

XSPEC Tutorial and Statistics

Basic steps for X-ray spectral analysis

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Basic steps for *X-ray spectral analysis*

Where can I find *XSPEC*?

- XSPEC is part of the NASA HEASoft software suite (FTOOLS)
- The latest version is HEASoft 6.29c (Sept. 2021) – xspec V12.12.0

<https://heasarc.gsfc.nasa.gov/docs/software/heasoft/>

- Supported architectures:
 - macOS/Mac OS X
 - PC Linux – Ubuntu (or other Debian-based Linux)
 - PC Linux – Fedora (or other RPM-based Linux)

XSPEC is a command-driven, interactive, X-ray spectral-fitting program, designed to be completely detector-independent

Alternatively: **Sherpa**

<https://cxc.cfa.harvard.edu/sherpa/>

Step 1a: 'grouping' spectra

Once X-ray spectra are extracted and response matrices are produced, four files (fits format) are used within XSPEC

- source spectrum
- background spectrum
- ARF response matrix
- RMF response matrix

Before loading these files in XSPEC, it is better to:

- (1) associate a source spectrum with its background file and response matrices (RMF and ARF);
- (2) group the spectral counts using a binning of e.g. 25 counts/bin (depending on the source photon statistics and the 'sampling' of the instrument spectral resolution) and allow application of the χ^2 **statistics** (it is required to be in the Gaussian regime in each spectral bin).
Alternatively, in low photon regime, use unbinned (or binned to 1 count/bin) data and **Cash statistics**

```
grppha pn.pi pn_25.grp comm="group min 25 & chkey BACKFILE back_spectrum.fits  
& chkey ANCRFILE pn.arf & chkey RESPFIL pn.rmf & exit"
```

i.e.: `grppha input_spectrum output_spectrum [...]`

Name all of the files properly!

Step 1b: loading data in XSPEC and “setup” commands

xspect

xspect> data pn_25.grp

load the grouped spectrum (produced in step 1a)

xspect> ignore bad

ignore spectral bins flagged as bad

xspect> ignore ** -0.3 7.2 -**

ignore spectral bins below 0.3 keV and above 7.2 keV (to be verified, i.e., adapted to your specific data, src. vs. bkg intensity)

xspect> cpd /xw

to change the plotting device (e.g., on screen, on PS file)

xspect> plot ldata

plot the data in log scale



Energy: with “.”

Otherwise: interpreted as channels
(conversion made via the RMF)

Loading multiple datasets

In case of **multiple datasets** (adopting the same model)

```
xspec> data 1:1 pn_25.grp 2:2 mos1_25.grp 3:3 mos2_25.grp
```

load all datasets at the same time

```
xspec> ignore 1-3:**-0.3 7.2-**
```

select the proper energy range for all datasets (1-3)

```
xspec> cpd /xw
```

```
xspec> plot ldata
```

When **multiple datasets** are used, remember to place in front of all models the **constant model** [e.g., mo **cons**(pha*po+...)] to account for cross-calibration uncertainties among different instruments of the same telescope/different telescopes and some possible source flux variability in case of multiple observations not taken simultaneously.

The first constant should be fixed to 1, the others are left free to vary (i.e., are part of the fitting)

xspec> show all

XSPEC version: 12.11.1
Build Date/Time: Mon Sep 28 19:46:54 2020

XSPEC12>data pn_25.grp

Fraction of **src_counts/total_counts**

```
1 file 1 spectrum
Spectrum 1 Spectral Data File: pn_25.grp
Net count rate (cts/s) for Spectrum:1 2.652e+00 +/- 7.965e-03 (96.8 % total)
Assigned to Data Group 1 and Plot Group 1
Noticed Channels: 23-1321
Telescope: XMM Instrument: EPN Channel Type: PI
Exposure Time: 4.441e+04 sec
Using fit statistic: chi
Using test statistic: chi
Using Background File back_spectrum.fits
Background Exposure Time: 4.441e+04 sec
Using Response (RMF) File pn.rmf for Source 1
Using Auxiliary Response (ARF) File pn.arf

Spectral data counts: 121704
```

loaded bkg
and response
files

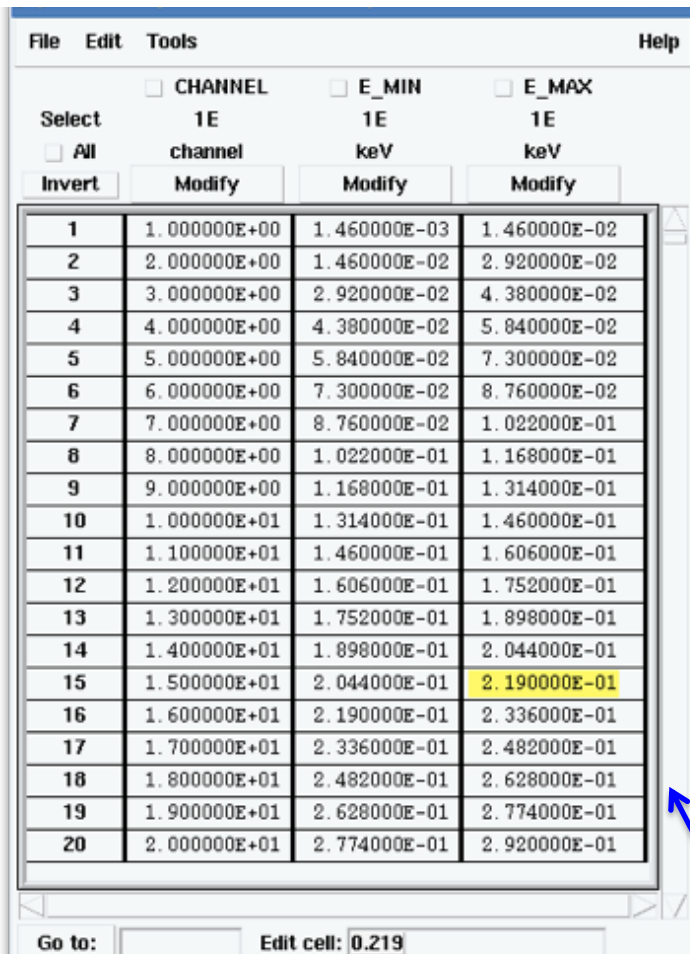
Source net (i.e. background-subtracted) **counts** = data counts × fraction =
=121704 × 0.968

Possible binning choices:

- have enough counts (e.g., 20-25) in each bin and then apply the χ^2 statistics;
- one count/bin and apply the Cash statistics (C-stat, named W-stat if background is subtracted);
- 'sampling' the spectral resolution of the data

Response matrices: RMF

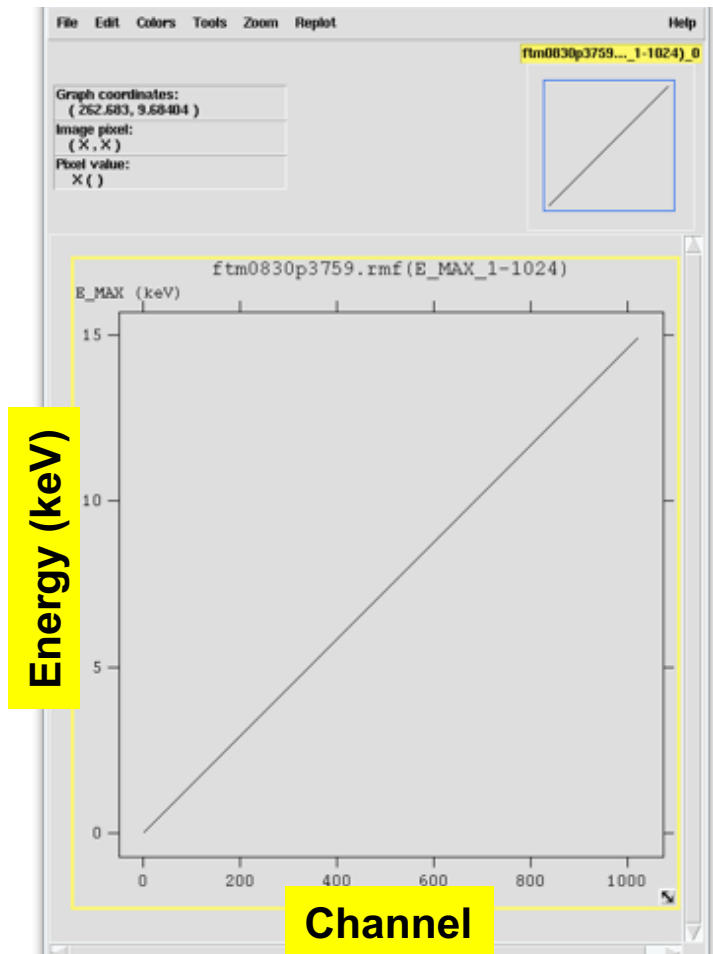
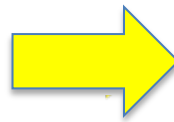
RMF: links the instrumental channel scale with the physical energy (wavelength) scale



The screenshot shows a software window with a menu bar (File, Edit, Tools, Help) and a table of data. The table has four columns: Channel, E_MIN, and E_MAX, each with a '1E' multiplier and a 'Modify' button. The data is as follows:

Channel	E_MIN (keV)	E_MAX (keV)
1	1.000000E+00	1.460000E-03
2	2.000000E+00	1.460000E-02
3	3.000000E+00	2.920000E-02
4	4.000000E+00	4.380000E-02
5	5.000000E+00	5.840000E-02
6	6.000000E+00	7.300000E-02
7	7.000000E+00	8.760000E-02
8	8.000000E+00	1.022000E-01
9	9.000000E+00	1.168000E-01
10	1.000000E+01	1.314000E-01
11	1.100000E+01	1.460000E-01
12	1.200000E+01	1.606000E-01
13	1.300000E+01	1.752000E-01
14	1.400000E+01	1.898000E-01
15	1.500000E+01	2.044000E-01
16	1.600000E+01	2.190000E-01
17	1.700000E+01	2.336000E-01
18	1.800000E+01	2.482000E-01
19	1.900000E+01	2.628000E-01
20	2.000000E+01	2.774000E-01

At the bottom, there is a 'Go to:' field and an 'Edit cell: 0.219' field. A blue arrow points from the 'Edit cell' field to the table.



Visualization of the RMF file using the **ftool fv**

Response matrices: ARF

ARF: indicates the effective response (hence sensitivity) of the mirrors+instrument at a given source position on the detector

fv: Binary Table of ftm0830p3759.arf[1] in /ho

File Edit Tools Help

ENER_LO ENER_HI SPECRESP

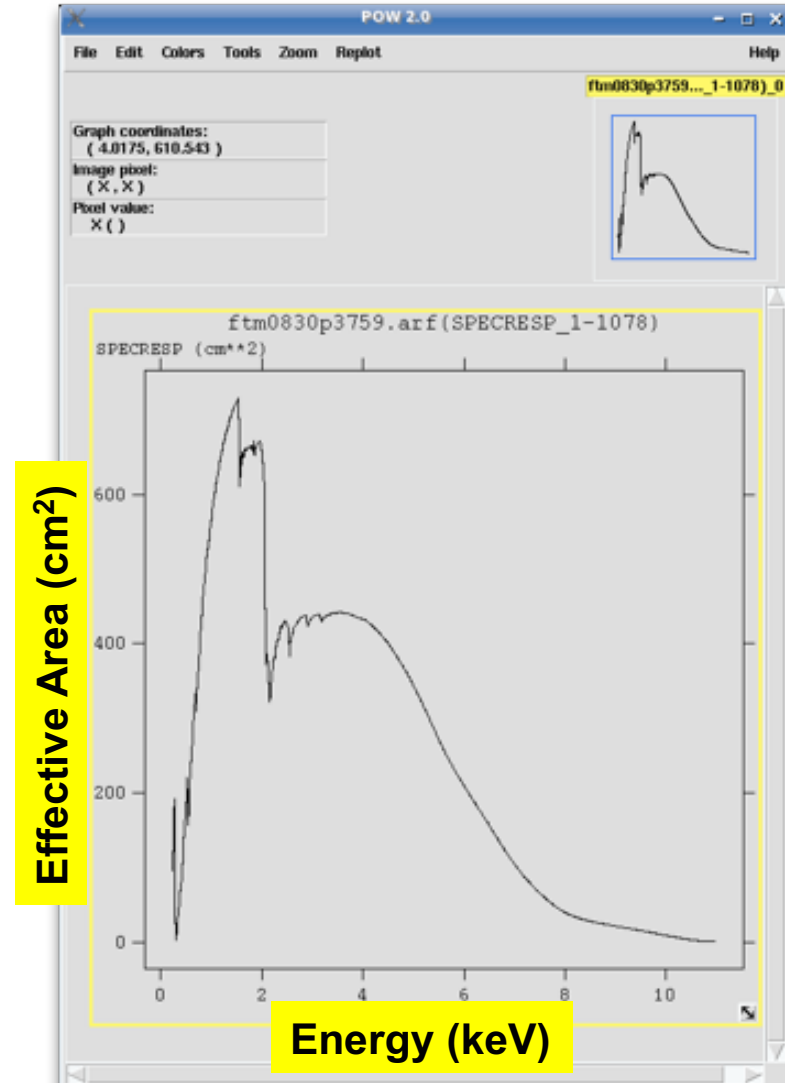
Select 1E 1E 1E

All keV keV cm**2

Invert Modify Modify Modify

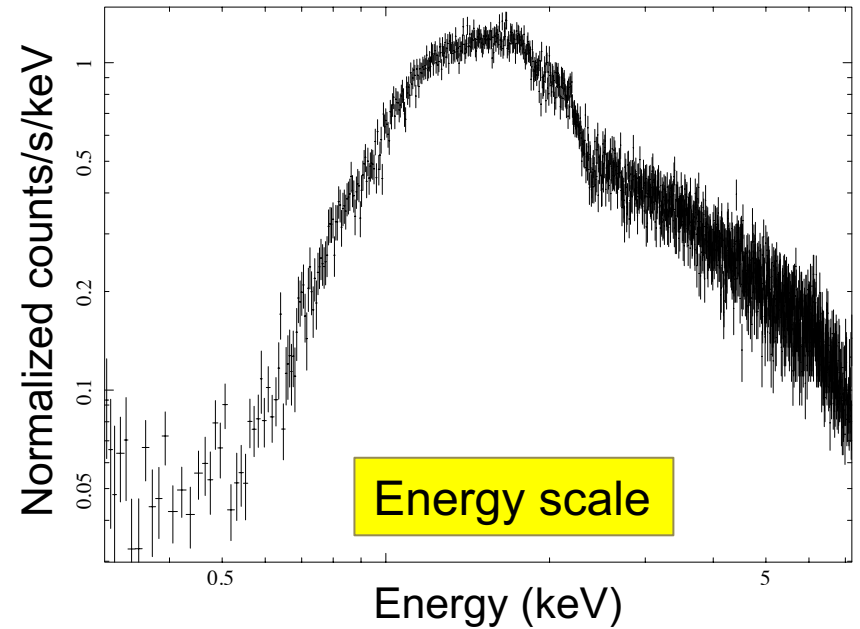
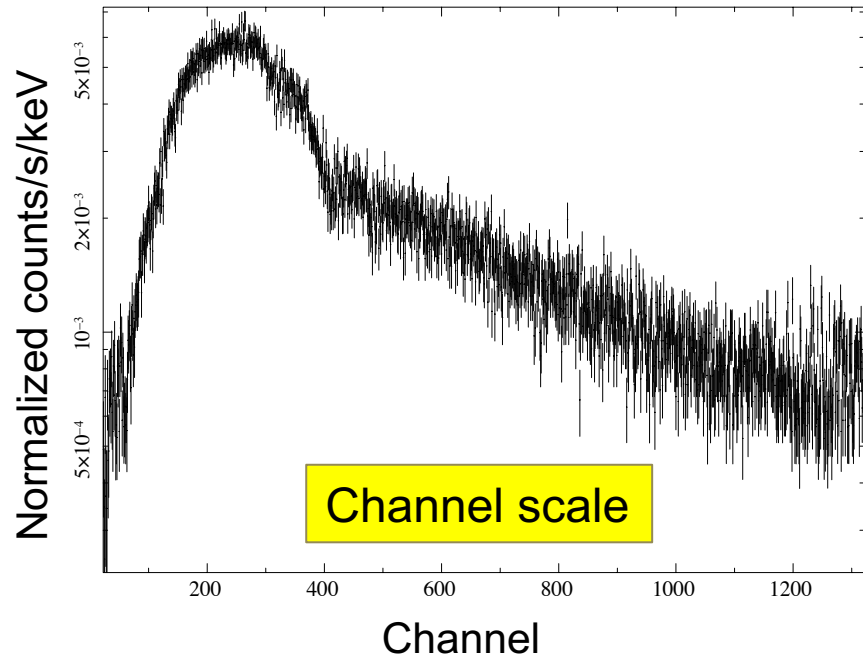
1	2.200000E-01	2.300000E-01	9.414584E+01
2	2.300000E-01	2.400000E-01	1.119709E+02
3	2.400000E-01	2.500000E-01	1.309653E+02
4	2.500000E-01	2.600000E-01	1.518642E+02
5	2.600000E-01	2.700000E-01	1.716482E+02
6	2.700000E-01	2.800000E-01	1.922011E+02
7	2.800000E-01	2.900000E-01	4.741680E+01
8	2.900000E-01	3.000000E-01	2.284590E+00
9	3.000000E-01	3.100000E-01	5.144246E+00
10	3.100000E-01	3.200000E-01	1.563580E+01
11	3.200000E-01	3.300000E-01	2.251595E+01
12	3.300000E-01	3.400000E-01	3.011008E+01
13	3.400000E-01	3.500000E-01	3.743014E+01
14	3.500000E-01	3.600000E-01	4.385400E+01
15	3.600000E-01	3.700000E-01	4.954287E+01
16	3.700000E-01	3.800000E-01	5.625348E+01
17	3.800000E-01	3.900000E-01	6.431229E+01
18	3.900000E-01	4.000000E-01	7.319862E+01
19	4.000000E-01	4.100000E-01	7.713167E+01
20	4.100000E-01	4.200000E-01	8.444775E+01

Go to: Edit cell: 0.42



xspec> `setplot energy`

Channel scale = instrument scale
Energy scale = "physical" scale

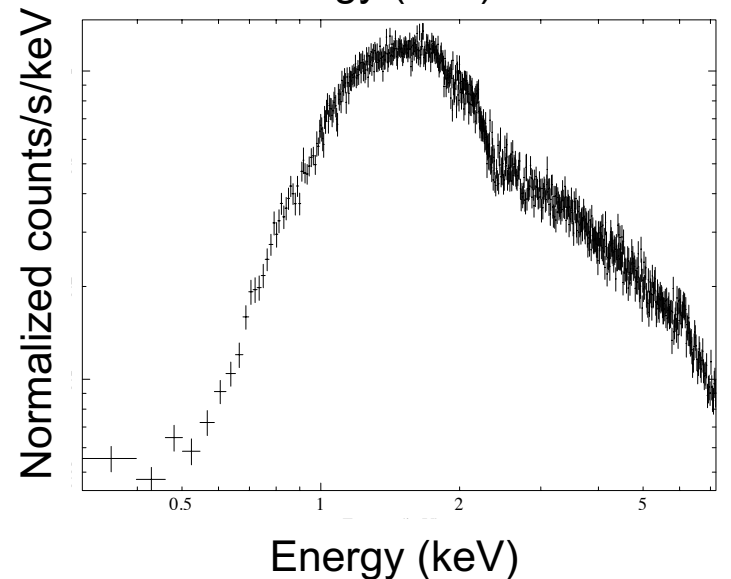


xspec> `setplot rebin 10 30`

minimum significance

max number of bins

(just for plotting purposes)

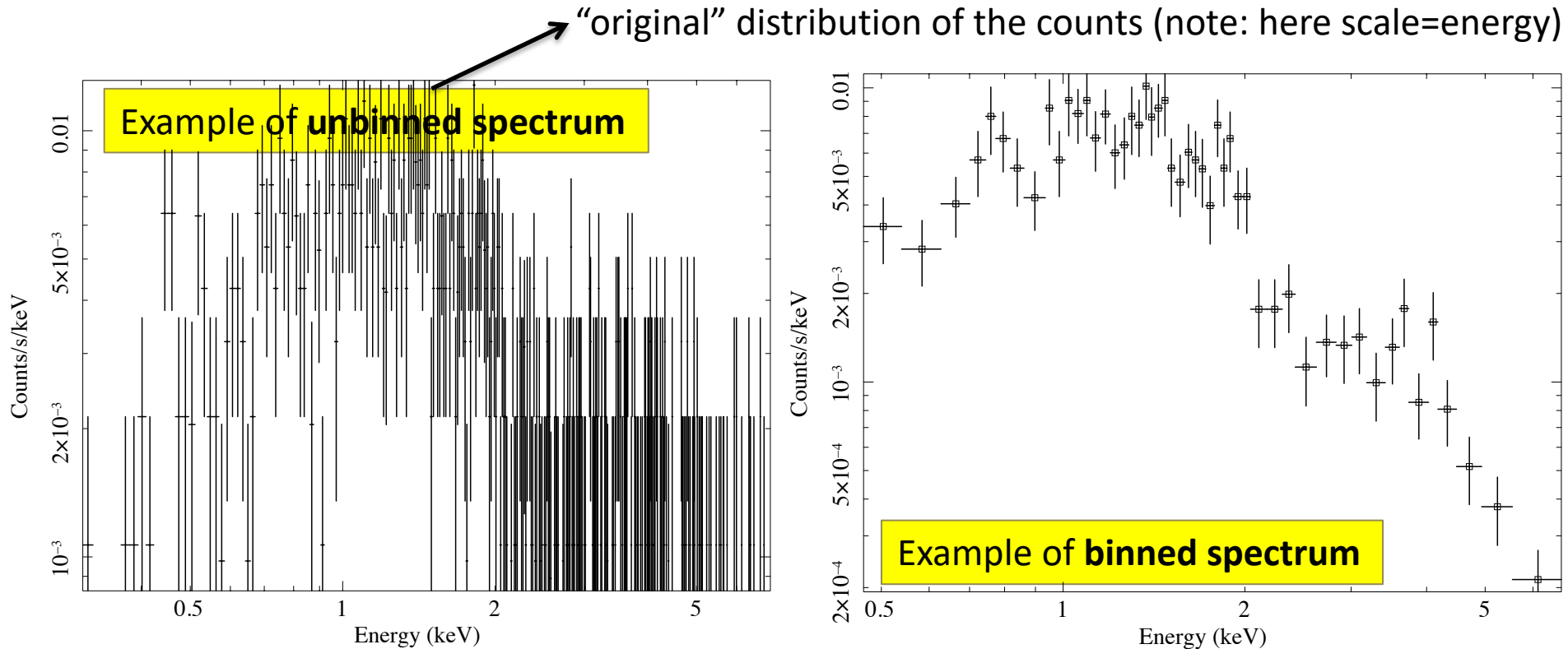


Spectrum in channels vs. spectrum in energy:
they are linked via the RMF (redistribution matrix file)

What does 'binning' (grouping) mean?

To apply the χ^2 test, we need that in every bin the statistics is nearly in the Gaussian regime, i.e., there is a sufficiently high number of counts

Using the fool *grppha* (or similar) we can require that each spectral bin contains at least a given number of counts (see step 1a)



Good photon statistics: it is suggested to rebin the data and apply χ^2

Step 2: choice of the models

XSPEC models like math operations

Additive models

agauss	apec	bapec	bbody	bbodyrad	bexrav
bexriv	bkn2pow	bknpower	bmc	bremss	bvapec
bvvapec	c6mekl	c6pmekl	c6pvmkl	c6vmekl	cemekl
cevmkl	cflow	compLS	compPS	compST	compTT
compbb	compmag	comptb	compth	cplinear	cutoffpl
disk	diskbb	diskir	diskline	diskm	disko
diskpbb	diskpn	eplogpar	eqpair	eqtherm	equil
expdec	ezdiskbb	gadem	gaussian	gnei	grad
grbm	kerrbb	kerrd	kerrdisk	laor	laor2
logpar	lorentz	meka	mekal	mkcflow	nei
npshock	nsa	nsagrav	nsatmos	nsmax	nsmaxg
nsx	ntea	nthComp	optxagn	optxagnf	pegpwr1w
pexmon	pexrav	pexriv	plcabs	posm	powerlaw
pshock	raymond	redge	refsch	rnei	sedov
sirf	smaug	srcut	sresc	step	vapec
vbremss	vequil	vgadem	vgnei	vmcflow	vmeka
vmekal	vnei	vnshock	vpshock	vraymond	vnei
vsedov	vvapec	vvgnei	vvnei	vvnpshock	vvshock
vrnei	vsedov	zagauss	zbbody	zbremss	zgauss
zpowerlw					

Multiplicative models

SSS_ice	TBabs	TBgrain	TBvarabs	absori	acisabs
cabs	constant	cyclabs	dust	edge	expabs
expfac	gabs	heilin	highcut	hrefl	lyman
notch	pcfabs	phabs	plabs	pwab	recorn
redden	smedge	spexcut	spline	swind1	uvred
varabs	vphabs	wabs	wndabs	xion	zTBabs
zbabs	zdust	zedge	zhight	zigm	zpcfabs
zphabs	zredden	zsm dust	zvarabs	zvfabs	zvpabs
zwabs	zwndabs	zxipcf			

Syntax:

$$M1 * M2 * (A1 + A2 + M3 * A3)$$

M=multiplicative model: modifies incident flux

A=additive model: source of emission

Other models

Convolution Models:

cflux	cpflux	gsmooth	ireflect	kdblur	kdblur2
kerrconv	lsmooth	partcov	rdblur	reflect	rgxsxsrc
simpl	zashift	zmshift			

Mixing Models:

ascac	projct	suzpsf	xmmpsf
-------	--------	--------	--------

Pile-up Models:

pileup

Example:

model wabs*(powerlaw+gaussian)

$$M(E) = \exp[-N_H \sigma(E)]$$

$$A(E) = K E^{-\alpha}$$

$$A(E) = K \frac{1}{\sigma \sqrt{2\pi}} \exp\left(-\frac{(E-E_0)^2}{2\sigma^2}\right)$$

Suggestion: 'starting' model for **AGN emission**:
powerlaw modified by Galactic (MW)
absorption

Step 3a: model fit and best-fitting solution

Absorption due to our Galaxy (MW): you need to **include it in all spectral models**. All photons pass through our own Galaxy

xspec> nh

```
XSPEC12>nh
Equinox (d/f 2000)[2000]
RA in hh mm ss.s or degrees[159.386] 04 18 21.3
DEC in dd mm ss.s or degrees[56.171] 38 01 36
>> Leiden/Argentine/Bonn (LAB) Survey of Galactic HI
LII , BII 161.675682 -8.819546
Requested position at X and Y pixel      22.78    103.39
Search nH in 4 X 4 box
Each pixel is 0.675 deg 0.675 deg
nH calculated using all points within
1.0000 deg from input position
      RA      DEC      Dist      nH
64.1051  37.3970  0.7360  2.65E+21
65.1324  37.3425  0.8071  2.80E+21
64.3226  37.9446  0.2251  2.93E+21
63.5005  38.5376  0.9979  3.00E+21
65.3701  37.8774  0.6333  2.89E+21
64.5573  38.4821  0.4561  3.09E+21
65.6250  38.4019  0.8984  2.84E+21
64.8094  39.0092  0.9978  2.99E+21
LAB >> Average nH (cm**-2)  2.90E+21
LAB >> Weighted average nH (cm**-2)  2.91E+21
/usr/local/heasoft-6.16/x86_64-apple-darwin10.8.0/bin/nh
```

Alternatively (web tool): <https://heasarc.gsfc.nasa.gov/cgi-bin/Tools/w3nh/w3nh.pl>
based on the HI4PI Survey (N.B. Bekhti et al. 2016, A&A, 594, A116)

xspec> mo pha*po

pha: accounts for the Galactic N_H (multiplicative model)
po: powerlaw model (additive model) for the primary AGN comp.

It is possible to provide values to the parameters at every step of the fitting process

-1 means frozen parameter (the same as using the command *freeze #* of the parameter; opposite: *thaw*)

XSPEC12>mo pha*po

```

Input parameter value, delta, min, bot, top, and max values for ...
      1      0.001(      0.01)      0      0      100000      1e+06
1:phabs:nH>2.91e-1 -1
      1      0.01(      0.01)     -3     -2      9      10
2:powerlaw:PhoIndex>1.8
      1      0.01(      0.01)      0      0      1e+20      1e+24
3:powerlaw:norm>1e-6

```

=====						
Model phabs<1>*powerlaw<2> Source No.: 1						Active/On
Model	Model Component	Parameter	Unit	Value		
par	comp					
1	1	phabs	nH	10^22	0.291000	frozen
2	2	powerlaw	PhoIndex		1.80000	+/- 0.0
3	2	powerlaw	norm		1.00000E-06	+/- 0.0

parameter number number of the component

```
xspec> query yes
```

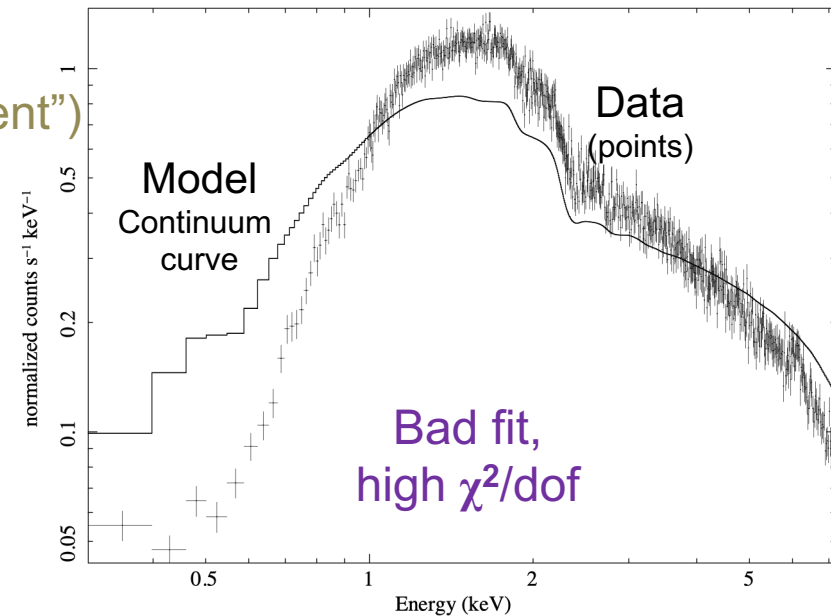
```
xspec> renorm (to allow a preliminary "adjustment")
```

```
xspec> fit 100 (fit 100 times)
```

```
=====
```

Model phabs<1>*powerlaw<2> Source No.: 1 Active/On					
Model	Model	Component	Parameter	Unit	Value
par	comp				
1	1	phabs	nH	10^22	0.291000
2	2	powerlaw	PhoIndex		0.895250
3	2	powerlaw	norm		3.65973E-03

```
=====
```



```
Fit statistic : Chi-Squared =      10561.52 using 1299 PHA bins.
```

```
Test statistic : Chi-Squared =      10561.52 using 1299 PHA bins.
```

```
Reduced chi-squared =      8.143041 for 1297 degrees of freedom
```

```
Null hypothesis probability = 0.000000e+00
```

dof=degrees of freedom=(number of datapoints – number of free parameters)=
=1299-2=1297

χ^2/dof close to unity means that it is a good fit (hence, not in this case!) – see lesson on statistics

Null hypothesis probability=probability that the model is a good representation of the datapoints (i.e., good if close to 1)

All the adopted models should be physically motivated according to the known source properties/classification + indications obtained at other wavelengths

Step 3b: adding components and fit

xspec> **addcomp 2 zpha** adding zpha as # component (#=order in the model)

```
XSPEC12>addcomp 2 zpha
```

Input parameter value, delta, min, bot, top, and max values for ...

1	0.001(0.01)	0	0	100000	1e+06
2:zphabs:nH>1						
0	-0.01(0.01)	-0.999	-0.999	10	10
3:zphabs:Redshift>.048						

xspec> **fit 100**

```
=====
```

Model phabs<1>*zphabs<2>*powerlaw<3> Source No.: 1 Active/On

Model	Model	Component	Parameter	Unit	Value	
par	comp					
1	1	phabs	nH	10 ²²	0.291000	frozen
2	2	zphabs	nH	10 ²²	1.00000	+/- 0.0
3	2	zphabs	Redshift		4.80000E-02	frozen
4	3	powerlaw	PhoIndex		0.895250	+/- 4.39599E-03
5	3	powerlaw	norm		3.65973E-03	+/- 1.85394E-05

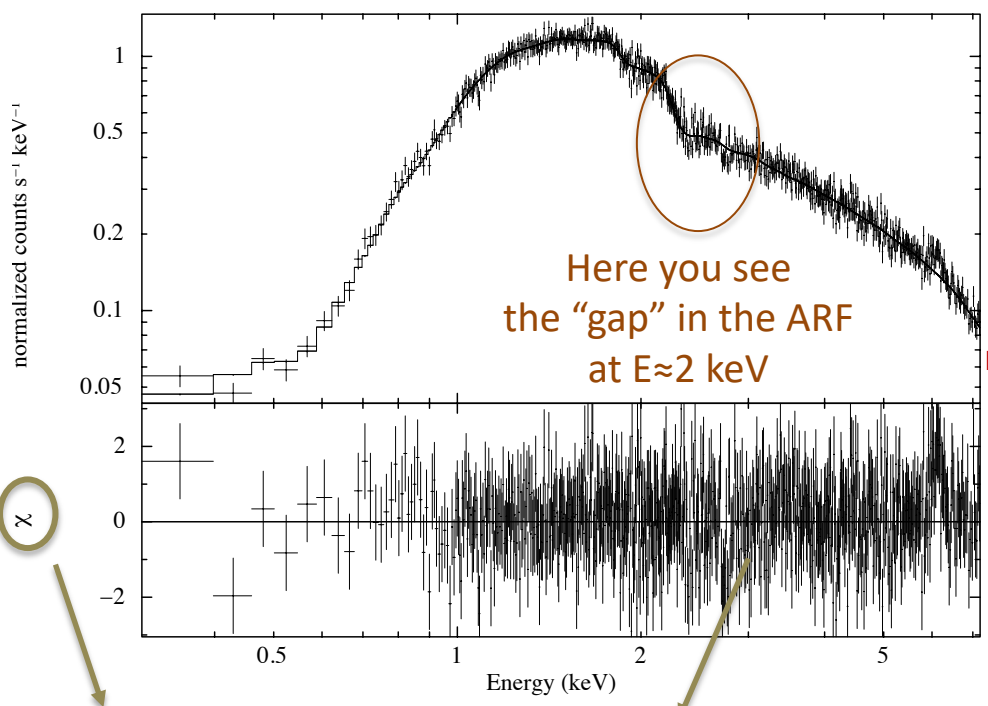
xspec> plot ldata delchi

xspec> plot model

to plot the input model

Convolved with the response matrix

data and folded model



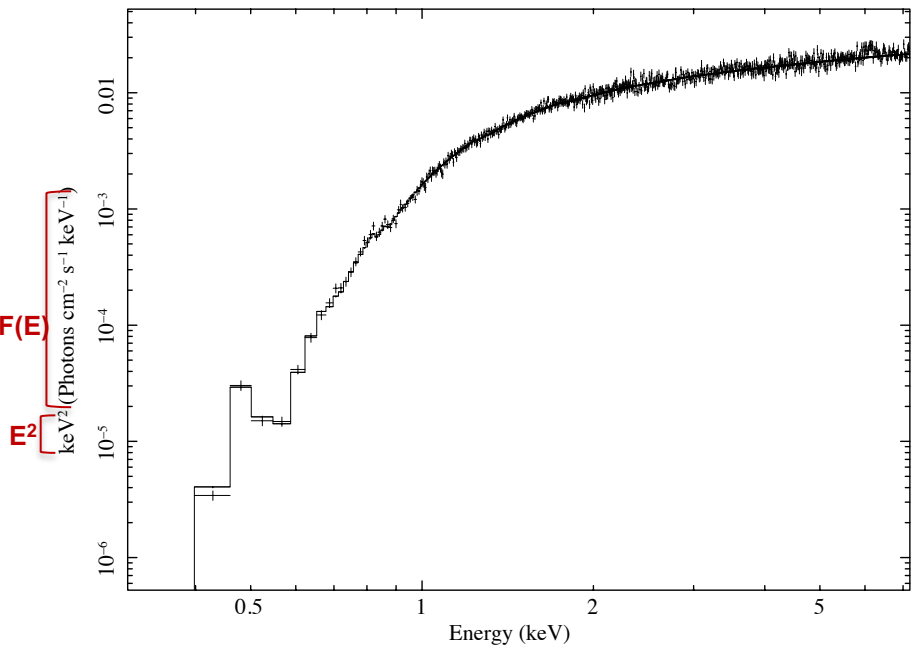
Here you see the "gap" in the ARF at $E \approx 2$ keV

$F(E)$
 E^2 $\text{keV}^2 (\text{Photons cm}^{-2} \text{s}^{-1} \text{keV}^{-1})$

xspec> plot eeufspect delchi

eeufspect: unfolded spectrum in $E^2 F(E)$

Unfolded Spectrum



delchi: (model-data), i.e. deviations in units of σ

Step 4: χ^2 statistical test

Test to compare the observed distribution of the results with that expected

$$\chi^2 = \sum_{k=1}^n \frac{(O_k - E_k)^2}{\sigma_k^2}$$

O_k =observed values (spectral datapoints)

E_k =expected values (model)

σ_k =error on the measured values (error on each spectral bin)

k =number of datapoints (bins after rebinning)

$$\chi^2 / dof \approx 1$$



the observed and expected distributions are similar

Applicability of χ^2 statistics

χ^2 statistic

$$S = \sum_i \left(\frac{S_i - B_i t_s / t_b}{O_K} - \frac{m_i t_s}{E_K} \right)^2 / \left(\frac{(\sigma_S)_i^2 + (\sigma_B)_i^2}{\sigma_K} \right)$$

where S_i = src counts in the $I=\{1, \dots, N\}$ data bins with exposure t_s ,
 B_i = background counts with exposure t_b and m_i = model predicted count rate; $(\sigma_S)^2$ and $(\sigma_B)^2$ = variance on the src and background counts, typically estimated by S_i and B_i

BUT

the χ^2 statistic fails in low-counting regime
(few counts in each data bin)

Alternative solutions in case of low photon statistics

- i. To rebin the data so that each bin contains a large enough number of counts

BUT: loss of information and dependence on the rebinning method adopted

- ii. To modify S so that it performs better in low-count regime (e.g., by estimating the variance for a given data bin using the average counts from the surrounding bins; Churazov+96)

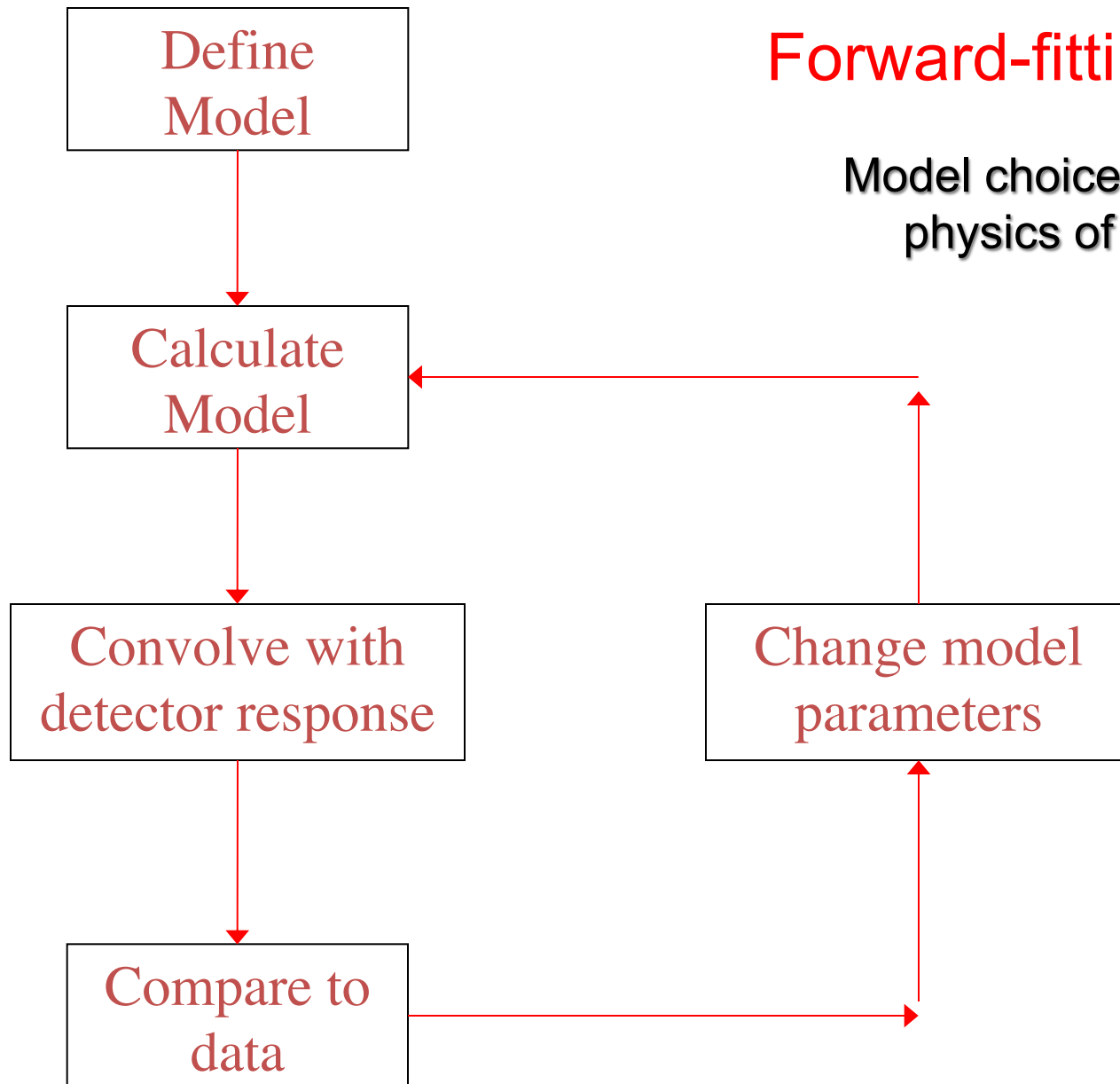
BUT: it would need Monte Carlo simulations to properly support the result

- iii. To construct a **maximum-likelihood estimator** based on the Poisson distribution of the detected counts (Cash79; Wachter+79). ML means finding the best fit of parameters that maximizes the Poisson likelihood

```
xspec> statistic chi (default) Binned data,  $\chi^2$  statistics ⇔ Gaussian statistics  
xspec> statistic cstat Unbinned data, C-statistics ⇔ Poisson statistics
```

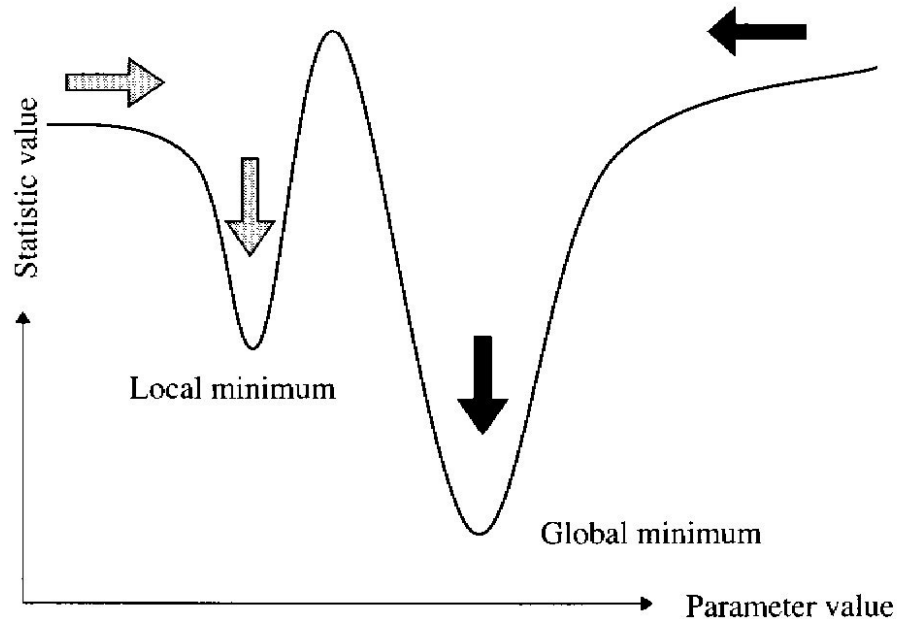
Forward-fitting algorithm

Model choice based on the physics of the source



Global vs. local minimum

Data analysis



If the fit process is started at the “right place”, then it will converge to the true minimum

The more complicated the model and the more highly correlated the parameters, then the more likely that the algorithm will hardly find the true minimum

`xspec> newpar 2 1.8`

to assign a new value to a parameter (2 here)

Useful also to ‘move’ the fit from a local minimum...

χ^2 in a nutshell

Reduced χ^2 large \leftrightarrow $P(\chi^2)$ small

- a. Errors are under-estimated
- b. The model does not describe the data correctly

Reduced χ^2 small \leftrightarrow $P(\chi^2)$ large

- c. Errors are over-estimated
- d. Were data “selected” in a particular way?

Step 5: error estimate

xspec> error #
 (#=number of the parameter)

p	ν					
	1	2	3	4	5	6
68.3%	1.00	2.30	3.53	4.72	5.89	7.04
90%	2.71	4.61	6.25	7.78	9.24	10.6
95.4%	4.00	6.17	8.02	9.70	11.3	12.8
99%	6.63	9.21	11.3	13.3	15.1	16.8
99.73%	9.00	11.8	14.2	16.3	18.2	20.1
99.99%	15.1	18.4	21.1	23.5	25.7	27.8

```

=====
Model phabs<1>*zphabs<2>*powerlaw<3> Source No.: 1 Active
Model Model Component Parameter Unit Value
par comp
  1 1 phabs nH 10^22 0.291000 frozen
  2 2 zphabs nH 10^22 0.465420 +/- 6.99525E-03
  3 2 zphabs Redshift 4.80000E-02 frozen
  4 3 powerlaw PhoIndex 1.59881 +/- 9.35898E-03
  5 3 powerlaw norm 9.98424E-03 +/- 1.19425E-04
=====
  
```

Avni76; Lampton+76

These are the errors at 1 σ for that parameter

Using energies from responses.

```

Fit statistic : Chi-Squared = 1286.80 using 1299 PHA bins.

Test statistic : Chi-Squared = 1286.80 using 1299 PHA bins.
Reduced chi-squared = 0.992903 for 1296 degrees of freedom
Null hypothesis probability = 5.667071e-01
Weighting method: standard
XSPEC12>error 4
Parameter Confidence Range (2.706)
  4 1.58343 1.6143 (-0.0153884,0.0154818)
  
```

2.706: 90% confidence level for one parameter of interest

Confidence	sigma	delta_chi-square	1 parameter of interest
68.3%	1.0	1.00	
90.0%	1.6	2.71	
95.5%	2.0	4.00	
99.0%	2.6	6.63	
99.7%	3.0	9.00	

Ex. 1: Error at **90%** confidence level for one parameter of interest:
 xspec> error **2.71** #param

Ex. 2: Error at **90%** confidence level for two parameters of interest:
 xspec> error **4.61** #param

Ex. 3: Error at **99%** confidence level for one parameter of interest:
 xspec> error **6.63** #param

1 parameter of interest: as only one parameter at each time would vary

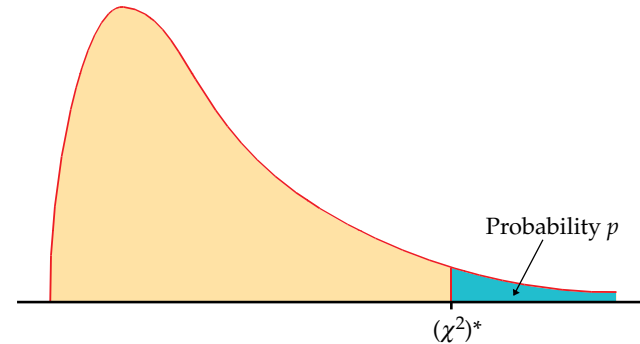


Table entry for p is the critical value $(\chi^2)^*$ with probability p lying to its right.

TABLE F												
χ^2 distribution critical values												
df	Tail probability p											
	.25	.20	.15	.10	.05	.025	.02	.01	.005	.0025	.001	.0005
1	1.32	1.64	2.07	2.71	3.84	5.02	5.41	6.63	7.88	9.14	10.83	12.12
2	2.77	3.22	3.79	4.61	5.99	7.38	7.82	9.21	10.60	11.98	13.82	15.20
3	4.11	4.64	5.32	6.25	7.81	9.35	9.84	11.34	12.84	14.32	16.27	17.73
4	5.39	5.99	6.74	7.78	9.49	11.14	11.67	13.28	14.86	16.42	18.47	20.00
5	6.63	7.29	8.12	9.24	11.07	12.83	13.39	15.09	16.75	18.39	20.51	22.11

Parameters of interest →

Step 5a: contour plots

```
xspec> steppar par1 min_value max_value #steps par2 min max #steps
```

Perform a fit while stepping the value of a parameter through a given range

```
XSPEC12>stepp 4 1.55 1.65 10 2 0.43 0.50 10
```

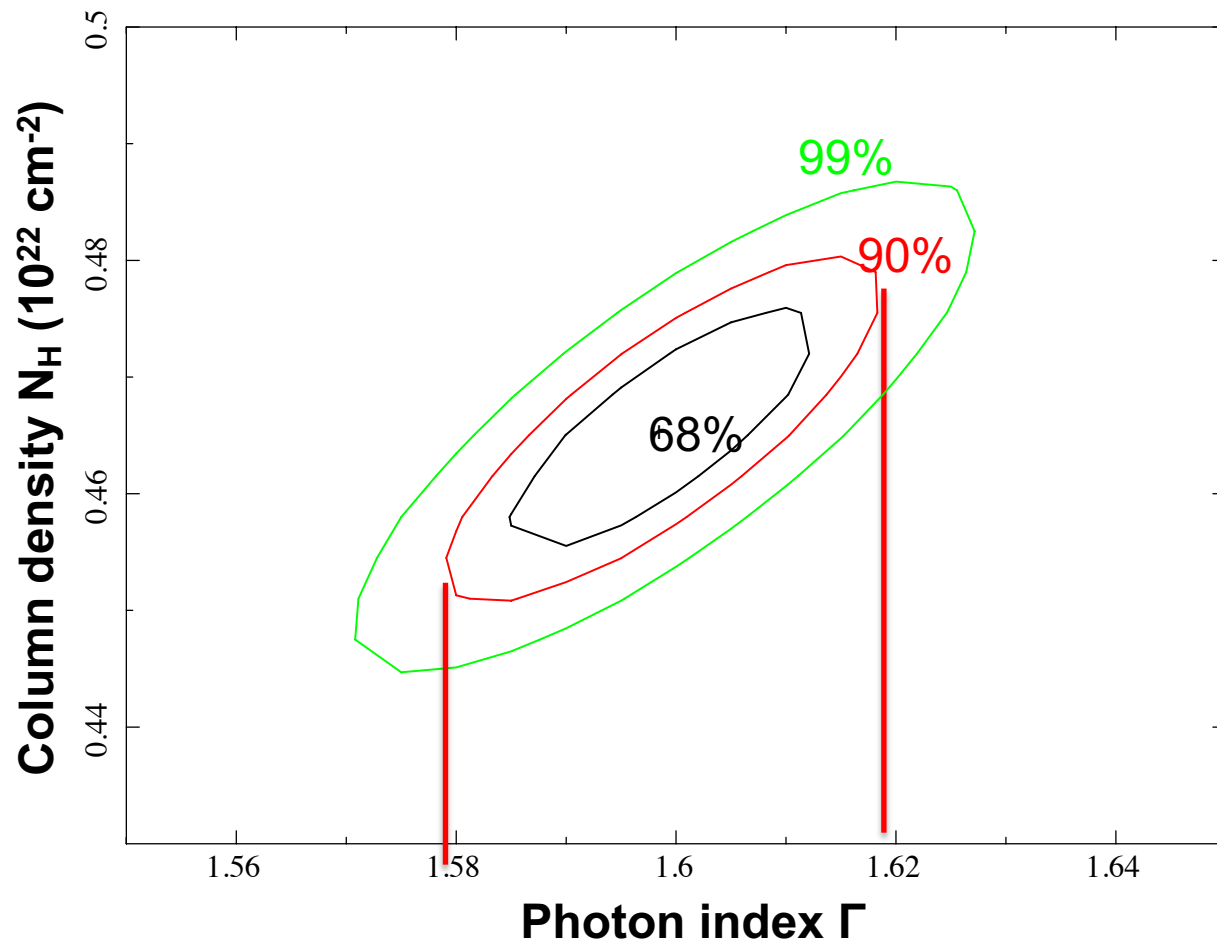
Chi-Squared	Delta Chi-Squared	PhoIndex	nH
1317	30.234	0	1.55
1313.8	26.991	1	1.56
1317.3	30.457	2	1.57
1327.4	40.613	3	1.58
1344.2	57.438	4	1.59
1367.7	80.908	5	1.6
1397.8	111	6	1.61
1434.5	147.68	7	1.62
1477.7	190.92	8	1.63
1527.5	240.68	9	1.64
1583.7	296.94	10	1.65
1527.3	240.45	10	1.65
1476.6	189.75	9	1.64
1432.3	145.51	8	1.63
1394.6	107.76	7	1.62
1363.3	76.53	6	1.61
1338.7	51.852	5	1.6
1320.6	33.752	4	1.59
1309.1	22.255	3	1.58
1304.2	17.383	2	1.57
1306	19.155	1	1.56

Parameters involved in the fit

It provides how one parameter varies wrt. another parameter (i.e., the error range for sets of parameters)

Useful also to understand whether two spectral parameters are correlated (not necessarily from a physical point of view)

```
xspect> plot contour
```

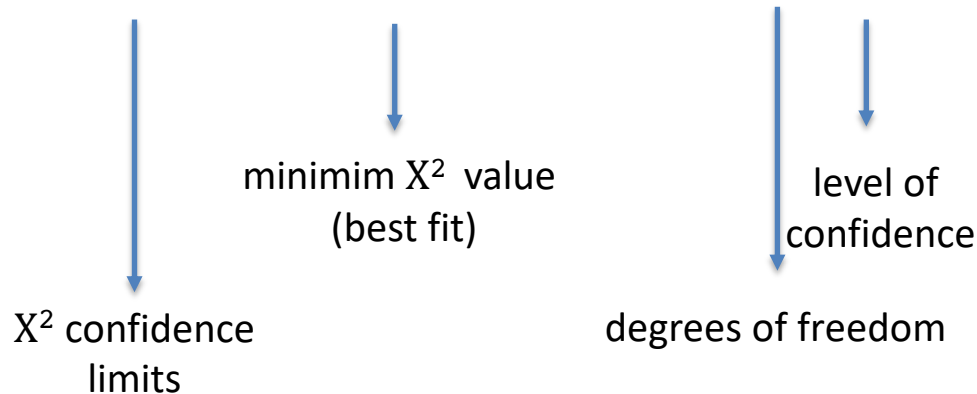


90% c.l.: the photon index varies in the range 1.58–1.62 (vs. 1.58–1.61 using the *error* command). Slight differences are explained because in the case of the *error* command, the uncertainty was computed for one parameter of interest

The meaning of contour plots/confidence regions

The *contour plots* define a confidence region in the parameter space (i.e., the “statistical surface”) within which the true parameters lie with a certain confidence (hence, 68, 90, 99% in XSPEC by default). They represent regions of constant probability

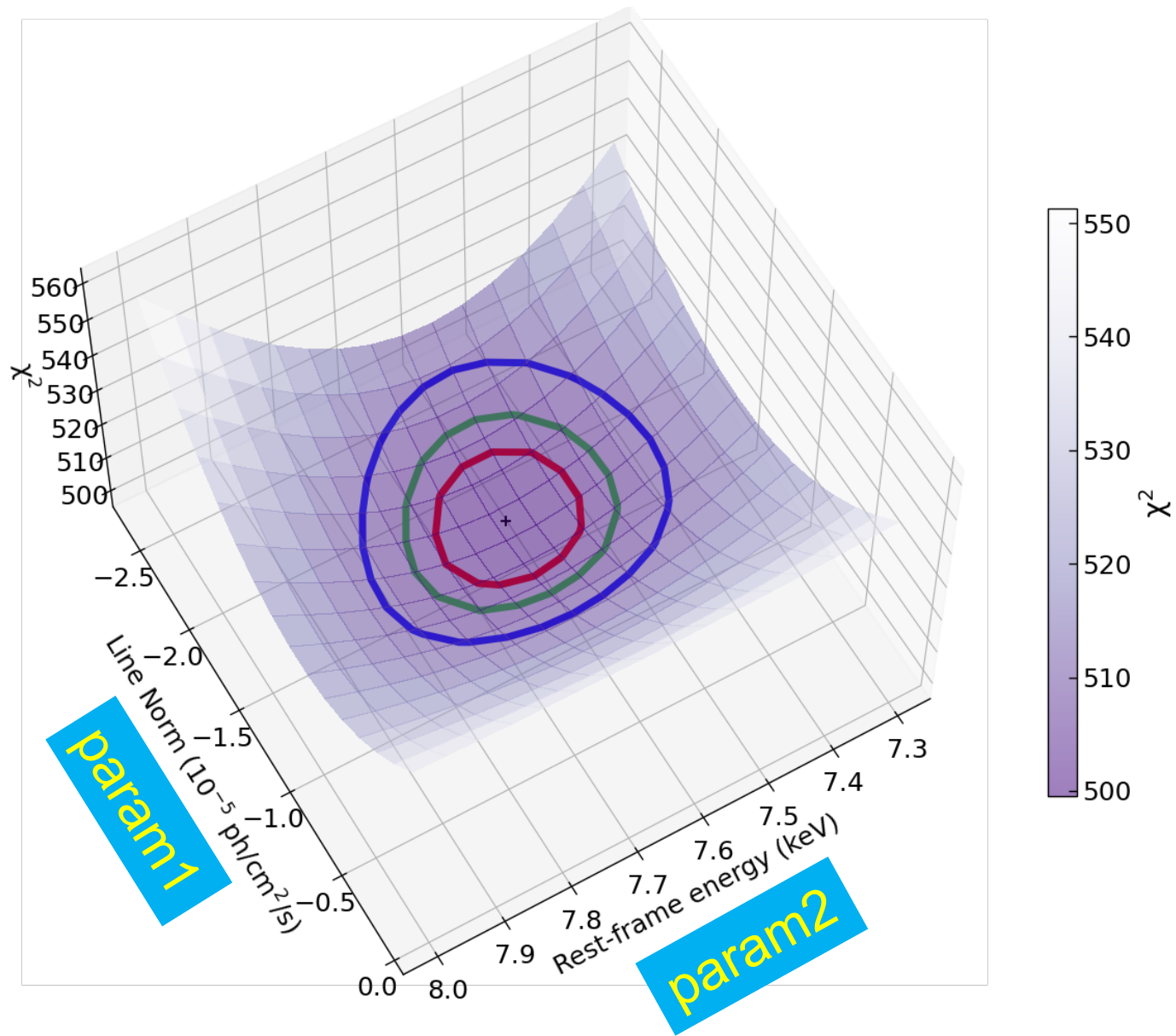
$$\chi^2_{\alpha} = \chi^2_{min} + \Delta(\nu, \alpha)$$



Δ depends only on the number of parameters involved in the fit (see previous slides)

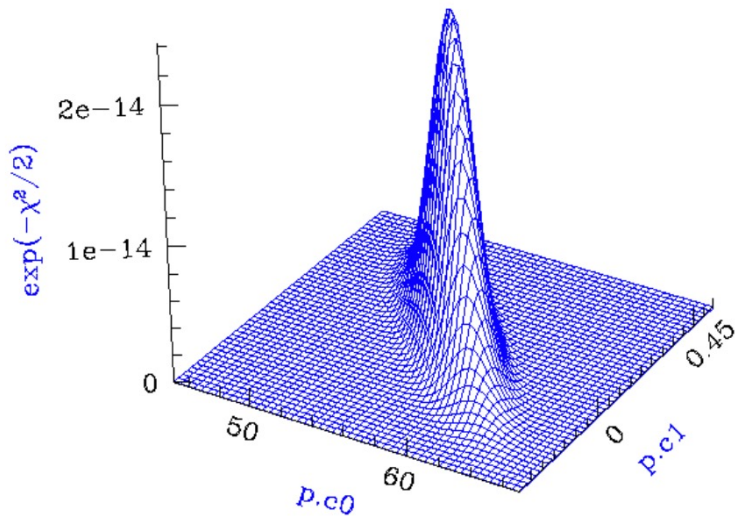
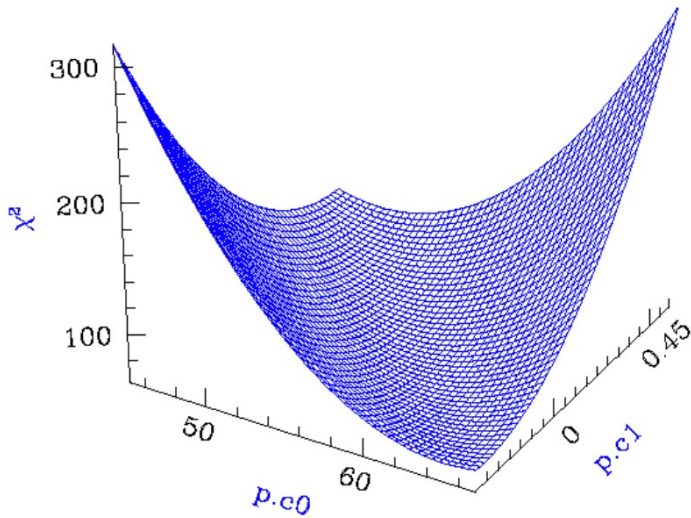
Avni 1976

α (%)	q (NO. OF INTERESTING PARAMETERS)		
	1	2	3
68.....	1.00	2.30	3.50
90.....	2.71	4.61	6.25
99.....	6.63	9.21	11.30



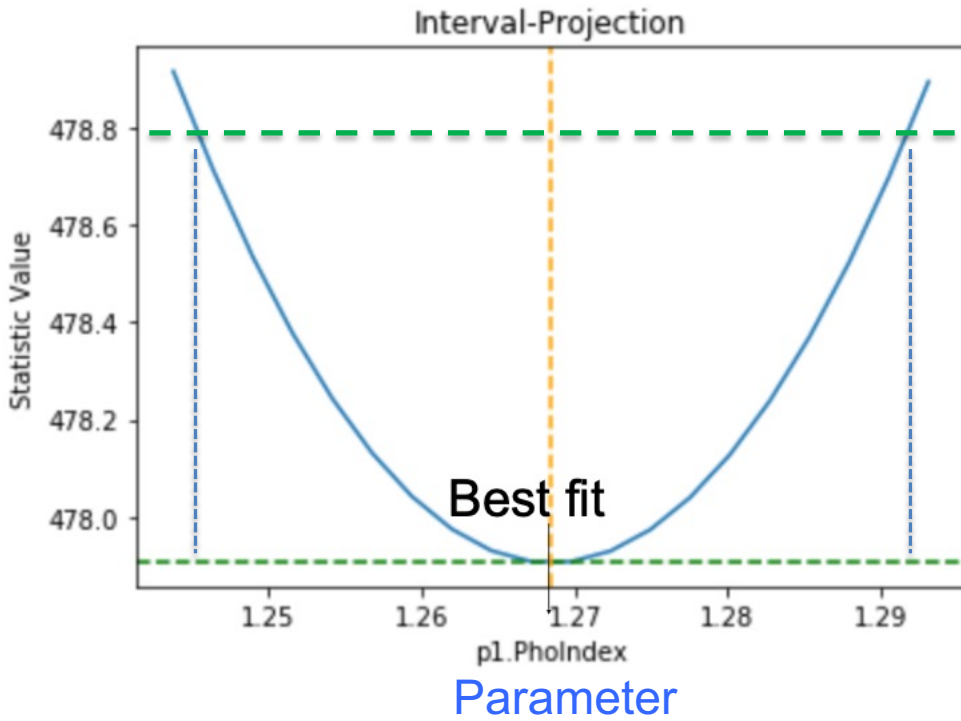
Courtesy of E. Bertola

Calculating Confidence Limits means Exploring the Parameter Space - Statistical Surface



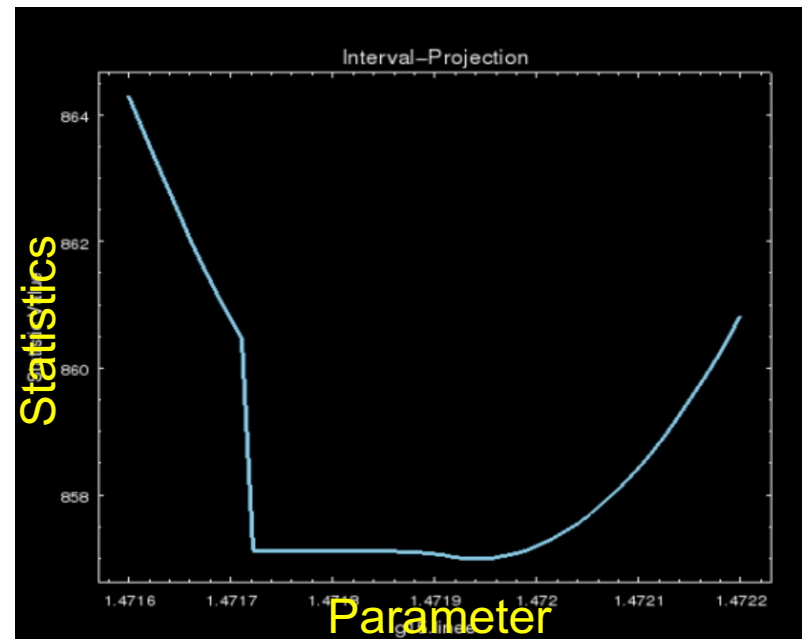
Example of a “**well-behaved**” statistical surface in parameter space, viewed as a multi-dimensional paraboloid (χ^2 , top), and as a multi-dimensional Gaussian ($\exp(-\chi^2/2) \approx L$, bottom).

Statistics



Well-behaved surface
(Gaussian, one parameter)

Not well-behaved surface
(not Gaussian)



Step 6: source flux and luminosity

```
xspec> flux 2 10          (flux band in keV)
xspec> lum 2 10 0.048    (lum band redshift)
```

command *cosmo* to change the cosmology

```
XSPEC12> flux 2 10
  Model Flux 0.0062186 photons (4.5024e-11 ergs/cm^2/s) range (2.0000 - 10.000 keV)
XSPEC12> ne 2 0

Fit statistic : Chi-Squared =      144391.0 using 1299 PHA bins.

Test statistic : Chi-Squared =      144391.0 using 1299 PHA bins.
  Reduced chi-squared =      111.4128 for 1296 degrees of freedom
  Null hypothesis probability = 0.000000e+00
  Current data and model not fit yet.
XSPEC12> lum 2 10 0.048
  Model Luminosity 2.4791e+44 ergs/s (2.0000 - 10.000 keV rest frame)
  (z = 0.0480 H0 = 70.0 q0 = 0.00 Lambda0 = 0.730)
```

Flux is *observed* (typically, no correction for absorption) and in the *observed-frame band* (units: erg/cm²/s)

Luminosity needs to be *intrinsic/de-absorbed* (so, put $N_H = 0$ and do **not** fit again) and is reported in the *source rest frame* (units: erg/s)

Uncertainties on fluxes and luminosities. I

xspec> flux 2 10 error 100 90 (100 trials to compute the error at 90% c.l. in the 2–10 keV band)

```
XSPEC12>flux 2 10 error 100 90
Parameter distribution is derived from fit covariance matrix.
Model Flux 0.0061987 photons (4.4751e-11 ergs/cm^2/s) range (2.0000 - 10.000 keV)
Error range 0.006159 - 0.006249 (4.441e-11 - 4.517e-11) (90.00% confidence)
```

xspec> lum 2 10 0.048 error 100 90 (the same as for the flux)

```
XSPEC12>lum 2 10 0.048 error 100 90
Parameter distribution is derived from fit covariance matrix.
Model Luminosity 2.3811e+44 ergs/s (2.0000 - 10.000 keV rest frame)
Error range 2.359e+44 - 2.396e+44 (90.00% confidence)
(z = 0.0480 H0 = 70.0 q0 = 0.00 Lambda0 = 0.730)
```


Uncertainties on fluxes and luminosities. II

Alternatively: use **cflux** and **clumin** as multiplicative model components.
cflux (**clumin**) in front of model component(s). At least one of the additive models should have the normalization fixed to a non-zero value.
 cflux/clumin must be treated as the other model components (i.e., they are part of the fit)

```
xspec> model pha*cflux*zpha*pow
xspec> [...]; fit
```

```
=====
Model phabs<1>*cflux<2>*zphabs<3>*powerlaw<4> Source No.: 1 Active/On
Model Model Component Parameter Unit Value
par comp
  1 1 phabs nH 10^22 0.291000 frozen
  2 2 cflux Emin keV 2.00000 frozen
  3 2 cflux Emax keV 10.0000 frozen
  4 2 cflux lg10Flux cgs -10.3374 +/- 2.36218E-03
  5 3 zphabs nH 10^22 0.507589 +/- 7.23604E-03
  6 3 zphabs Redshift 4.80000E-02 frozen
  7 4 powerlaw PhoIndex 1.61125 +/- 9.39481E-03
  8 4 powerlaw norm 1.01795E-02 frozen
```

Boundaries for the computation
Emin=2 keV
Emax=10 keV
lg10Flux is the log of the flux in the observed energy range Emin-Emax
 The **powerlaw normalization** has been **frozen**

```
Fit statistic : Chi-Squared 1290.08 using 1299 bins.
```

```
Test statistic : Chi-Squared 1290.08 using 1299 bins.
Null hypothesis probability of 5.41e-01 with 1296 degrees of freedom
```

```
XSPEC12>error 4
Parameter Confidence Range (2.706)
  4 -10.3414 -10.3335 (-0.00394489,0.00392021)
```

Uncertainties on fluxes and luminosities. III

For what concerns the X-ray luminosity, it must be computed as *intrinsic* (*de-absorbed*). This can be achieved placing the column density =0 without subsequent fitting the spectrum. For the value+error, **clumin** can be used (with no 'extra' requirements):

```
xspec> model pha*zpha*clumin*pow
xspec> [...]; fit
```

```
=====
Model phabs<1>*zphabs<2>*clumin<3>*powerlaw<4> Source No.: 1 Active/On
Model Model Component Parameter Unit Value
par comp
 1 1 phabs nH 10^22 0.291000 frozen
 2 2 zphabs nH 10^22 0.507588 +/- 7.23591E-03
 3 2 zphabs Redshift 4.80000E-02 frozen
 4 3 clumin Emin keV 2.00000 frozen
 5 3 clumin Emax keV 10.0000 frozen
 6 3 clumin Redshift 4.80000E-02 frozen
 7 3 clumin lg10Lum cgs 44.4067 +/- 1.80573E-03
 8 4 powerlaw PhoIndex 1.61125 +/- 9.39481E-03
 9 4 powerlaw norm 1.03806E-02 frozen
```

Boundaries for the computation
Emin=2 keV
Emax=10 keV
lg10Lum is the log of the luminosity in the *rest-frame energy range* Emin-Emax
The **powerlaw normalization** has been **frozen**

Fit statistic : Chi-Squared 1290.08 using 1299 bins.

Test statistic : Chi-Squared 1290.08 using 1299 bins.

Null hypothesis probability of 5.41e-01 with 1296 degrees of freedom

XSPEC12>error 7

```
Parameter Confidence Range (2.706)
 7 44.4032 44.4102 (-0.00353496,0.00351265)
```

Step 7: the F-test

(here applied to estimate the statistical significance of the inclusion of an emission line)

Model 1: absorbed powerlaw

Model 2: absorbed powerlaw + iron emission line

xspect> addcomp 3 zgauss

xspect> fit 100

```
XSPEC12>addcomp 3 zgauss
```

```
Input parameter value, delta, min, bot, top, and max values for ...
```

4:zgauss:LineE>6.4	6.5	0.05(0.065)	0	0	1e+06	1e+06
5:zgauss:Sigma>.01	0.1	0.05(0.001)	0	0	10	20
6:zgauss:Redshift>.048	0	-0.01(0.01)	-0.999	-0.999	10	10
7:zgauss:norm>1e-6	1	0.01(0.01)	0	0	1e+20	1e+24

```
Fit statistic : Chi-Squared = 1284.34 using 1299 PHA bins.
```

```
Model phabs<1>*zphabs<2>(zgauss<3> + powerlaw<4>) Source No.: 1 Active/On
Model Model Component Parameter Unit Value
par comp
1 1 phabs nH 10^22 0.291000 frozen
2 2 zphabs nH 10^22 0.470750 +/- 7.09342E-03
3 2 zphabs Redshift 4.80000E-02 frozen
4 3 zgauss LineE keV 6.40830 +/- 2.18809E-02
5 3 zgauss Sigma keV 1.00000E-02 frozen
6 3 zgauss Redshift 4.80000E-02 frozen
7 3 zgauss norm 2.65689E-05 +/- 4.58946E-06
8 4 powerlaw PhoIndex 1.61154 +/- 9.66835E-03
9 4 powerlaw norm 1.01037E-02 +/- 1.23074E-04
```

```
Fit statistic : Chi-Squared = 1253.29 using 1299 PHA bins.
```

```
Test statistic : Chi-Squared = 1253.29 using 1299 PHA bins.
Reduced chi-squared = 0.968541 for 1294 degrees of freedom
Null hypothesis probability = 7.868667e-01
```

$$\Delta\chi^2/\Delta\text{dof}=33.5/2$$

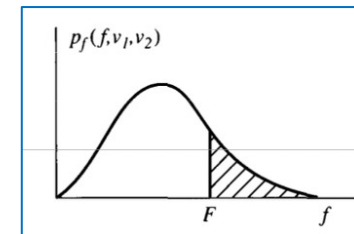


$$\chi^2/\text{dof}=1253.3/1294$$

vs. 1286.8/1296 (no line)



xspec> ftest chi2_mod2 dof_mod2 chi2_mod1 dof_mod1
→ Low F value: low statistical significance of the added component



xspec> ftest 1253.3 1294 1286.8 1296

```
XSPEC12>ftest 1253.3 1294 1286.8 1296
```

```
F statistic value = 17.2939 and probability 3.87222e-08
```

Large F value → low probability (of exceeding that value, see tables)
→ highly significant improvement due to the additional component

Use the F-test to evaluate the improvement to a spectral fit due to the assumption of a different model, with additional terms

Conditions:

- (a) the simpler model is nested within the more complex model;
- (b) the extra parameters have Gaussian distribution (not truncated by the parameter space boundaries) – BUT see also Protassov+02 on caveats

$$P_f(f; \nu_1, \nu_2) = \frac{\chi_1^2 / \nu_1}{\chi_2^2 / \nu_2}$$

$$\propto \Delta\chi^2 / k$$

The larger this ratio, the larger the improvement in the spectral fitting

k = number of additional parameters

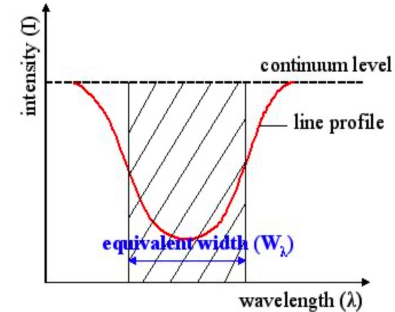
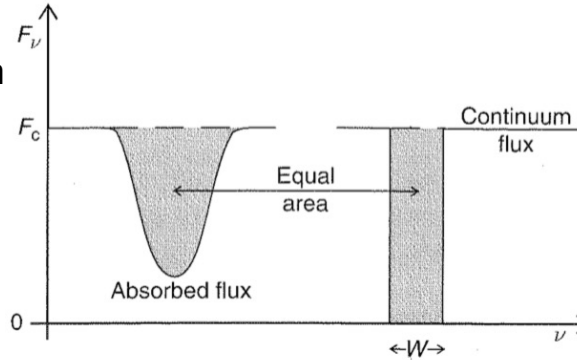
Uncertainties on the line EW measurement. I

Wavelength/frequency space definition [Angstrom/keV units]

EW is a measure of how prominent a line is (F_λ , F_ν) wrt. the continuum (F_C)

$$W_\lambda = \int_{\lambda_1}^{\lambda_2} \frac{F_C - F_\lambda}{F_C} d\lambda \quad \text{Units=Angstrom}$$

$$W_\nu = \int_{\nu_1}^{\nu_2} \frac{F_C - F_\nu}{F_C} d\nu \quad \text{Units=eV}$$



```
xspec> eqw # (#=model component of the Gaussian)
```

```
xspec> eqw # error 100 90 (EW including errors at 90% c.l.)
```

Alternatively: assuming that the dominant contribution to the EW error comes from the line intensity (so, limited contribution from the uncertainty on the continuum emission), one can (1) compute the 90% error on the line normalization, (2) place the upper 90% value as line normalization and (3) type `eqw` again (without fitting), then (4) place the lower 90% value as line normalization and (5) type `eqw` again (without fitting)

Uncertainties on the line EW measurement. II

```
=====
Model phabs<1>*zphabs<2>(powerlaw<3> + zgauss<4>) Source No.: 1 Active/On
Model Model Component Parameter Unit Value
par comp
1 1 phabs nH 10^22 0.291000 frozen
2 2 zphabs nH 10^22 0.513229 +/- 7.33688E-03
3 2 zphabs Redshift 4.80000E-02 frozen
4 3 powerlaw PhoIndex 1.62435 +/- 9.70444E-03
5 3 powerlaw norm 1.03048E-02 +/- 1.25935E-04
6 4 zgauss LineE keV 6.40857 +/- 2.12948E-02
7 4 zgauss Sigma keV 1.00000E-02 frozen
8 4 zgauss Redshift 4.80000E-02 frozen
9 4 zgauss norm 2.73168E-05 +/- 4.59249E-06
=====
```

```
Fit statistic : Chi-Squared 1254.73 using 1299 bins.
Test statistic : Chi-Squared 1254.73 using 1299 bins.
Null hypothesis probability of 7.78e-01 with 1294 degrees of freedom
```

XSPEC12>eqw 4

```
Data group number: 1
Additive group equiv width for Component 4: 0.0477921 keV
XSPEC12>eqw 4 err 100 90
```

```
Data group number: 1
Additive group equiv width for Component 4: 0.0477921 keV
Parameter distribution is derived from fit covariance matrix.
Equiv width error range: 0.0368183 - 0.0605744 keV
XSPEC12>error 9
Parameter Confidence Range (2.706)
9 1.97559e-05 3.48608e-05 (-7.55792e-06,7.54694e-06)
XSPEC12>ne 9 1.97559e-05;eqw 4
```

```
Fit statistic : Chi-Squared 1257.64 using 1299 bins.
Test statistic : Chi-Squared 1257.64 using 1299 bins.
Null hypothesis probability of 7.61e-01 with 1294 degrees of freedom
Current data and model not fit yet.
```

```
Data group number: 1
Additive group equiv width for Component 4: 0.0345677 keV
XSPEC12>ne 9 3.48608e-05;eqw 4
```

```
Fit statistic : Chi-Squared 1257.64 using 1299 bins.
Test statistic : Chi-Squared 1257.64 using 1299 bins.
Null hypothesis probability of 7.61e-01 with 1294 degrees of freedom
Current data and model not fit yet.
```

```
Data group number: 1
Additive_group equiv width for Component 4: 0.0609973 keV
```

easiest method (lower/upper 90% c.i. values)

“approximated” method (using the errors on the line normalization only)

Step 8: save data+model and 'recover' all in XSPEC later

To save the current data + model you may use the command

```
xspec> save all zpha_po_zgauss  
xspec> [...]
```

A file zpha_po_zgauss.xcm is saved

To recover the settings + data + model later, you can use the command

```
xspec> @zpha_po_zgauss.xcm  
xspec> fit
```

XSPEC will ask you to fit the data again

Possibly useful commands

in **XSPEC**

- `setplot rebin #1 #2` (to rebin the data; #1 indicates the number of σ)
- `show all`
- `show files`
- `show notice`
- `script filename` [save all the commands in a file (filename here; default: `xspec.xcm`)]
- `save model bestmodel.xcm` (save only the best fit model, without the data)

In **ILOT (plotting environment for XSPEC)**

`xspec> iplot`

- `time off` (to remove the date in the bottom-right part of the plot)
- `csize 2` (character size)
- `msize` (marker size)
- `label top` (title of the plot)
- `label filename` (title of the file)
- `hardcopy nomefile.ps/cps` (save a figure)
- `plot`
- `wen nomefile` [writes two files (`.qdp` and `.pco`), one with data and the other with plot settings]