

PREVIOUS  
LECTURE:

“REAL” MAXIMUM LIKELIHOOD  
METHOD: POISSONIAN DATA

FINDING PERIODICITIES IN DATA

- LOMB-SCARLE DIAGRAMS
- PHASE DISPERSION MINIMISATION
- FOURIER TECHNIQUES

OAF2 CHAPTER 6.1 & 6.2

NUM RES CHAPTER 13.8, 14.3, 14.5 & 14.7

# PERIOD FINDING II

## PHASE-DISPERSION MINIMISATION: PDM

FOLD DATA GIVEN A TRIAL PERIOD IN M BINS

CALCULATE THE VARIANCE IN EACH BIN

LARGE VARIANCE

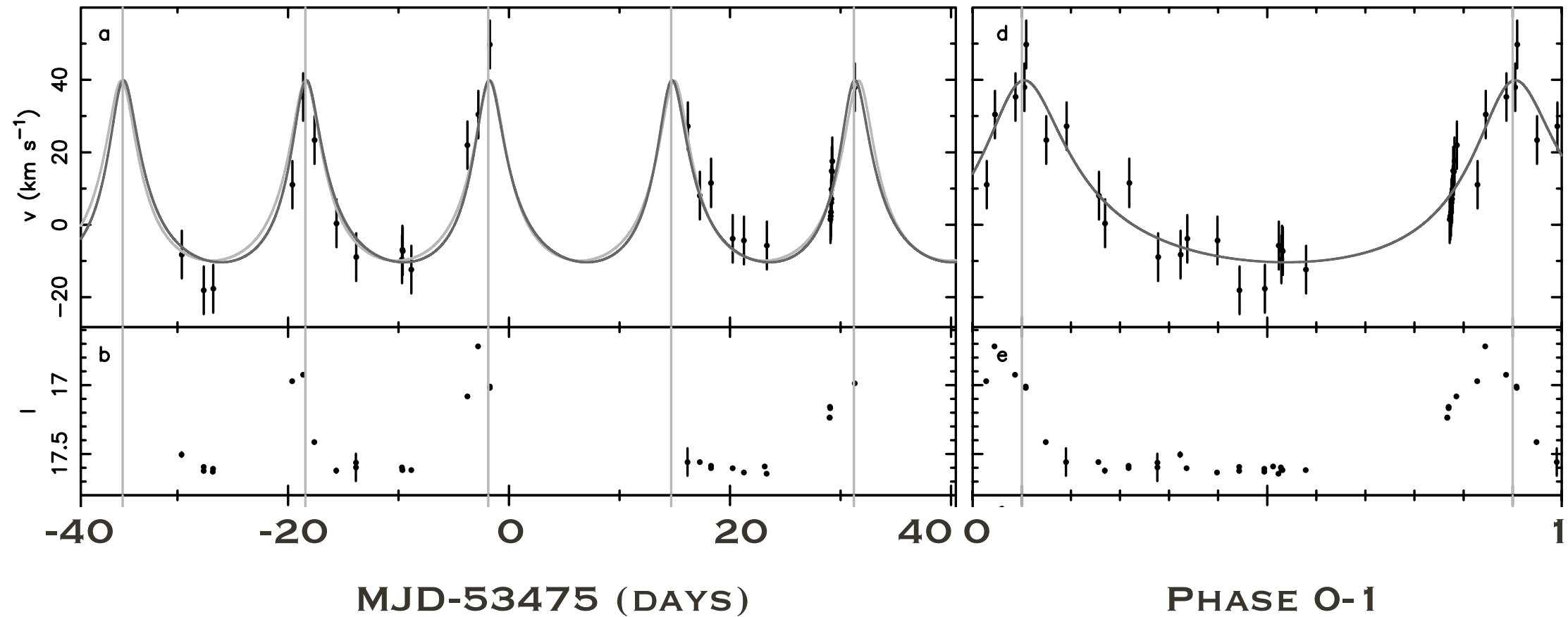
NOT THE RIGHT PERIOD



$$\sigma^2 = \frac{1}{N-1} \sum_{i=1}^N (x_i - \bar{x})^2 \quad \text{VARIANCE IN THE DATA}$$

$$s_k^2 = \frac{1}{N-1} \sum_{j=1}^{n_k} (x_j - \bar{x})^2 \quad \text{VARIANCE IN ONE SAMPLE}$$

# LIGHT CURVE AND FOLDED LIGHT CURVE



**HERE INDEPENDENT BINS, COULD  
ALSO HAVE “SLIDING WINDOW” BINS,  
EACH DATA POINT IN MORE THAN 1 BIN**

# PDM (CONTINUED)

$$s^2 = \frac{\sum_{k=1}^M (n_k - 1) s_k^2}{\sum_{k=1}^M n_k - M} \quad \text{VARIANCE IN THE SAMPLES}$$

  $\theta = \frac{s^2}{\sigma^2} \quad \text{WRONG PERIOD } \Theta \approx 1$

VARIANCE IN THE SAMPLES = VARIANCE IN THE DATA

“RIGHT” PERIOD  $\Theta \ll 1$

SCRAMBLE DATA IN A MONTE CARLO SIMULATION TO  
CALCULATE SIGNIFICANCES

TODAY

CORRELATIONS

STUDENT'S T

PEARSON'S R

SPEARMAN'S RANK

SCIENCE PROJECTS AT SRON

# STUDENT'S T

HOW DIFFERENT ARE TWO MEANS?

$$s_d = \left( \frac{\sum_{i \in A} (x_i - \bar{x}_A)^2 + \sum_{i \in B} (x_i - \bar{x}_B)^2}{N_A + N_B - 2} \left( \frac{1}{N_A} + \frac{1}{N_B} \right) \right)^{0.5}$$

STANDARD ERROR ON THE DIFFERENCE IN THE MEANS

$$t = \frac{\bar{x}_A - \bar{x}_B}{s_d}$$

SIGNIFICANCE IN  $t$ : IS DISTRIBUTED AS  $t$ 'S DISTRIBUTION WITH  
 $N_A + N_B - 2$  DEGREES OF FREEDOM

# WHAT IS STUDENT'S T DISTRIBUTION?

NUMERICAL RECIPES CHAPTER 6.4

$$A(t|\nu) = \frac{1}{\nu^{1/2} B(\frac{1}{2}, \frac{\nu}{2})} \int_{-t}^t \left(1 + \frac{x^2}{\nu}\right)^{-\frac{\nu}{2}} dx$$

$A(t|\nu)$  IS OFTEN NUMERICALLY CALCULATED WITH AN INCOMPLETE BETA FUNCTION  
(SEE NUM RES EQUATION 6.4.9)

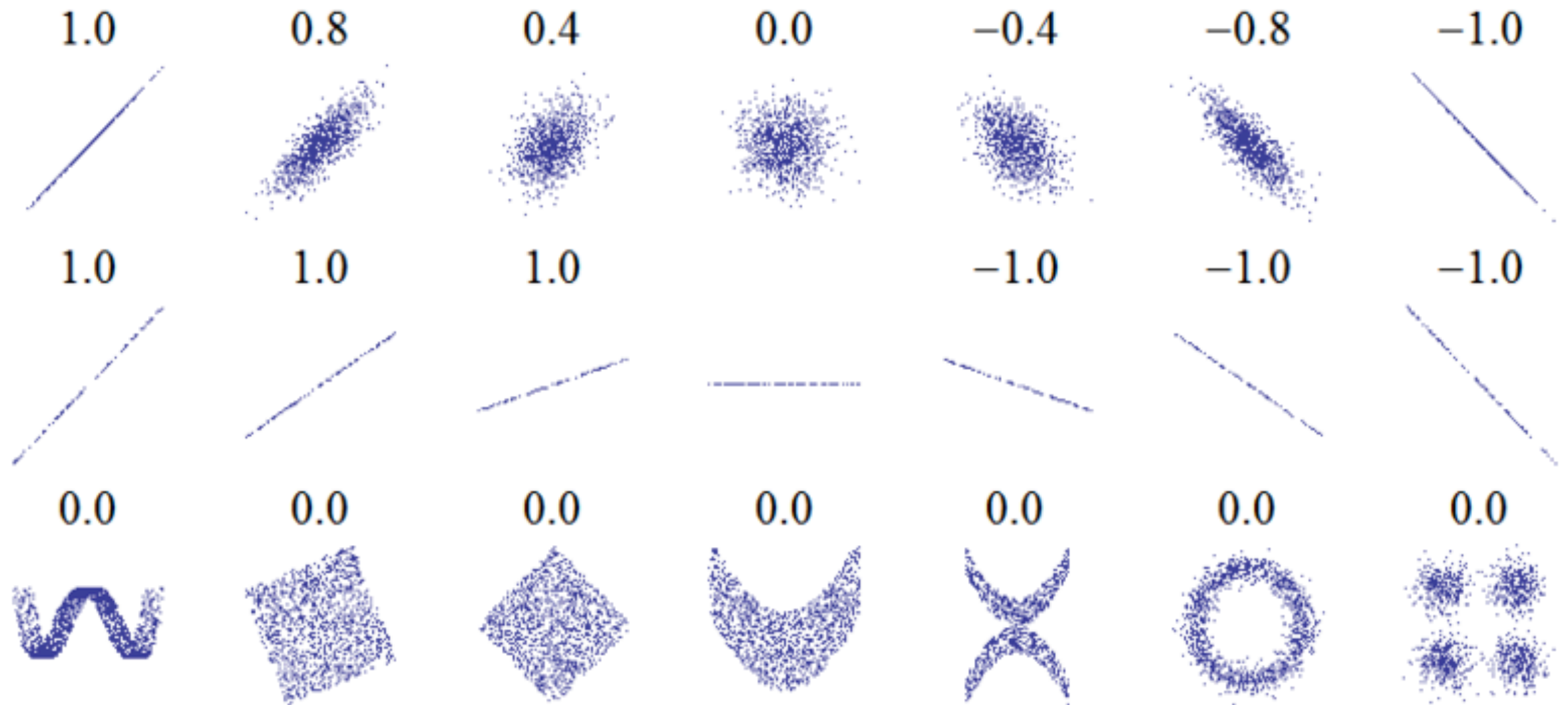
THIS CAN BE EXPANDED TO CASES WHERE THE TWO MEASUREMENT SETS A AND B  
HAVE DIFFERENT VARIANCES.

# LINEAR CORRELATION

## PEARSON'S R FORMAL DEFINITION OF PEARSON'S R

$$\rho_{x,y} = \frac{\text{cov}(x, y)}{\sigma_x \sigma_y} = \frac{E((X - \mu_x)(Y - \mu_y))}{\sigma_x \sigma_y}$$
$$r = \frac{\sum_i (x_i - \bar{x})(y_i - \bar{y})}{\sqrt{\sum_i (x_i - \bar{x})^2} \sqrt{\sum_i (y_i - \bar{y})^2}}$$

FROM WIKIPEDIA



**SIGNIFICANCE & CONFIDENCE REGION? BOOTSTRAP!**

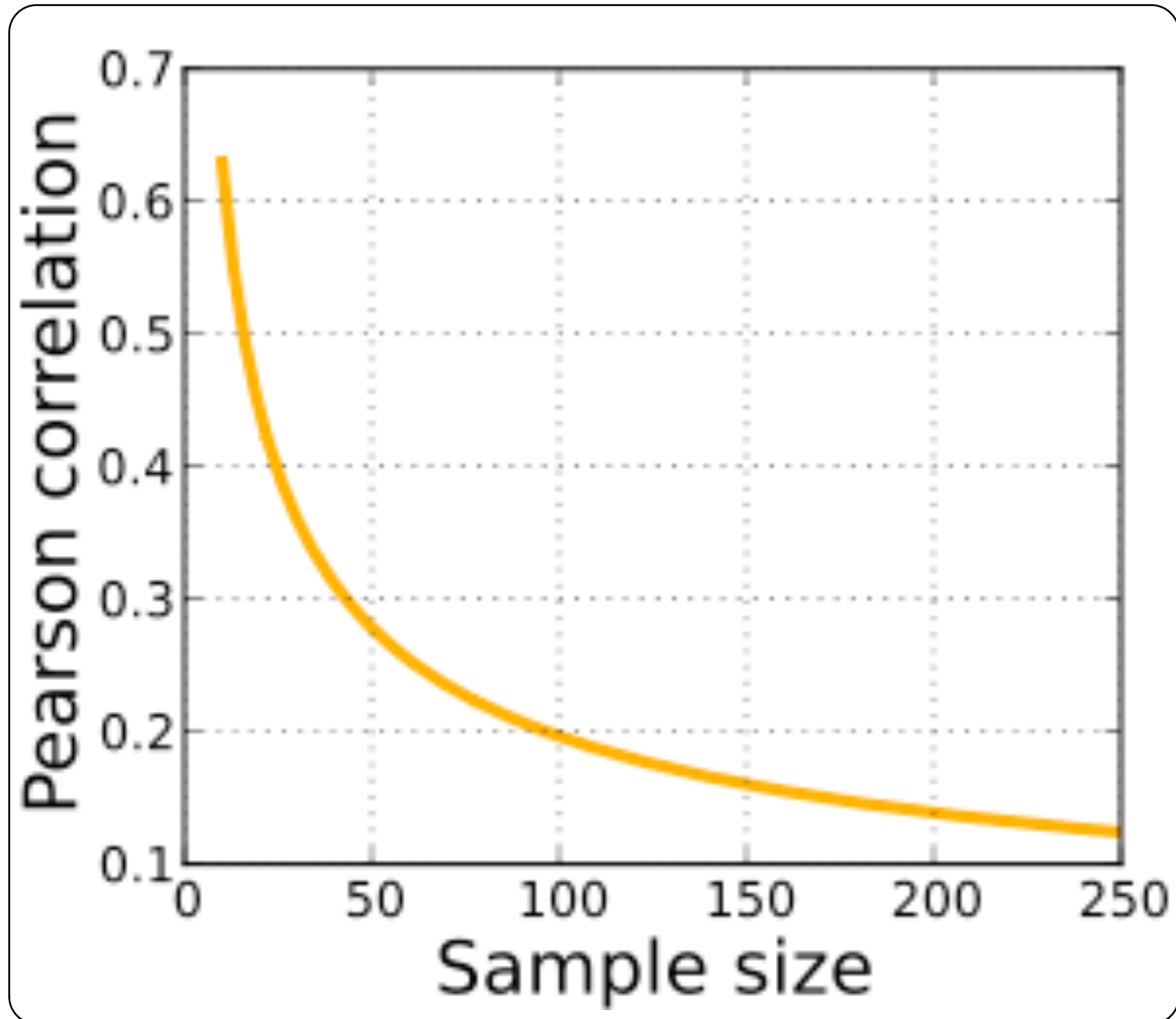
**MAKE NEW RANDOM PAIRS  $x_i$  AND  $y_i$  AND REPEAT CALC R**



# ANALYTICAL APPROX

PROBABILITY THAT  $|r| > |r_{\text{obs}}|$  by chance =  $\text{erfc} \left( \frac{|r| \sqrt{N}}{\sqrt{2}} \right)$

IN THE CASE OF THE NULL HYPOTHESIS OF UNCORRELATED X AND Y



FROM WIKIPEDIA

# NON-PARAMETRIC CORRELATION

## SPEARMAN'S RANK

$$\rho = 1 - \frac{6\sum d_i^2}{n(n^2 - 1)}$$

$$d_i = x_i - y_i$$

DIFFERENCE BETWEEN RANKS  $x_i$  AND  $y_i$

**SIGNIFICANCE & CONFIDENCE REGION? BOOTSTRAP!**

**MAKE NEW RANDOM RANK PAIRS  $x_i$  AND  $y_i$  AND REPEAT**

**CALC RHO**

**IF SAME DATA VALUE APPEARS MORE THEN  
ONCE:**

$$\rho = \frac{\sum_i (x_i - \bar{x})(y_i - \bar{y})}{(\sum_i (x_i - \bar{x})^2 \sum_i (y_i - \bar{y})^2)^{1/2}}$$

**ASSIGN SAME RANK TO THE DATA WHERE  
VALUE IS THE SAME: AVERAGE RANK!**

	<b>RANK</b>	<b>RANK</b>
<b>X_1 = 1.2</b>	<b>1 OR 2</b>	<b>1.5</b>
<b>X_2 = 3.2</b>	<b>4</b>	<b>4</b>
<b>X_3 = 2.8</b>	<b>3</b>	<b>3</b>
<b>X_4 = 1.2</b>	<b>1 OR 2</b>	<b>1.5</b>

# EXAMPLE SPEARMAN'S RANK (FROM WIKIPEDIA)

IQ HOURS OF TV PER WEEK

$X_i$	$Y_i$	RANK $X_i$	RANK $Y_i$	$D_i$	$D_i^2$
86	0	1	1	0	0
97	20	2	6	-4	16
99	28	3	8	-5	25
100	27	4	7	-3	9
101	50	5	10	-5	25
103	29	6	9	-3	9
106	7	7	3	4	16
110	17	8	5	3	9
112	6	9	2	7	49
113	12	10	4	6	36

**SUM OVER  $D_i^2 = 194$ ,  $N=10$ ,  $RHO = -0.176$**

## SCIENCE AT SRON STAFF MEMBERS

 **WIM HERMSEN: PULSARS, INTEGRAL DATA**

 **JEAN IN 'T ZAND: TYPE I X-RAY BURSTS (MOSTLY BROADBAND X-RAY SPECTRA)**

 **JELLE KAASTRA: CLUSTERS OF GALAXIES, ISM STUDIES (HIGH-RESOLUTION X-RAY SPECTROSCOPY)**

 **ELISA COSTANTINI: ISM STUDIES, AGN (HIGH-RESOLUTION X-RAY SPECTROSCOPY)**

 **LUCIEN KUIPER: PULSARS, INTEGRAL SOURCES (X-RAY TIMING, BROADBAND X-RAY SPECTRA)**

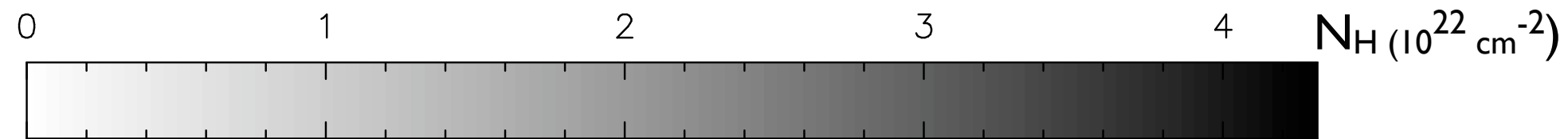


**PETER JONKER: LOW-MASS X-RAY BINARIES, NEUTRON STARS & (INTERMEDIATE MASS) BLACK HOLES**

**OPTICAL: SPECTROSCOPY/PHOTOMETRY**

**X-RAY: ASTROMETRY, PHOTOMETRY, SPECTROSCOPY**

# Predictions: $\sim 400$ LMXBs

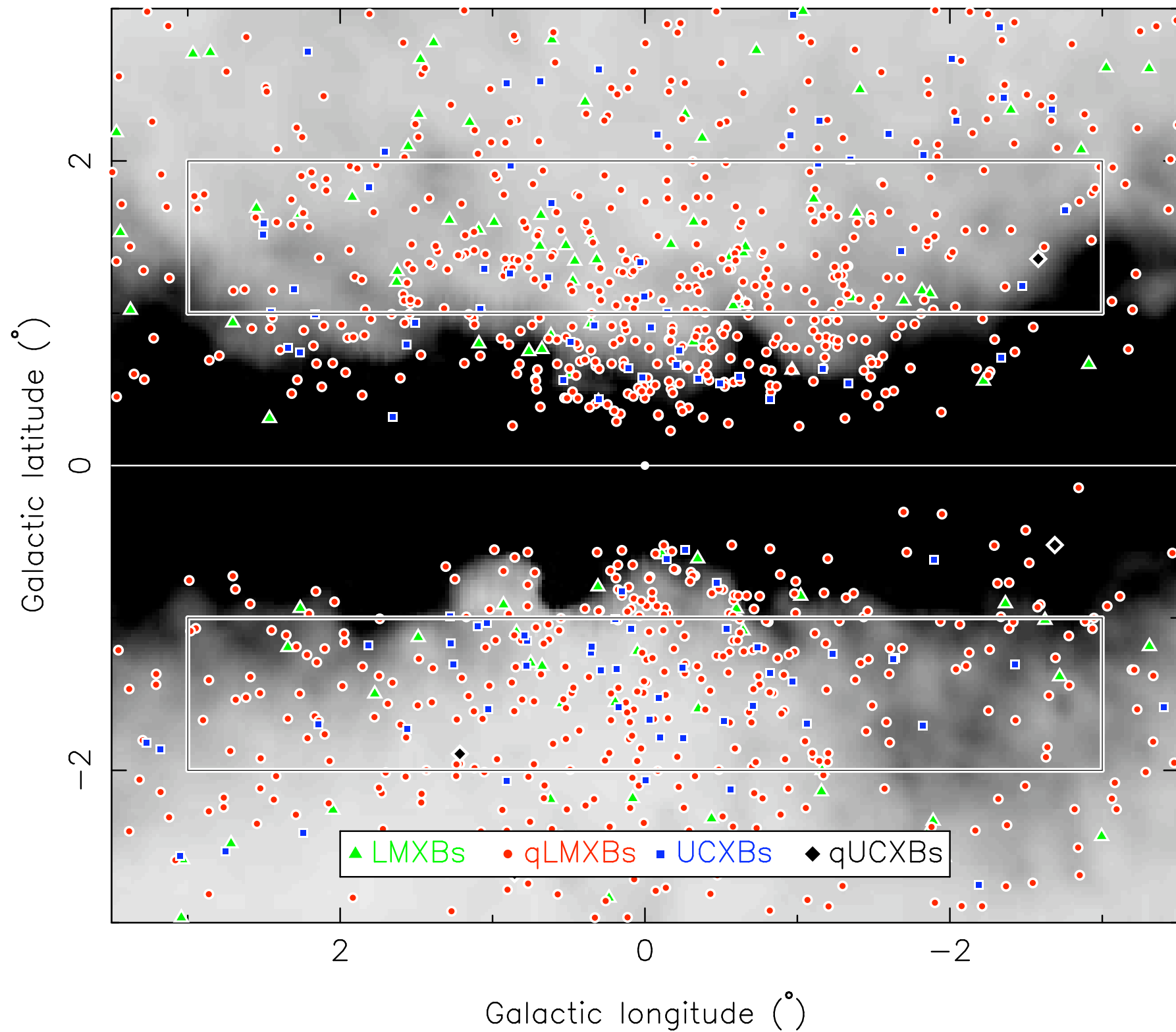


CVs  $\sim 450$

qLMXBs  $\sim 350$

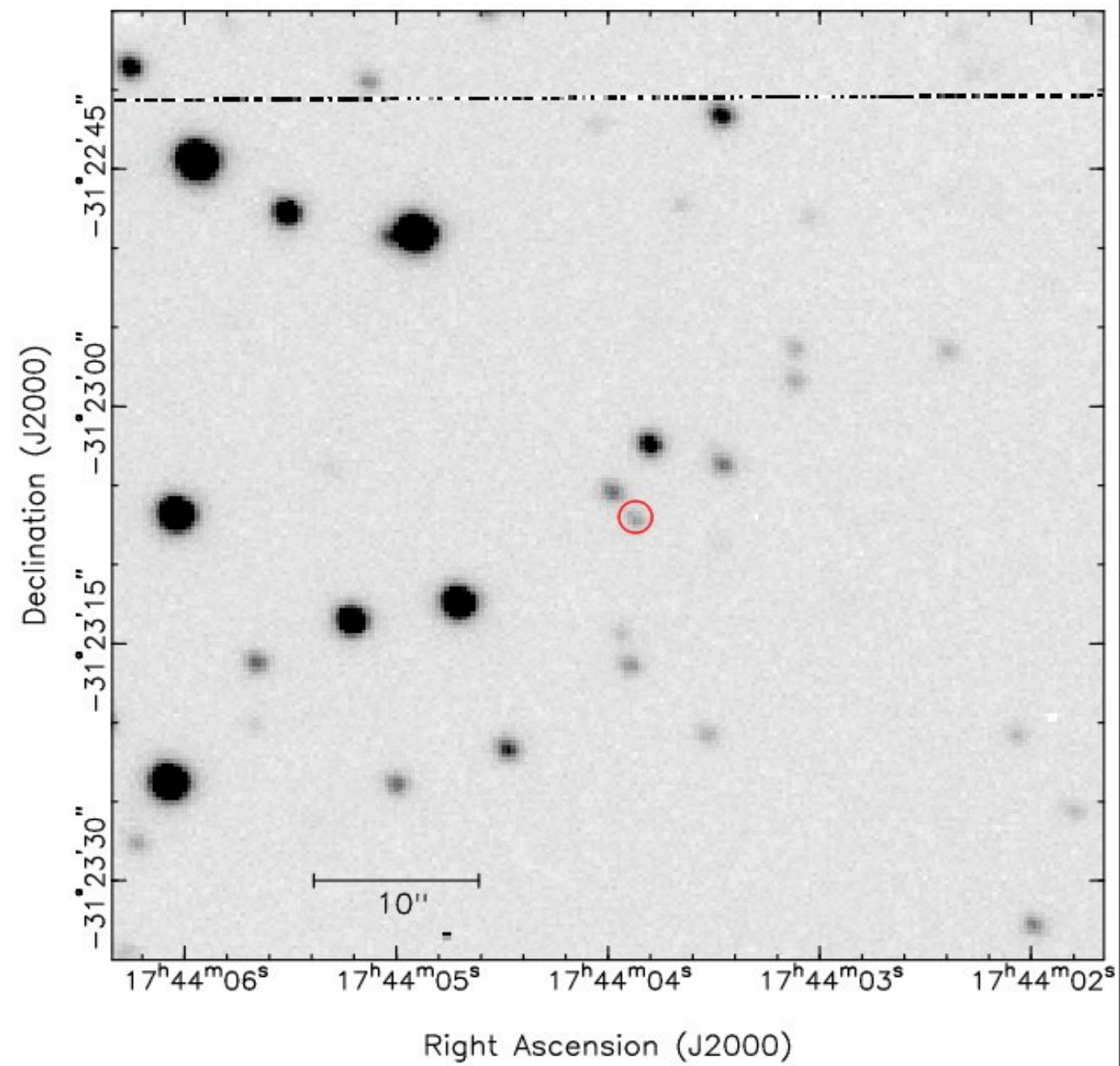
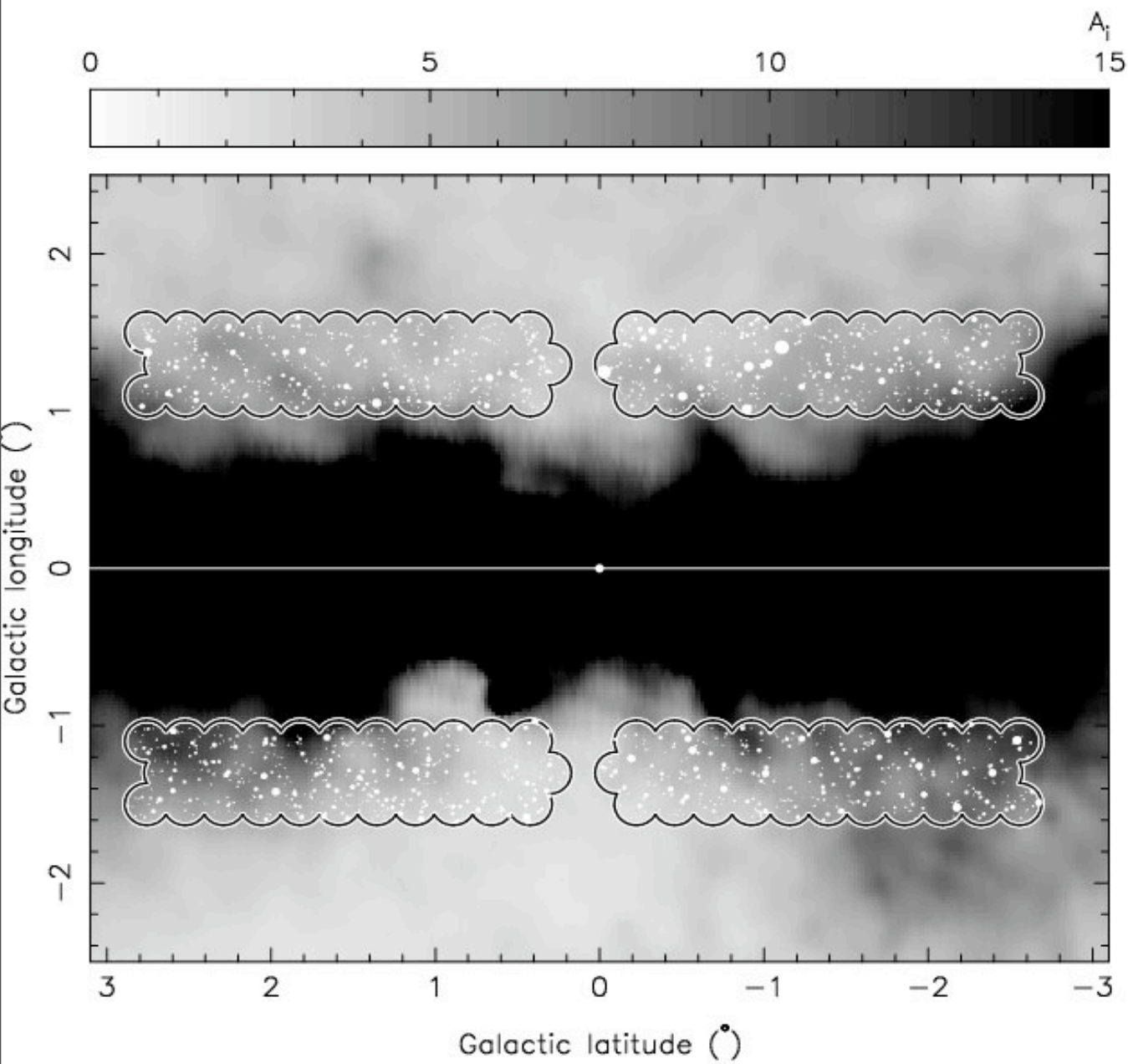
UCXBs  $\sim 50$

RS CVn  $\sim 550$



Details of Galactic model: Nelemans et al. 2004

# GALACTIC BULGE SURVEY





**CORE GROUP OF PEOPLE WORKING ON THE GBS:  
ME (PI)**

**EVA RATTI (PHD STUDENT)**

**GIJS NELEMANS (NIJMEGEN UNIV)**

**LENNART VAN HAAFTEN (PHD STUDENT, NIJM.)**

**DANNY STEEGHS (WARWICK UNIV, UK)**

**MANUEL TORRES (HARVARD-SMITHSONIAN CFA  
BECOMES MY POST-DOC, MAY 1)**

**SEVERAL STUDENT PROJECTS, INCLUDING MASTER  
STUDENT PROJECTS**