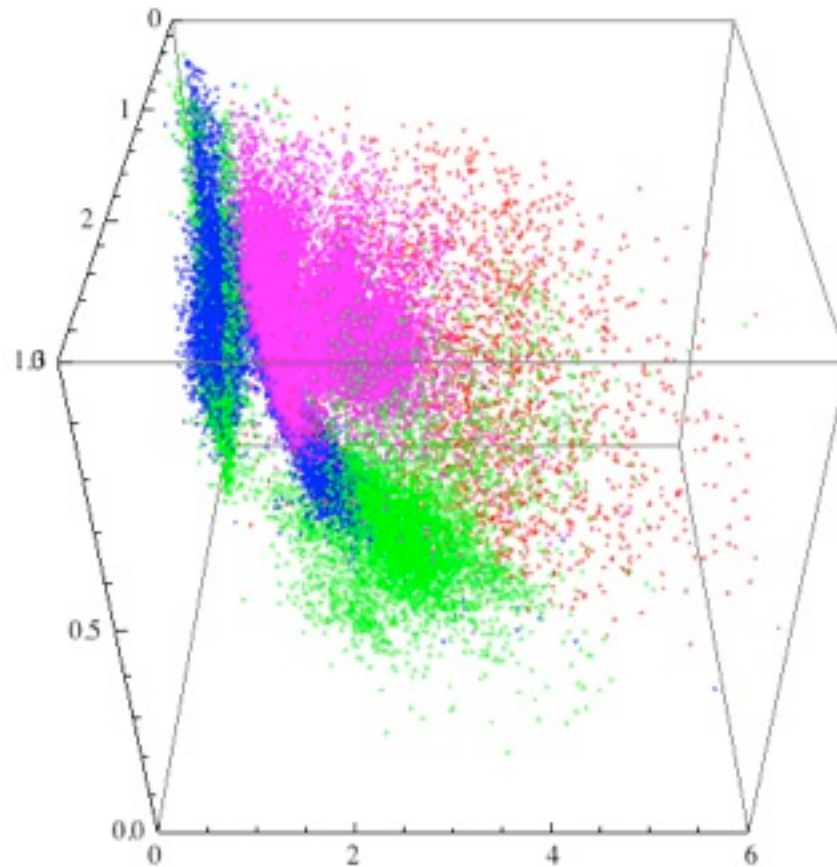


Adding a new dimension: multivariate studies of X-ray Binaries

Saku Vrtilek (CfA), Luke Bornn (Harvard),
Bram Boroson (CSU), Joey Richards (LLNL)



Putting X-ray binaries in their proper place.

Introduction:

X-ray binaries

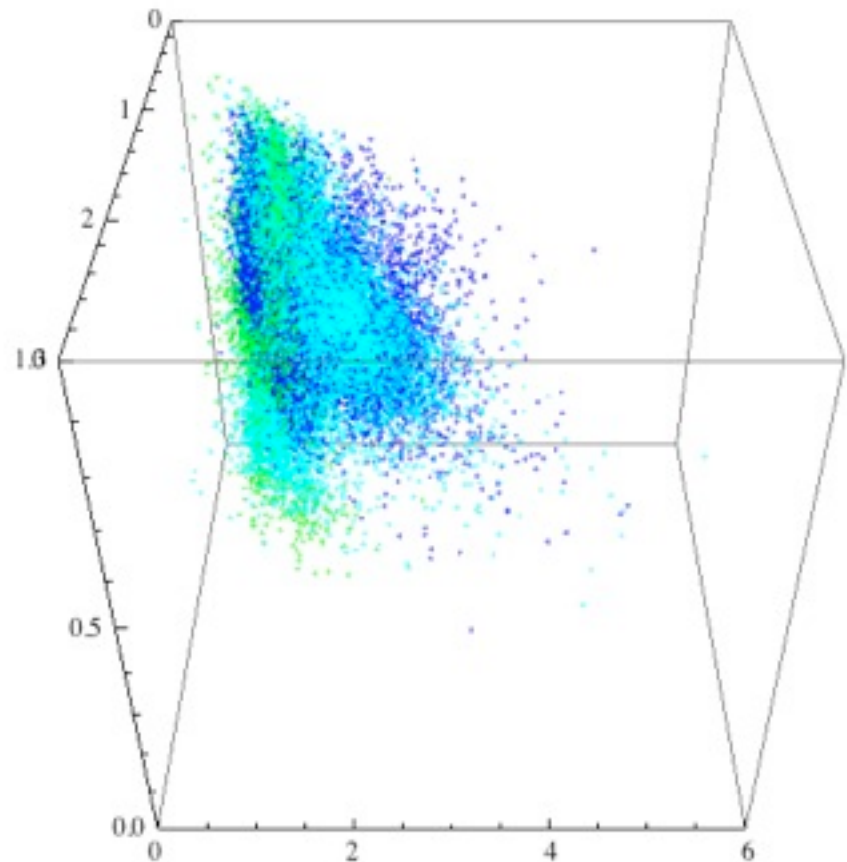
Data set

CCI description

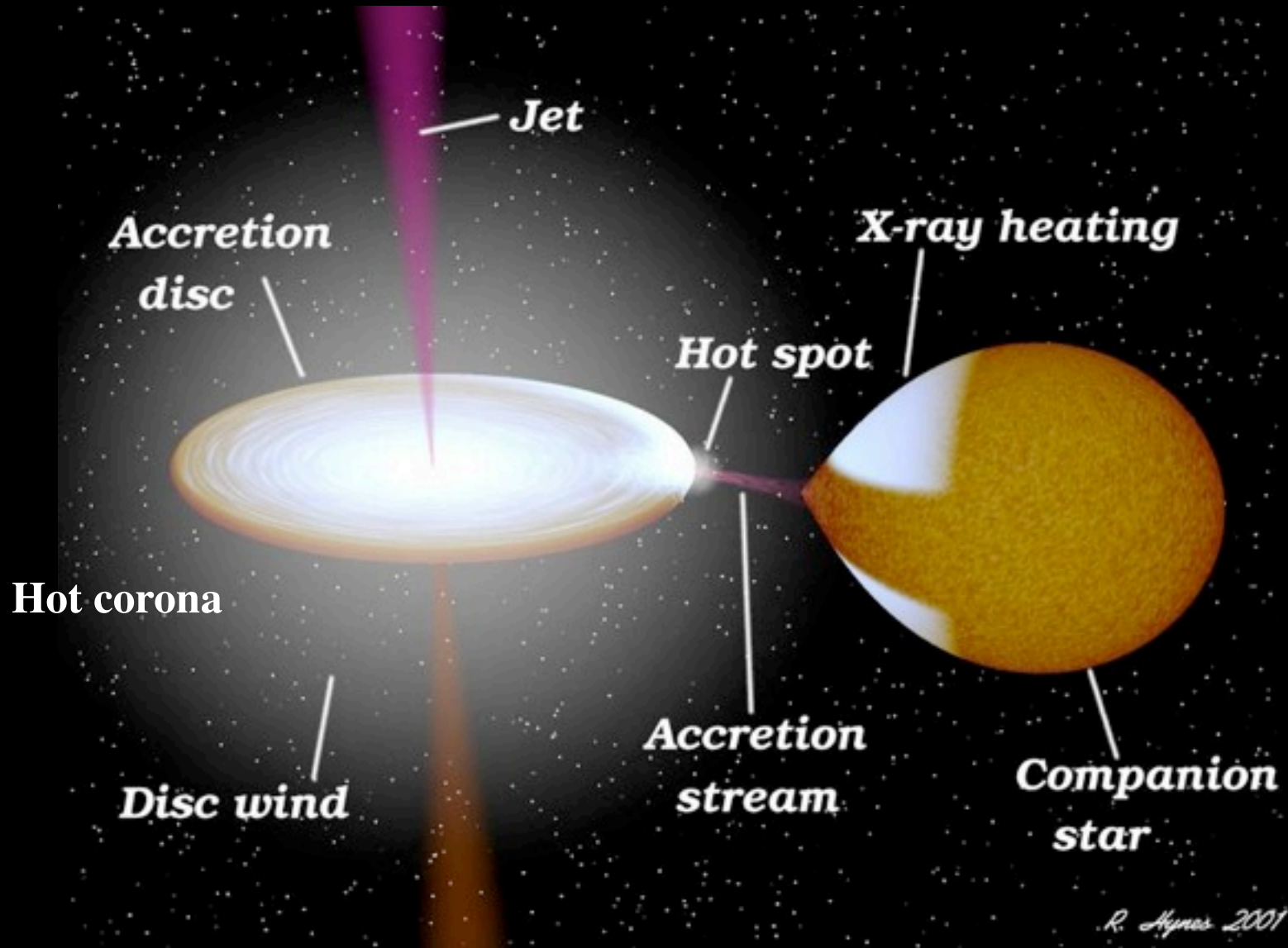
Physical interpretations

Statistical solutions (Luke)

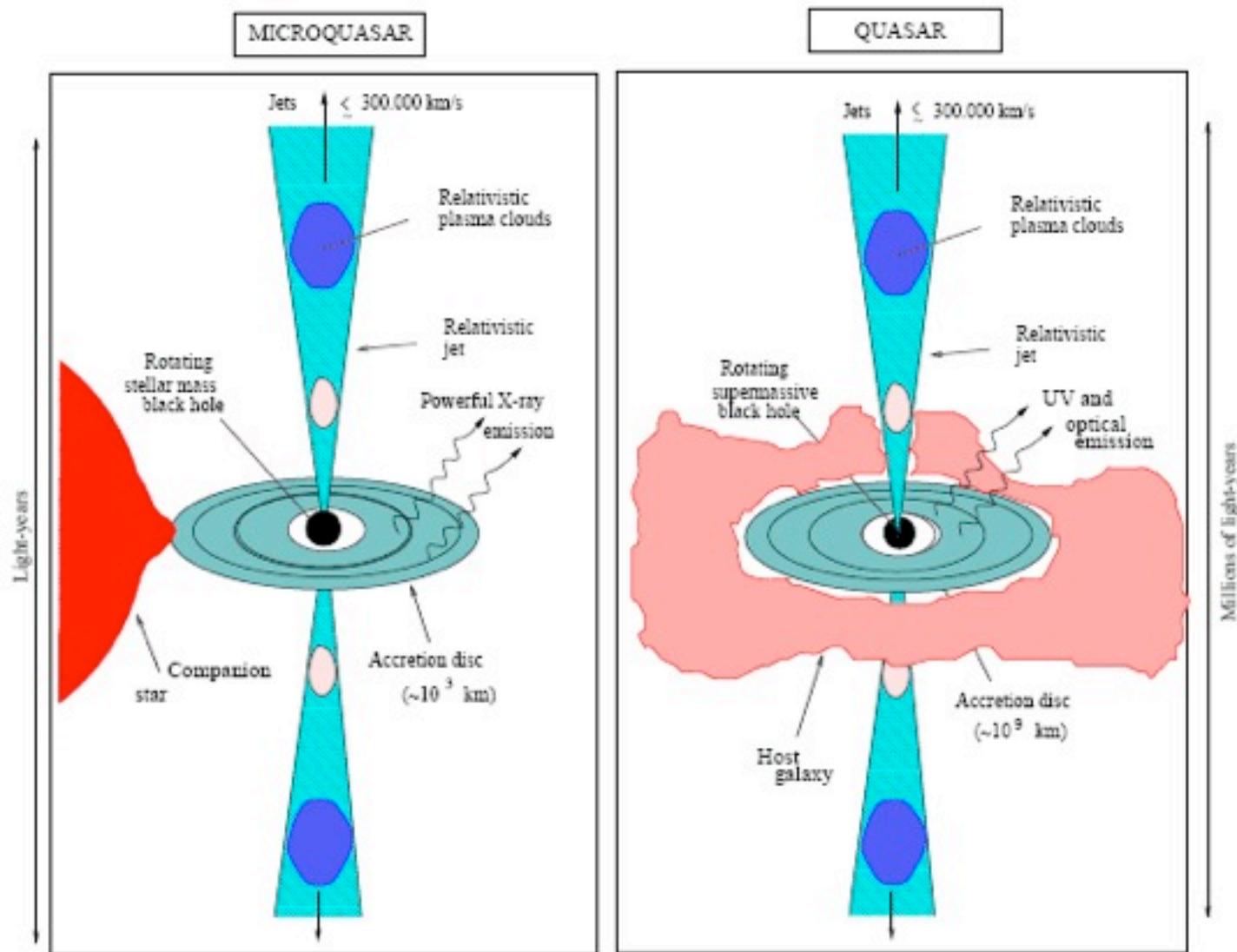
Future work



What are X-ray binaries?

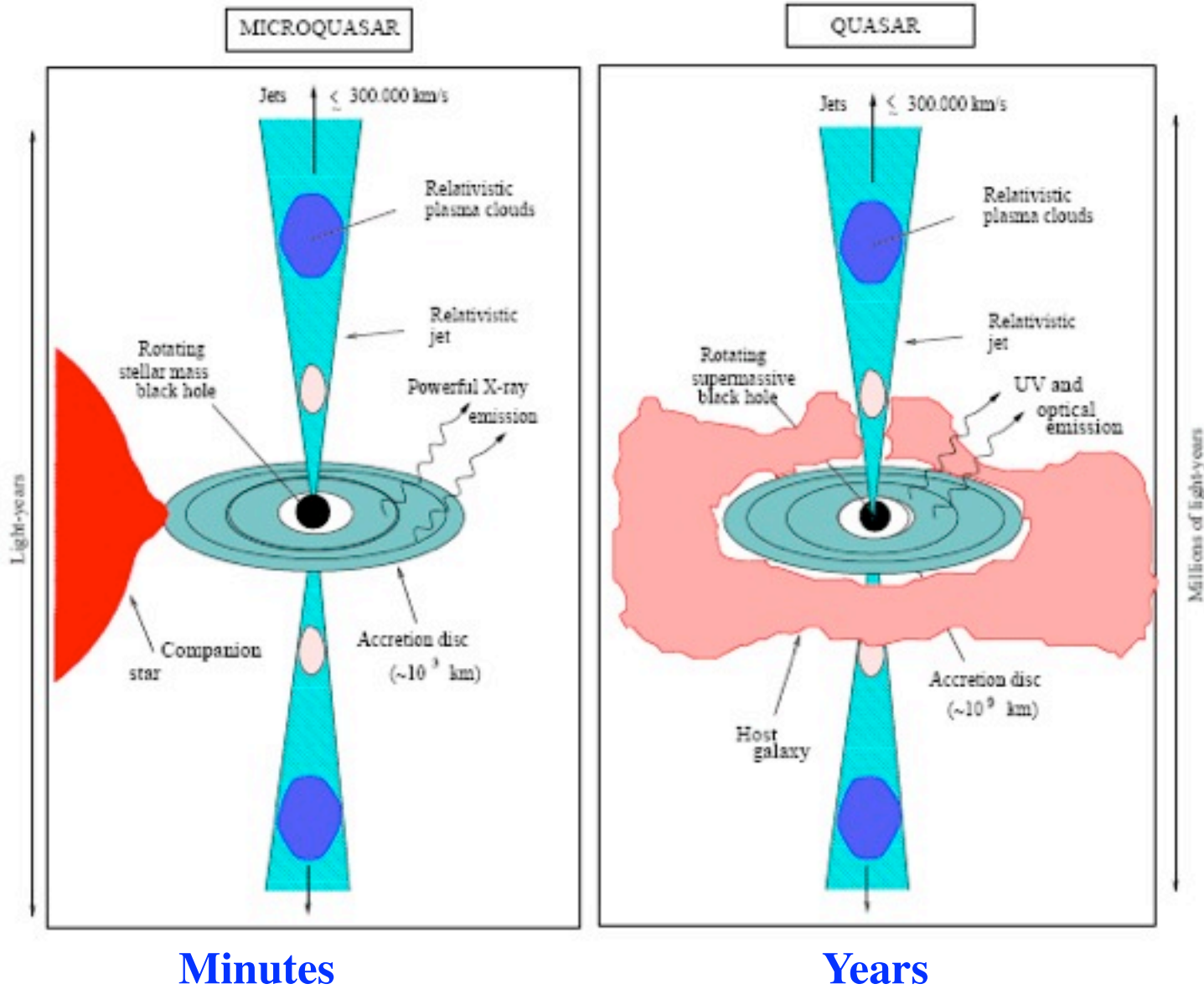


Quasars and microquasars show direct correlation between kinetic power and γ -ray luminosity over 10 orders of magnitude! **Nemmen et al. 2012**



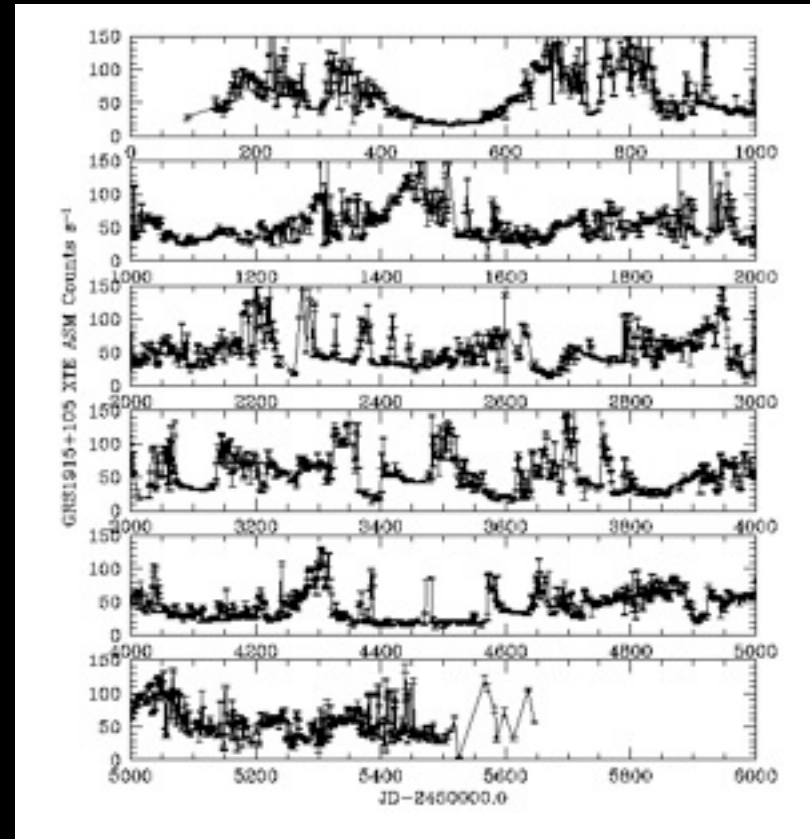
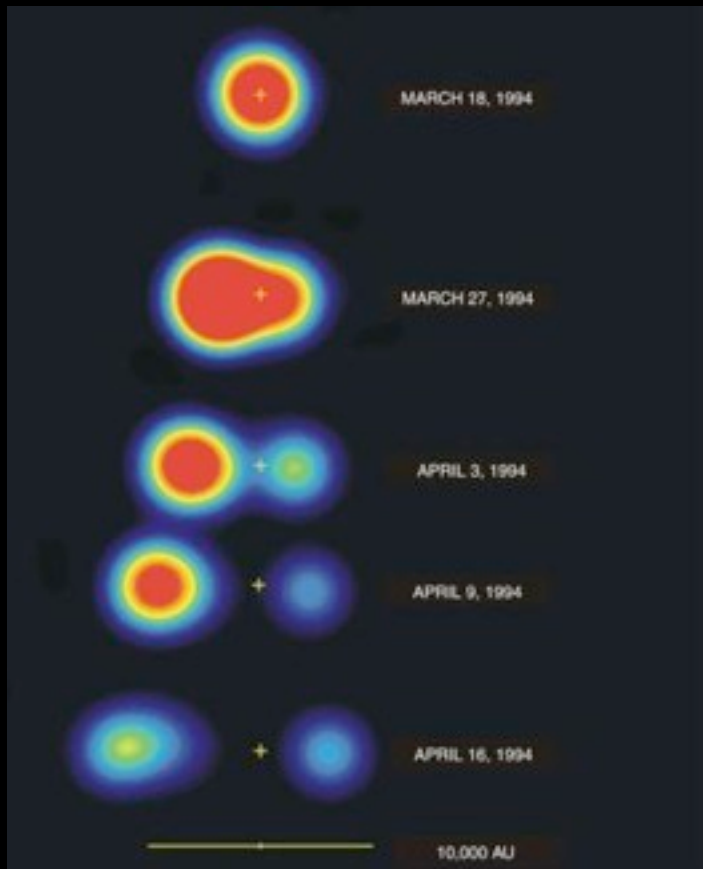
<http://hera.ph1.uni-koeln.de/~heintzma>

$$\tau \approx R_s/c \sim M$$



Mirabel et al 1994

Nature front page

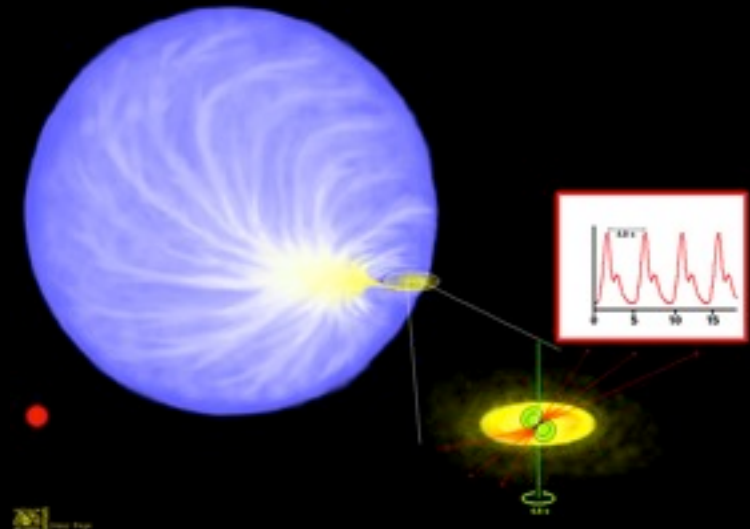
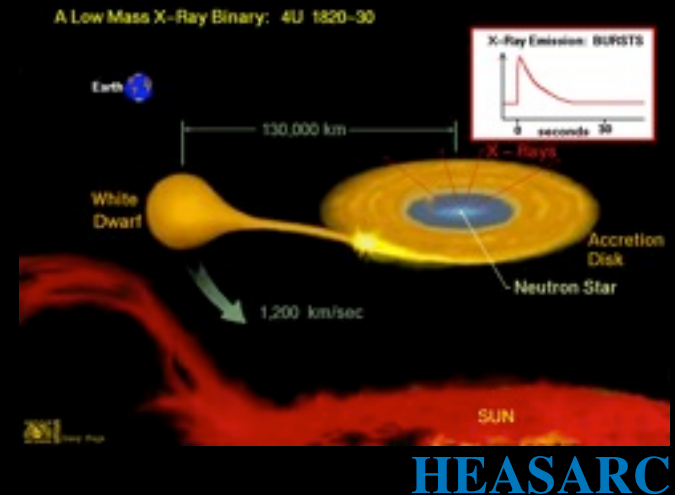


GRS1915+105:

First XRB system observed to show prominent relativistic jets

Why Study X-ray Binaries?

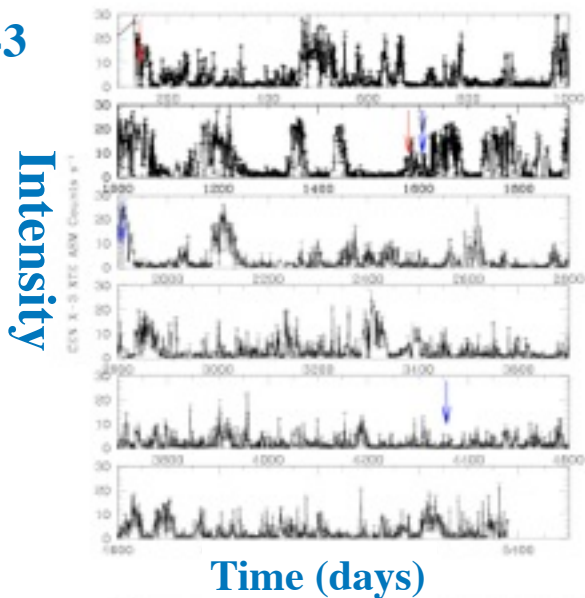
- Efficient matter to energy converters
- Study matter at extreme conditions
- Contain endpoints of stellar evolution
- Most nearby, easily studied example of accretion processes and disk/jet interaction



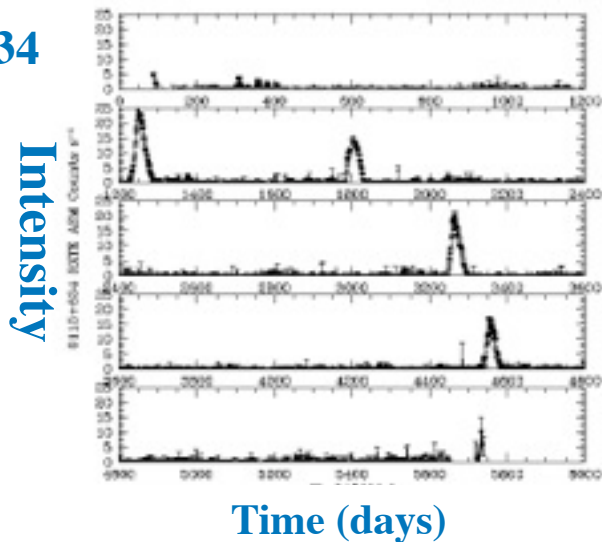
RXTE/ASM: 15 year light curves

Neutron star systems

Cen X-3

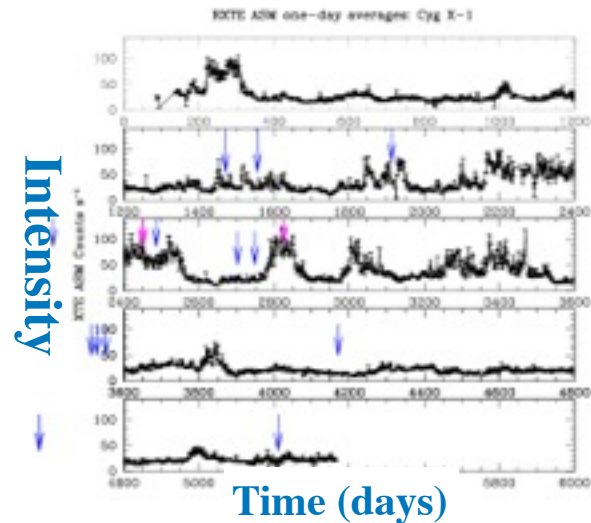


0115+634

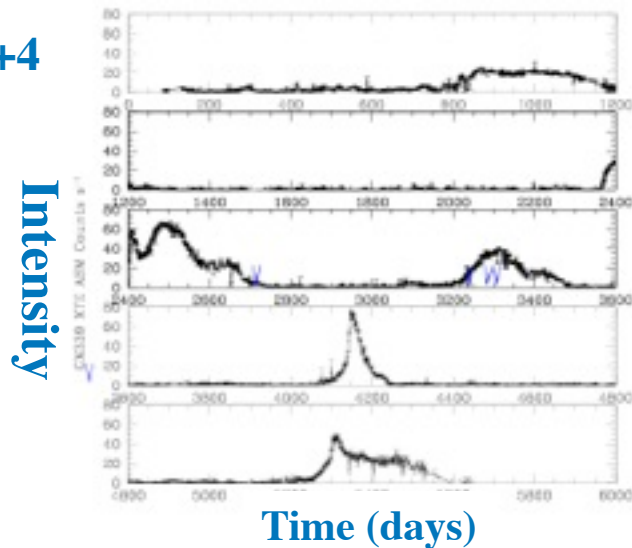


Black hole systems

Cyg X-1

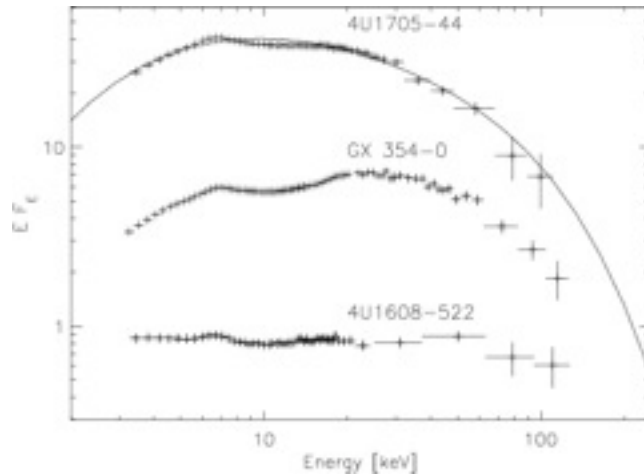


GX339+4

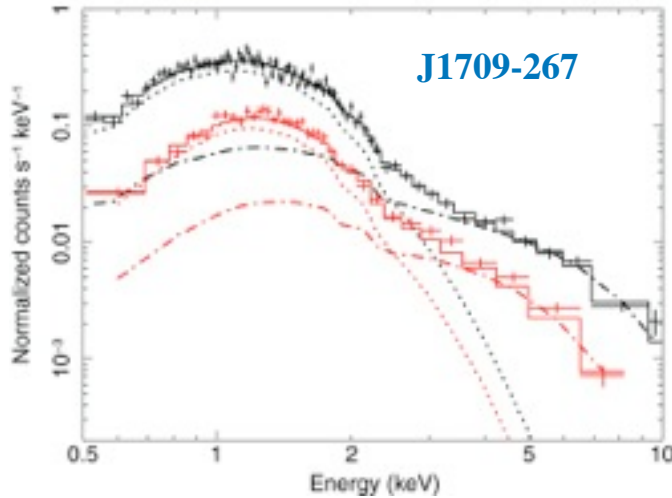


Spectra of X-ray binaries

Neutron star systems

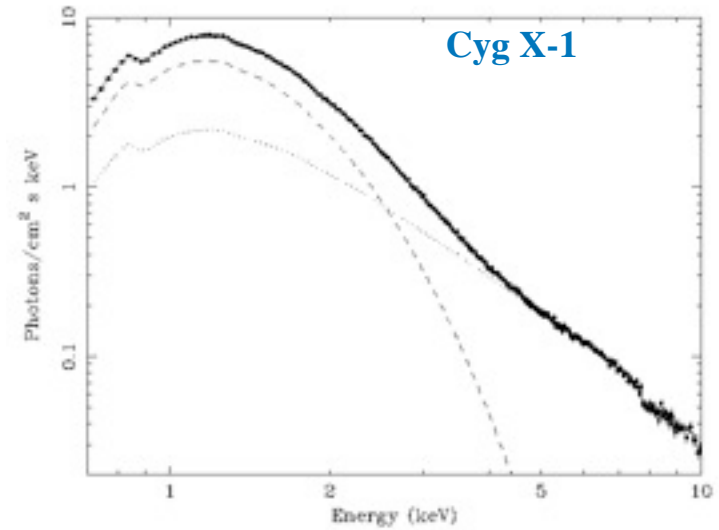


Deufel, Dullemond & Spruit 2001

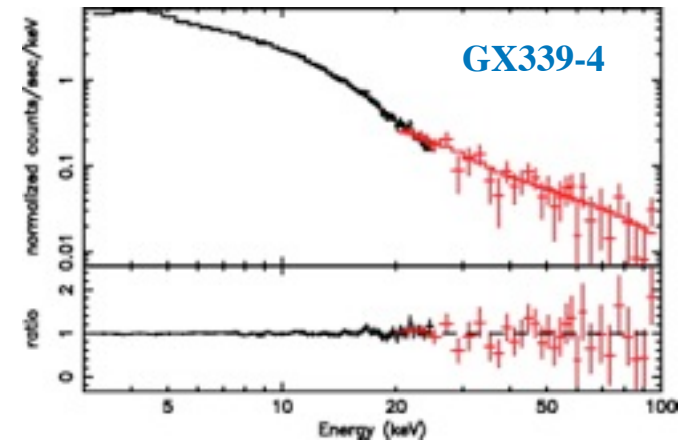


Dejenaar, Wijnands, & Miller 2013

Black hole systems

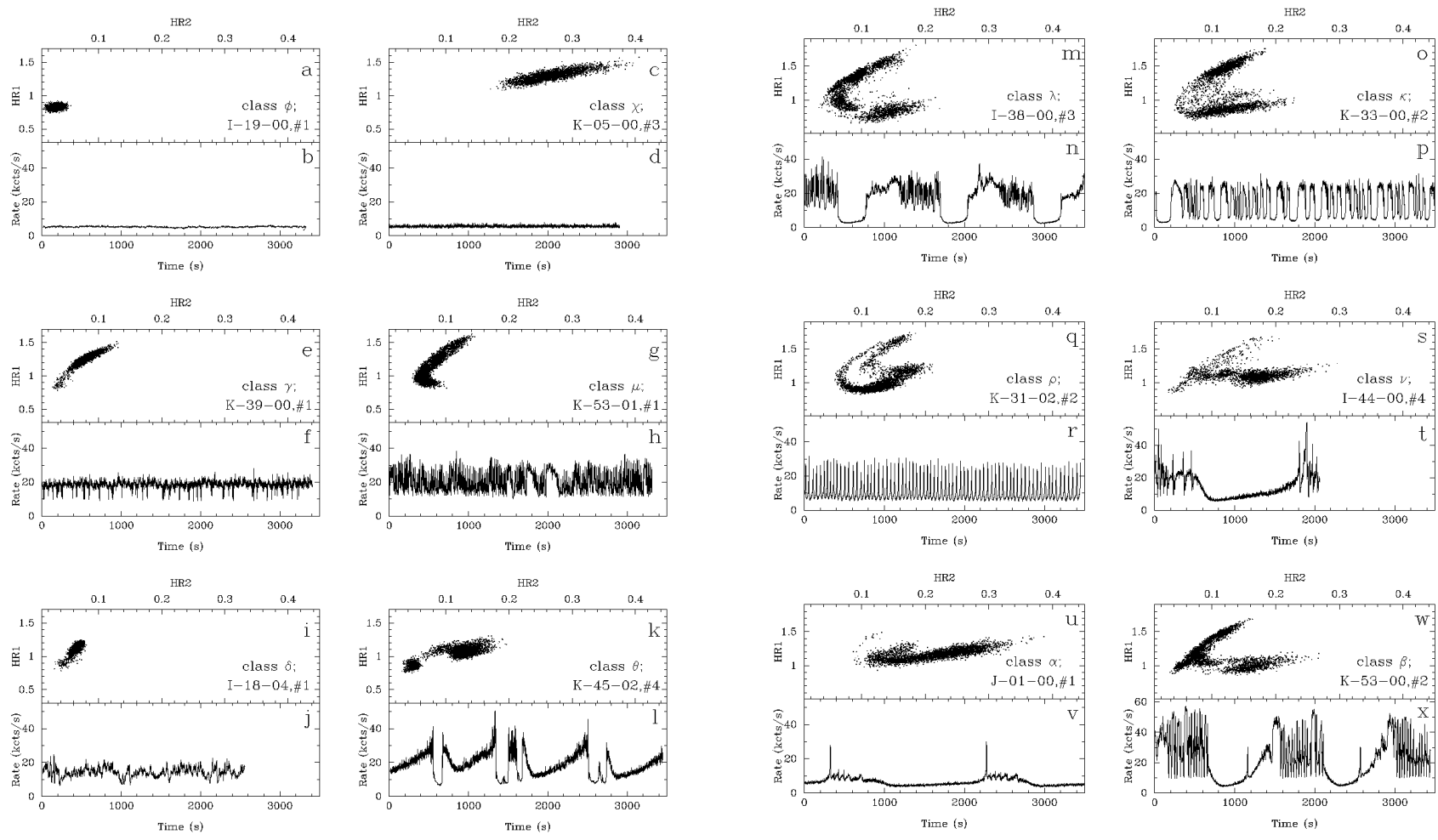


Dotani et al 1997



Miller, Homan, & Miniutti 2006

RXTE PCA lightcurves and color-color diagrams of GRS1915+105



1s bins; 1 hour intervals; $HR1 = (5-13\text{keV})/(2-5\text{keV})$; $HR2 = (13-60\text{keV})/(2-5\text{keV})$

Belloni et al 2000¹⁰

Putting X-ray binaries in their proper place.

Introduction:

X-ray binaries

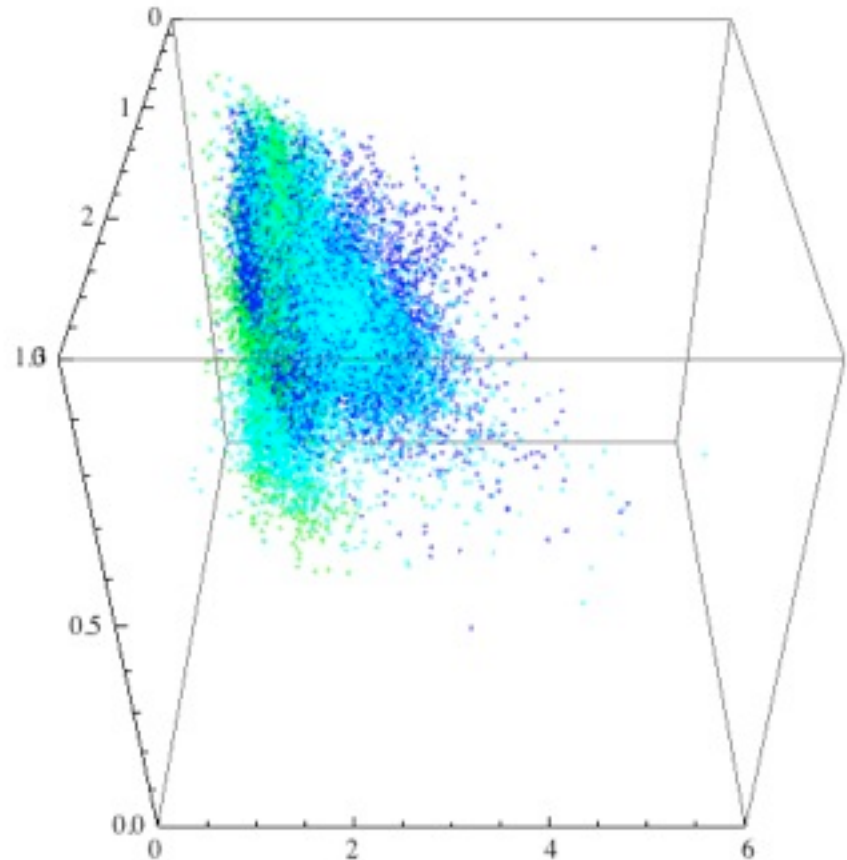
→ Data set

CCI description

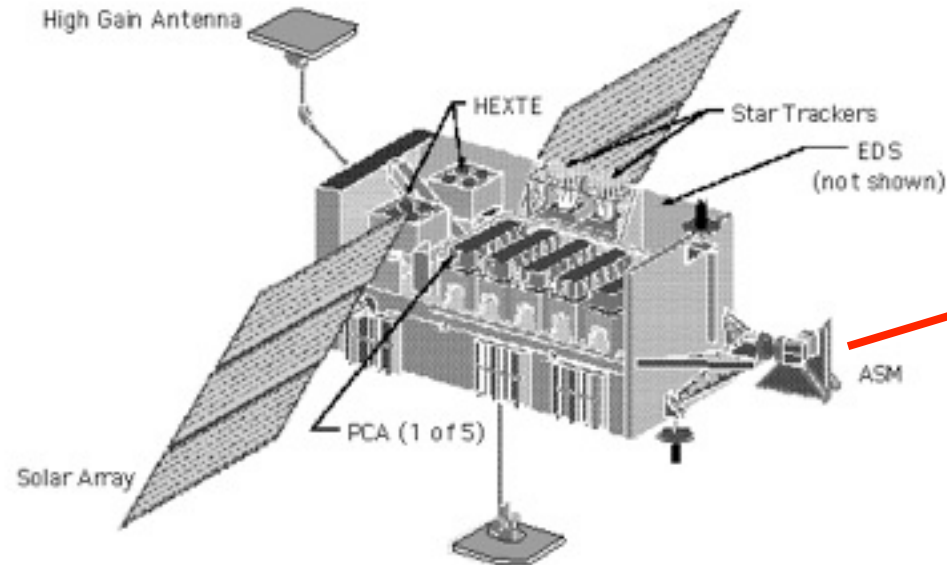
Physical interpretations

Statistical solutions (Luke)

Future work



XTE Spacecraft



Levine et al 1996



RXTE ASM

3 scanning shadow cameras each with a collecting area of 30 cm²

Covers 80% of sky every 90 minutes

Sensitivity: 30 mCrab

3 energy bands covering 1.3-12 keV

Over 15 years of data available on about 500 sources.

CCI Diagrams

Soft **C**olor HR1 = (3-5keV)/(1.3-3keV)

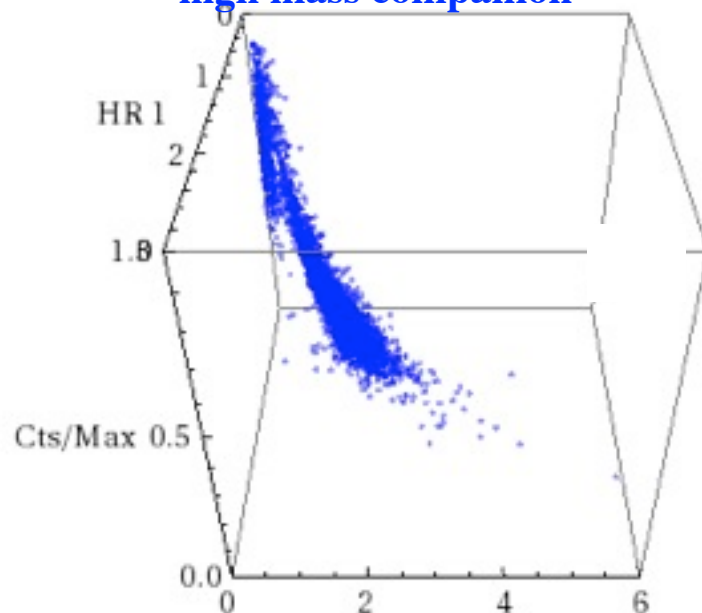
Hard **C**olor HR2 = (5-12keV)/(1.3-3keV)

Intensity = 1.3-12keV counts

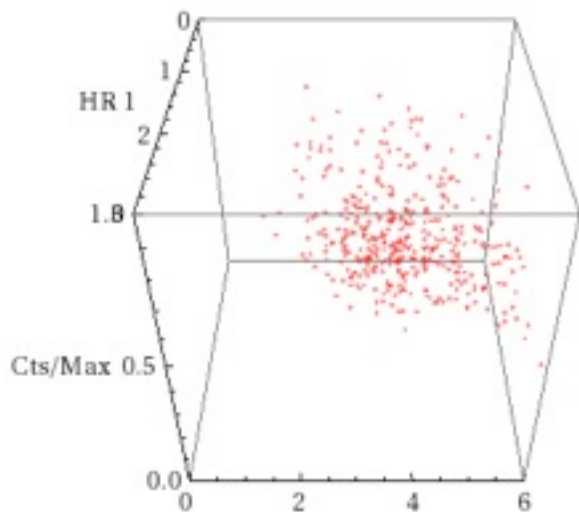
(scaled from 0-1)

RXTE/ASM data: One day averages over 13 y

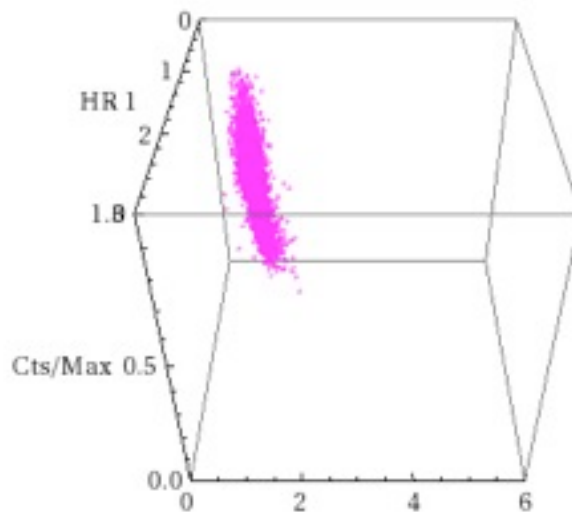
Cyg X-1; black hole;
high mass companion



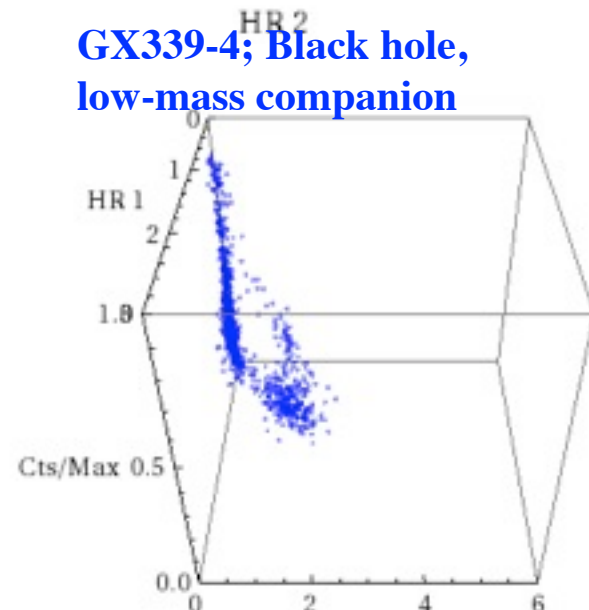
Vela X-1; pulsing Neutron Star



Cyg X-2; non-pulsing
Neutron Star “Z” type



GX339-4; Black hole,
low-mass companion



HR 2

HR 2

HR 2

Color-Color-Intensity Diagrams

C HR1 = (3-5keV)/(1.3-3keV)

C I HR2 = (5-12keV)/(1.3-3keV)

I Intensity = 1.3-12keV counts
(Intensity normalized to top 1%)
(Only $\geq 5\sigma$ points plotted)

RXTE/ASM data:

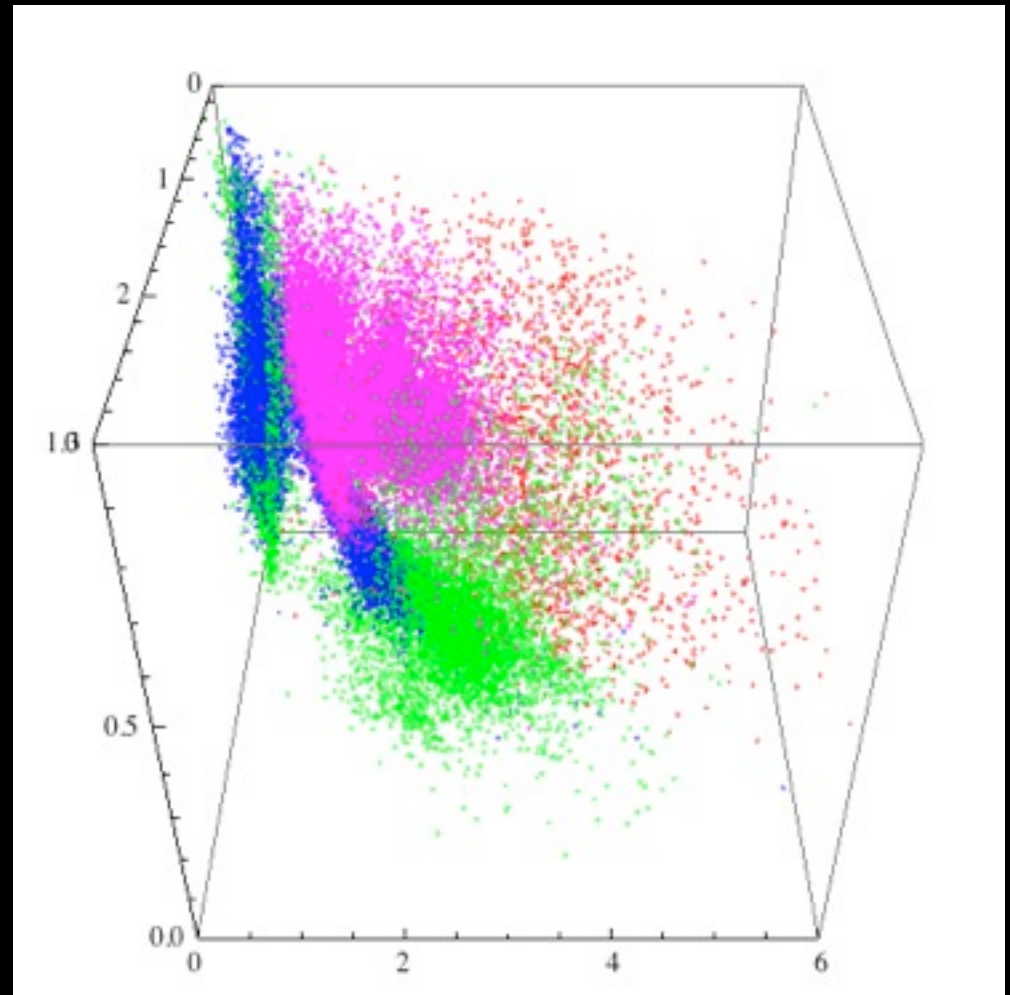
One day averages over 13 years

Black holes high mass

Black holes low mass

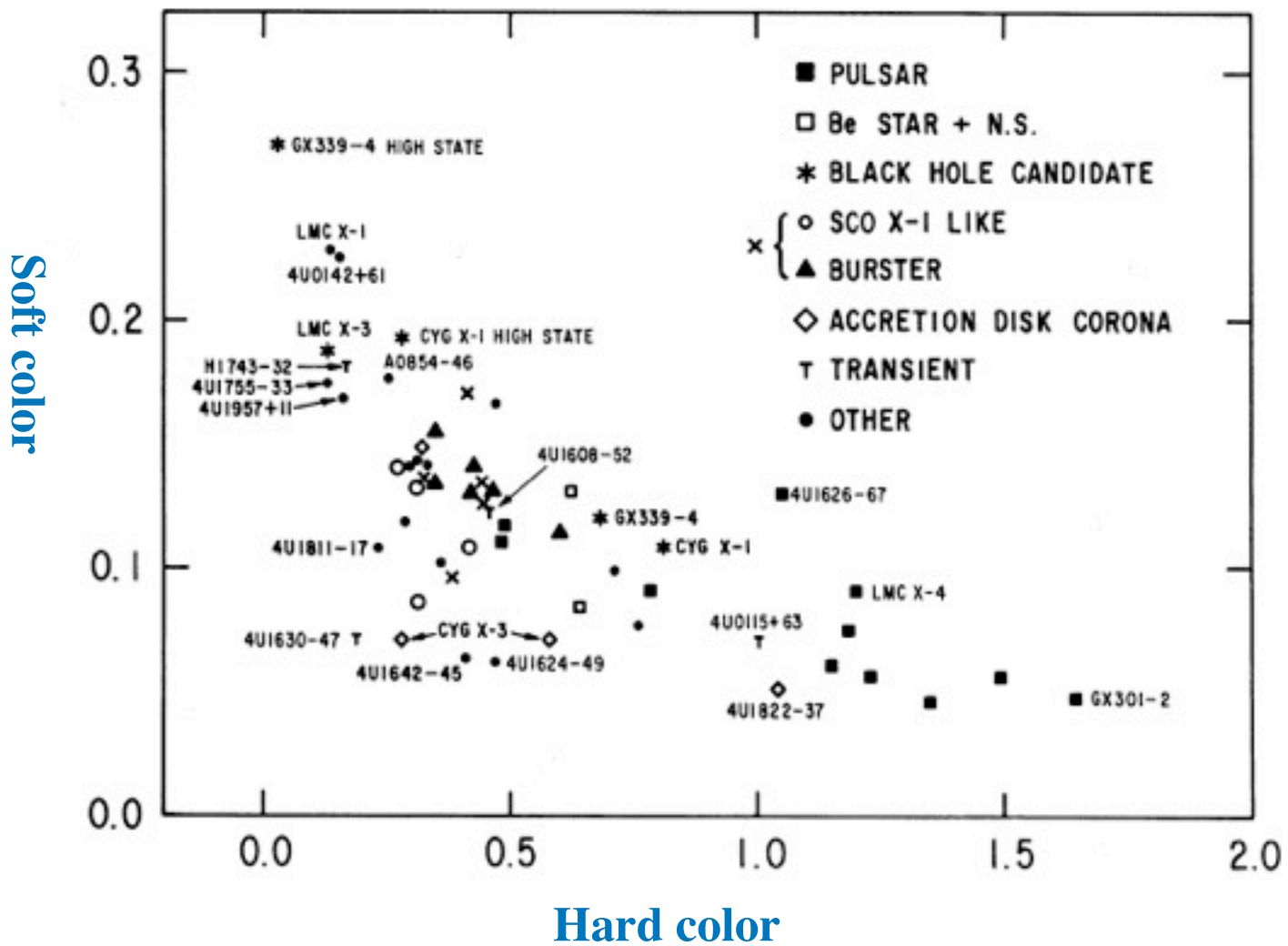
Pulsing neutron stars

Non-pulsing neutron stars



Vrtilek & Boroson 2013

UNUSUALLY SOFT X-RAY SPECTRUM OF LMC X-3



White & Marshall 1984

Color-Color-Intensity Diagrams

C HR1 = (3-5keV)/(1.3-3keV)

CI HR2 = (5-12keV)/(1.3-3keV)

I Intensity = 1.3-12keV counts
(Intensity normalized to top 1%)
(Only $\geq 5\sigma$ points plotted)

RXTE/ASM data:

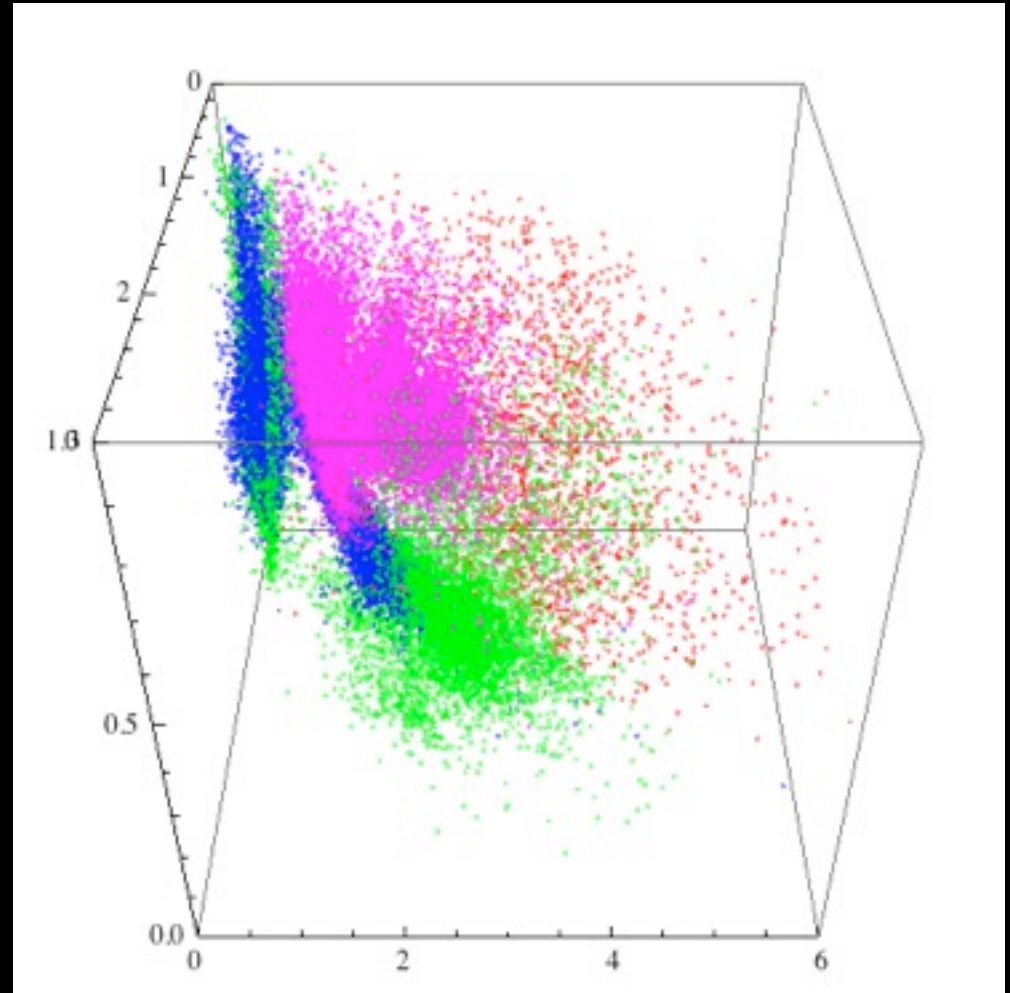
One day averages over 13 years

Black holes high mass

Black holes low mass

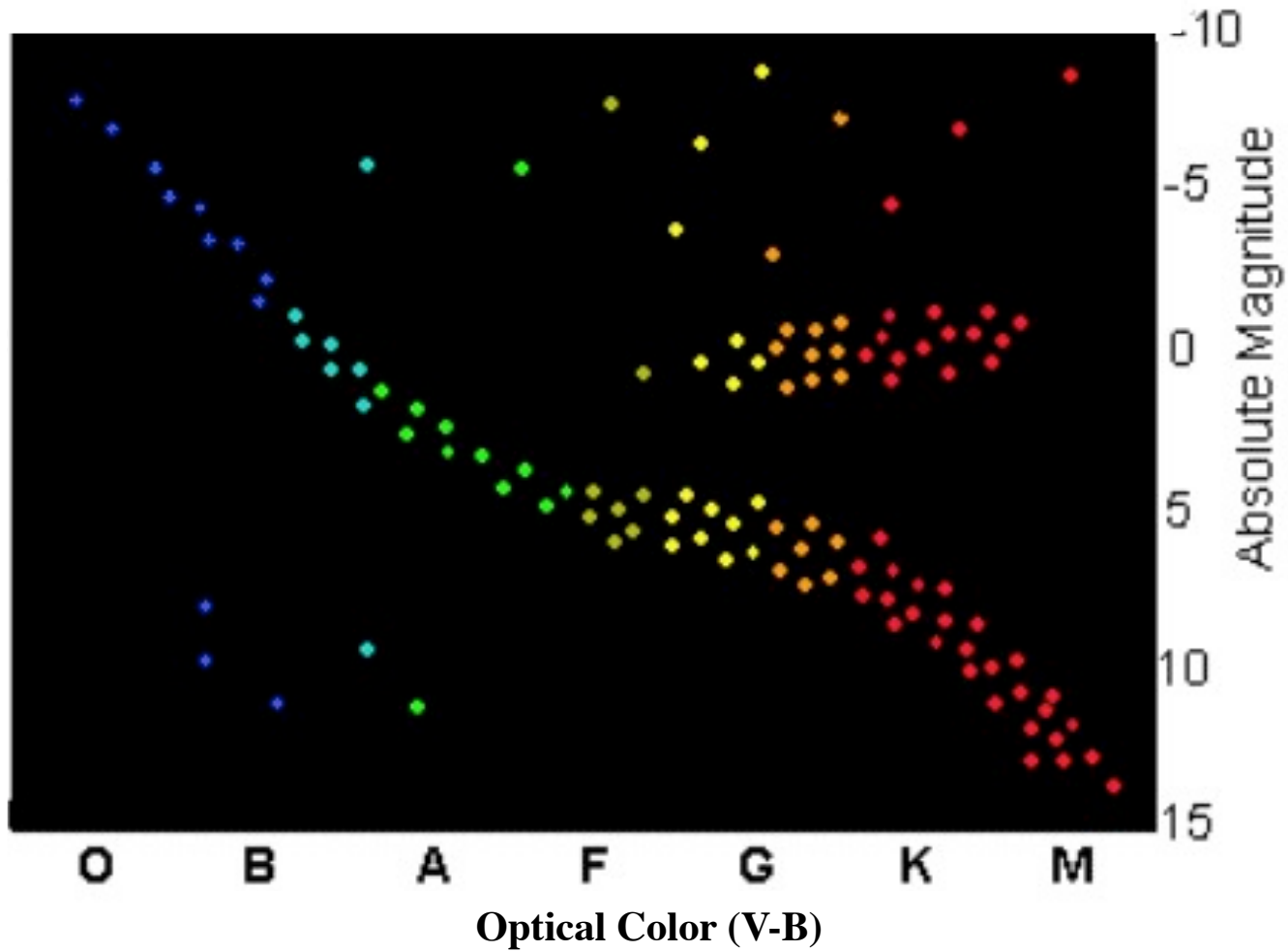
Pulsing neutron stars

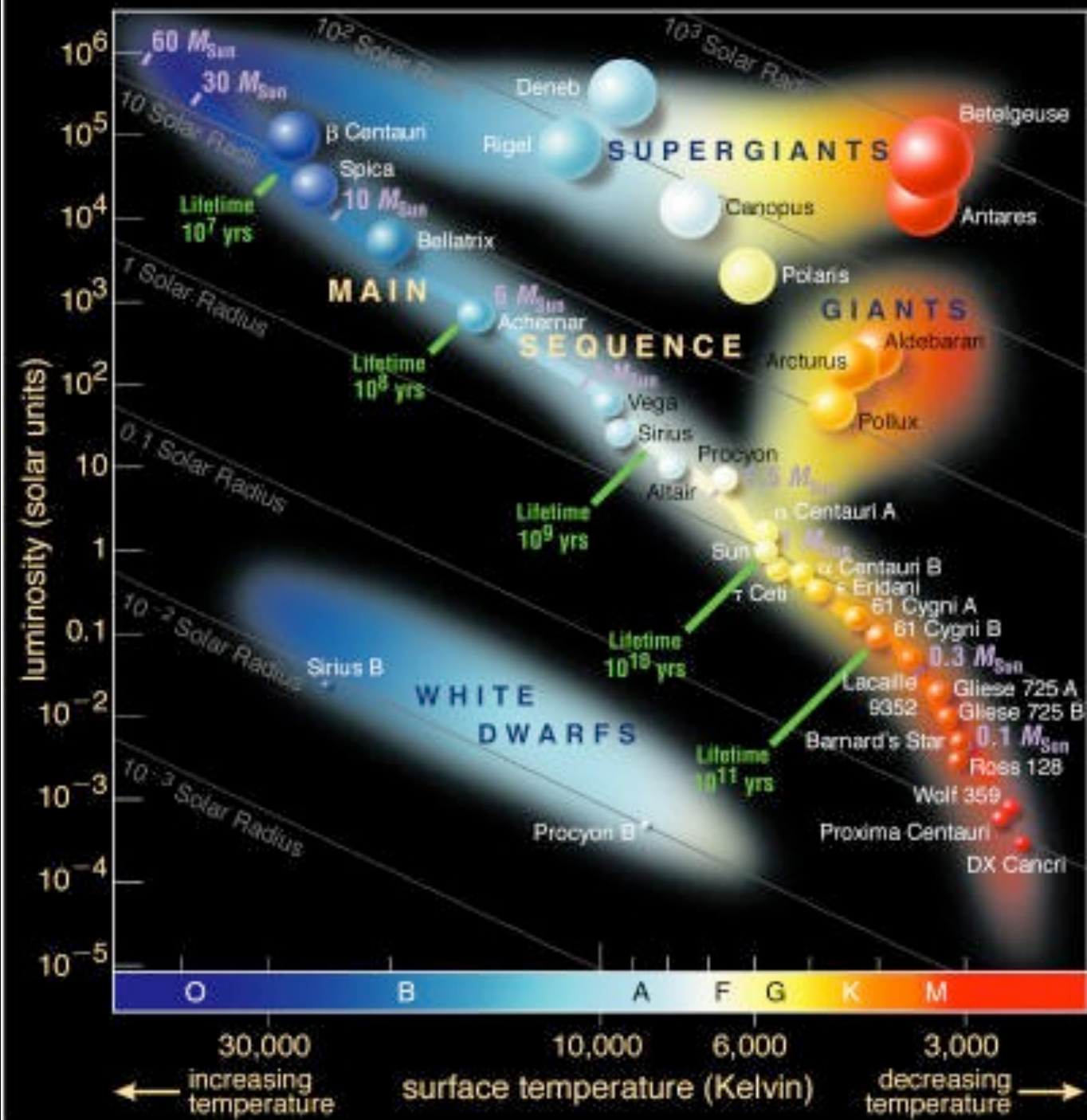
Non-pulsing neutron stars

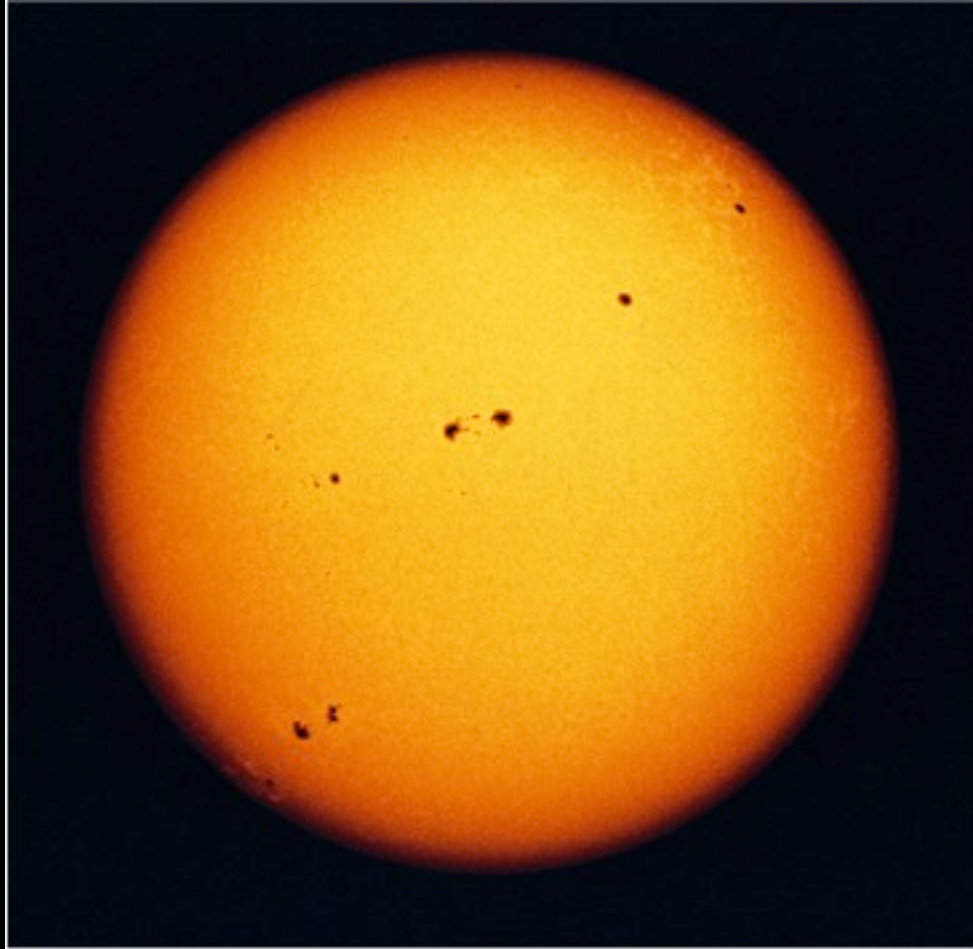


Vrtilek & Boroson 2013

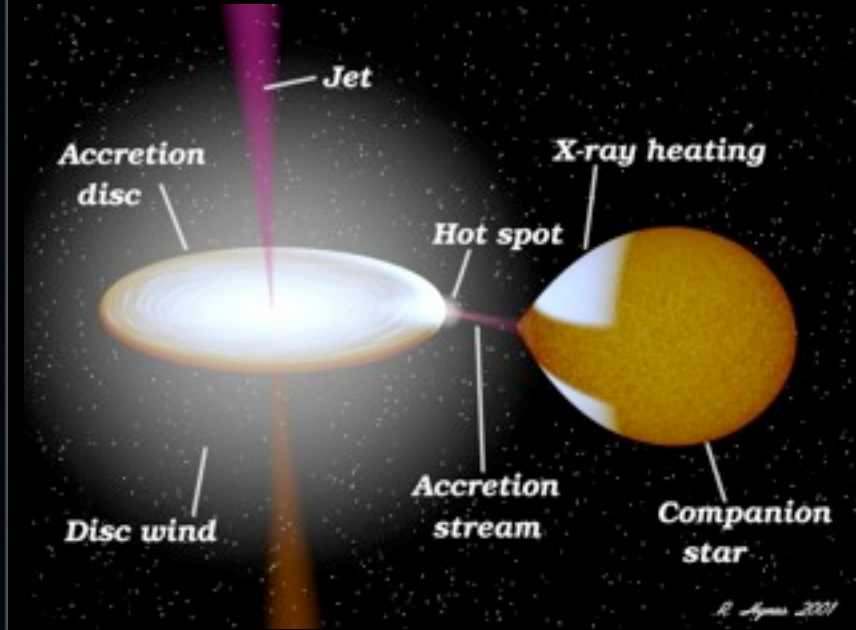
Schematic Hertzsprung-Russell Diagram





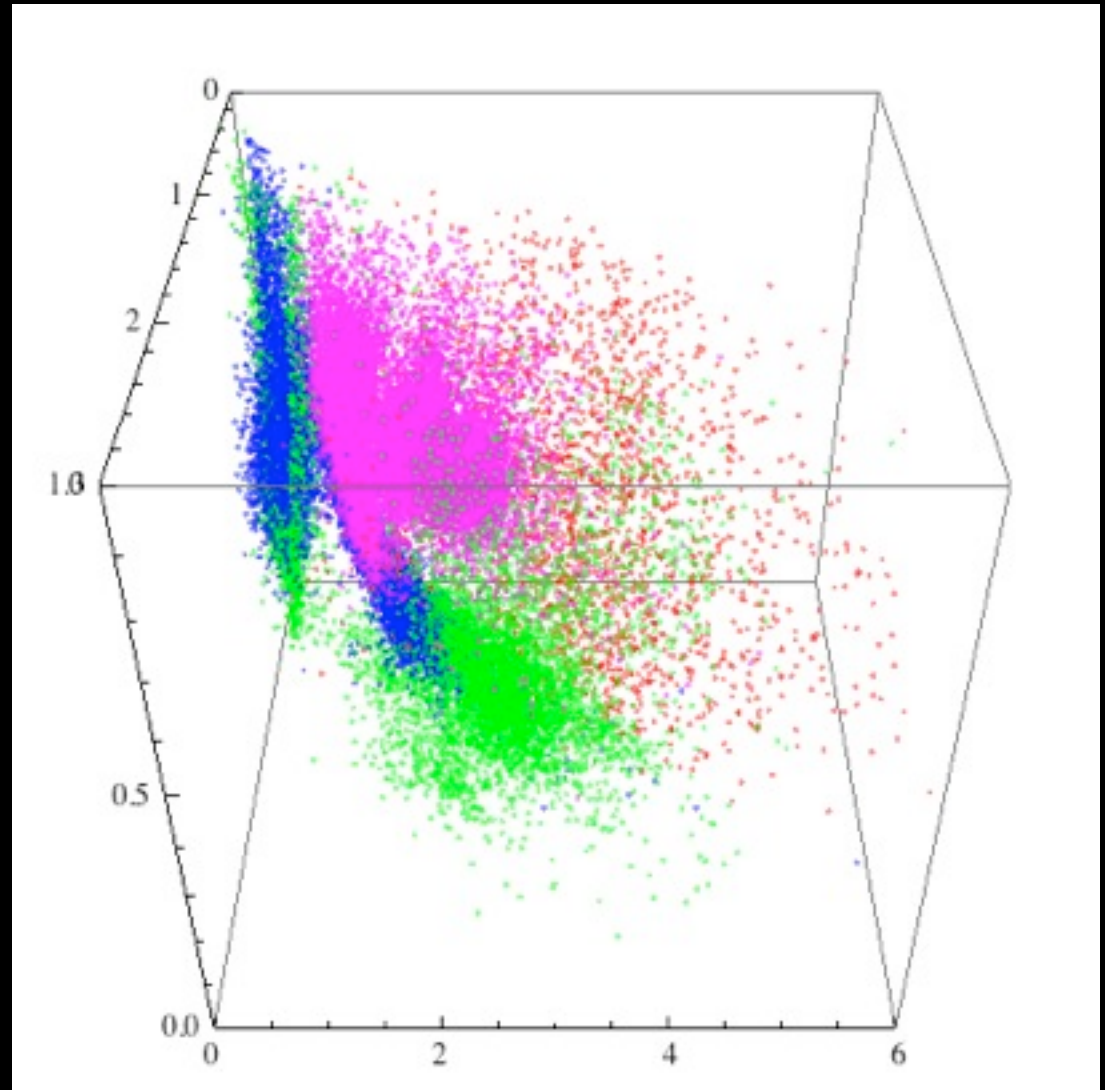


Optical Color + Optical Luminosity



X-ray color + X-ray luminosity

A Hertsprung-Russell diagram for accreting binaries?



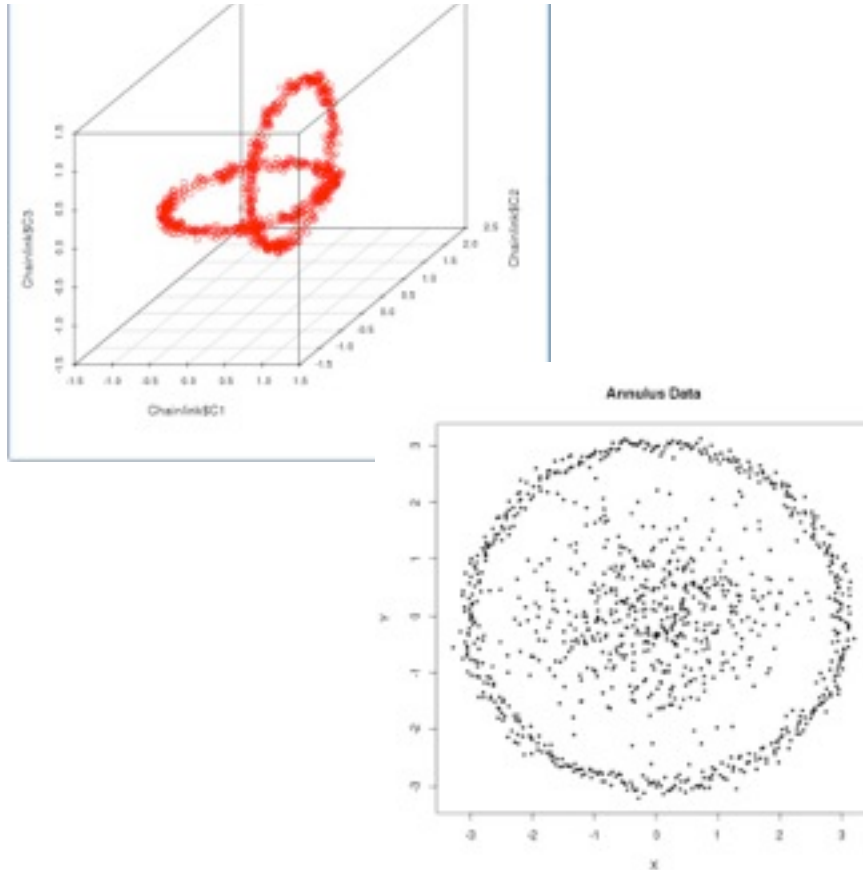
Black holes high mass
Black holes low mass
Pulsing neutron stars
Non-pulsing neutron stars

Vrtilek & Boroson 2013

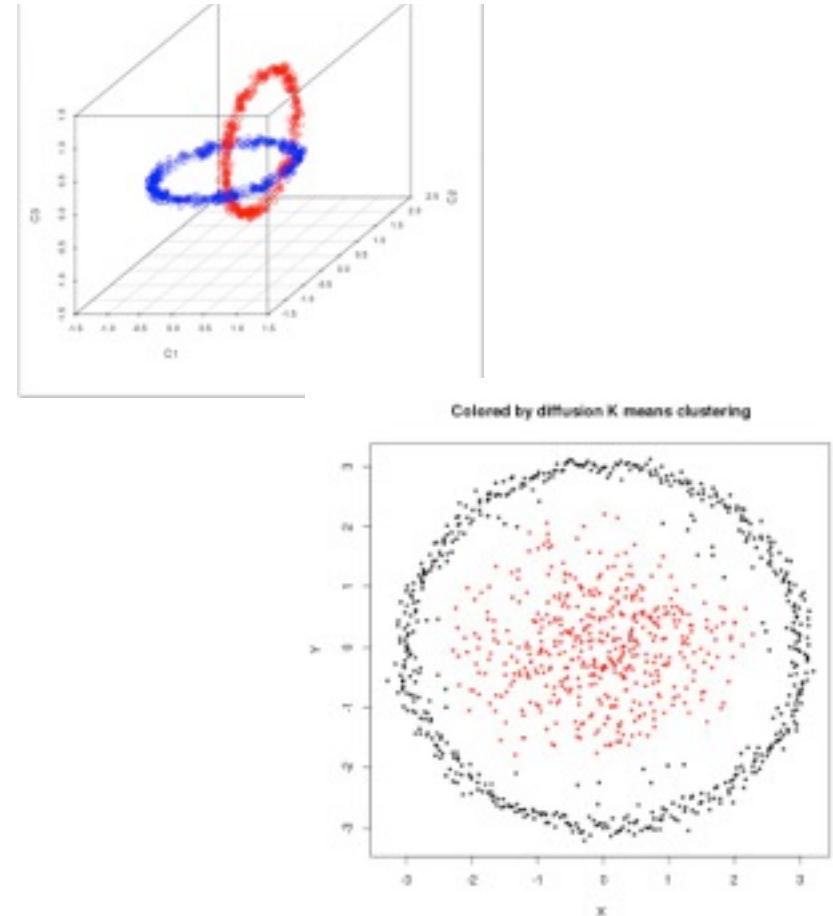
Spectral Connectivity Analysis

Richards et al (2008; 2009)
Freeman et al (2009)
Lee & Waterman (2010)

Input data
diffusionMap



Data clustered by

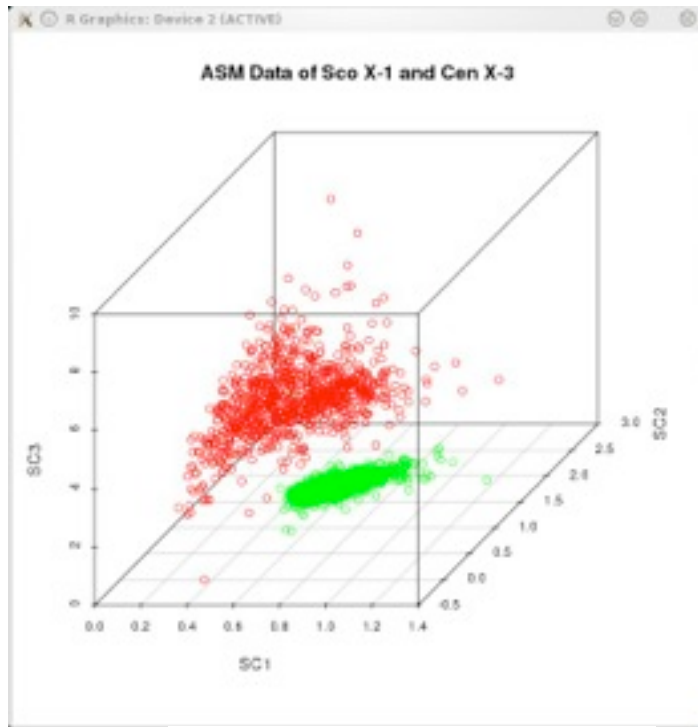


diffusionMap:

<http://cran.r-project.org/web/packages/diffusionMap/index.html>

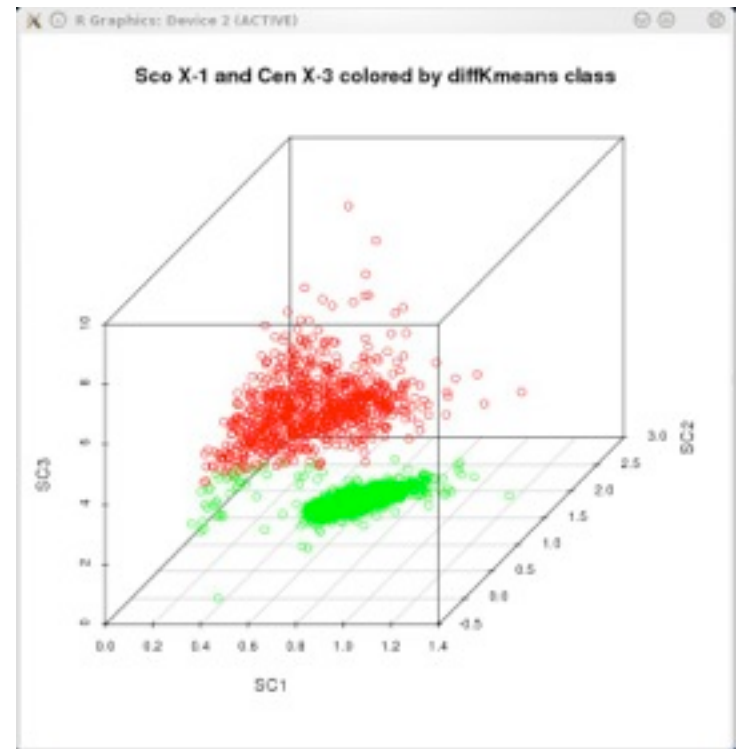
Pulsars vs Z-sources

Input data colored by
prior knowledge
clusters



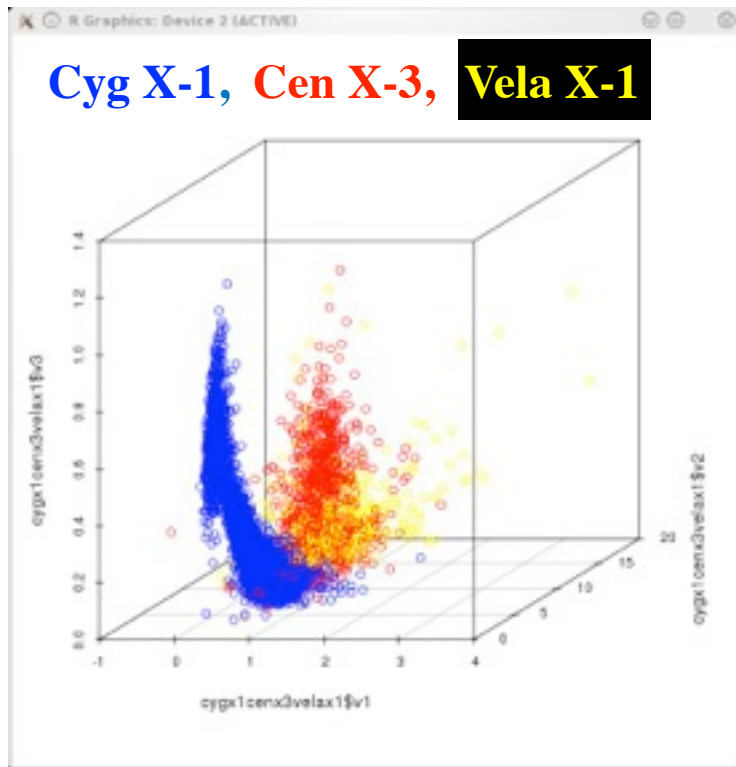
Sco X-1, Cen X-3

Data colored by
diffusionMap

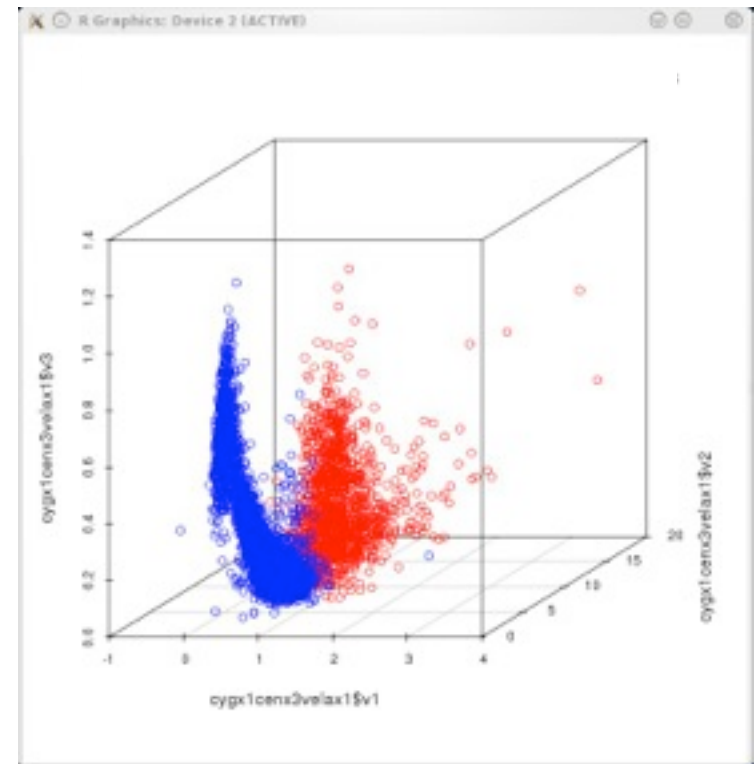


Pulsars vs Black Holes

Input data colored by
prior knowledge



Data colored by
diffusionMap clusters

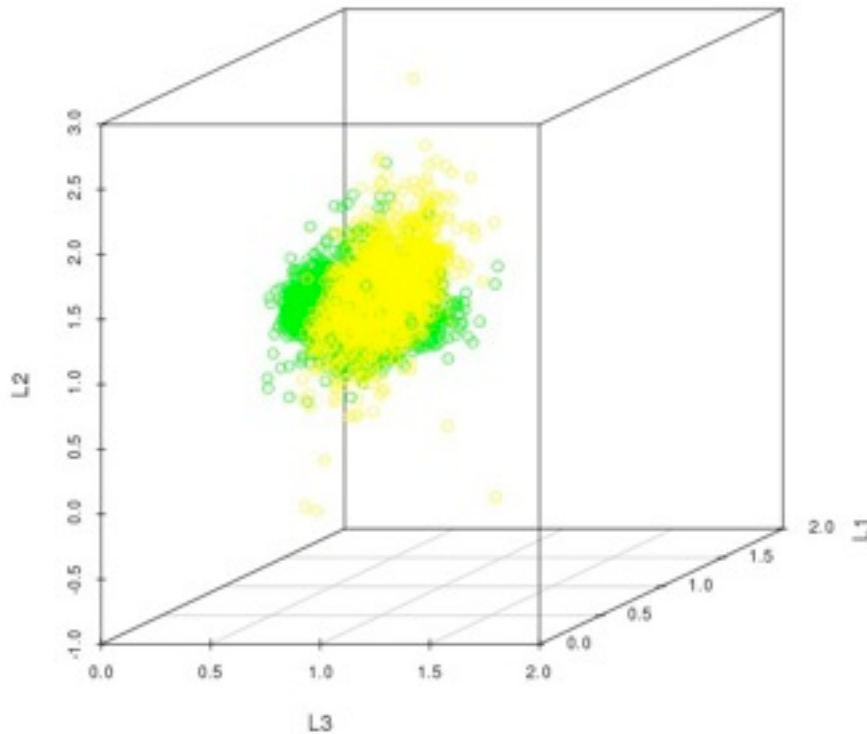


Z sources vs Atoll sources

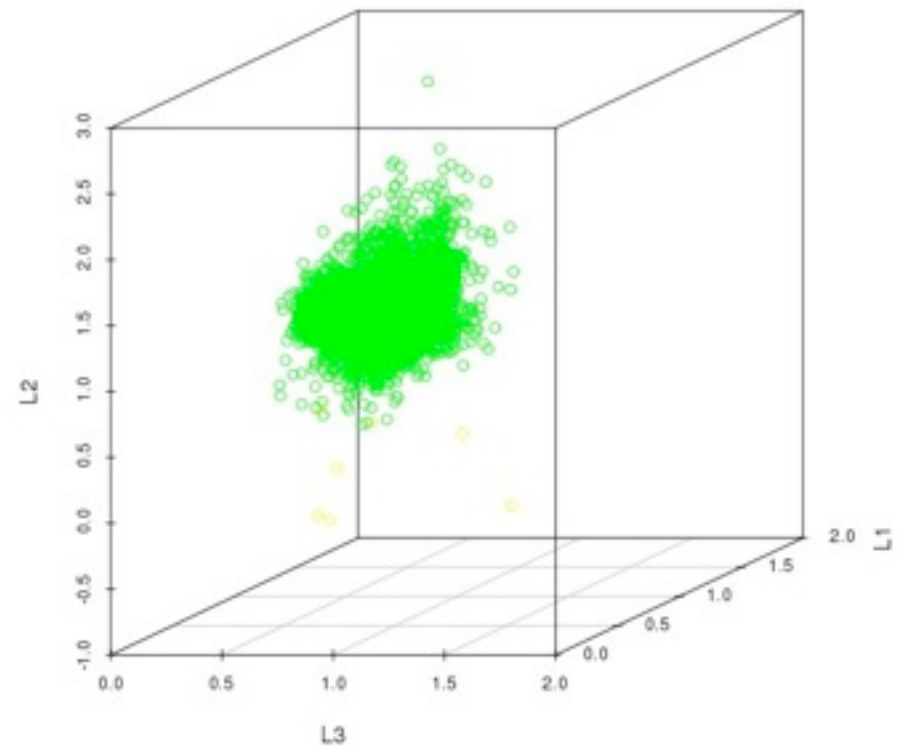
Input data colored by
prior knowledge
clusters

Data colored by
diffusionMap

ASM Data of Cyg X-2 and GX9+9



Cyg X-2 and GX9+9 colored by diffKmeans class

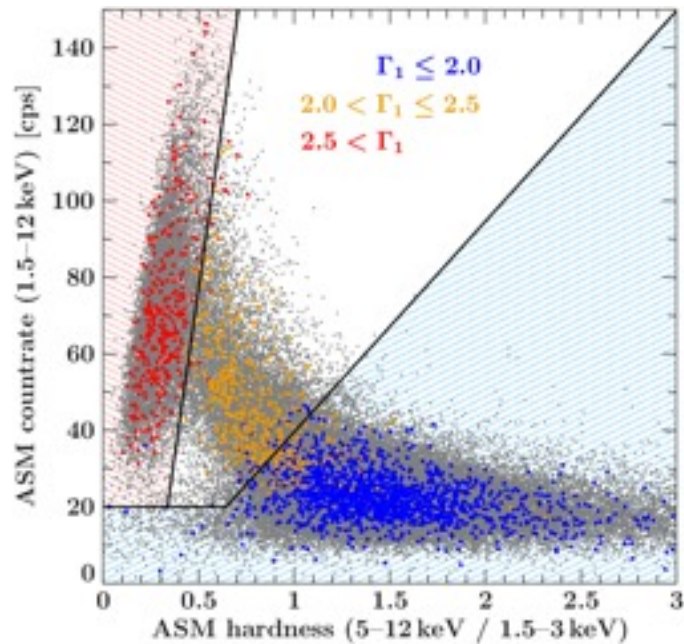


Cyg X-2, **GX9+9**

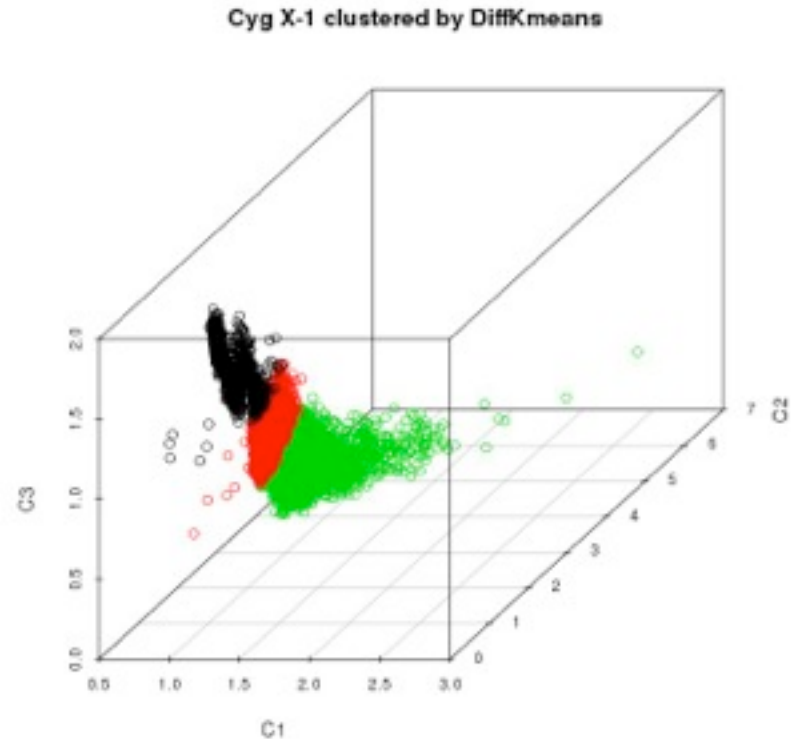
Different states of a single source: Cygnus X-1

(**Hard state**, **intermediate state**, and **soft state** of Cyg X-1 in ASM determined using 2741 spectral fits to PCA data)

PCA data of Cyg X-1 clustered by diffusionMap

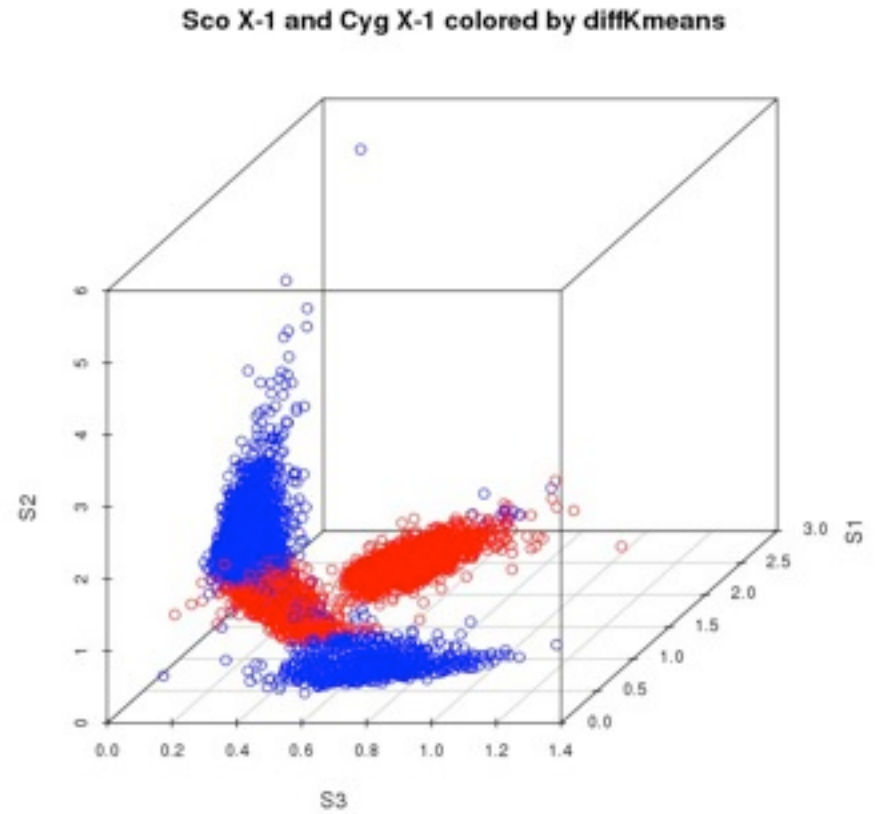
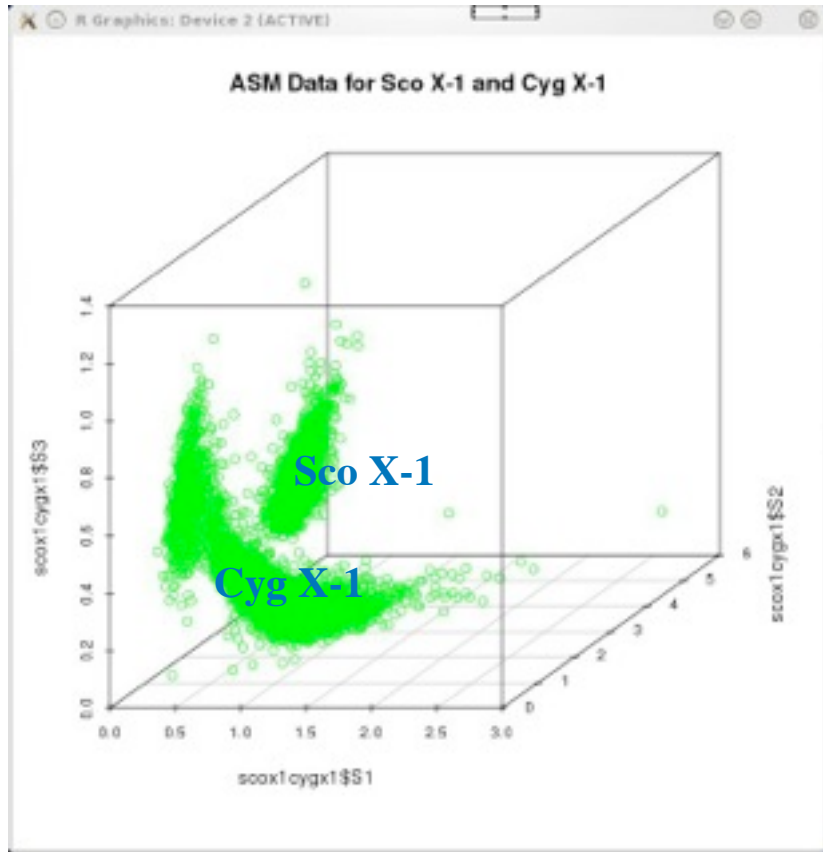


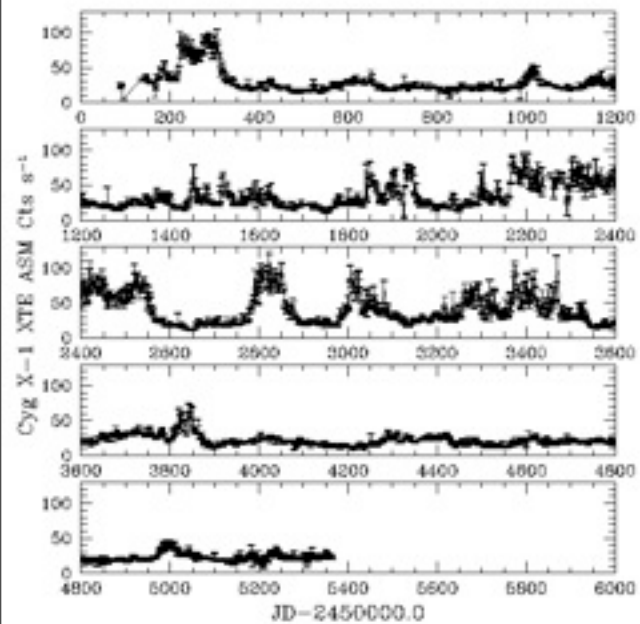
Grinberg et al. 2013



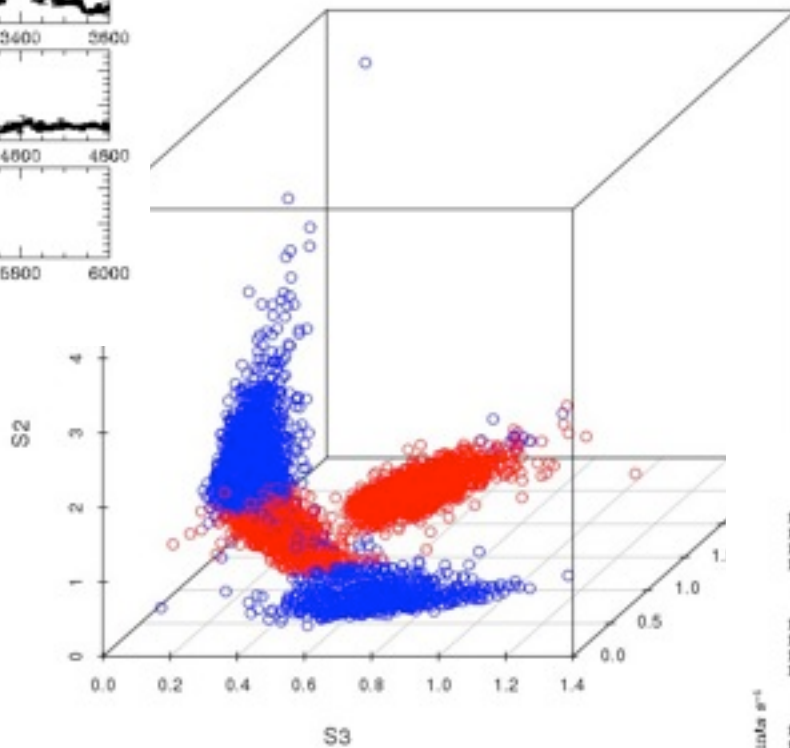
Buchan et al 2013

Separating Black holes and Z sources?

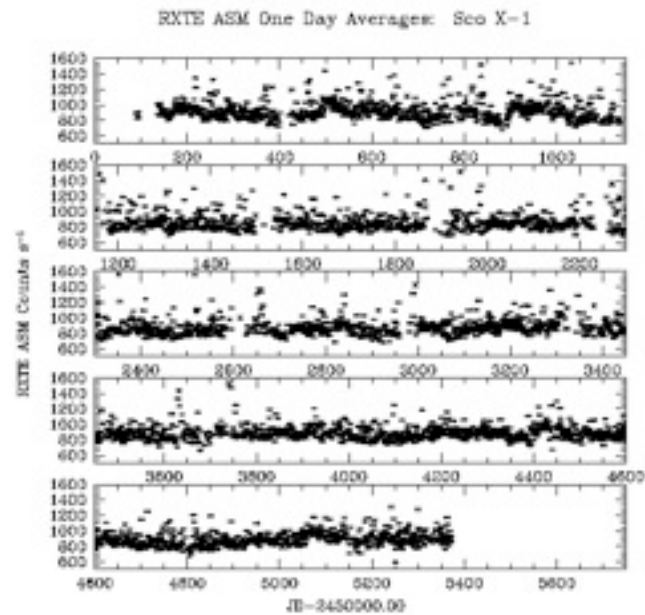


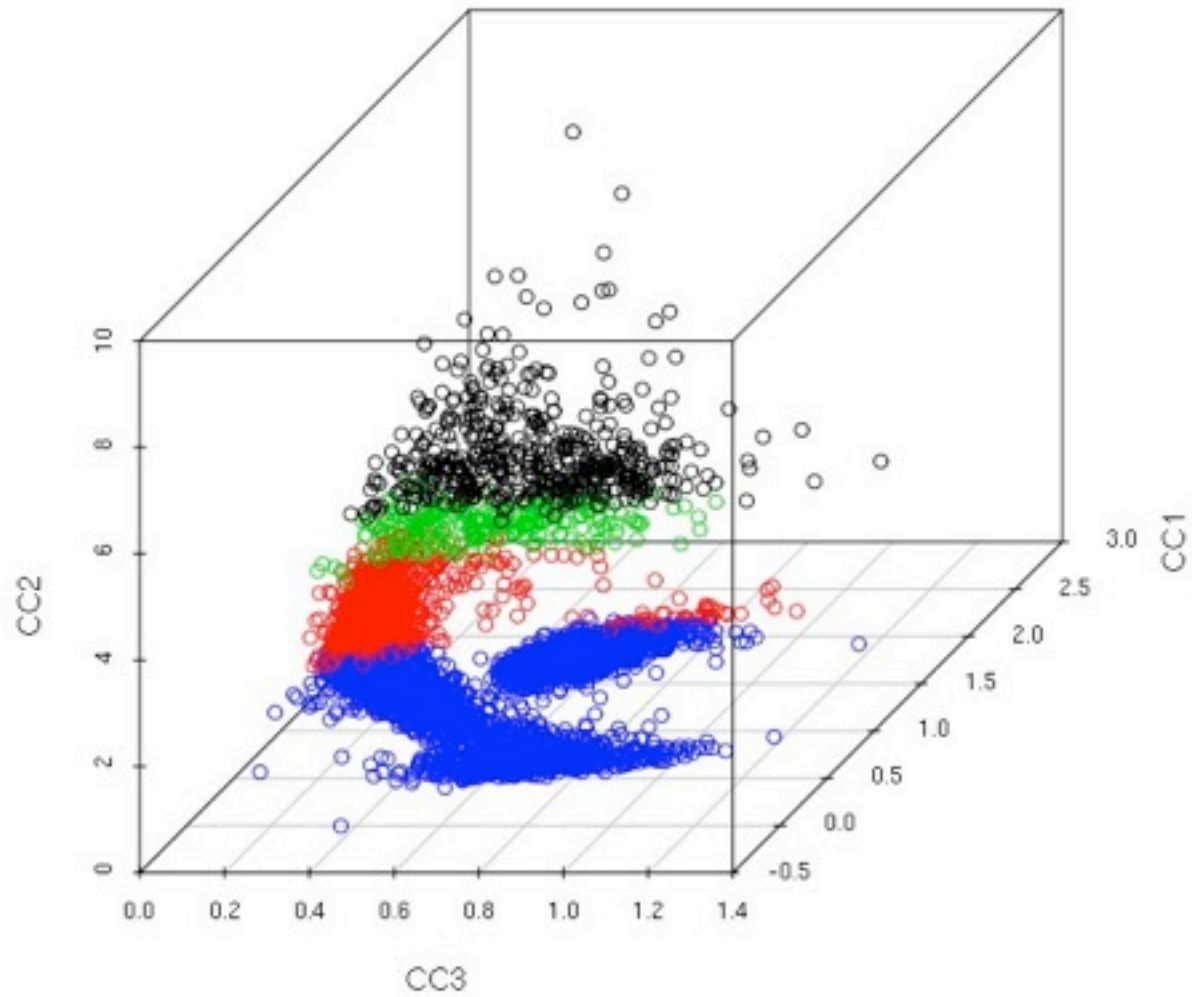


Sco X-1 and Cyg X-1 colored by diffKmeans



Is Sco X-1 equivalent to the intermediate state of Cyg X-1?

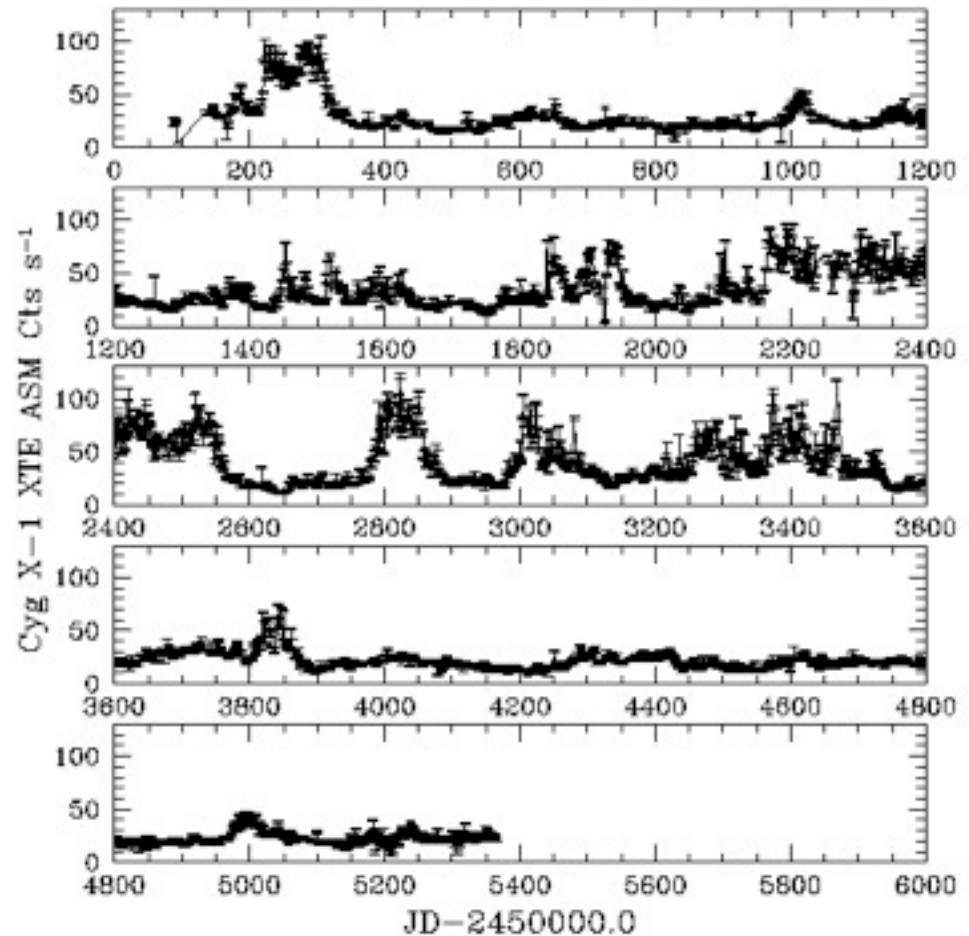
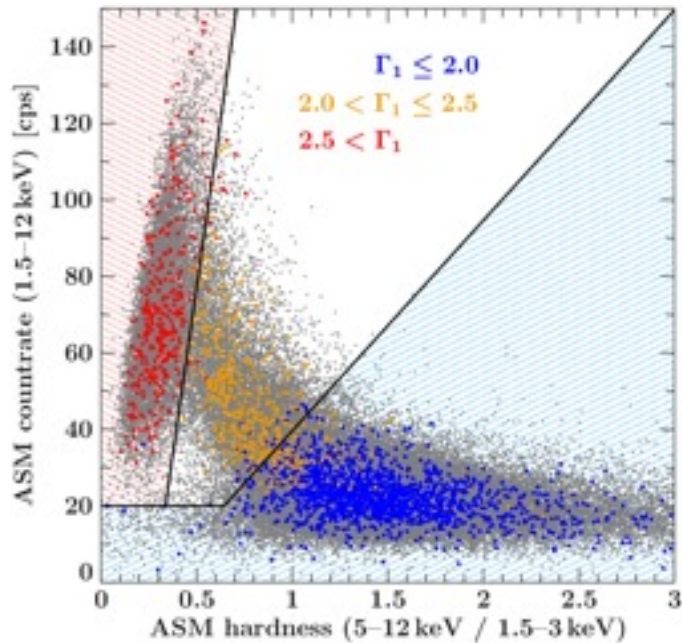




Different approach: see Luke's presentation!

Different states of a single source: Cygnus X-1

(**Hard state**, **intermediate state**, and **soft state** of Cyg X-1 in ASM determined using 2741 spectral fits to PCA data)

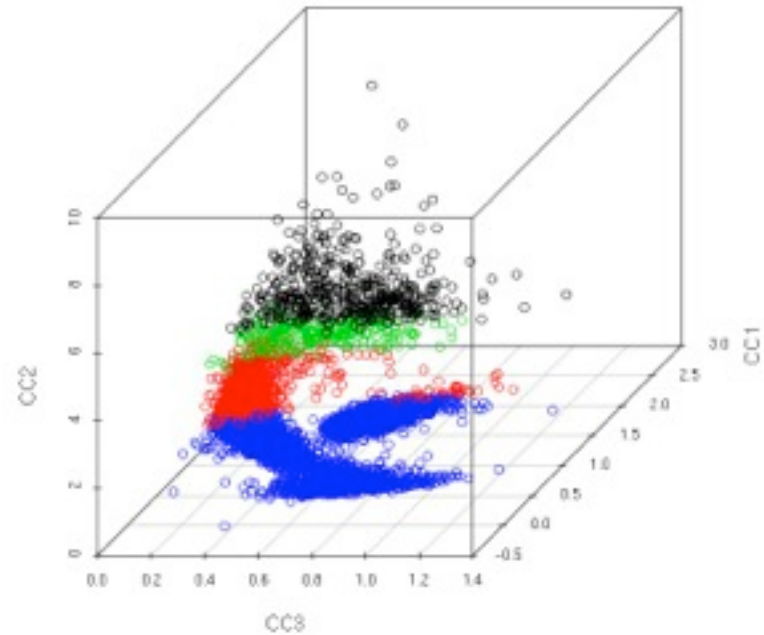
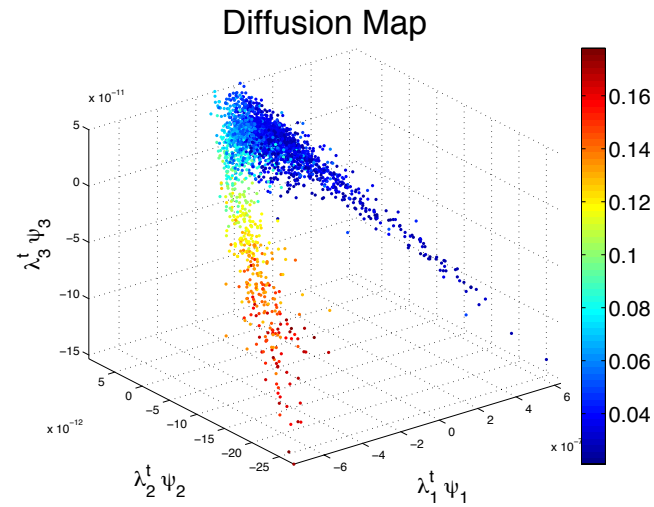


Grinberg et al. 2013

Problems with diffusionMap code:

- 1) optimized for selection by redshift;
- 2) critically dependent on number of groups and spacing between groups.

Different approach: see Luke's presentation!



Putting X-ray binaries in their proper place.

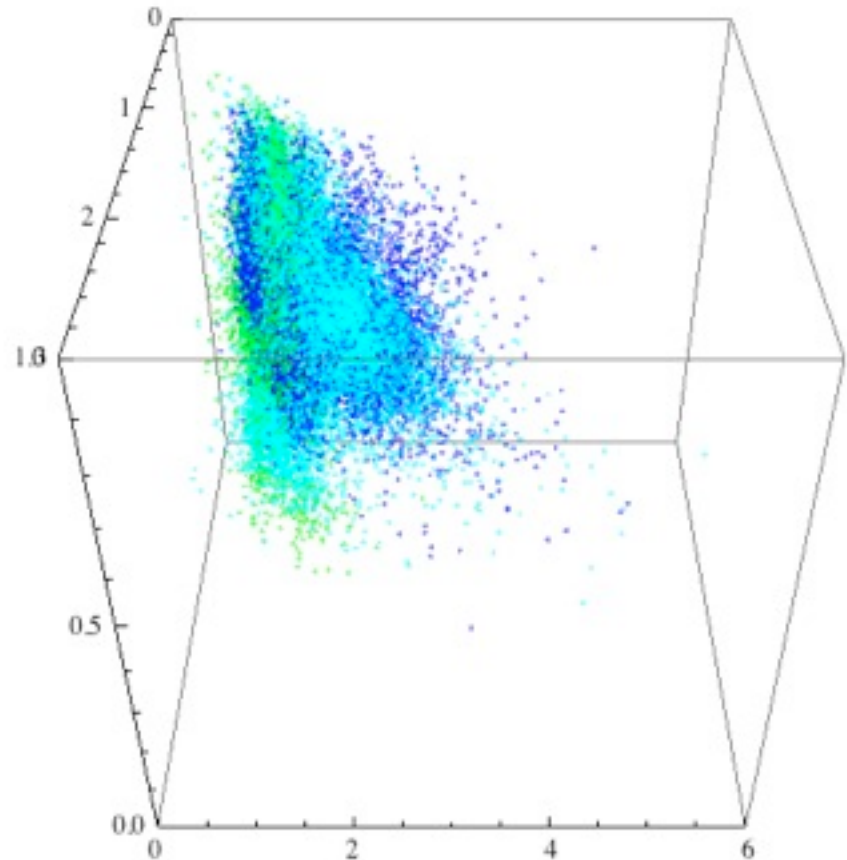
Introduction:

- ✓ X-ray binaries
- ✓ Data set
- ✓ CCI description

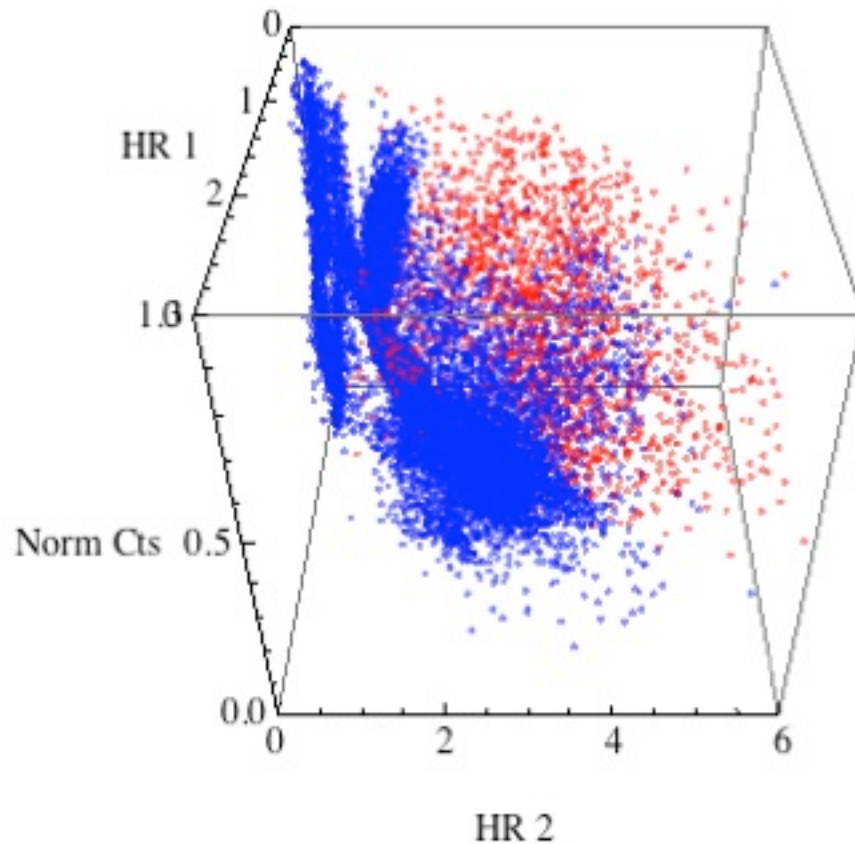
→ Physical interpretations

Statistical solutions (Luke)

Future work



Incorporating the Physics

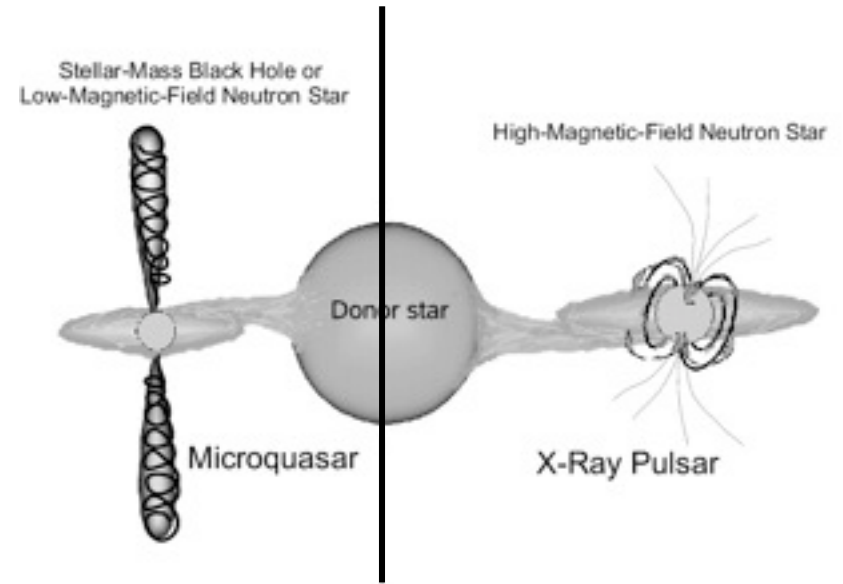
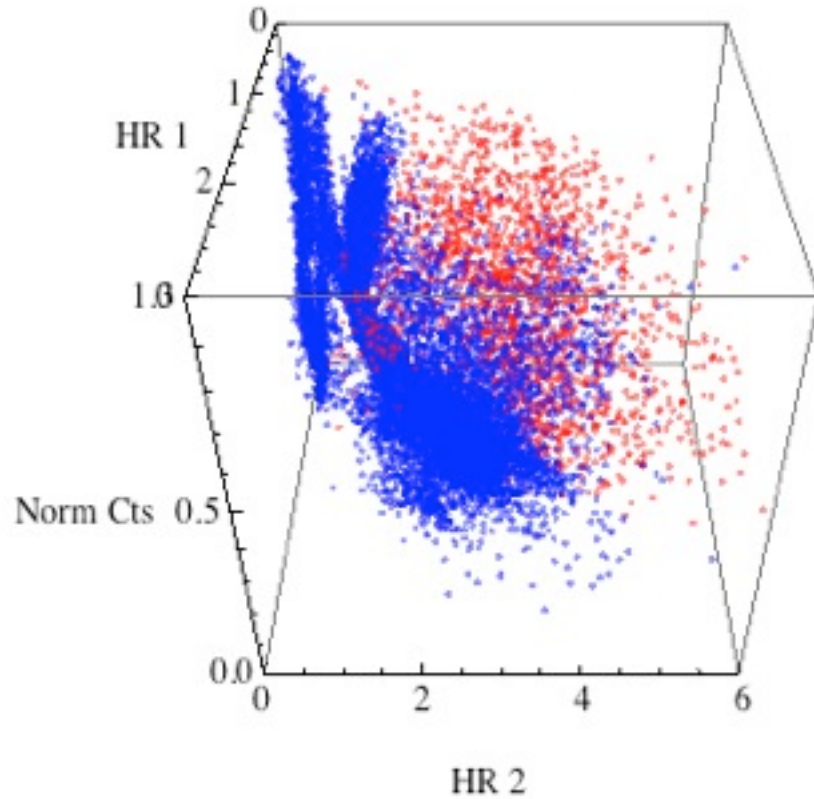


Cyg X-1
Cyg X-3
Circinus X-1
XTE J1550-564
Sco X-1
GROJ1655-40
GRS 1915+105
GX339-4

Resolved jet sources

X-ray pulsars

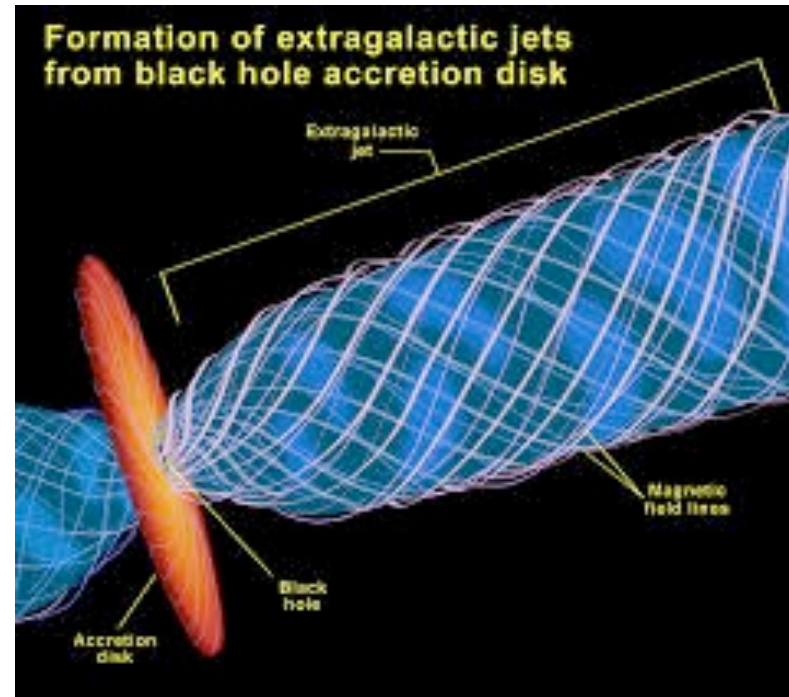
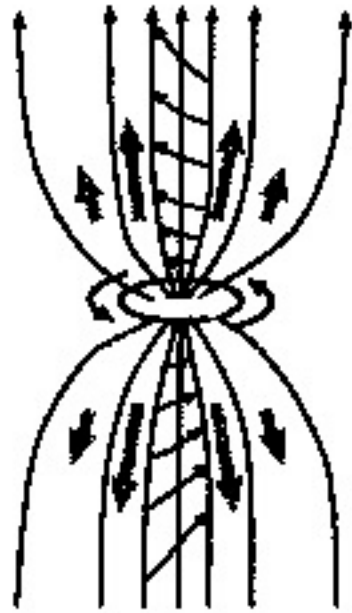
Incorporating the Physics



Massi & Bernado (2008)

Resolved jet sources

X-ray pulsars



If $P_B < P_p$ field lines spiral

$$P_B = B^2/8\pi$$

$$P_p = \rho v^2$$

$P_B = P_p$ at the Alfvén radius

Condition for jet formation is that

$$R_A/R_* = 1 \text{ for NS}$$

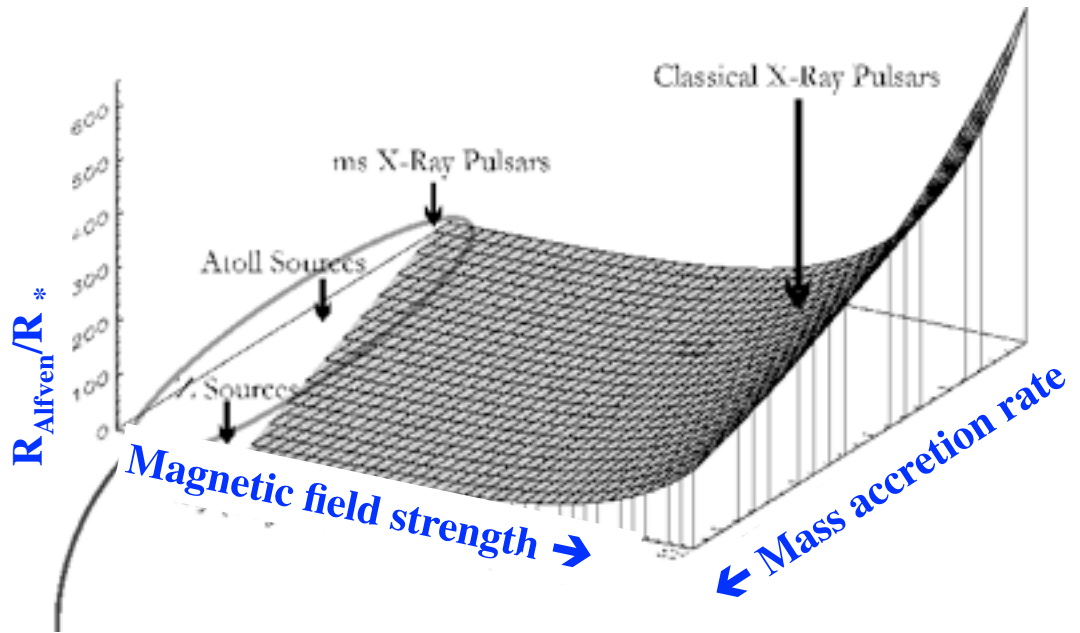
$$R_A/R_{LSO} = 1 \text{ for BH}$$

$$P_B = B^2/8\pi$$

$$P_p = \rho v^2$$

So for the jet criterion

$$P_B = P_p \rightarrow B^2/8\pi = \rho v^2$$



Massi & Bernado 2008:

$$\dot{M}_{\text{dot}} = 4\pi R^2 \rho v \text{ (Longair 1994)}$$

$$v = (2GM_*/R)^{1/2}$$

$$\text{For a dipole magnetic field: } B/B_* = (R_*/R)^3$$

$$R_A/R_* \cong 0.87 (B_*/10^8 \text{G})^{4/7} (\dot{M}_{\text{dot}} 10^{-8} M_{\text{sun}}/\text{year})^{-2/7}$$

For a NS with a mass $1.44 M_{\text{sun}}$ and radius of 9km (Titarchuk & Shaposhnikov 2002)

Massi & Bernado 2008 quantified this progression using known values:

$$R_{\text{Alfven}}/R_{\text{NS surface}} = 1 \text{ for neutron star systems}$$

$$R_{\text{Alfven}}/R_{\text{ISO}} = 1 \text{ for black hole systems.}$$

$$B \leq 1.35 \times 10^8 \text{ G}$$

Schwarzschild blackhole

$$B \leq 5 \times 10^8 \text{ G}$$

Kerr blackhole

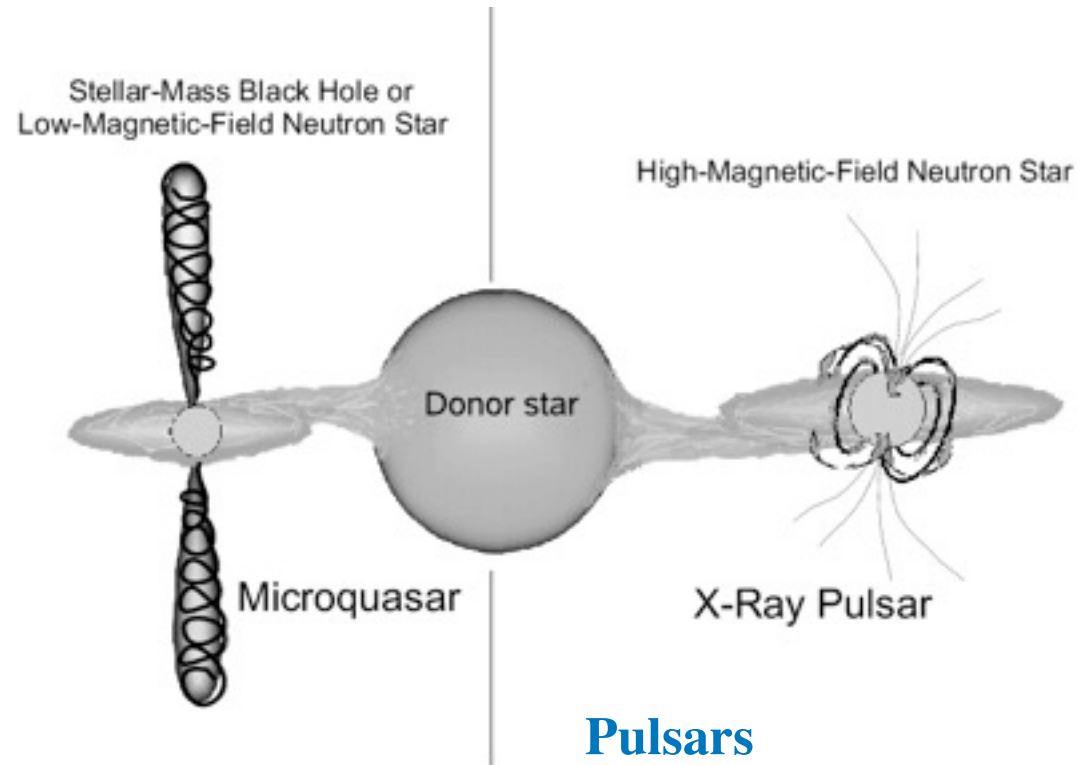
$$B \leq 10^{8.2} \text{ G} \quad \text{Z-sources}$$

$$B \leq 10^{7.7} \text{ G} \quad \text{Atoll sources}$$

$$B \leq 10^{7.5} \text{ G}$$

Millisecond pulsars

$$B \leq 10^{5.9} \text{ G} \quad \text{AGN}$$



Pulsars

$$B \sim 10^{12} \text{ G}$$

No jets at any accretion rate

Fender et al model for jet production in XRBs

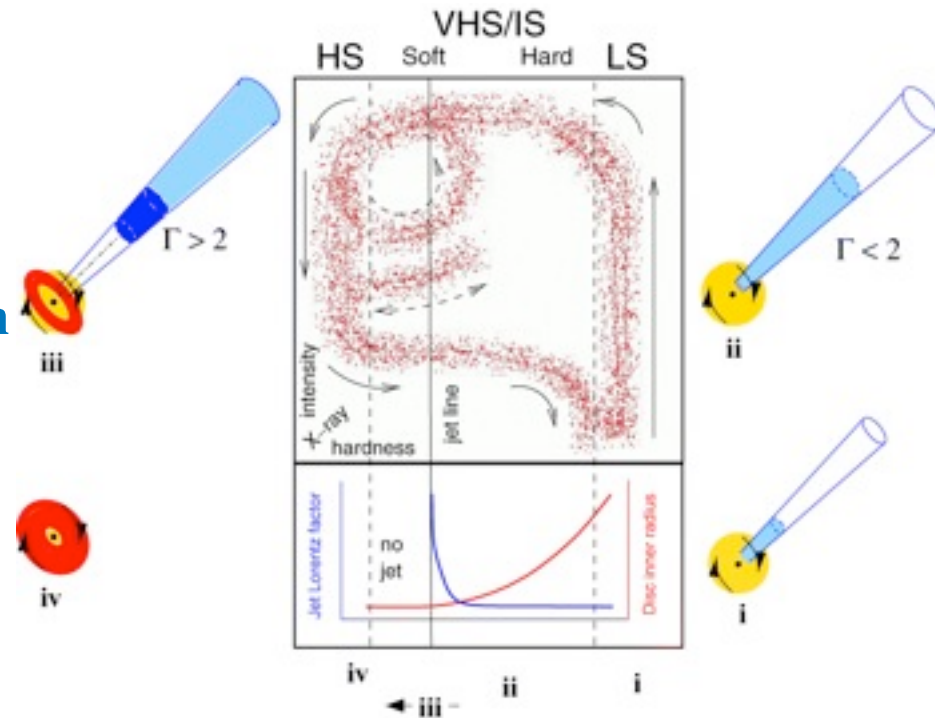
From most likely to least likely to produce jets:

Black hole systems with no intrinsic magnetic field.

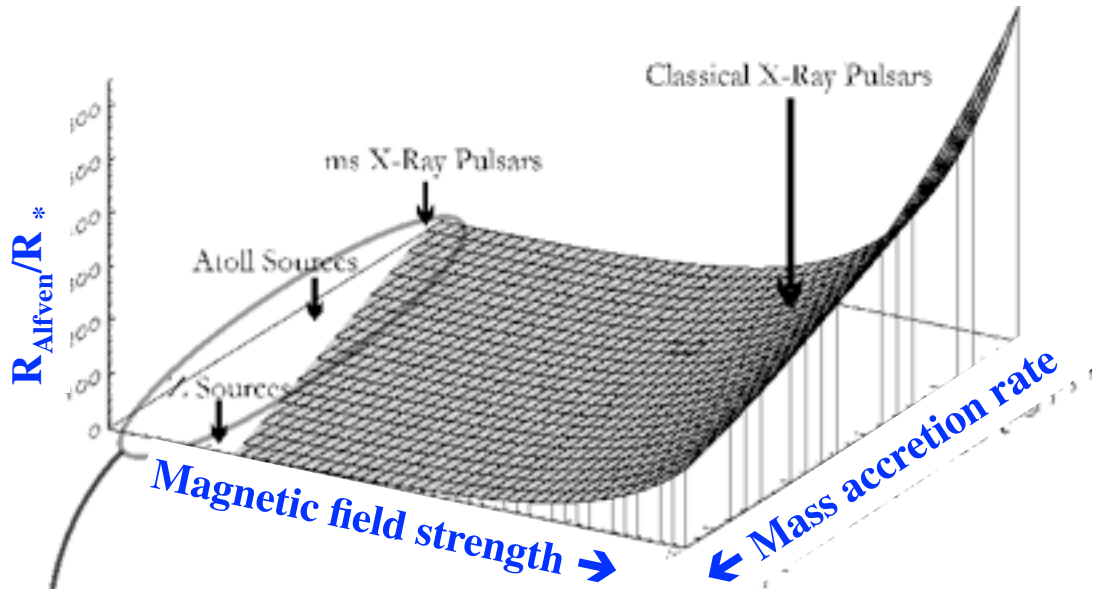
Low-mass neutron star systems with weak magnetic fields at high accretion (Z-type)

Low-mass neutron star systems with weak magnetic fields at low accretion (Atoll)

High-mass neutron star systems with high magnetic fields (Pulsars)

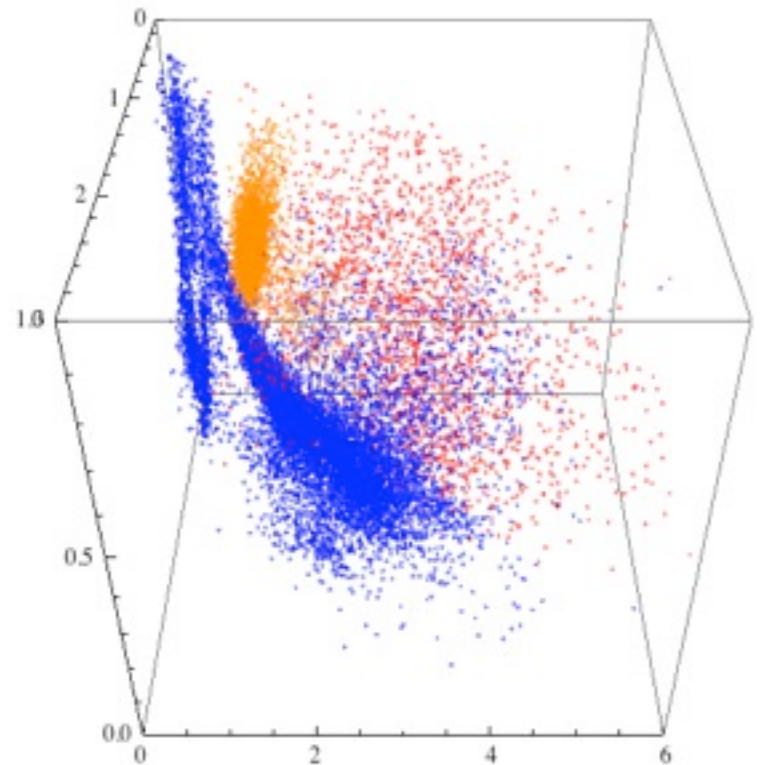


Fender, Belloni, & Gallo (2004)

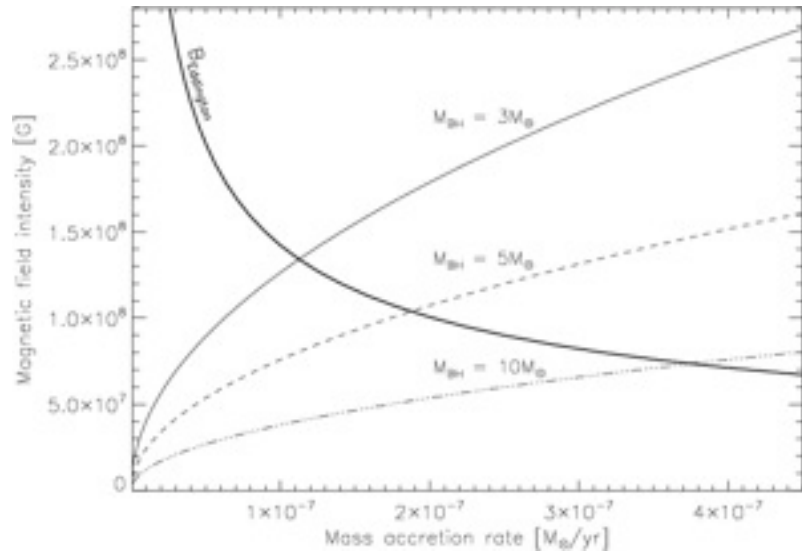


Massi & Bernado 2008

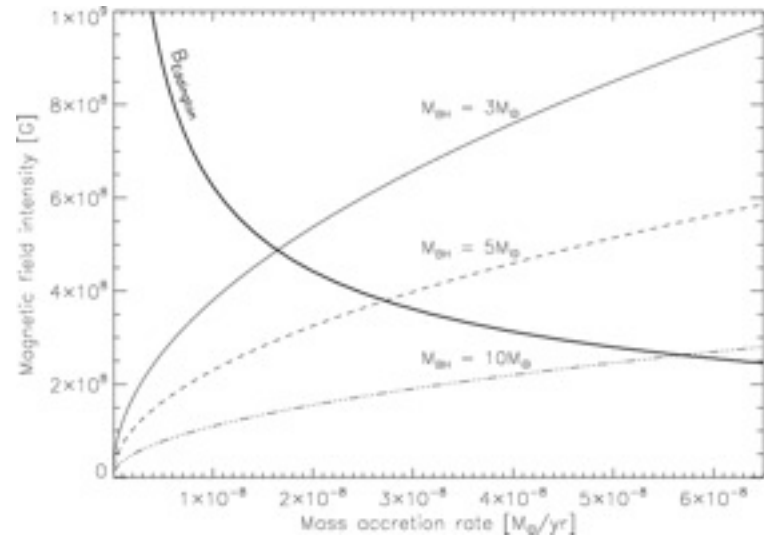
Sco X-1



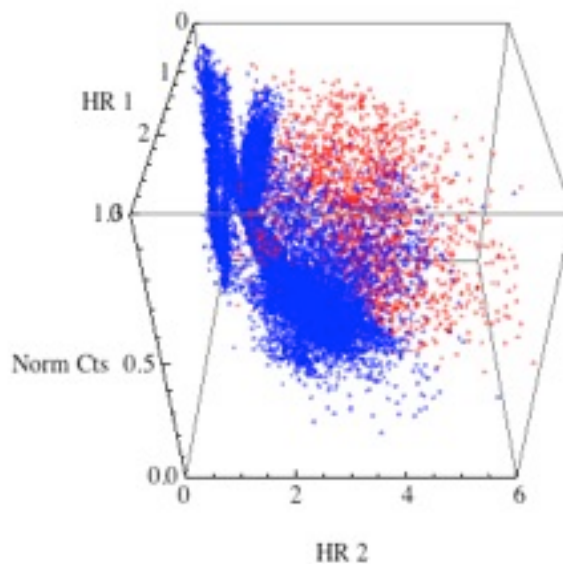
$$R_A/R_{\text{LSO}} = 1$$

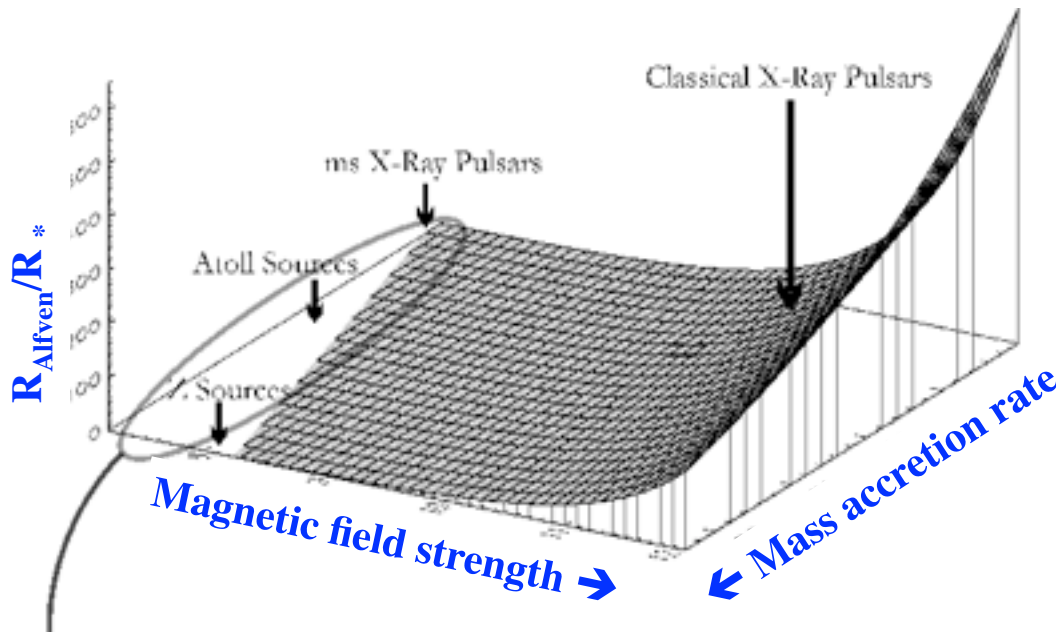


Schwarzschild-BH XRBs



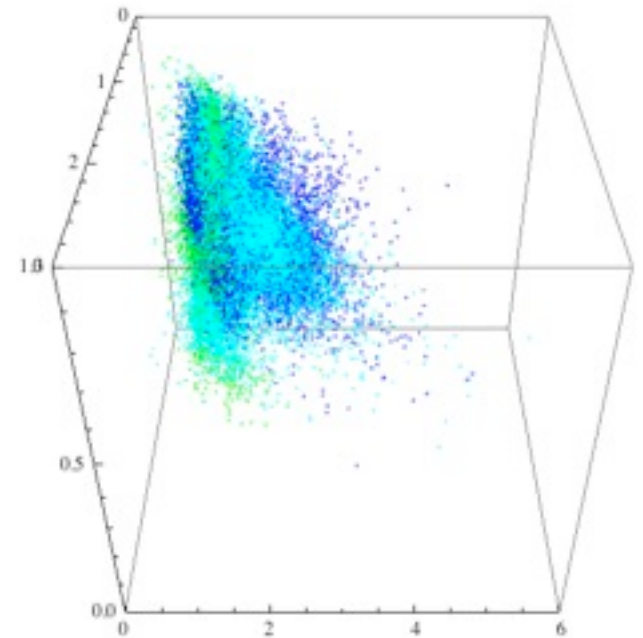
Kerr-BH XRBs





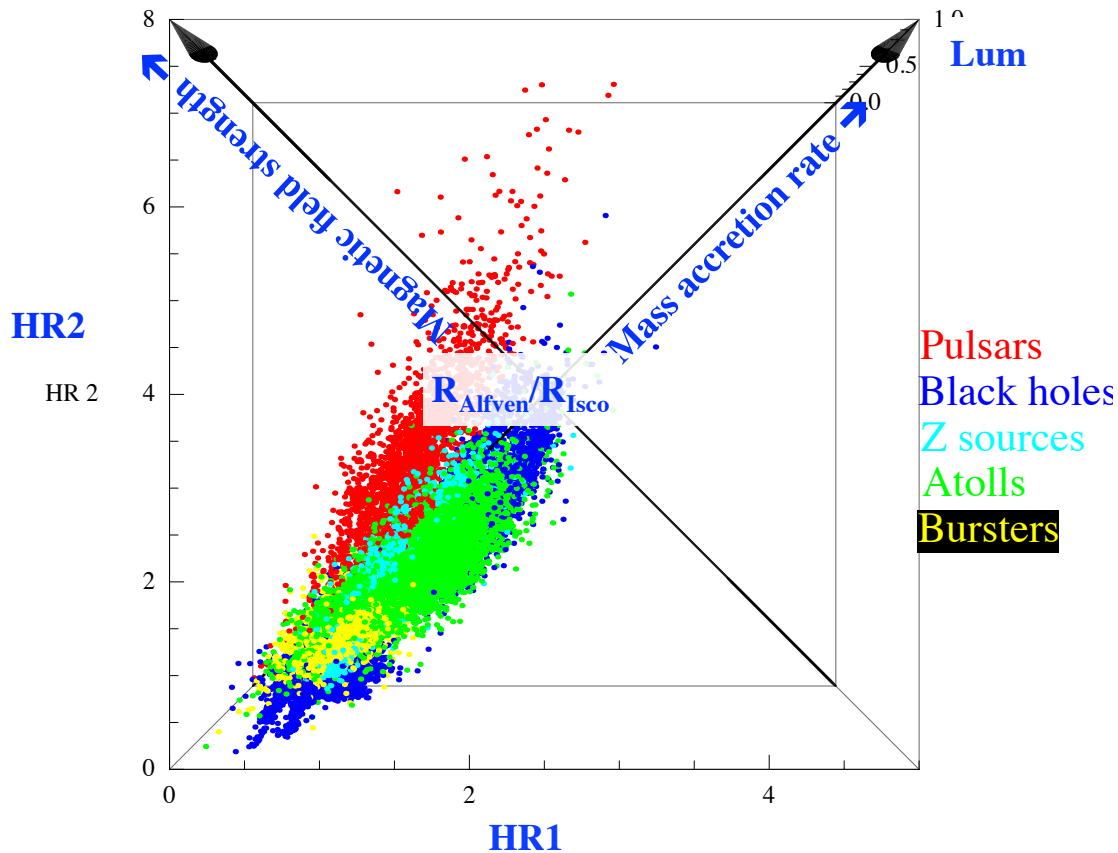
Massi & Bernado 2008

Homan et al 2010 claim \dot{M}_{dot} increases from Atoll to Z sources. And bursters are thought to be at very low \dot{M}_{dot} .

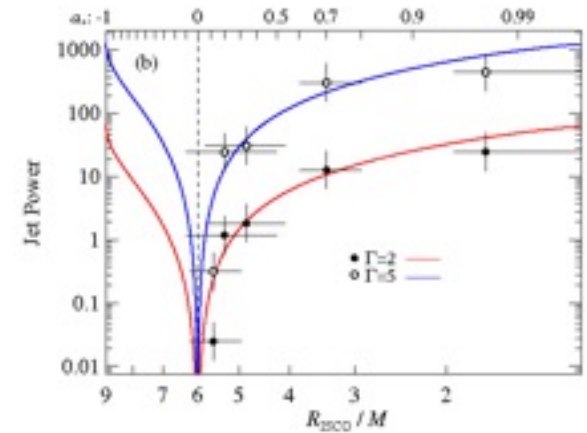


CCI diagram incorporate ALL key elements that determine interplay between jet power and disk radiation:

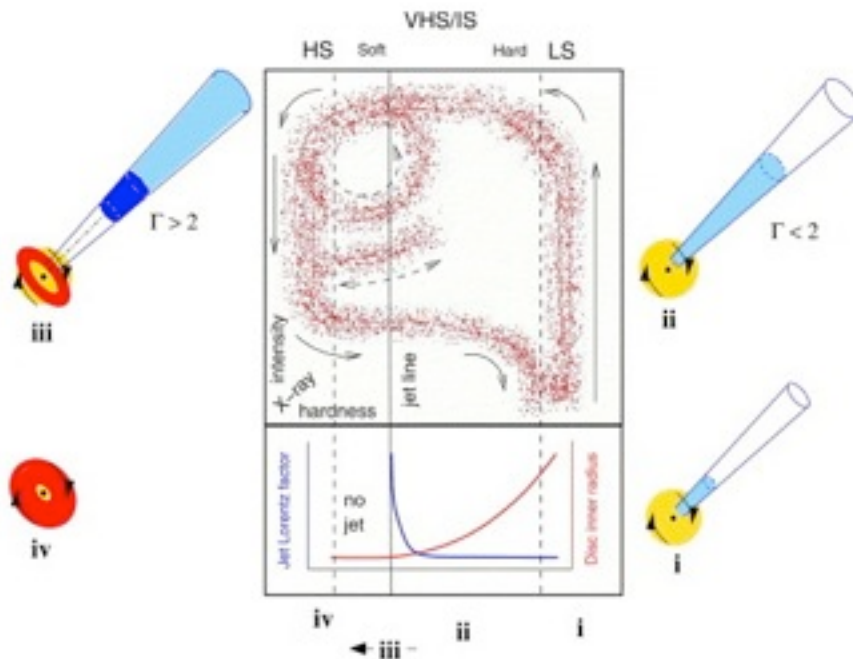
1. Mass accretion rate which determines available energy
2. Strong magnetic fields which inhibit jet formation
3. Basic condition for jet formation ($R_A/R_{\text{Isco}} = 1$)



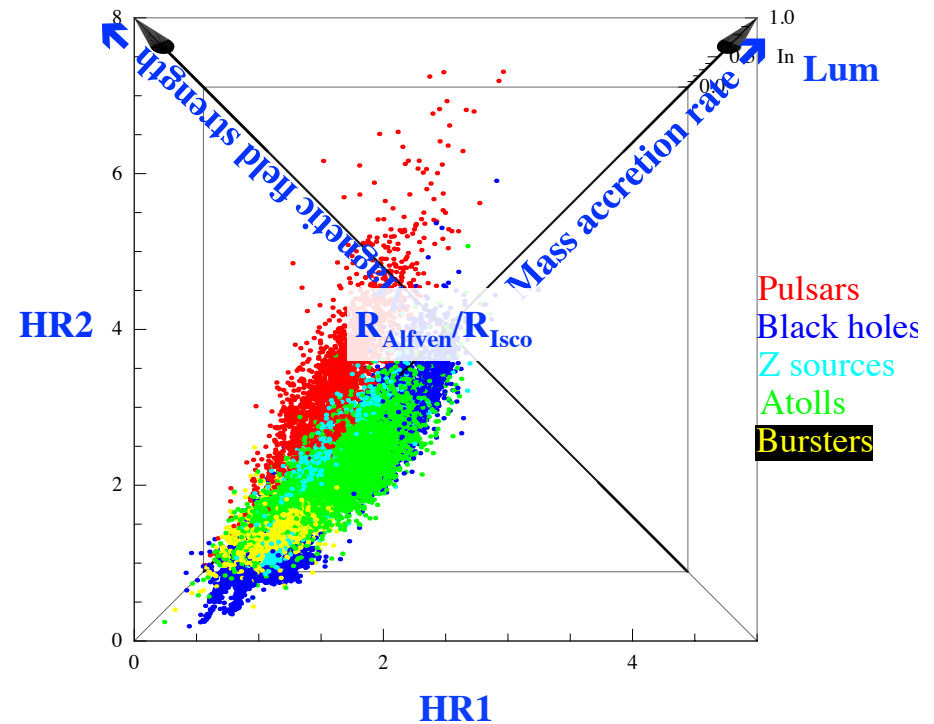
1. Mass accretion rate determines available energy
2. Strong magnetic fields inhibit jet formation
3. ISCO is related to jet power



McClintock, Narayan, & Steiner 2013



Fender, Belloni, & Gallo (2004)



Putting X-ray binaries in their proper place.

Introduction:

X-ray binaries

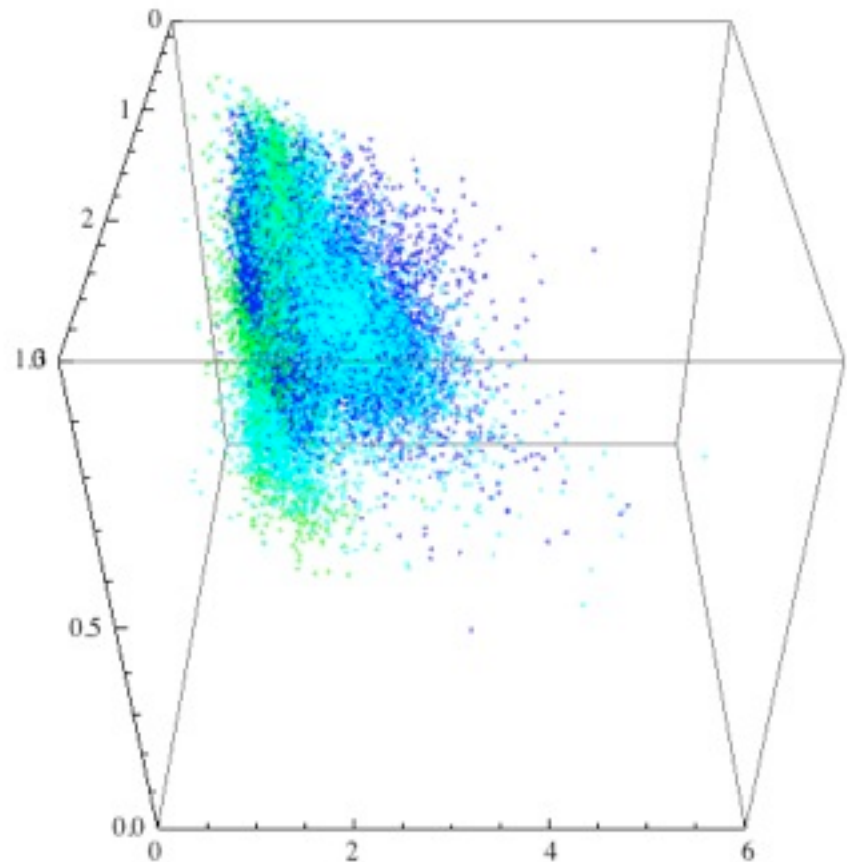
Data set

CCI description

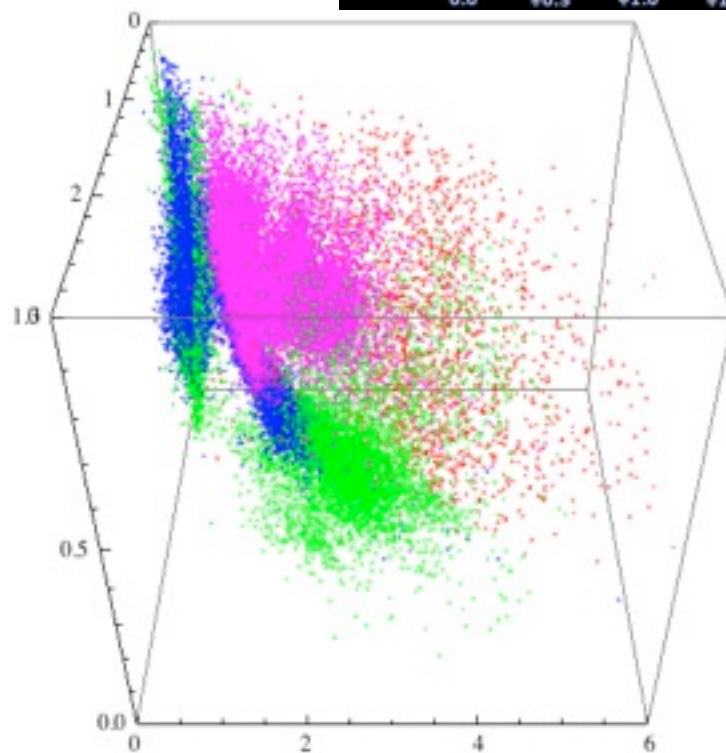
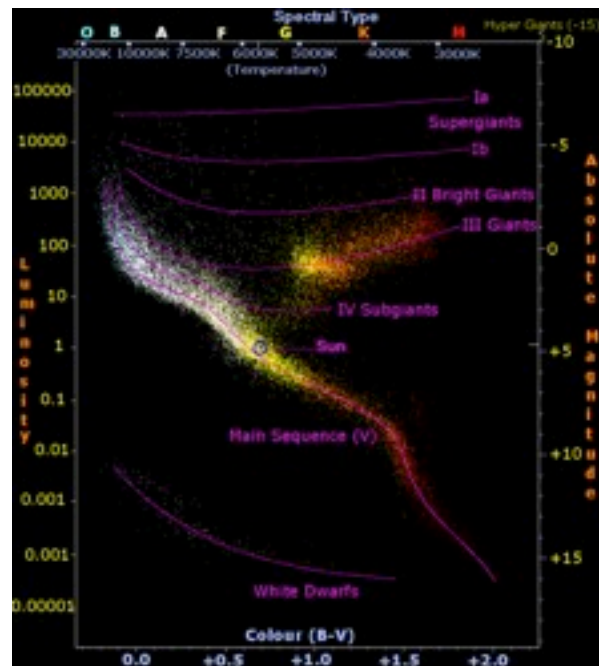
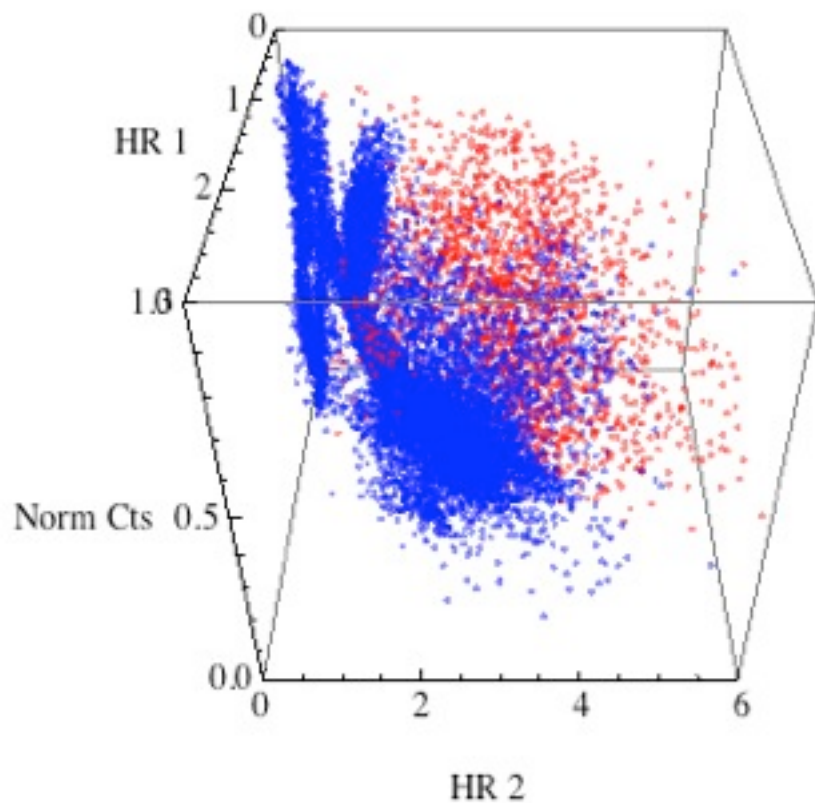
Physical interpretations

Statistical solutions (Luke)

→ Future work



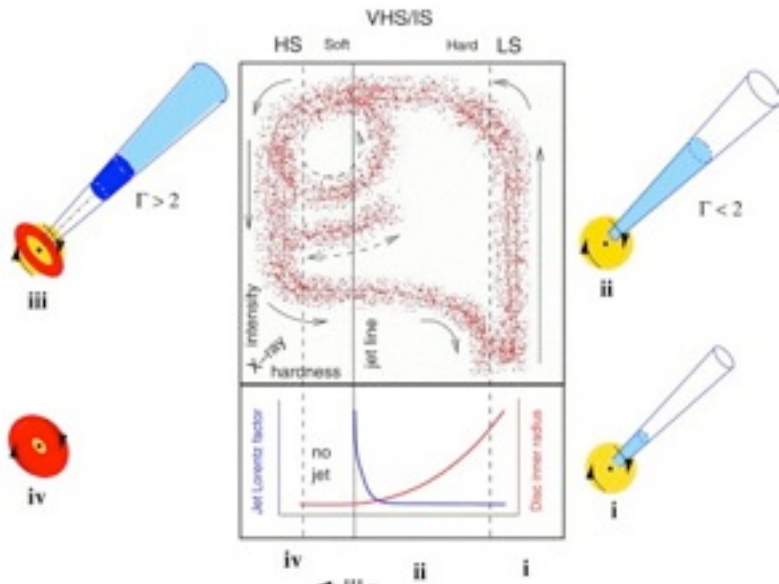
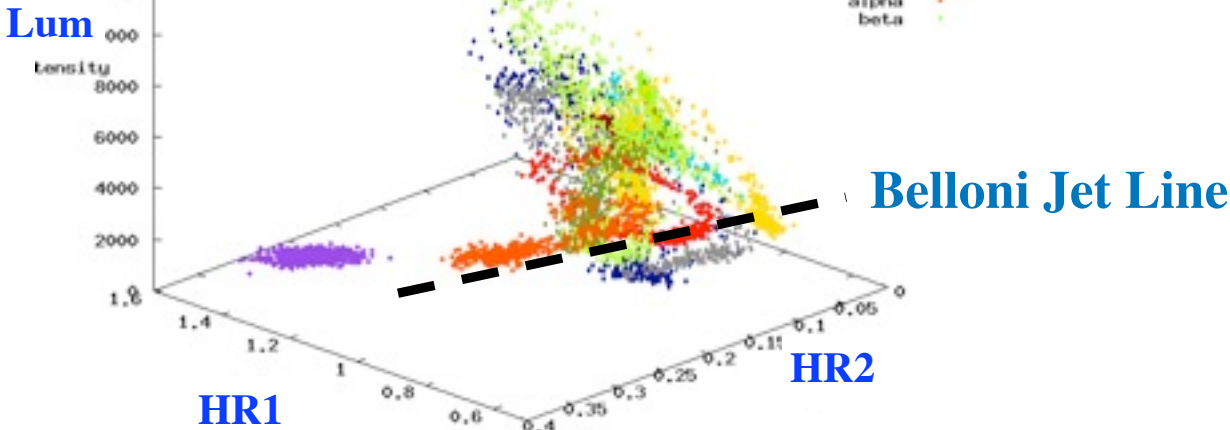
Template from known sources



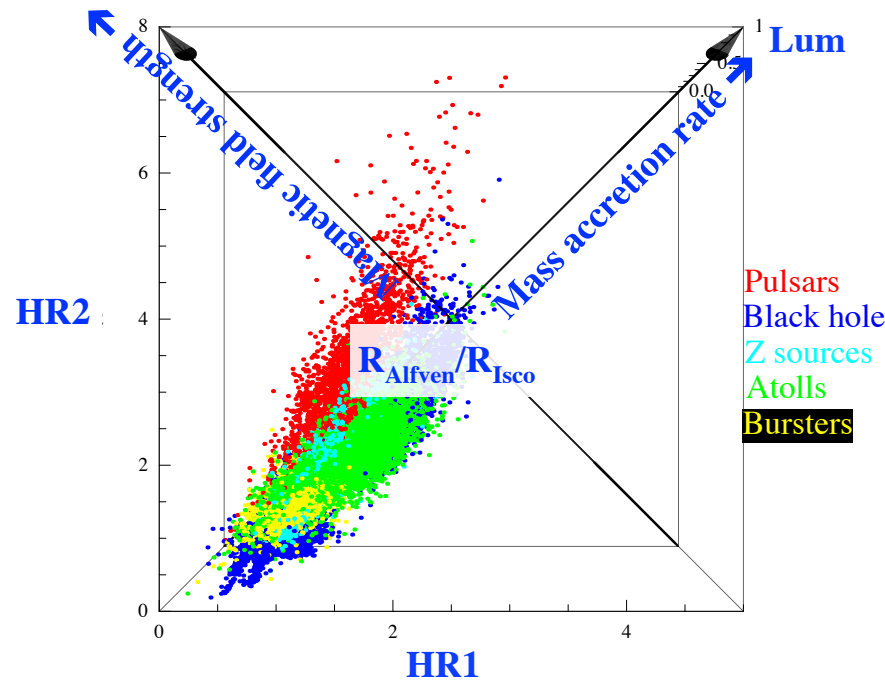
GRS 1915+105 Belloni states

- delta
- chi2
- lambda
- gamma
- mu
- theta
- kappa
- rho
- nu
- alpha
- beta

Putting in the numbers.

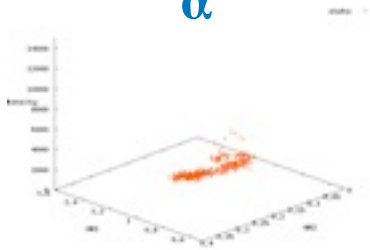


Fender, Belloni, & Gallo (2004)

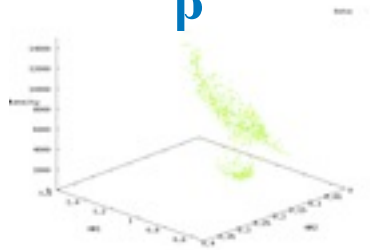


Individual sources with better resolution

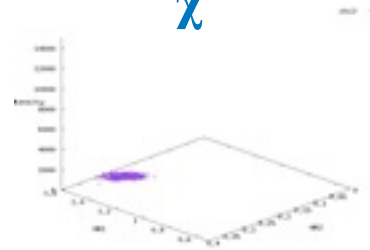
α



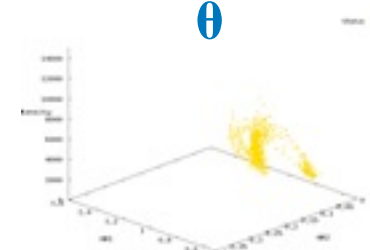
β



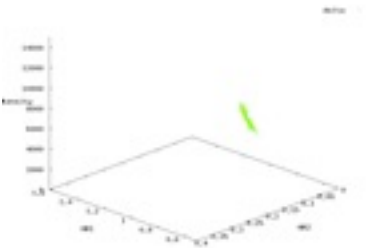
χ



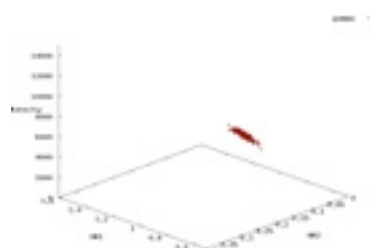
θ



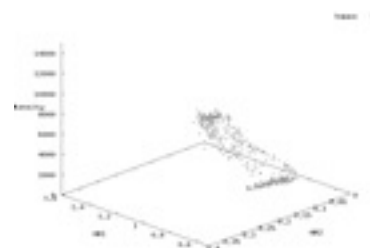
δ



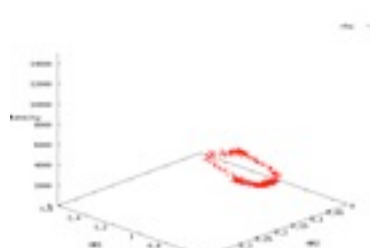
γ



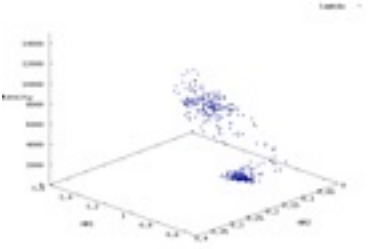
κ



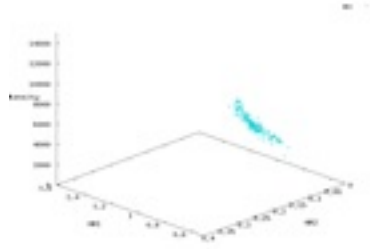
ρ



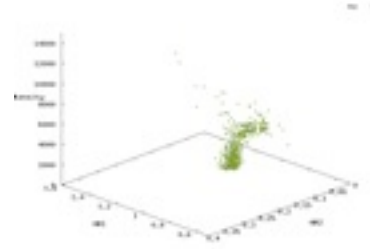
λ



μ



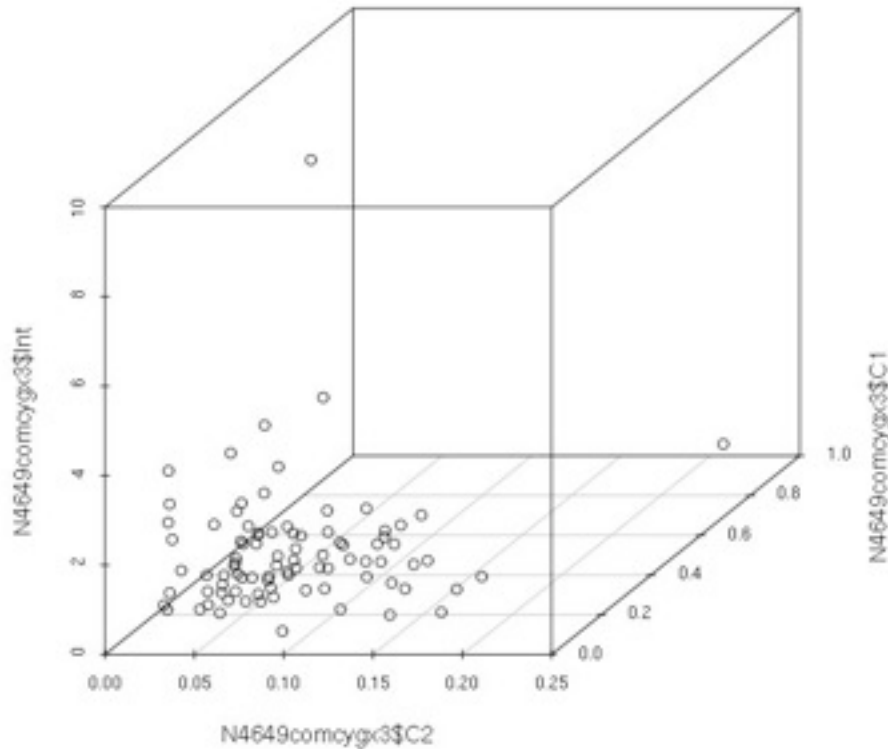
ν



Peris 2013

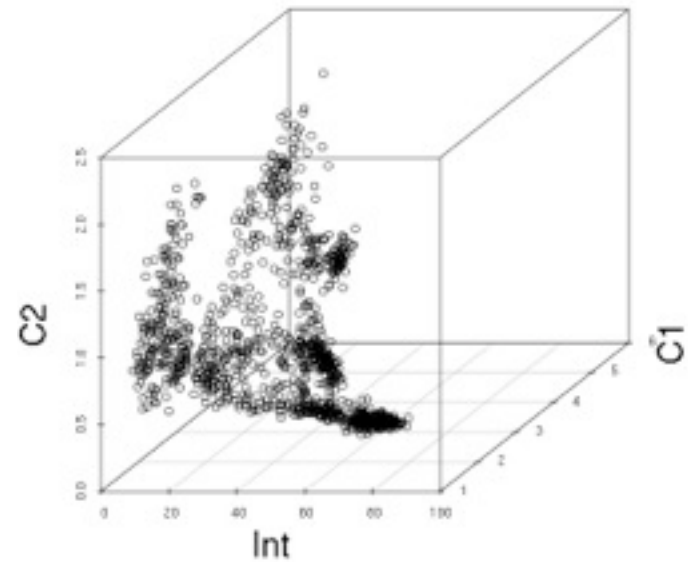
PCA Data of GRS1915+105 Belloni states

X-ray binaries in external galaxies: NGC4649



Chandra ACIS data from Dong-
Woo Kim and Pepi Fabbiano

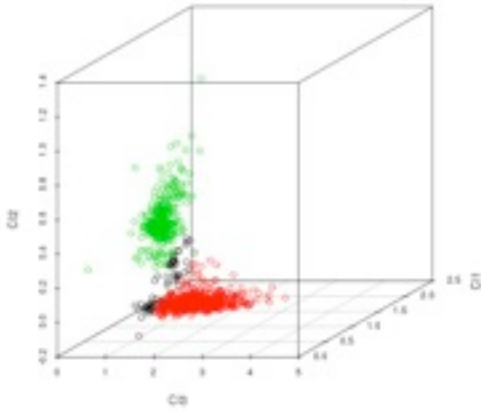
Cyg X-3 Kalkonen states



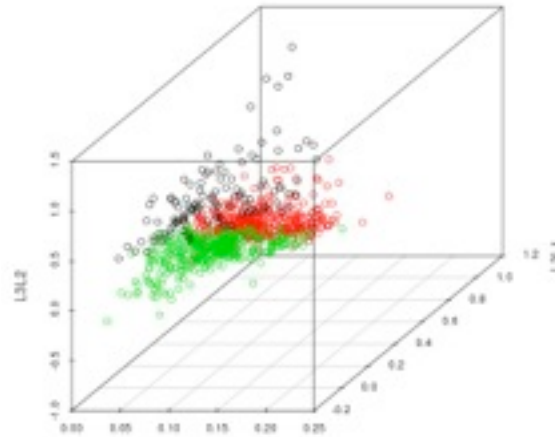
Chandra grating data from Mike
McCollough

MAXI data

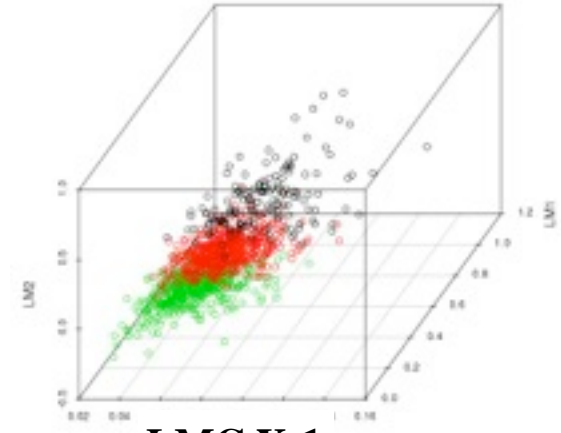
Freshwater et al 2013



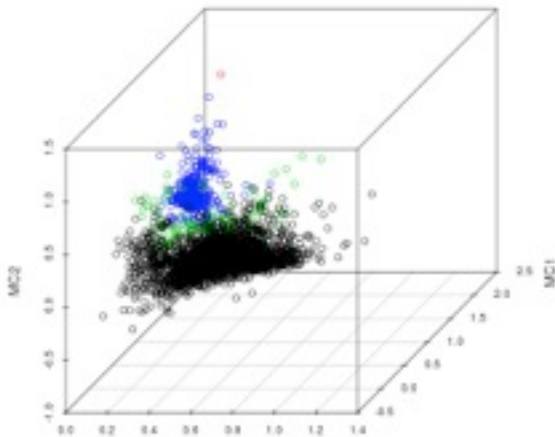
Cyg X-1



LMC X-3



LMC X-1



Cyg X-1, LMC X-1, LMC X-3

Slit camera with a collecting area of 5000 cm².

90-98% of sky every 96 minutes.

Sensitivity: 3 mCrab

Energy range: 0.5-30 keV

Resolution: 18% at 6 keV)

Monitoring over 1000 sources.



What we are working on...

Defining geometric loci for classification of unknown objects.

Identifying the physics that drives objects to specific locations in CCI

Quantifying the disk-jet connection:

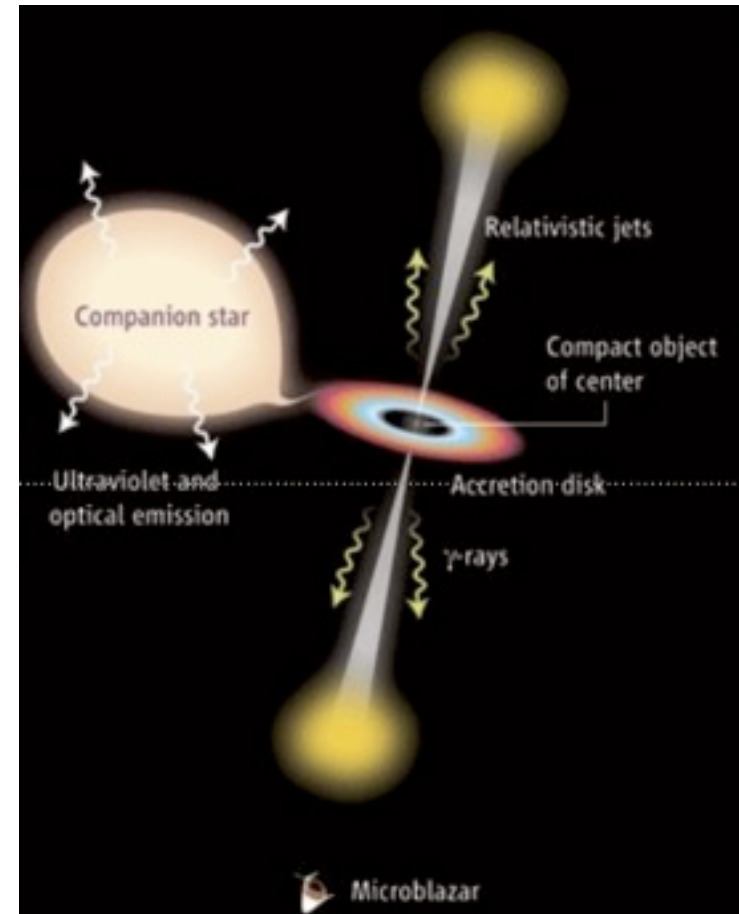
When will an accreting neutron star become a microquasar rather than a pulsar?

When will a black hole X-ray binary evolve into a microquasar phase?

Studying states within a given object (need better resolution data)

Studying populations in other galaxies.

Expanding to other databases, instruments, and object classes.



http://hera.ph1.uni-koeln.de/~heintzma/U1/MIV_microq.htm

XRB classification scheme

Binary systems containing black holes:*

Dynamically well determined with massive companions

Dynamically well determined with low-mass companions

Black hole candidates

Binary systems containing neutron stars:**

Systems with high mass companions

Pulsars

Non-pulsing

Systems with low mass companions

Pulsars

Non-pulsing

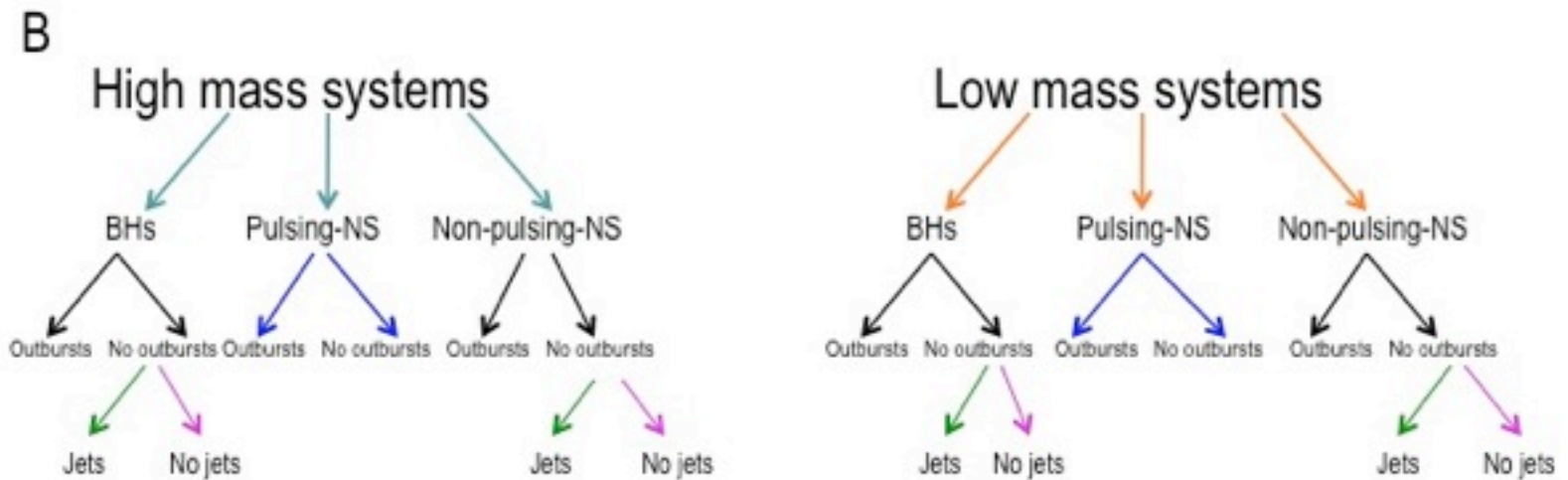
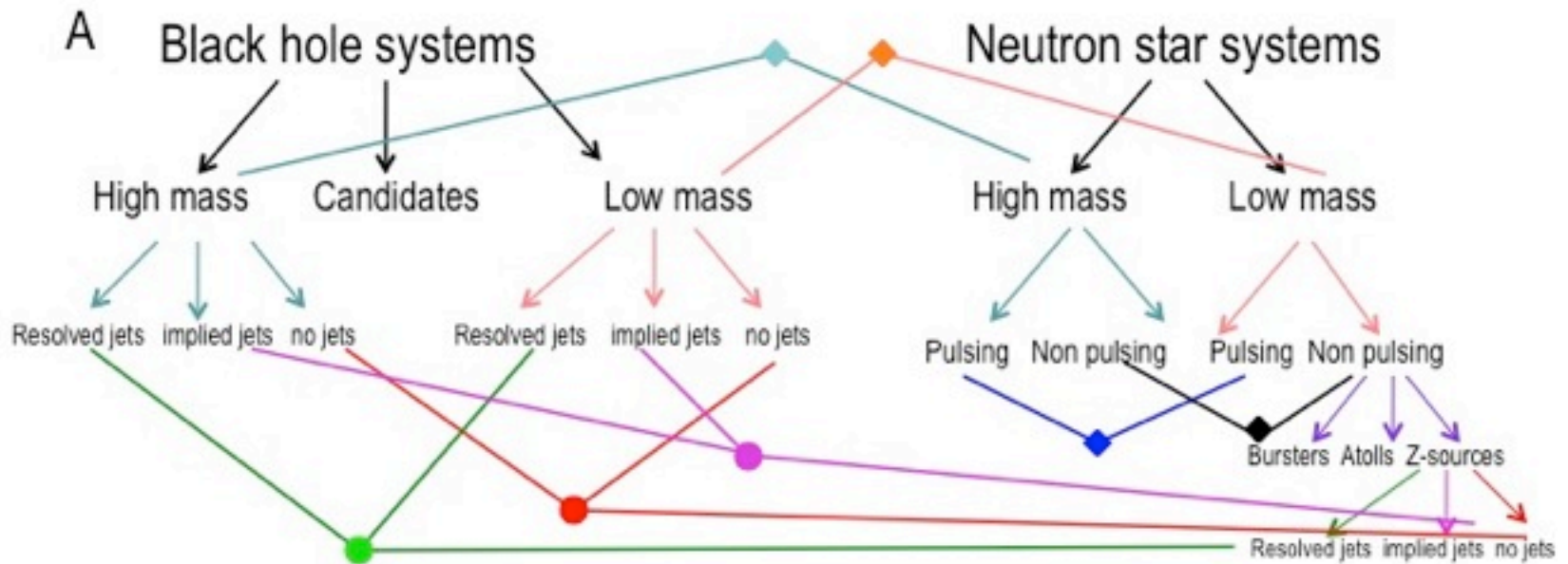
Z-sources

Atolls

Bursters

*From Remillard & McClintock 2006

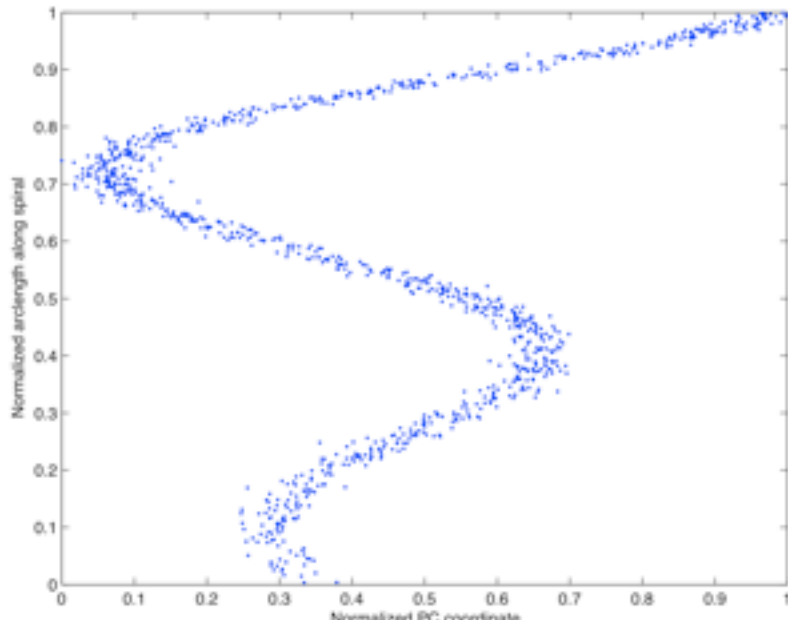
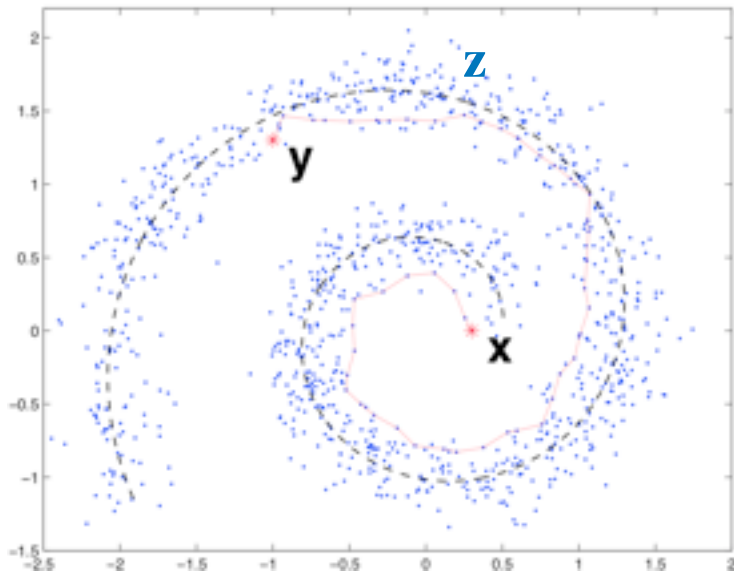
**Liu, van Paradijs, & van den Heuvel 2000,2001



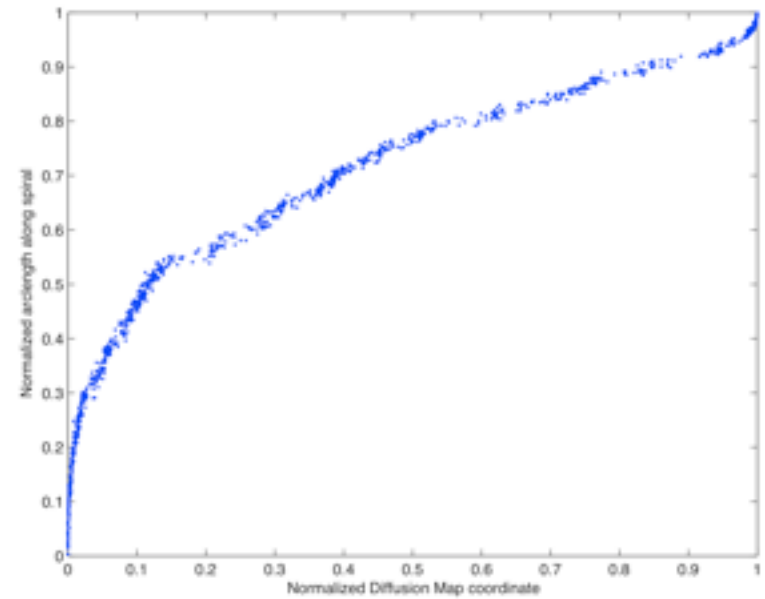
Sample heirarchical clustering schemes.

Capturing geometries

Richards et al (2008)



Principal Components Analysis
Analysis



Spectral Connectivity