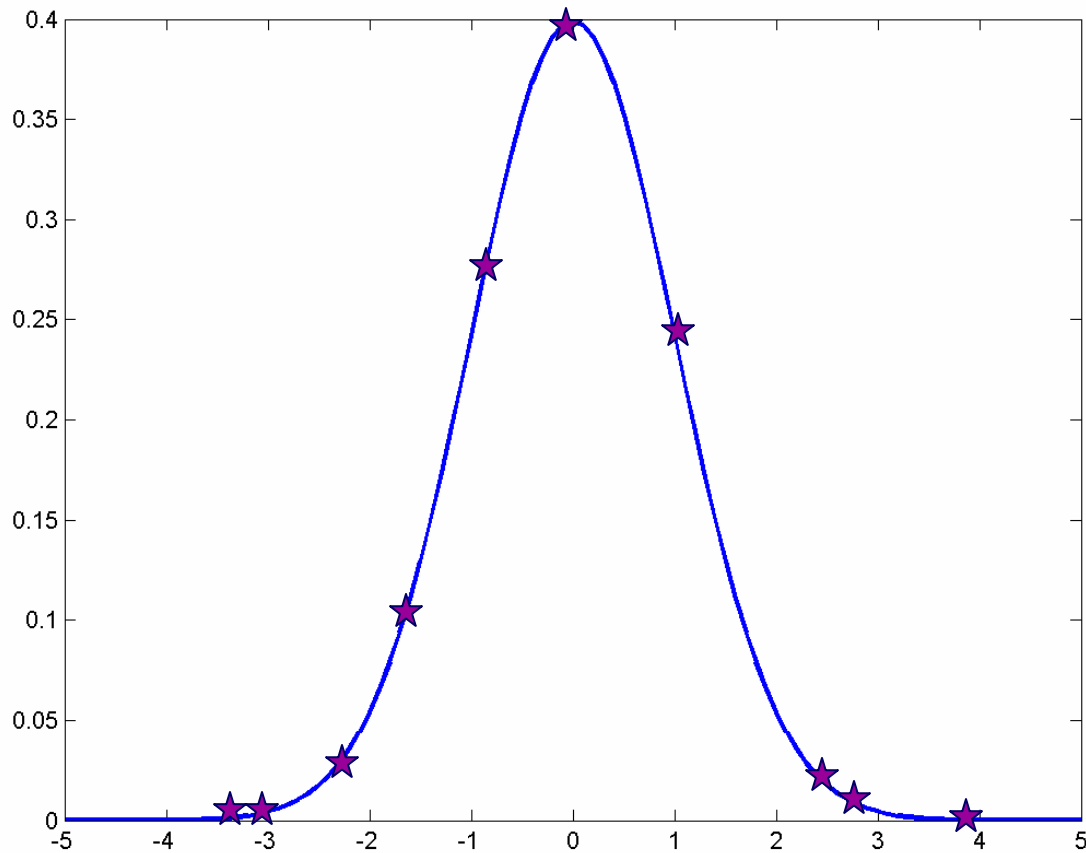
# How Stochastic Integration Works

Uniformly draw samples from the interval



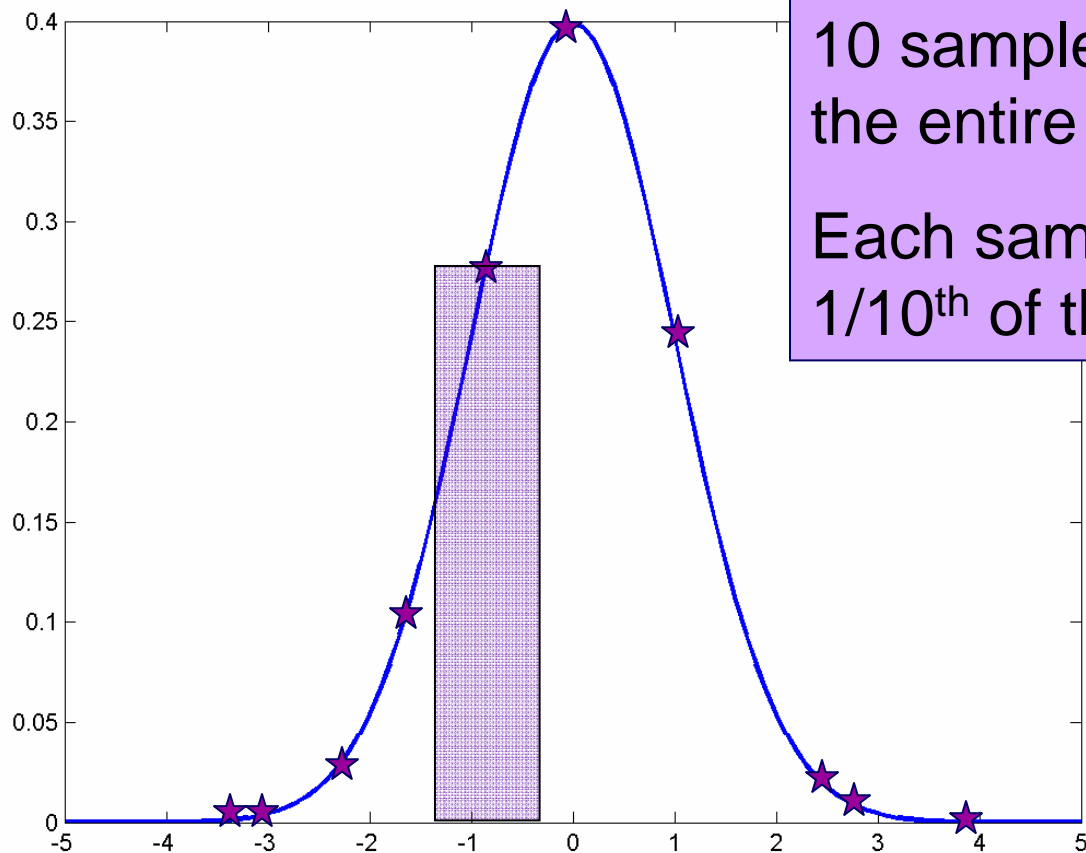
# Stochastic Integration

Uniformly drawn samples are used to approximate an integral



# Stochastic Integration

Each sample represents an area

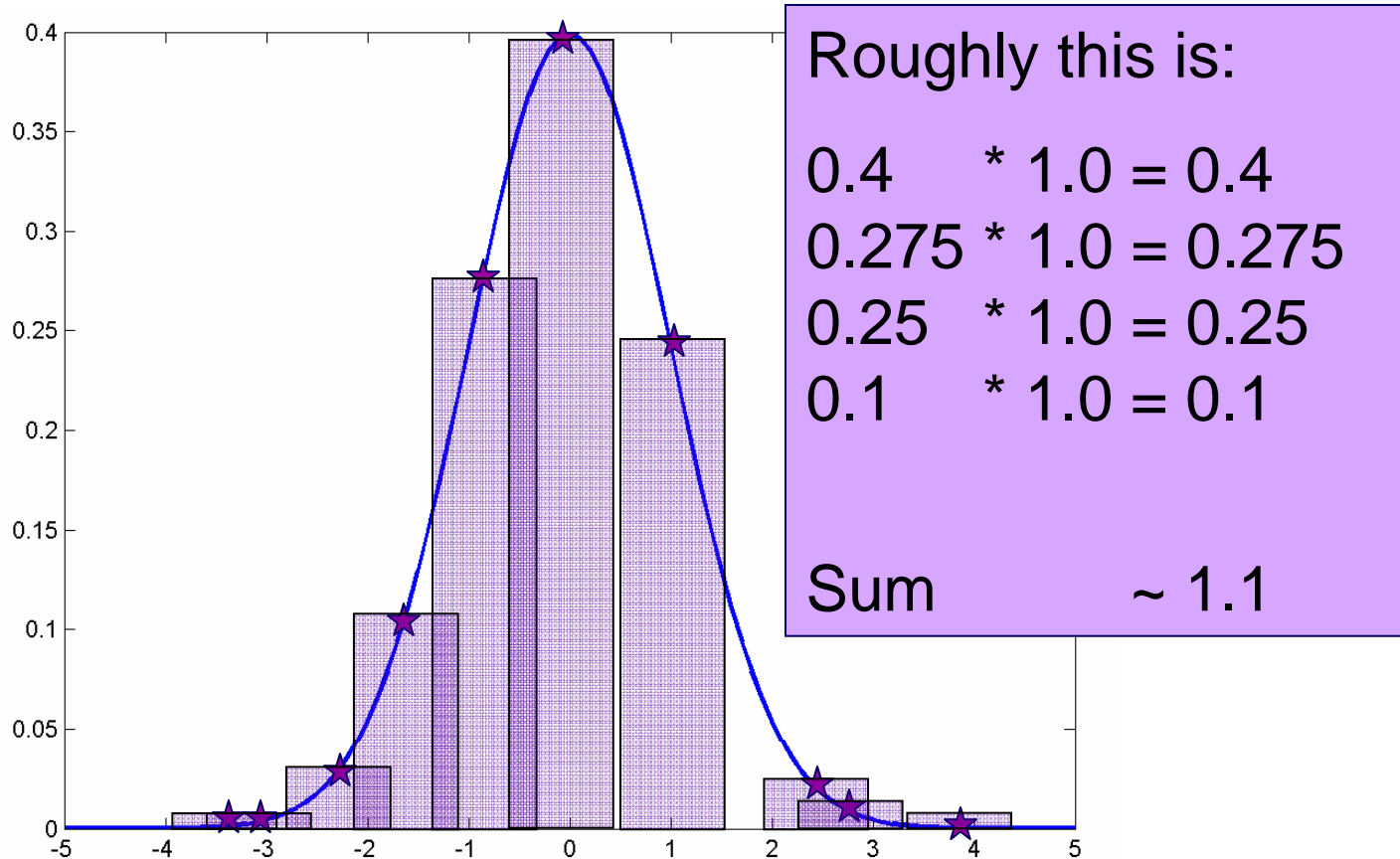


10 samples cover the entire interval

Each sample covers 1/10<sup>th</sup> of the interval

# Stochastic Integration

Add up the areas

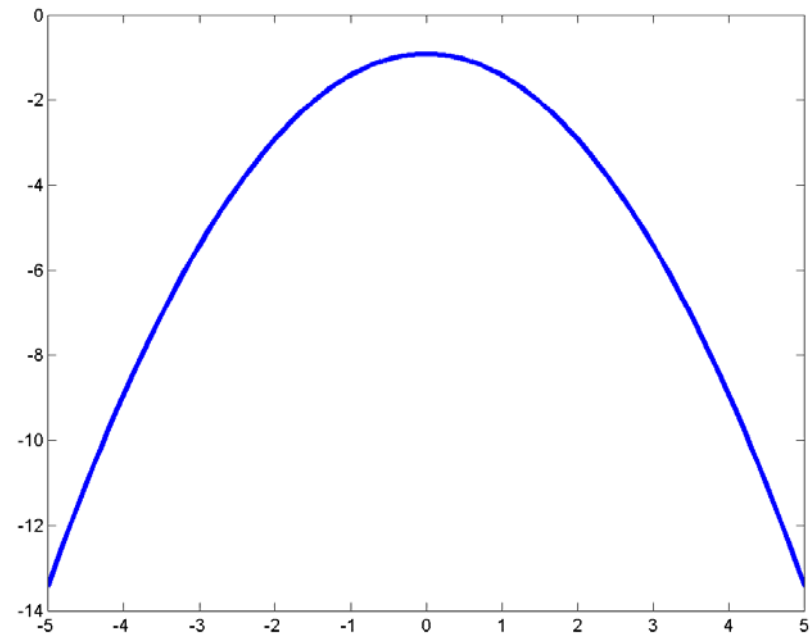


# Skillings Nested Sampling

John Skilling's **Nested Sampling** is a variation on this theme.

The idea is:

0. work with the log posterior
1. start with  $N$  samples
2. find the least probable sample
3. use it to define  $\log P_{\text{star}}$
4. duplicate one other sample
5. constrained exploration
6.  $N$  uniform samples over smaller interval
7. goto 2

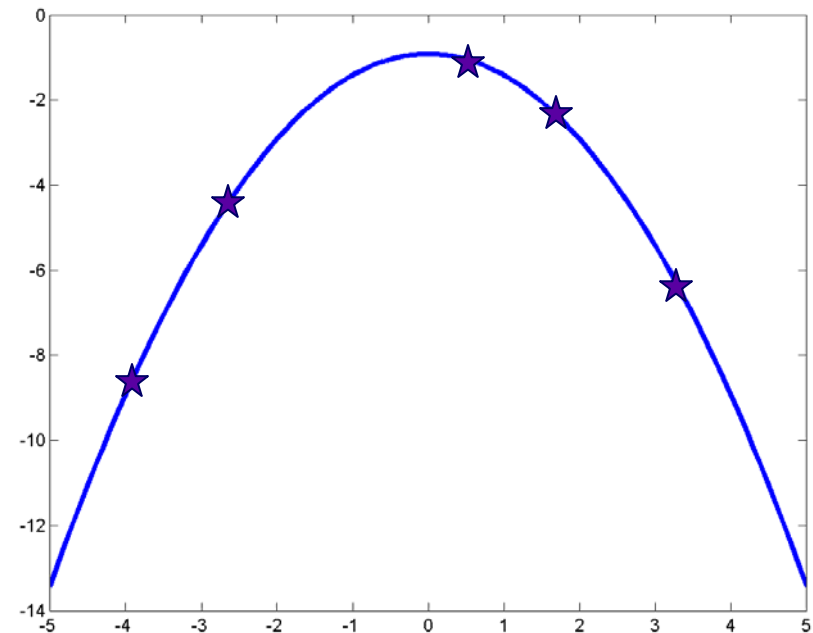


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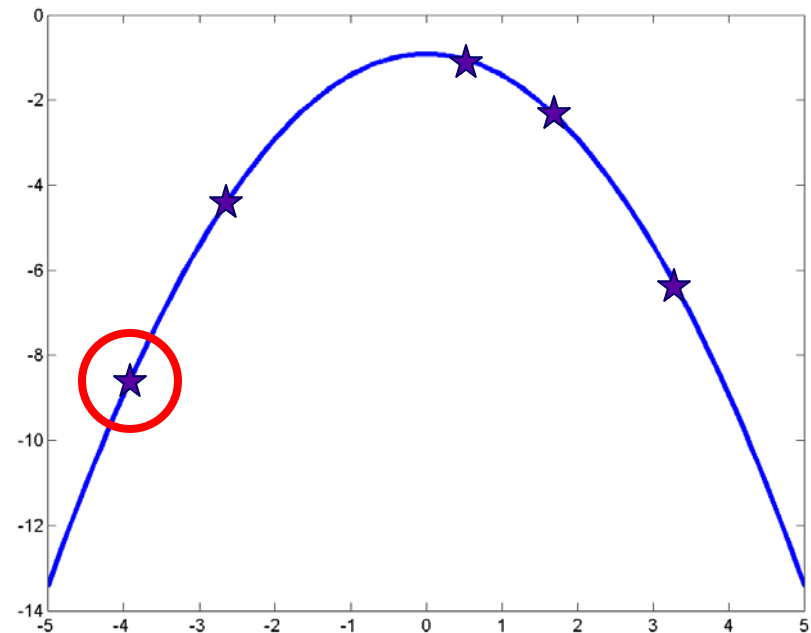


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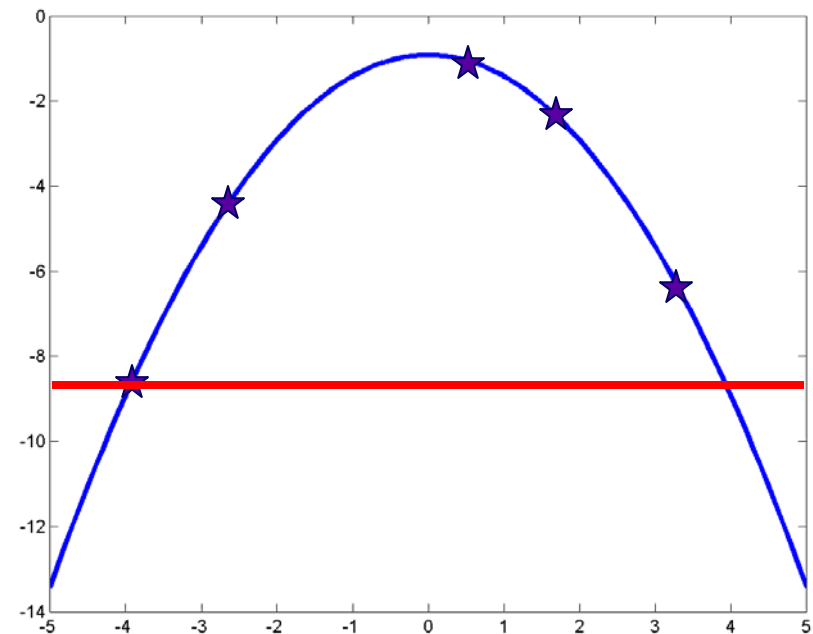


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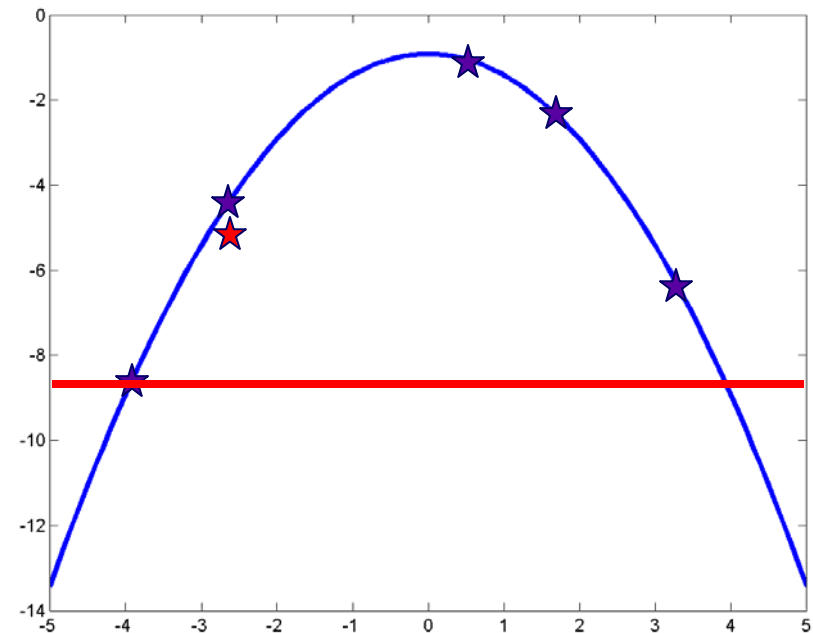


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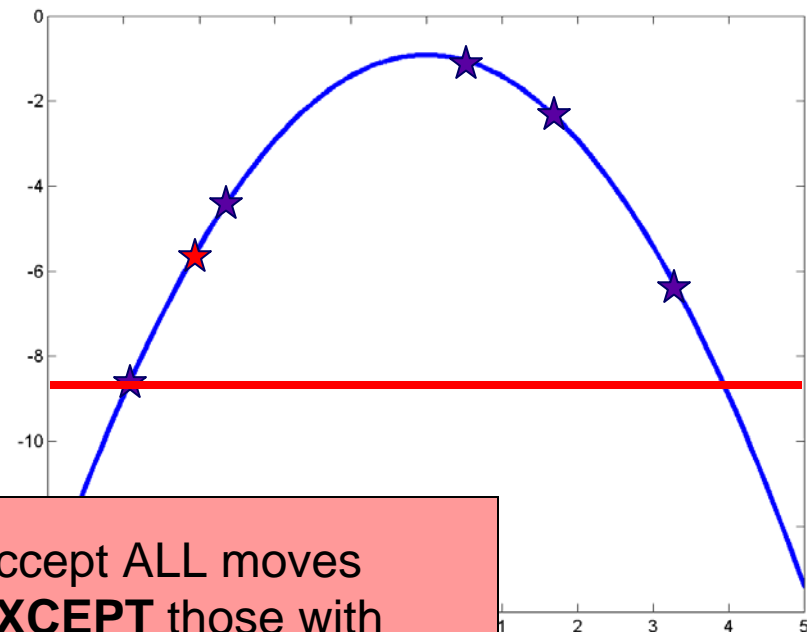


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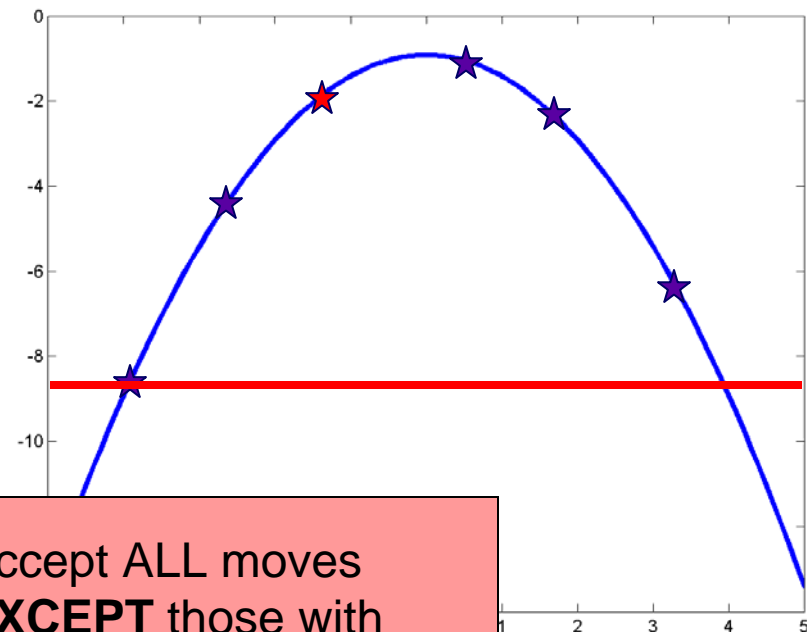
Accept ALL moves  
**EXCEPT** those with  
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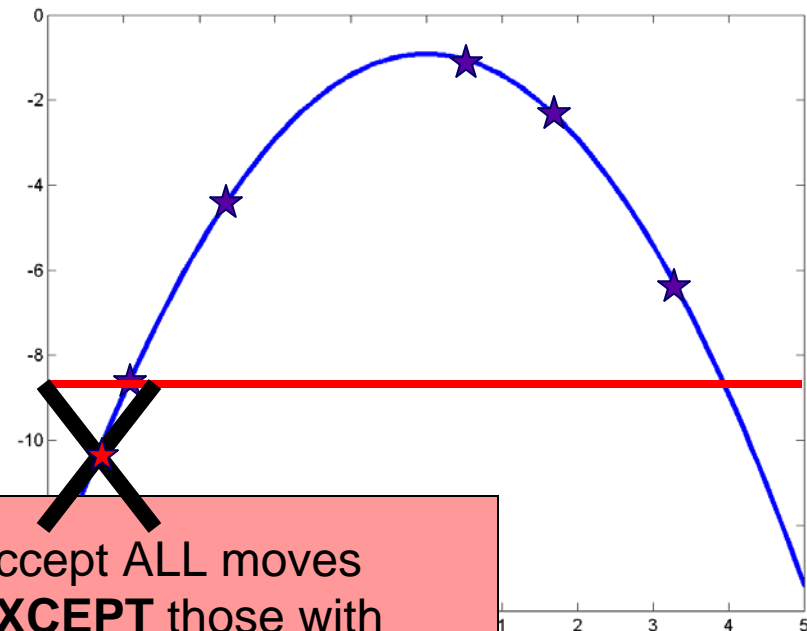
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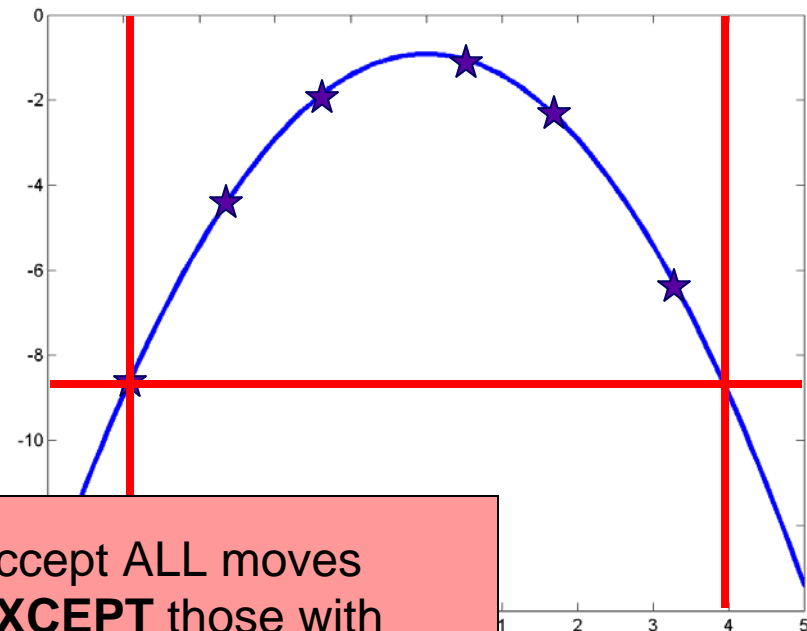
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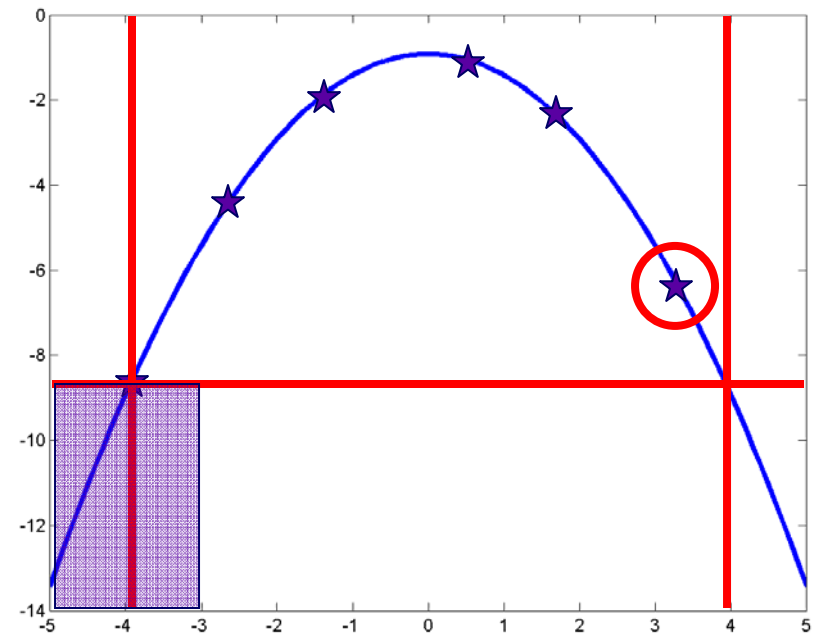
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The idea is:

0. work with the log posterior
1. start with  $N$  samples
2. find the least probable sample
3. use it to define  $\log P_{\text{star}}$
4. duplicate one other sample
5. constrained exploration
6.  $N$  uniform samples over smaller interval
7. goto 2

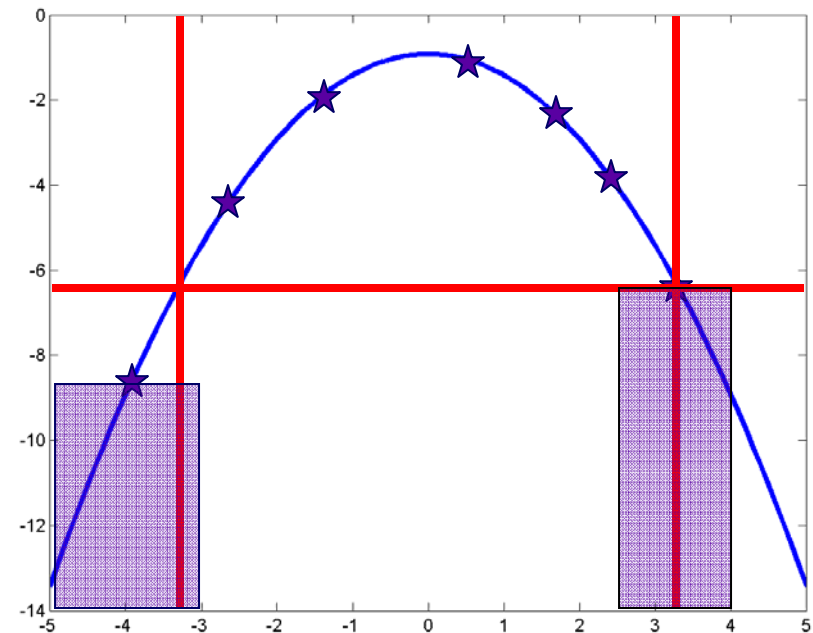


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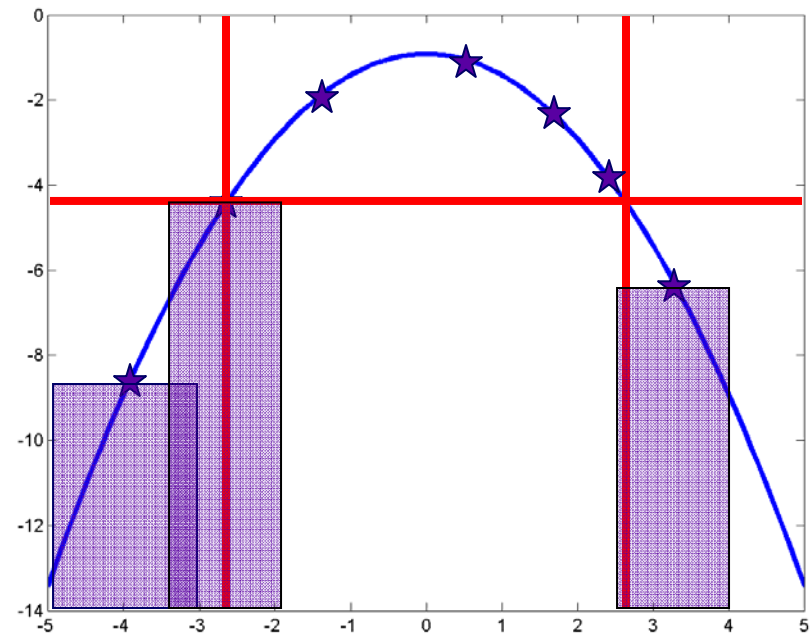




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Notice that the interval shrinks as we iterate and contracts to high probability regions.

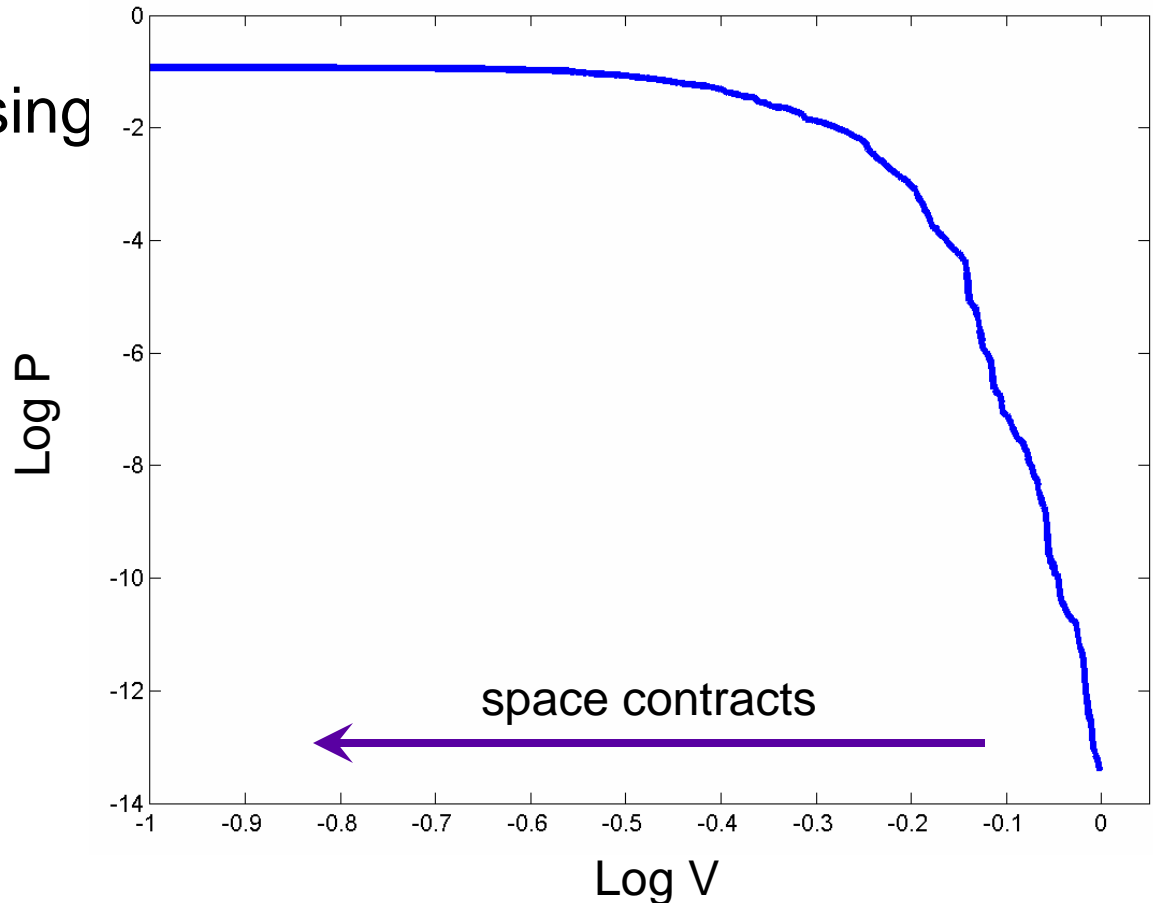
Also, the area associated with each sample decreases as we refine our integral in regions that matter.



# Typical Behavior

In a well-behaved problem the log probability increases monotonically with a monotonically decreasing rate.

Since we are ordering according to the probability, this turns all problems into ONE-DIMENSIONAL problems!!!



# Movie of Acoustic Source Separation



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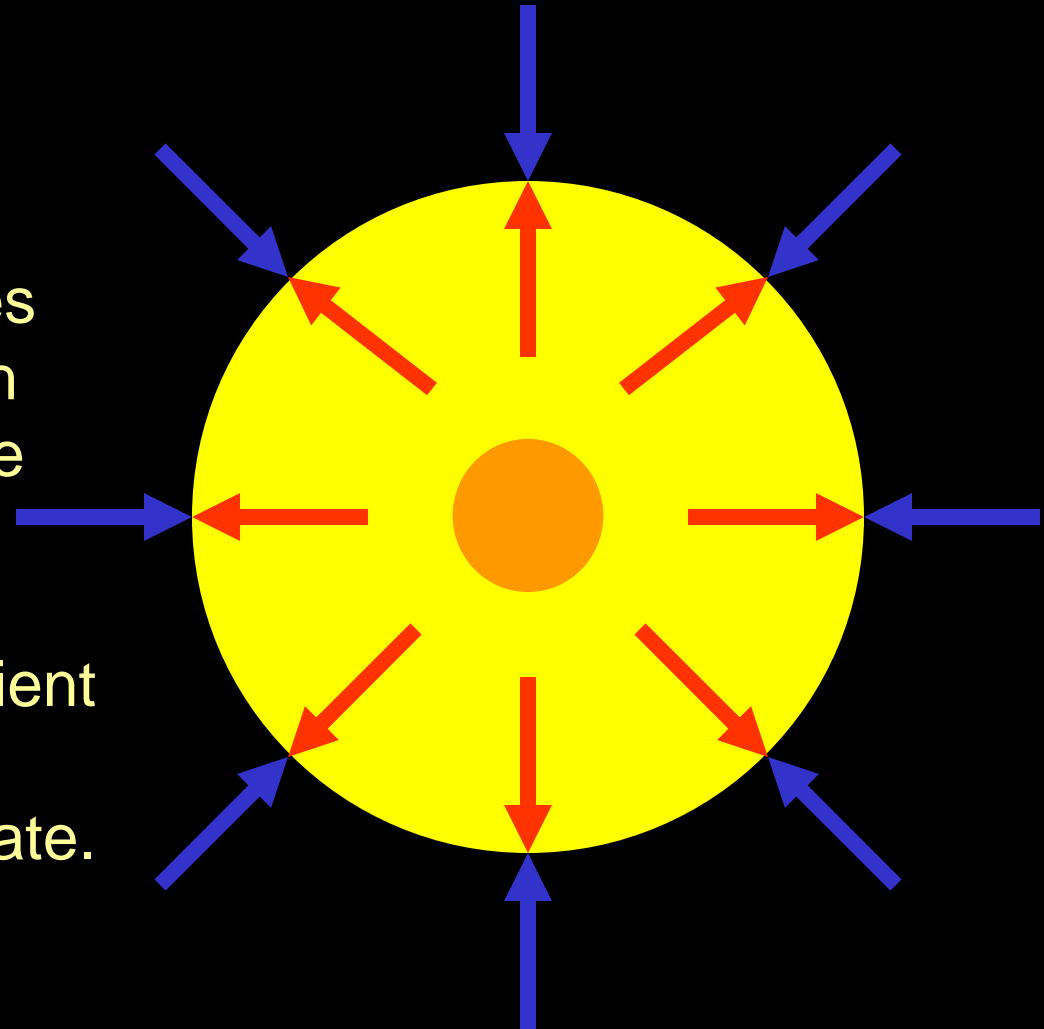
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If So, How Did PAHs Get There?

# Forces Governing Stellar Structure

Nuclear fusion occurs in the high temperature and density present in the **core** and generates **thermal pressure**, which acts against the attractive **gravitational forces**.

As long as there is sufficient fuel in the core, the star remains in this steady-state.



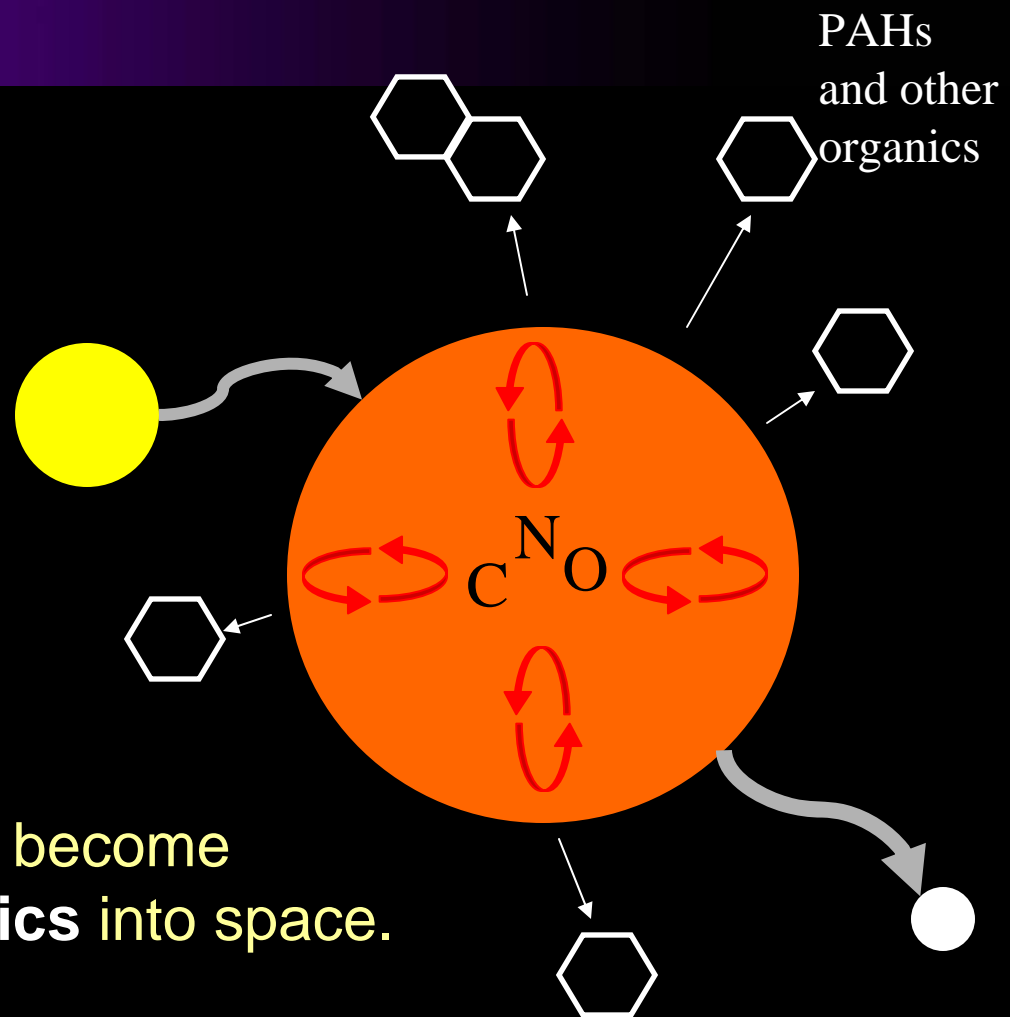
# Stellar Evolution

Stars eventually run out of Hydrogen to fuse, and begin to collapse cramming more matter into the core.

The greater densities and pressures allow creation of C N and O.

The star swells and cools to become a **Red Giant** spewing **organics** into space.

When fuel finally runs out, the star collapses into a **hot White Dwarf**



# Why are PAHs so Interesting?

10-20% of all carbon atoms in the Interstellar Medium (ISM) are in PAH molecules

For this reason, PAH emissions are found in almost every cosmic environment in which there are concentrations of dust illuminated by ultraviolet radiation

They could be used to characterize the conditions of the ISM, and could be used as a tracer of star formation in the Milky Way

PAHs now appear to be important molecules on the pathway to life