

Introduction to the
COLERAINE
stock assessment model



Arni Magnusson

Overview

MODEL

- generalized equations
- Excel user interface
- Bayesian parameter estimation
- AD Model Builder optimization

DATA

- catch by age/length, biomass indices
- stratification by sex and gears
- priors for estimated parameters
- values of fixed parameters

OUTPUT

- max likelihood point estimates
- MCMC posterior likelihood profiles
- projections of harvest strategies

APPLICATION

- Icelandic cod data

Background

Ray Hilborn

Professor, Univ. of Wash.

Theory & application

Mark Maunder

Ph.D. student, Univ. of Wash.

Programming & application

Ana Parma

Int. Pac. Halibut Comm.

Theory

Billy Ernst

Ph.D. student, Univ. of Wash.

Programming & application

John Payne

Ph.D. student, Univ. of Wash.

User interface

Paul Starr

New Zeal. Seaf. Ind. Council

Application

Generalized model

Coleraine can be used to model a wide variety of stocks.
The model may or may not be

- ♦ sex-specific
- ♦ gear-specific
- ♦ fitted to data from commercial landings
and/or research surveys
and/or CPUE
- ♦ fitted to age and/or length data

Population dynamics

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

N : population size

a : age

t : year

M : natural mortality rate

u : harvest rate

Harvest rate and landings

$$u_t = \frac{C_t}{e^{-0.5M} \sum_a s_a N_{a,t} w_{a,t}}$$

u : harvest rate	N : population size
t : year	s : selectivity
C : landings	a : age
M : natural mortality rate	w : weight

Age distribution in first year

recruits $N_{1,1} = \omega R_0$

intermediate
age classes $N_{a,1} = N_{1,1} e^{-M(a-1)}$

plus group $N_{a,1} = \frac{N_{1,1} e^{-M(A-1)}}{1 - e^{-M}}$

N : population size

M : natural mortality rate

ω : initial recruitment fraction

v_{init} : initial selectivity

R_0 : virgin recruitment

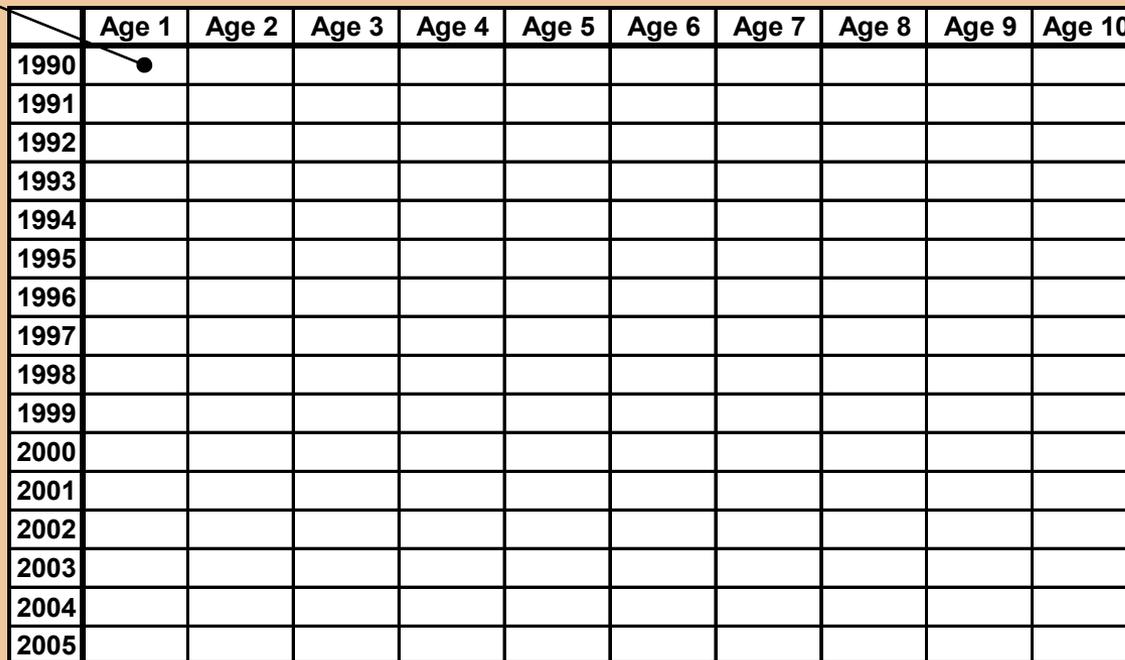
u_{init} : initial harvest rate

a : age

A : maximum age

Population constructed

$$N_{1,1} = R_0$$



	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	●									
1991										
1992										
1993										
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1998										
1999										
2000										
2001										
2002										
2003										
2004										
2005										

Population constructed

$$N_{1,1} = R_0$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$



	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	•	•	•	•	•	•	•	•	
1991										
1992										
1993										
1994										
1995										
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2000										
2001										
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2003										
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2005										

Population constructed

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$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	●
1991										
1992										
1993										
1994										
1995										
1996										
1997										
1998										
1999										
2000										
2001										
2002										
2003										
2004										
2005										

Population constructed

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	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
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1991										
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2000										
2001										
2002										
2003										
2004										
2005										

Population constructed

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1991										
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1993										
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2000										
2001										
2002										
2003										
2004										
2005										

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Population constructed

$$N_{1,1} = R_0$$

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	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
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1991		783	520	291	173	103	61	36	22	55
1992			536	297	166	99	59	35	21	44
1993				334	185	103	62	37	22	40
1994					223	124	69	41	24	41
1995						138	77	43	25	41
1996							73	40	23	35
1997								43	24	34
1998									24	32
1999										30
2000										
2001										
2002										
2003										
2004										
2005										

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Recruitment

$$N_{1,t+1} = \frac{S_t}{\alpha + \beta S_t}$$

N_1 : recruits

t : years

S : spawning biomass

α : shape parameter (1 / initial slope)

β : shape parameter (1 / asymptote)

Beverton-Holt

$$N_{1,t+1} = \frac{S_t}{\alpha + \beta S_t}$$

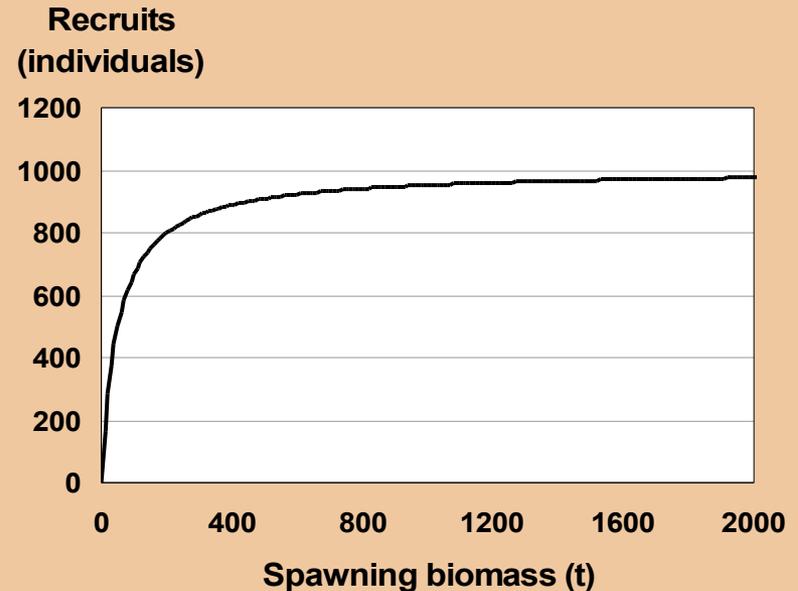
N_1 : recruits

t : years

S : spawning biomass

α : shape parameter (1 / initial slope)

β : shape parameter (1 / asymptote)



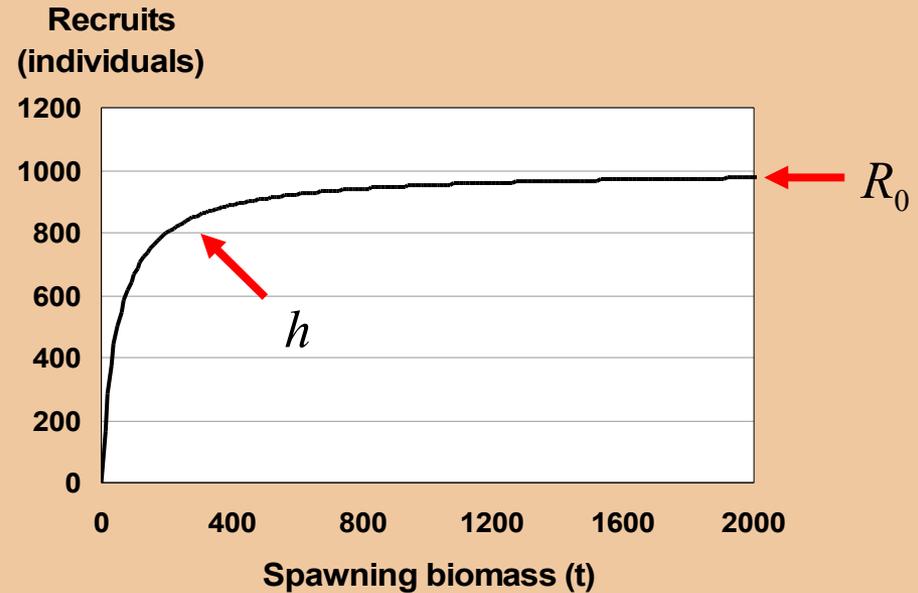
Reparametrized Beverton-Holt

$$N_{1,t+1} = \frac{S_t}{\alpha + \beta S_t}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

R_0 : virgin recruitment

h : slope parameter (by definition $0.2 \leq h \leq 1.0$)



Spawning biomass

$$S_t = \sum_a N_{a,t} \Phi_a W_{a,t}$$

S : spawning biomass

N : population size

a : age

t : years

Φ : fraction mature

W : weight

Population constructed

$$N_{1,1} = R_0$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
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1992	●		536	297	166	99	59	35	21	44
1993	●			334	185	103	62	37	22	40
1994	●				223	124	69	41	24	41
1995	●					138	77	43	25	41
1996	●						73	40	23	35
1997	●							43	24	34
1998	●								24	32
1999	●									30
2000	●									
2001	●									
2002	●									
2003	●									
2004	●									
2005	●									

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Population constructed

$$N_{1,1} = R_0$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
1993	989	256	154	334	185	103	62	37	22	40
1994	466	793	189	103	223	124	69	41	24	41
1995	723	371	564	117	64	138	77	43	25	41
1996	1860	566	244	298	62	34	73	40	23	35
1997	459	1475	395	145	177	37	20	43	24	34
1998	501	362	997	220	81	99	20	11	24	32
1999	292	393	239	530	117	43	52	11	6	30
2000	433	231	269	137	304	67	25	30	6	21
2001	726	339	152	143	73	161	36	13	16	14
2002	592	572	229	84	79	40	89	20	7	17
2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

Harvest rate

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Harvest rate

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

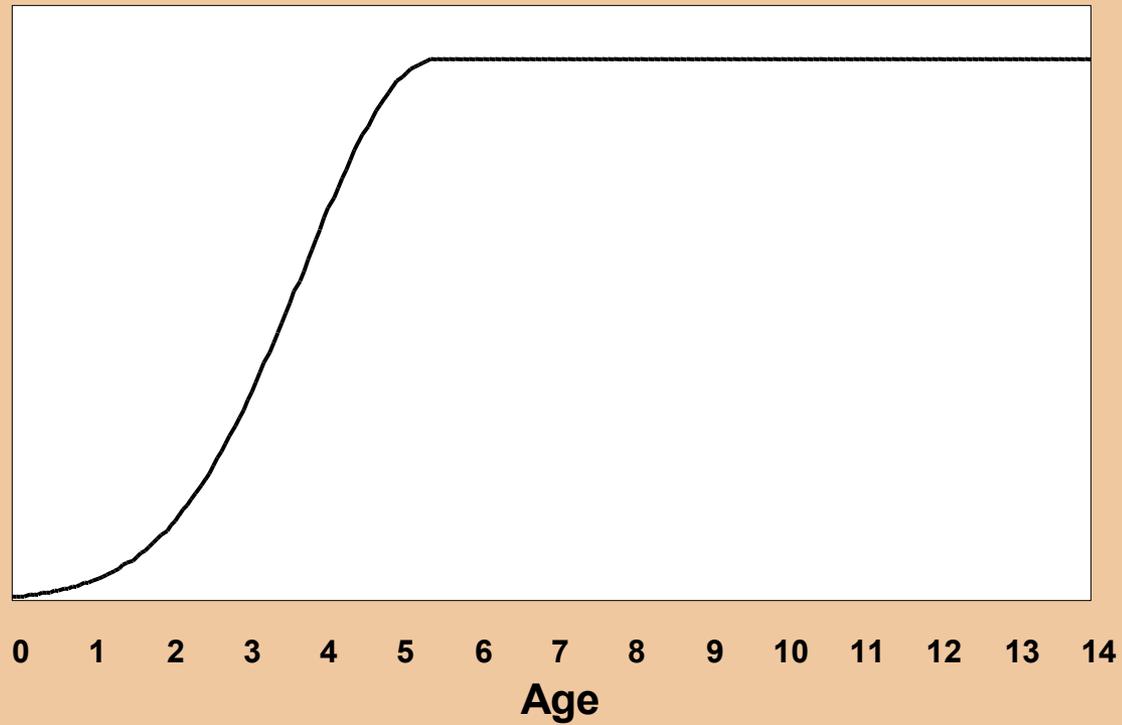
$$u_{a,t} = u_t s_{a,t} \quad \star \text{ selectivity}$$

$$u_t = \frac{Y_t}{e^{-0.5M} \sum_a s_{a,t} N_{a,t} w_{a,t}}$$

Selectivity

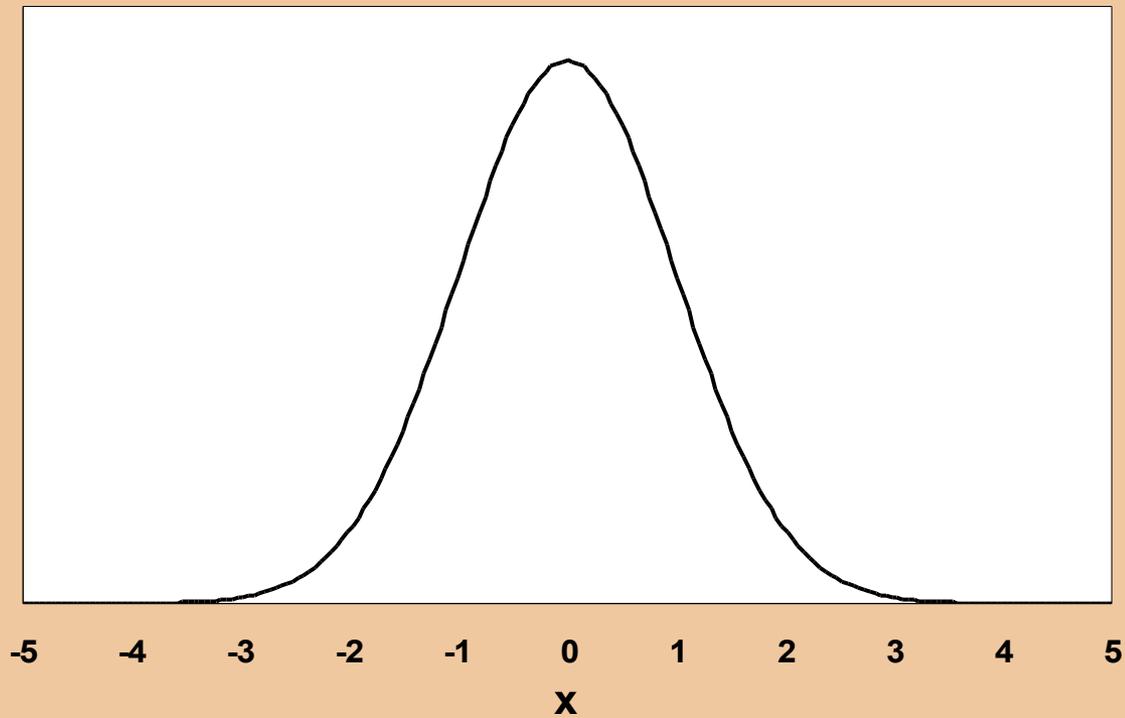
Selectivity

Proportional
harvest rate



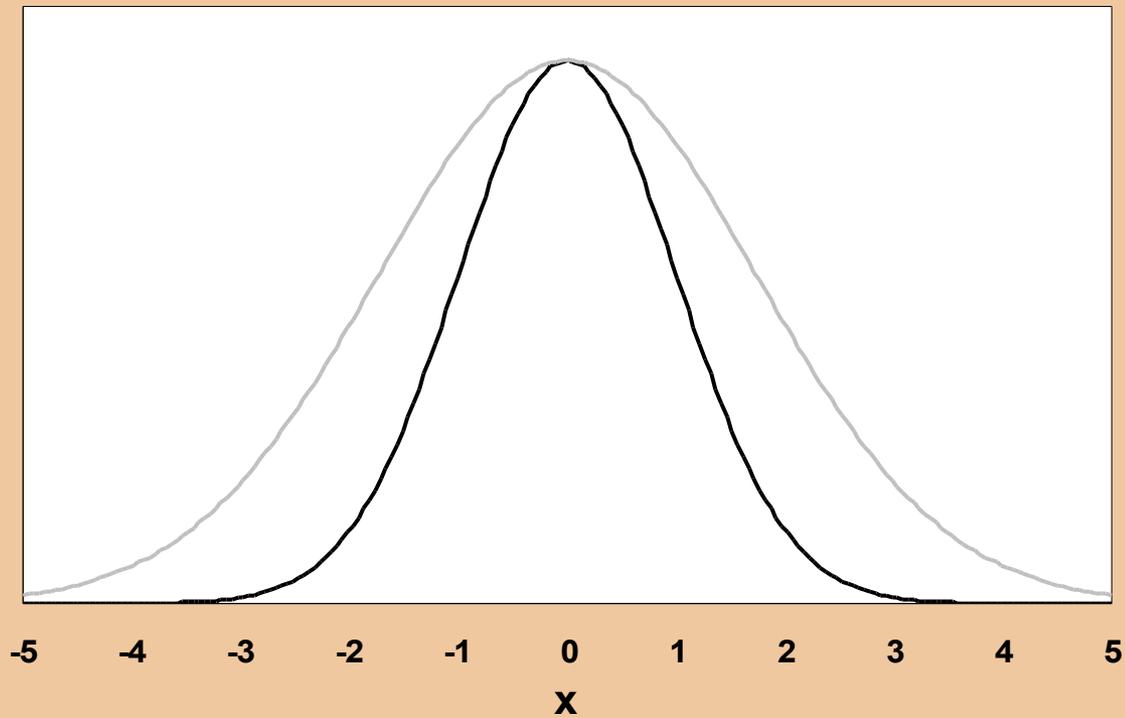
Normal distribution

$$f(x|\mu, \sigma_L^2, \sigma_R^2)$$



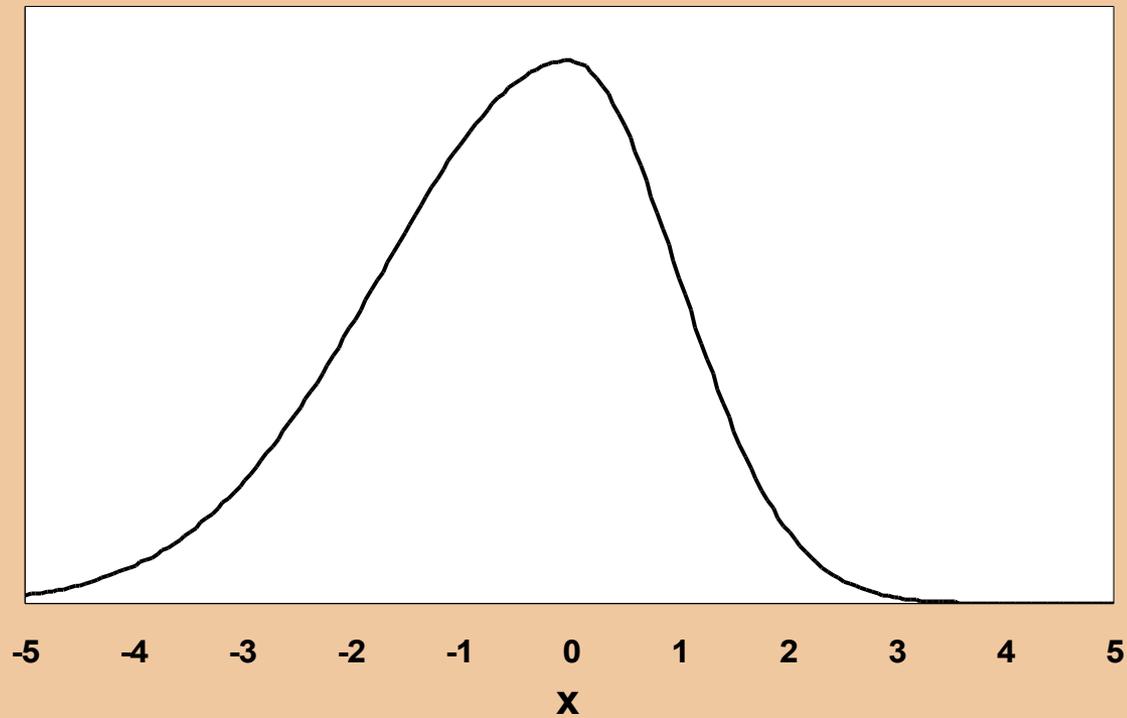
Different variance

$$f(x|\mu, \sigma_L^2, \sigma_R^2)$$



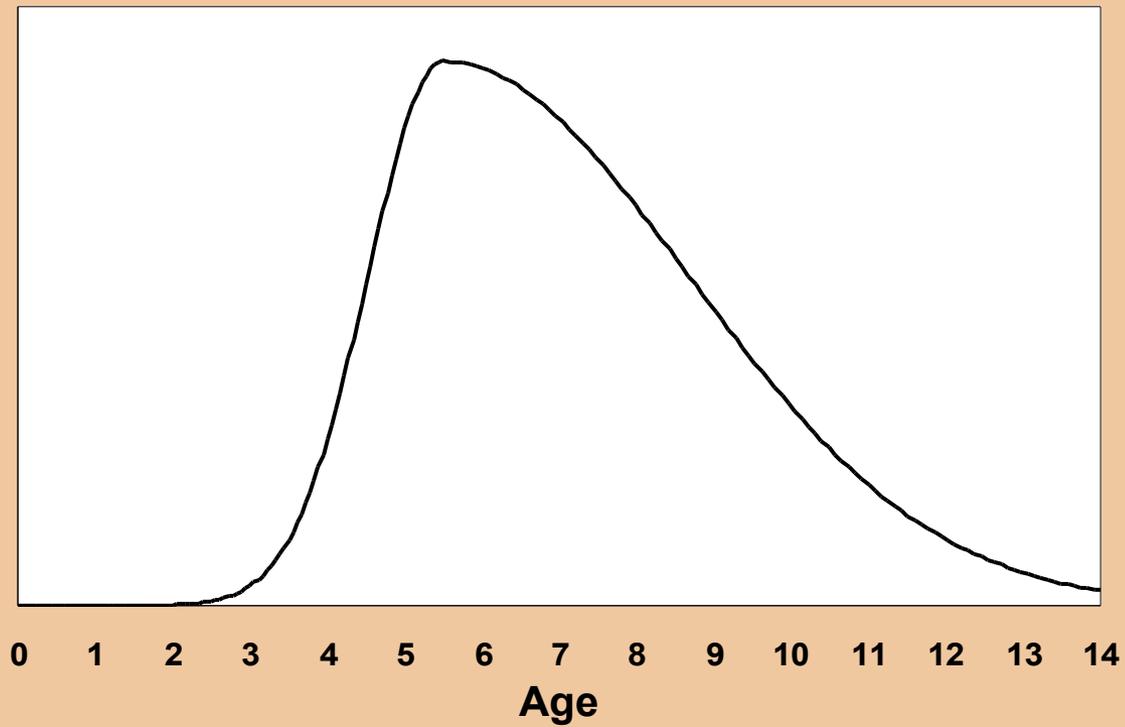
Asymmetric normal

$$f(x|\mu, \sigma_L^2, \sigma_R^2)$$



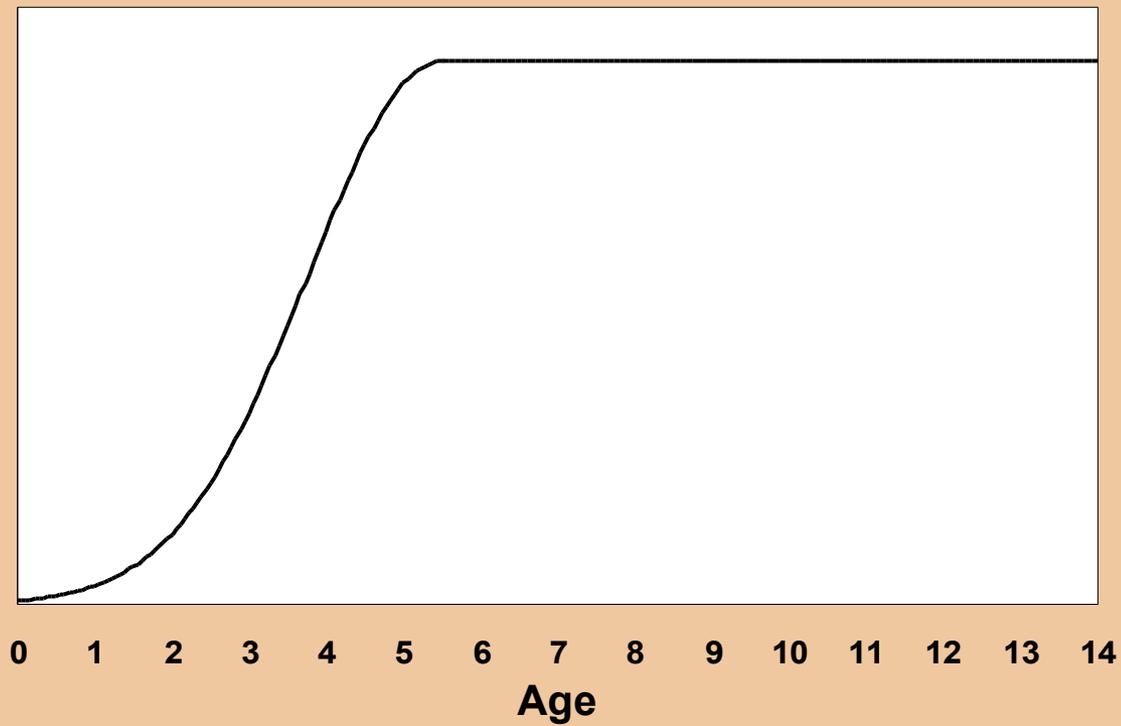
Gillnet

Selectivity



Bottom trawl

Selectivity



Bottom trawl

Selectivity



Estimated parameters

Virgin recruitment
 $N_{1,1} = R_0$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

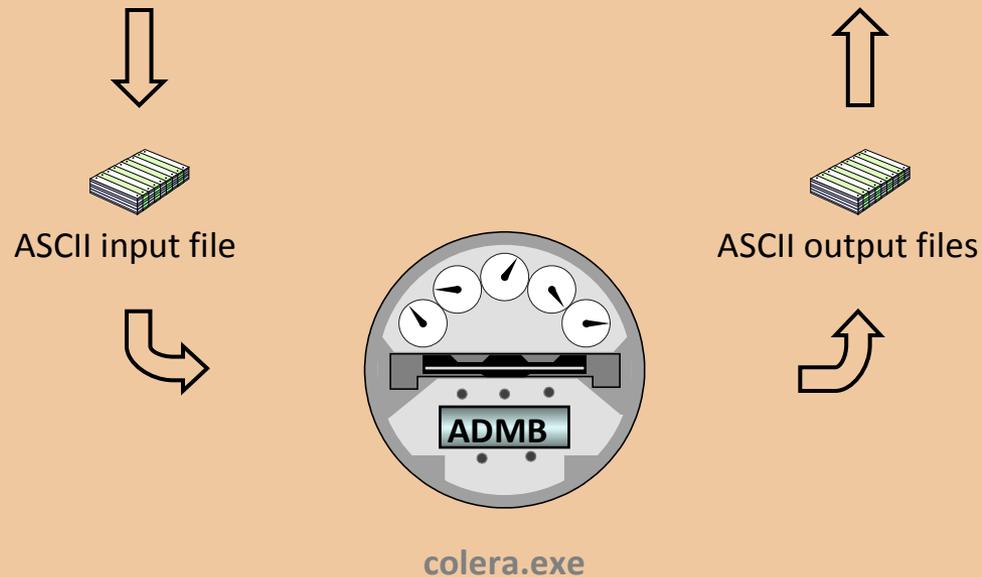
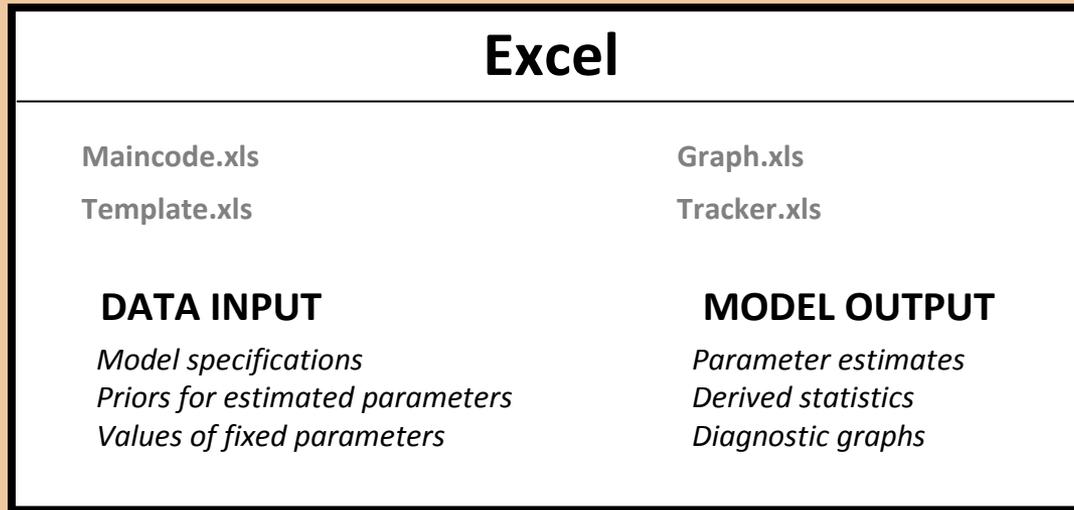
$$N_{1,t+1} = f(S_t | R_0, h)$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
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1992	321	215	536	297	166	99	59	35	21	44
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2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

Selectivity parameters:
 Sleft, Sfull, Sright

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t}) \quad u_{a,t} = u_t S_{a,t}$$

User interface

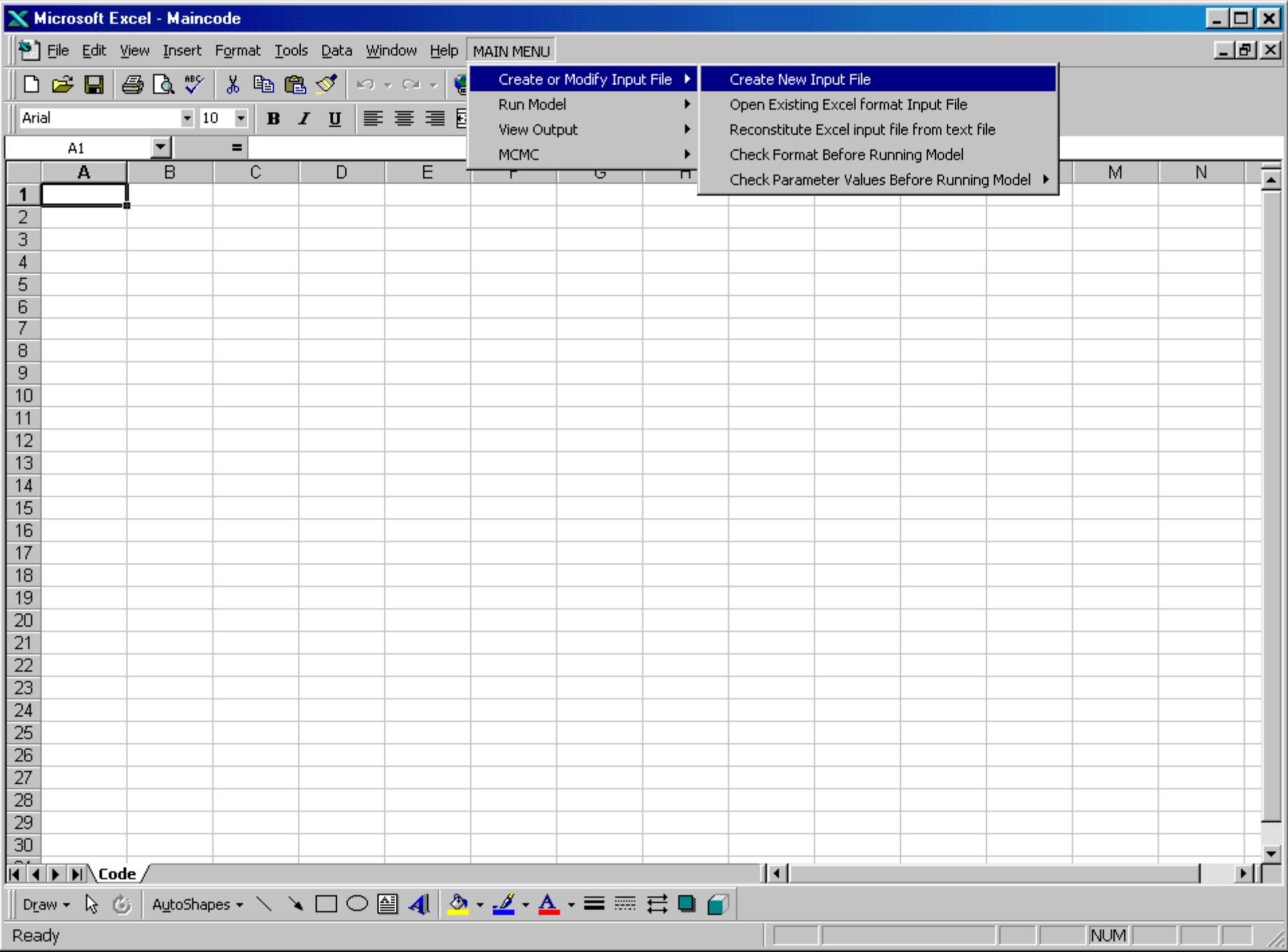


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- Create or Modify Input File ▶
- Run Model ▶
- View Output ▶
- MCMC ▶

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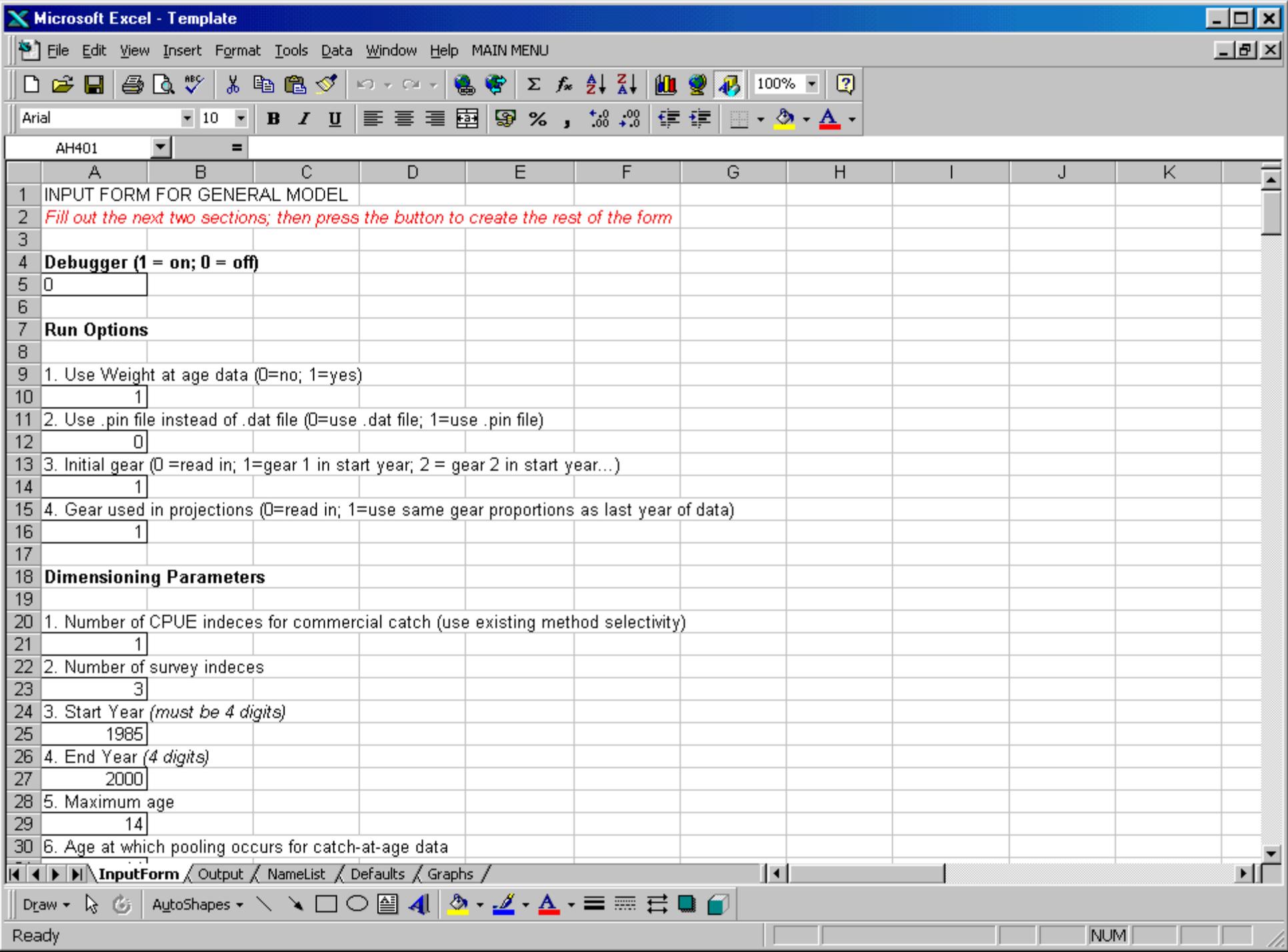


File icons: Save, Print, Undo, Redo, Copy, Paste, Find, etc.

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- Create or Modify Input File
 - Create New Input File
 - Open Existing Excel format Input File
 - Reconstitute Excel input file from text file
 - Check Format Before Running Model
 - Check Parameter Values Before Running Model
- Run Model
- View Output
- MCMC

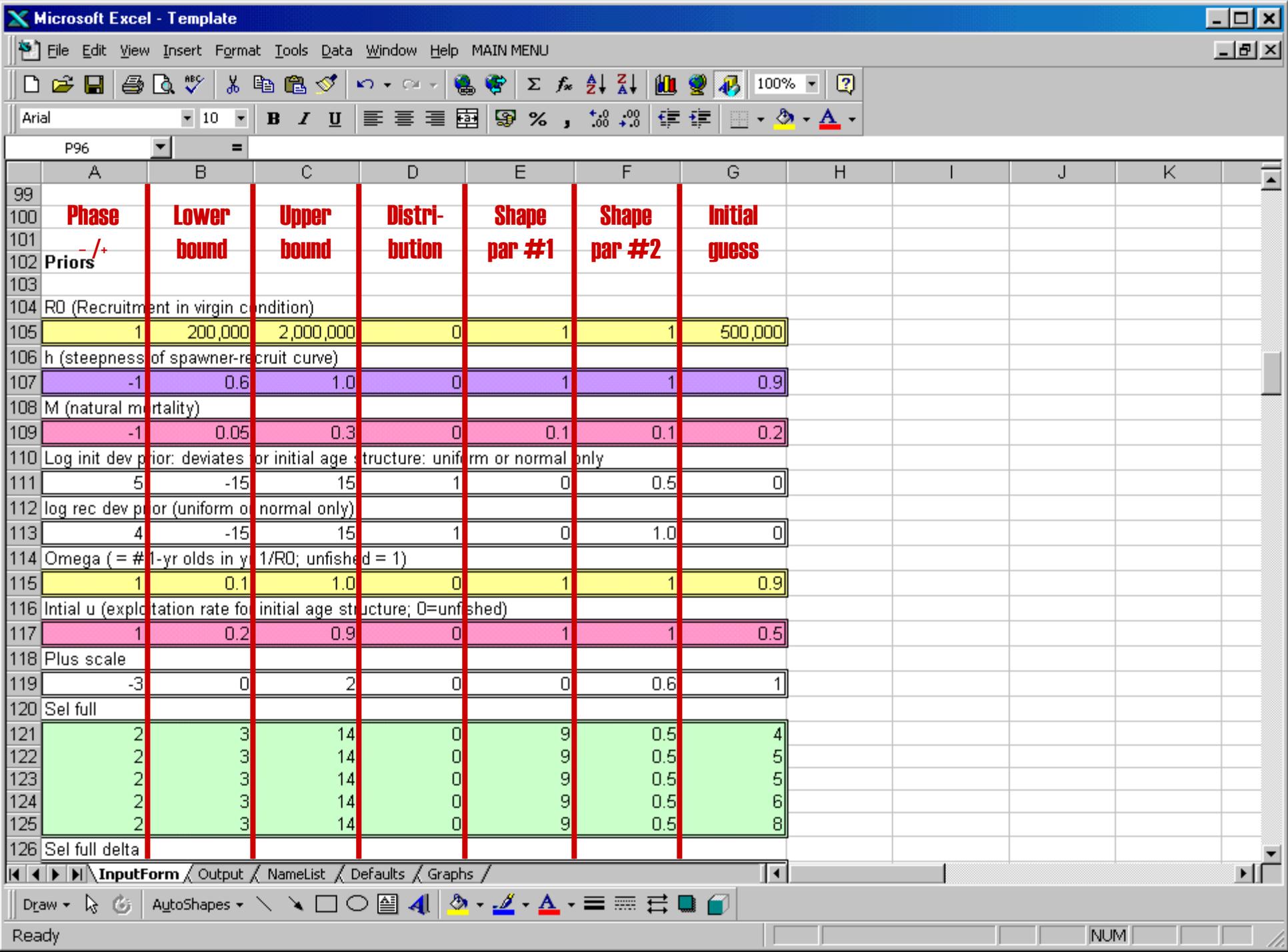
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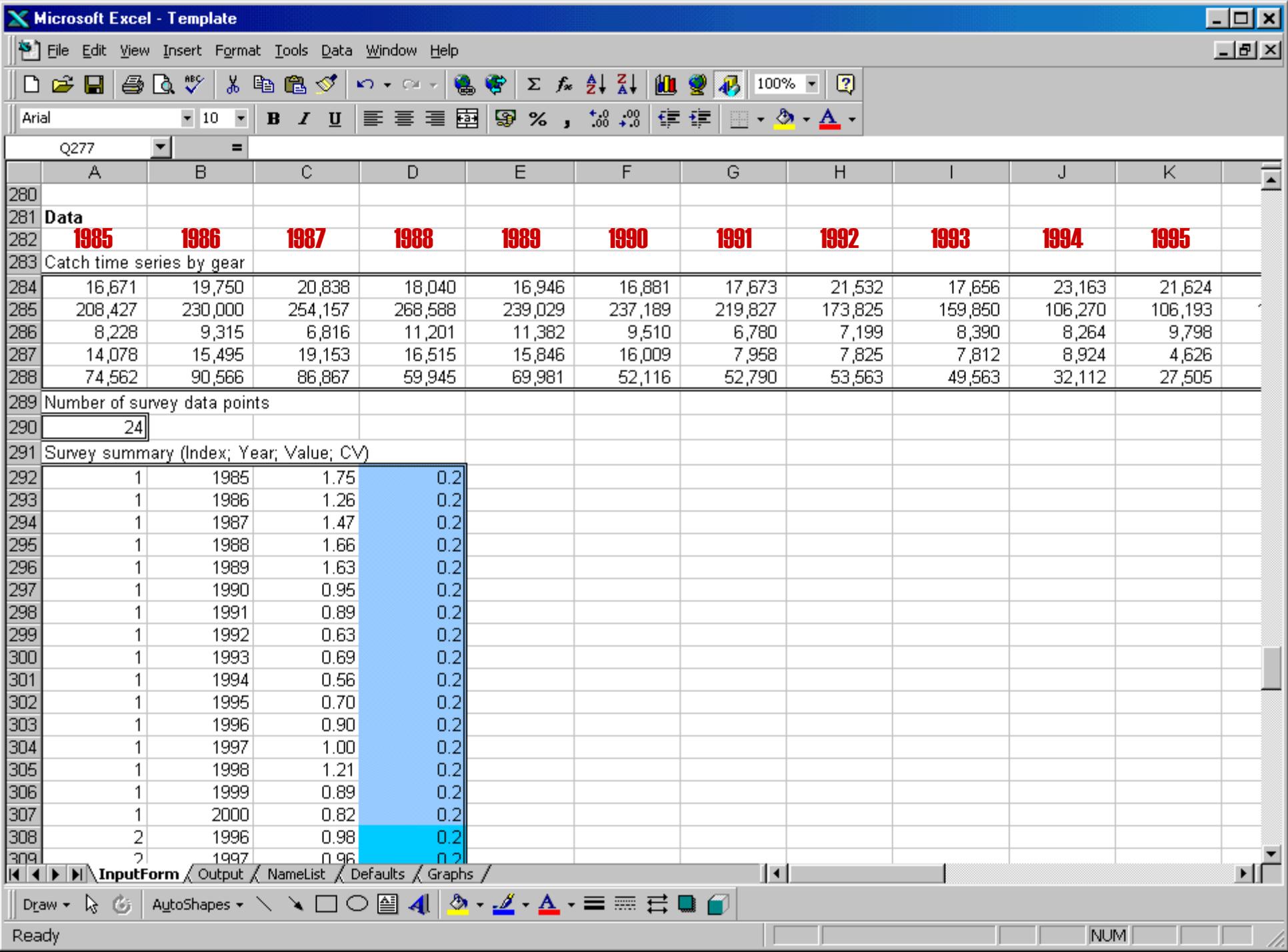
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	A	B	C	D	E	F	G	H	I	J	K
99											
100											
101											
102	Priors										
103											
104	RO (Recruitment in virgin condition)										
105	1	200,000	2,000,000	0	1	1	500,000				
106	h (steepness of spawner-recruit curve)										
107	-1	0.6	1.0	0	1	1	0.9				
108	M (natural mortality)										
109	-1	0.05	0.3	0	0.1	0.1	0.2				
110	Log init dev prior: deviates for initial age structure: uniform or normal only										
111	5	-15	15	1	0	0.5	0				
112	log rec dev prior (uniform or normal only)										
113	4	-15	15	1	0	1.0	0				
114	Omega (= # 1-yr olds in yr 1/RO; unfished = 1)										
115	1	0.1	1.0	0	1	1	0.9				
116	Initial u (exploitation rate for initial age structure; 0=unfished)										
117	1	0.2	0.9	0	1	1	0.5				
118	Plus scale										
119	-3	0	2	0	0	0.6	1				
120	Sel full										
121	2	3	14	0	9	0.5	4				
122	2	3	14	0	9	0.5	5				
123	2	3	14	0	9	0.5	5				
124	2	3	14	0	9	0.5	6				
125	2	3	14	0	9	0.5	8				
126	Sel full delta										



	A	B	C	D	E	F	G	H	I	J	K
99											
100	Phase	Lower bound	Upper bound	Distribution	Shape par #1	Shape par #2	Initial guess				
101	-/+										
102	Priors										
103											
104	RO (Recruitment in virgin condition)										
105	1	200,000	2,000,000	0	1	1	500,000				
106	h (steepness of spawner-recruit curve)										
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120	Sel full										
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124	2	3	14	0	9	0.5	6				
125	2	3	14	0	9	0.5	8				
126	Sel full delta										



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	A	B	C	D	E	F	G	H	I	J	K
348	4	1998	5	0	0.000	0.008	0.020	0.155	0.513	0.138	0.067
349	4	1999	5	0	0.000	0.001	0.039	0.055	0.443	0.334	0.055
350	5	1996	30	0	0.001	0.017	0.069	0.096	0.306	0.381	0.091
351	5	1997	30	0	0.000	0.023	0.085	0.241	0.165	0.174	0.238
352	5	1998	30	0	0.000	0.001	0.015	0.076	0.339	0.194	0.182
353	5	1999	30	0	0.000	0.004	0.033	0.061	0.280	0.417	0.096

354 Nsurvey C@A

355 24

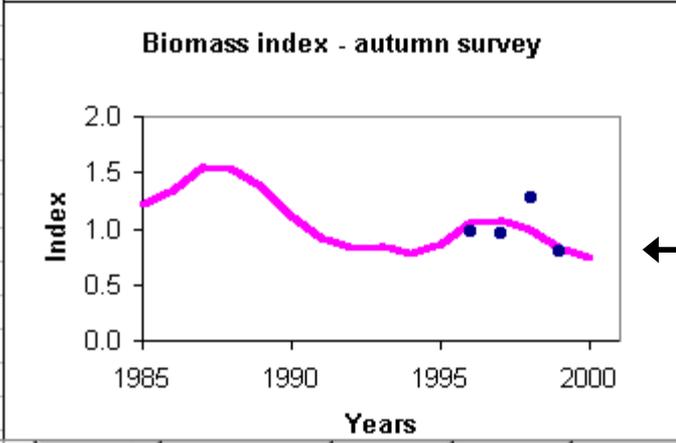
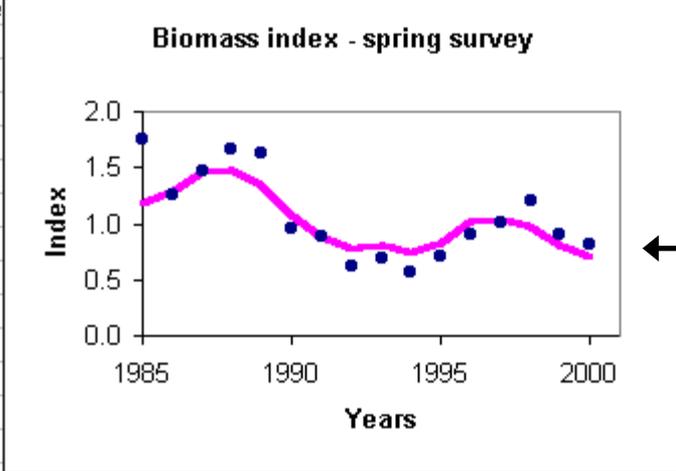
356 Survey catch at age data (survey; year; sample size; a1; a2; a3...)

357	1	1985	30	0.051	0.344	0.108	0.148	0.199	0.070	0.047	0.015
358	1	1986	30	0.059	0.239	0.375	0.088	0.084	0.108	0.028	0.011
359	1	1987	30	0.014	0.106	0.381	0.305	0.079	0.048	0.048	0.010
360	1	1988	30	0.012	0.027	0.257	0.371	0.251	0.030	0.023	0.025
361	1	1989	30	0.017	0.070	0.091	0.325	0.303	0.160	0.020	0.007
362	1	1990	30	0.039	0.085	0.188	0.101	0.197	0.249	0.118	0.012
363	1	1991	30	0.030	0.126	0.138	0.225	0.119	0.145	0.170	0.036
364	1	1992	30	0.007	0.175	0.298	0.175	0.153	0.064	0.058	0.053
365	1	1993	30	0.032	0.043	0.312	0.344	0.118	0.093	0.021	0.019
366	1	1994	30	0.141	0.158	0.083	0.265	0.230	0.060	0.042	0.008
367	1	1995	30	0.010	0.252	0.225	0.081	0.215	0.158	0.034	0.016
368	1	1996	30	0.030	0.044	0.332	0.222	0.101	0.121	0.112	0.027
369	1	1997	30	0.008	0.152	0.092	0.378	0.196	0.066	0.060	0.042
370	1	1998	30	0.049	0.035	0.182	0.096	0.370	0.170	0.039	0.033
371	1	1999	30	0.050	0.234	0.051	0.297	0.091	0.167	0.078	0.016
372	1	2000	30	0.113	0.175	0.341	0.044	0.190	0.052	0.052	0.027
373	2	1996	30	0.082	0.056	0.309	0.221	0.087	0.118	0.096	0.024
374	2	1997	30	0.013	0.198	0.086	0.363	0.194	0.057	0.050	0.032
375	2	1998	30	0.058	0.034	0.210	0.104	0.237	0.234	0.071	0.031
376	2	1999	30	0.115	0.218	0.073	0.280	0.090	0.144	0.062	0.009
377	3	1996	10	0.000	0.001	0.020	0.081	0.118	0.293	0.352	0.091

Microsoft Excel toolbar with icons for file operations, editing, and formatting. The font is set to Arial, size 10. The active cell is B6.

56 =

	A	B	C	D	E	F	G	H	I	J	K	L	M	N
11	Gear	Year	Female	Male	From	To	Major	Minor						
12	Spring		Y	N/A	1985	2001	5	0						
13	Autumn		Y	N/A	1985	2001	5	0						
14	Ne				2001		5	0						



Estimated parameters

Virgin recruitment
 $N_{1,1} = R_0$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
1993	989	256	154	334	185	103	62	37	22	40
1994	466	793	189	103	223	124	69	41	24	41
1995	723	371	564	117	64	138	77	43	25	41
1996	1860	566	244	298	62	34	73	40	23	35
1997	459	1475	395	145	177	37	20	43	24	34
1998	501	362	997	220	81	99	20	11	24	32
1999	292	393	239	530	117	43	52	11	6	30
2000	433	231	269	137	304	67	25	30	6	21
2001	726	339	152	143	73	161	36	13	16	14
2002	592	572	229	84	79	40	89	20	7	17
2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$\hat{I}_t = q\hat{B}_t$
 Survey/CPUE catchability

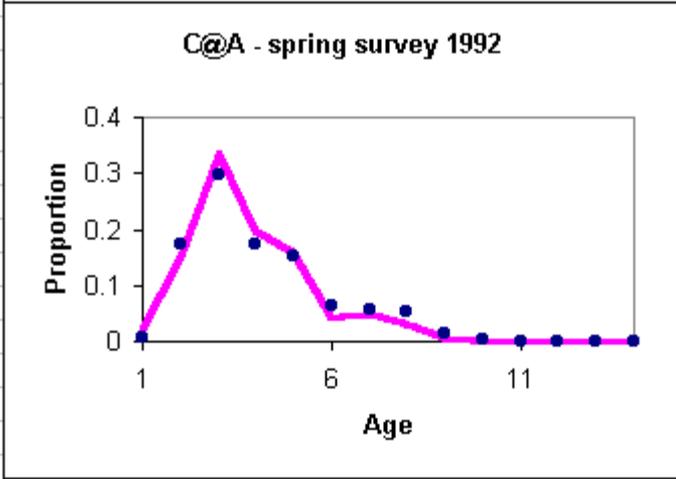
Selectivity parameters:
 Sleft, Sfull, Sright

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t}) \quad u_{a,t} = u_t S_{a,t}$$

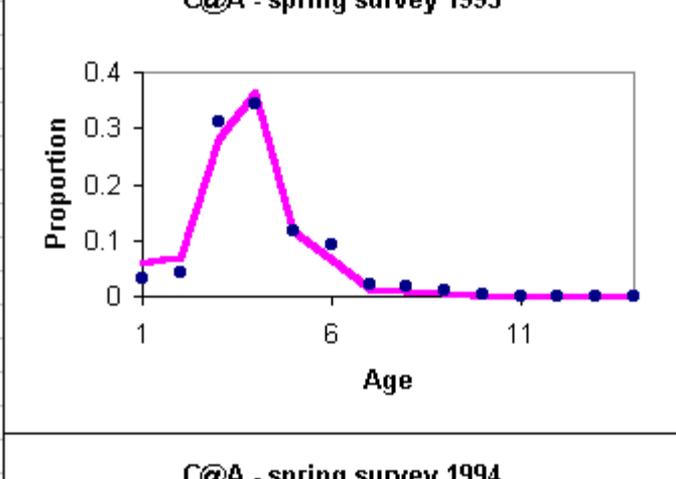
Standard toolbar with icons for file operations, editing, and formatting. The status bar shows 'R98' and a formula bar with '='.

	A	B	C	D	E	F	G	H	I	J	K	L	M	N
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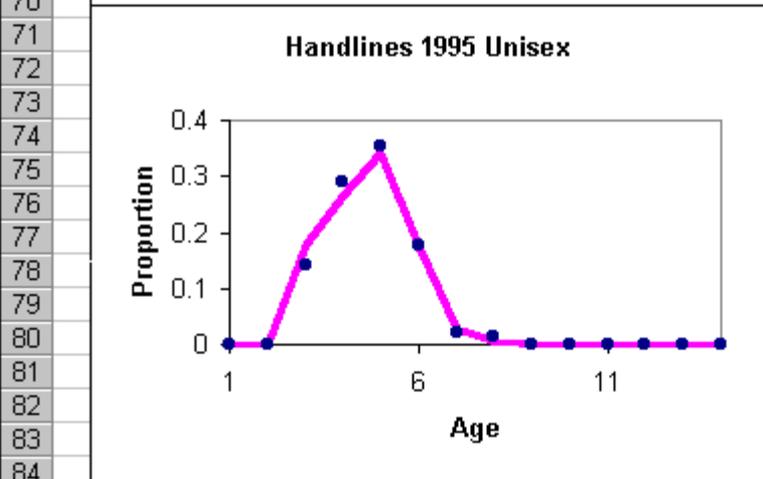
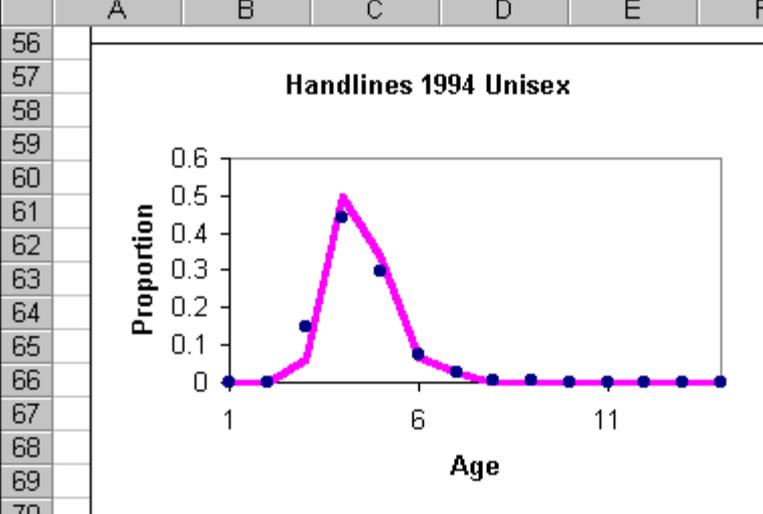


General \ SurvNoSexCL \ SurvC@L \ ComC@L \ **SurvC@A** \ ComC@A \ Surveys \ SurvSel \ ComSel \ CPUE \ Master \ Graphmaster \ Nhat

Draw toolbar with icons for drawing shapes, lines, and text.

Microsoft Excel ribbon with various icons for file operations, editing, and formatting. The font is set to Arial, size 10. The active cell is B548.

	A	B	C	D	E	F	G	H	I	J	K	L	M	N
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Catch-at-age likelihood

$$\log L_C^g = -0.5 \sum_{t=1}^{Nyears} \sum_{a=1}^A \log \left[\left(P_{a,t}^g (1 - P_{a,t}^g) + 0.1/A \right) \right]$$
$$+ \sum_{t=1}^{Nyears} \sum_{a=1}^A \log \left[\exp \left\{ \frac{-(\tilde{P}_{a,t}^g - P_{a,t}^g)^2}{2(P_{a,t}^g (1 - P_{a,t}^g) + 0.1/A) \tau^g} \right\} + 0.01 \right]$$

L_C : catch-at-age likelihood

g : gear

a : age

t : years

T : number of years

a : age

A : number of age groups

P : proportional catch at age

τ : 1 / catch sample size

Biomass index likelihood

$$\log L_I^g = \sum_t \log \left[\exp \left(-0.5 \frac{I^g \varepsilon_t^2}{I^g \sigma_t^2} \right) + 0.01 \right]$$

L_I : biomass index likelihood

g : gear

I : biomass index

t : years

ε : log-normal error term

σ : survey variance

Total likelihood

$$\log L = \sum_g \log L_I^g + \sum_g \log L_C^g + \sum_g \log L_S^g$$

L : total likelihood

g : gear

L_I : biomass index likelihood

L_C : commercial catch-at-age likelihood

L_S : survey catch-at-age likelihood

Penalties

$$Pen_p = 0.5 \frac{\varepsilon_p^2}{\sigma_p^2}$$

For example,
recruitment deviates
or time-varying selectivity

Pen : penalty for deviation

p : parameter

ε : residual from prior μ

σ : variance of prior distribution

Objective function

$$f = \log L - \sum_p Pen_p$$

L : total likelihood

Pen : penalty sum of square

p : parameter

Initial population and recruitment

$$N_{1,1} = R_0$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

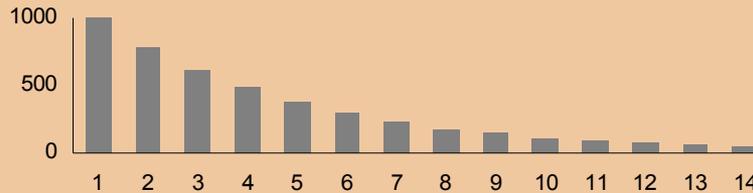
$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
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1997	459	1475	395	145	177	37	20	43	24	34
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1999	292	393	239	530	117	43	52	11	6	30
2000	433	231	269	137	304	67	25	30	6	21
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2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Initial population and recruitment



$$N_{1,1} = R_0$$

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
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1997	459	1475	395	145	177	37	20	43	24	34
1998	501	362	997	220	81	99	20	11	24	32
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2000	433	231	269	137	304	67	25	30	6	21
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2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$$N_{1,t+1} = f(S_t | R_0, h)$$

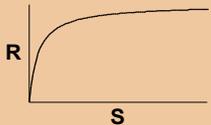
$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Initial population and recruitment

$$N_{1,1} = R_0$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

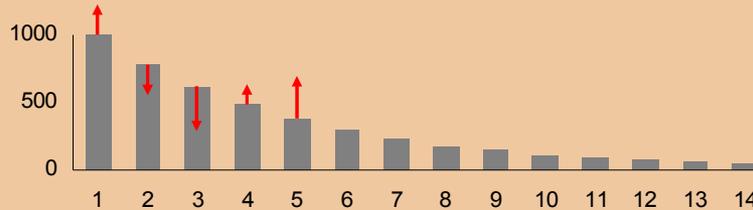
$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$



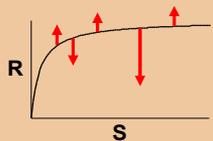
	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
1993	989	256	154	334	185	103	62	37	22	40
1994	466	793	189	103	223	124	69	41	24	41
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2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Initial population and recruitment



$$N_{1,1} = R_0$$



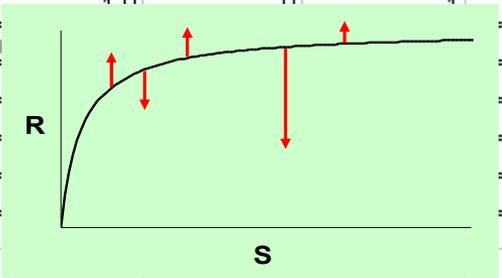
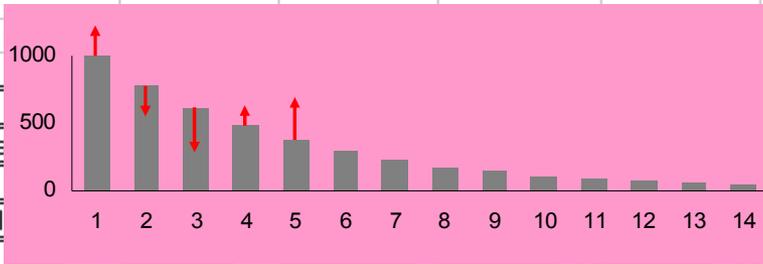
	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
1993	989	256	154	334	185	103	62	37	22	40
1994	466	793	189	103	223	124	69	41	24	41
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2000	433	231	269	137	304	67	25	30	6	21
2001	726	339	152	143	73	161	36	13	16	14
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2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t})$$

Toolbar: Undo, Redo, Cut, Copy, Paste, Find, Print, Save, Open, Close, Home, Insert, Format, Tools, Data, Window, Help, 100%, Help icon.

Font: Arial, 10, Bold, Italic, Underline, Text color, Fill color, Background color, Borders, Styles, AutoSum, Percent, Increase/Decrease decimal places, Increase/Decrease indent, Number format, Language, Font color.

	A	B	C	D	E	F	G	H	I	J	K
102	Priors										
104	RO (Recruitment										
105	1						500,000				
106	h (steepness of s										
107	-1							0.9			
108	M (natural mortal										
109	-1							0.2			
110	Log init dev prior: deviates for initial age structure: uniform or normal only										
111	5	-15	15	1	0	0.5	0				
112	log rec dev prior (uniform or normal only)										
113	4	-15	15	1	0	1.0	0				
114	Omega (= # 1-yr olds in yr 1/RO; unfished = 1)										
115	1	0.1	1.0	0	1		1	0.9			
116	Initial u (exploitation rate for i										
117	1	0.2					1	0.5			
118	Plus scale										
119	-3	0					0.6	1			
120	Sel full										
121	2	3					0.5	4			
122	2	3					0.5	5			
123	2	3	14	0	9		0.5	5			
124	2	3	14	0	9		0.5	6			
125	2	3	14	0	9		0.5	8			
126	Sel full delta										
127	-1	-3	3	0	0		0.6	0			



Estimated parameters

Virgin recruitment

$$N_{1,1} = R_0$$

Initial deviates

$$\times \exp(Dev_a)$$

$$N_{a,1} = N_{1,1} e^{-M(a-1)} \prod_{i=1}^{a-1} (1 - u_{i,1})$$

$$N_{A,1} = \frac{N_{1,1} e^{-M(A-1)} \prod_{i=1}^{A-1} u_{i,1}}{1 - e^{-M} \prod_{i=1}^{A-1} u_{i,1}}$$

$$N_{1,t+1} = f(S_t | R_0, h)$$

$$\times \exp(Dev_t)$$

Recruitment deviates

	Age 1	Age 2	Age 3	Age 4	Age 5	Age 6	Age 7	Age 8	Age 9	Age 10
1990	1000	793	553	329	196	116	69	41	24	80
1991	273	783	520	291	173	103	61	36	22	55
1992	321	215	536	297	166	99	59	35	21	44
1993	989	256	154	334	185	103	62	37	22	40
1994	466	793	189	103	223	124	69	41	24	41
1995	723	371	564	117	64	138	77	43	25	41
1996	1860	566	244	298	62	34	73	40	23	35
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1998	501	362	997	220	81	99	20	11	24	32
1999	292	393	239	530	117	43	52	11	6	30
2000	433	231	269	137	304	67	25	30	6	21
2001	726	339	152	143	73	161	36	13	16	14
2002	592	572	229	84	79	40	89	20	7	17
2003	760	475	423	153	56	53	27	60	13	16
2004	1222	599	321	236	85	31	29	15	33	16
2005	324	959	397	172	127	46	17	16	8	27

$$\hat{I}_t = q \hat{B}_t$$

Survey/CPUE catchability

Selectivity parameters: Sleft, Sfull, Sright

$$N_{a+1,t+1} = N_{a,t} e^{-M} (1 - u_{a,t}) \quad u_{a,t} = u_t S_{a,t}$$

100%

Arial 10 **B** *I* U

	A	B	C	D	E	F	G	H	I	J	K
244	Age error										
245	0.8	0.2	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0
246	0.1	0.8	0.1	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0
247	0.0	0.2	0.6	0.1	0.1	0.0	0.0	0.0	0.0	0.0	0.0
248	0.0	0.0	0.2	0.7	0.1	0.0	0.0	0.0	0.0	0.0	0.0
249	0.0	0.0	0.0	0.1	0.8	0.1	0.0	0.0	0.0	0.0	0.0
250	0.0	0.0	0.0	0.0	0.1	0.8	0.1	0.0	0.0	0.0	0.0
251	0.0	0.0	0.0	0.0	0.0	0.1	0.8	0.1	0.0	0.0	0.0
252	0.0	0.0	0.0	0.0	0.0	0.0	0.1	0.8	0.1	0.0	0.0
253	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.1	0.8	0.1	0.0
254	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.1	0.8	0.1
255	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.1	0.8
256	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.1
257	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0
258	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0

259 No. of weight-at-age data sets

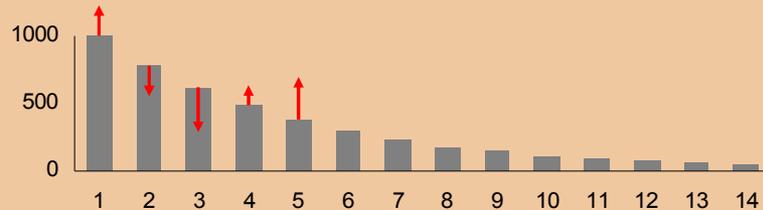
260

261 Weight at age on annual basis (year, sex; a1;a2;a3...)

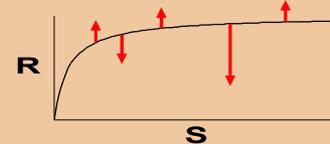
262	1985	1	0.20	0.60	1.41	1.97	2.58	3.65	4.98	6.37	8.21
263	1986	1	0.20	0.60	1.46	1.96	2.84	3.59	4.64	6.16	7.50
264	1987	1	0.20	0.60	1.32	1.96	2.69	3.89	4.72	6.26	7.37
265	1988	1	0.20	0.60	1.44	1.81	2.58	3.52	4.93	6.00	7.14
266	1989	1	0.20	0.60	1.19	1.81	2.59	3.92	5.21	6.89	8.04
267	1990	1	0.20	0.60	1.29	1.70	2.38	3.03	4.62	6.52	8.89
268	1991	1	0.20	0.60	1.31	1.90	2.48	3.16	3.79	5.68	7.24
269	1992	1	0.20	0.60	1.29	1.77	2.47	3.29	4.39	5.58	6.83
270	1993	1	0.20	0.60	1.39	1.89	2.77	3.76	4.93	6.05	7.45
271	1994	1	0.20	0.60	1.44	2.06	2.56	3.66	5.12	6.26	7.72
272	1995	1	0.20	0.60	1.35	1.96	2.92	3.63	5.18	6.42	7.92
273	1996	1	0.20	0.60	1.46	1.93	3.13	4.14	4.92	6.01	7.41

Confronting uncertainty

Initial process error



Recruitment process error



Ageing observation error

0.8	0.2	0.0	0.0
0.1	0.8	0.1	0.0
0.0	0.2	0.6	0.1
0.0	0.0	0.2	0.7
0.0	0.0	0.0	0.1
0.0	0.0	0.0	0.0

Likelihood function with log-normal error structure

$$\ln L_l^g = \sum_t \ln \left[\exp \left(-0.5 \frac{I_t^g \mathcal{E}_t^2}{I_t^g \sigma_t^2} \right) + 0.01 \right]$$

Model output

PARAMETERS

point estimates

Arial 10 **B** *I* U % , +.0 +.00 75%

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R
1	File Path	C:\CodiGe	C:\CodiGe	C:\CodiGe	C:\CodiGe	C:\CodiGe	C:\CodiGe	C:\CodiGear										
2																		
3																		
4		RUN47	RUN48	RUN49	RUN50	RUN51	RUN54	RUN55										
5	Input File	wt0.txt	wt4.txt	wt12.txt	wt15.txt	wt15.txt	loco.txt	gear247.txt										
6																		
7	Likelihoods	-1,420	-1,421	-781	-1,338	-1,421	-1,421	-1,421										
8	CPUE	0	0	0	0	0	0	0										
9	Comm. CA 1	-226	-229	-225	-229	-229	-229	-229										
10	Comm. CA 2	-213	-212	-201	-213	-212	-212	-212										
11	Comm. CA 3	-215	-215	-209	-215	-215	-215	-215										
12	Comm. CA 4	-106	-106	-66	-106	-106	-106	-106										
13	Comm. CA 5	-97	-97	-93	-97	-97	-97	-97										
14	Survey 1	7	7	18	6	6	6	6										
15	Survey 2	1	1	8	1	1	1	1										
16	Survey 3	1	1	1	1	1	1	1										
17	Survey CA 1	-382	-381	23	-296	-381	-381	-381										
18	Survey CA 2	-94	-93	48	-93	-93	-93	-93										
19	Survey CA 3	-103	-103	-102	-103	-103	-103	-103										
20	Penalties	5	5	17	4	5	5	5										
21																		
22	Parameters																	
23	R0	377,940	380,000	380,000	380,000	380,000	383,381	368,632										
24	h	0.321	0.900	0.900	0.900	0.900	0.900	0.927										
25	M	0.2	0.2	0.2	0.2	0.2	0.2	0.2										
26	omega	0.97	0.97	0.97	0.97	0.97	0.98	0.98										
27	uinit	0.41	0.50	0.50	0.50	0.50	0.55	0.49										
28	Selffull handline	3.6	3.7	3.8	3.8	3.7	4.3	3.7										
29	Selffull trawl	5.2	5.2	4.8	5.3	5.2	5.2	5.2										
30	Selffull seine	5.2	5.3	4.8	5.2	5.2	5.3	5.3										
31	Selffull 6in	6.1	6.1	7.0	6.2	6.1	6.1	6.1										
32	Selffull 7to9	8.4	8.4	7.2	8.4	8.4	8.4	8.4										
33	log_varLest 1	-1.4	-1.2	-0.9	-1.0	-1.2	0.0	-1.2										
34	log_varLest 2	1.0	1.1	0.8	1.1	1.1	1.0	1.1										
35	log_varLest 3	0.6	0.6	0.2	0.6	0.6	0.6	0.6										
36	log_varLest 4	0.2	0.2	-15.0	0.3	0.2	0.2	0.2										
37	log_varLest 5	1.5	1.5	1.1	1.5	1.5	1.5	1.5										
38	log_varRest 1	9.0	3.5	3.5	3.5	3.5	2.9	3.6										
39	log_varRest 2	15.0	15.0	15.0	15.0	15.0	15.0	15.0										
40	log_varRest 3	15.0	15.0	15.0	15.0	15.0	15.0	15.0										

Model output

PARAMETERS

**Maximum
likelihood**
(incl. penalties)

→ point estimates

→ Bayesian posterior probability profiles

MCMC

PROJECTIONS

→ evaluation of harvest strategies

Toolbar: Create or Modify Input File, Run Model, View Output, MCMC, Run MCMC, Run mc_eval, MCMC to CODA

Font: Arial, Size: 10, Bold, Italic, Underline, Bullets, Numbered

Cell: P33 =

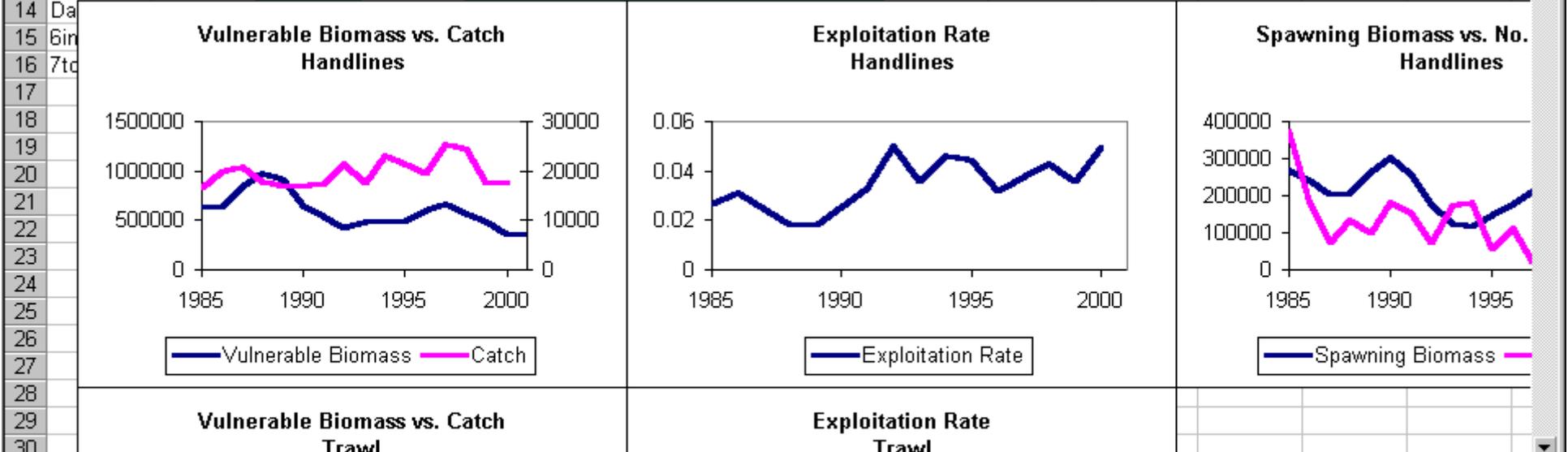
1	Titles ("None" to leave blank)		Size (in.)		Spacing (in.) between		ing Position - 1st chart	
2	X axis	None	Width	3.5	Left		0.2	
3	Y axis		Height	2.5	Top		2.4	
4	Series 1	Default						
5	Series 2	Default						

Name of sheet where graphs will go:

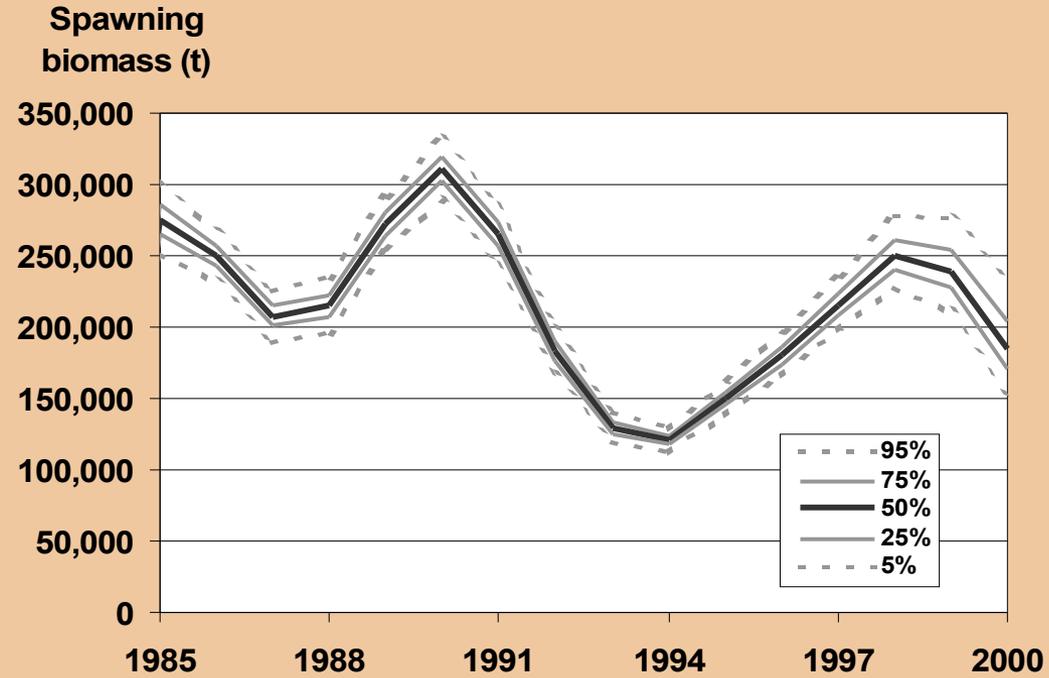
		Graph (Y or N)		X axis range		Tick marks	
Index or		Unisex or		From	To	Major	Minor
Gear	Year	Female	Male				
12	Handlines			1985	2001	5	0
13	Trawl			1985	2001	5	0

MAKE Charts

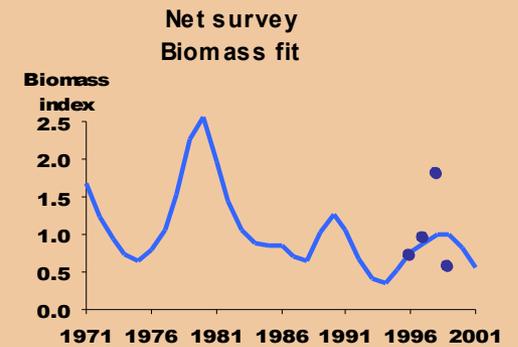
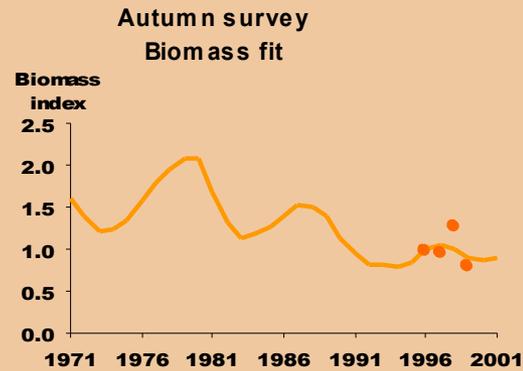
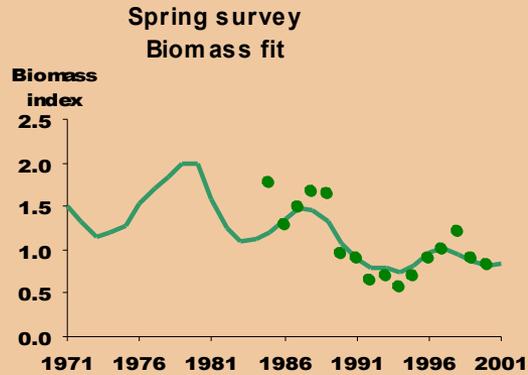
DELETE Charts



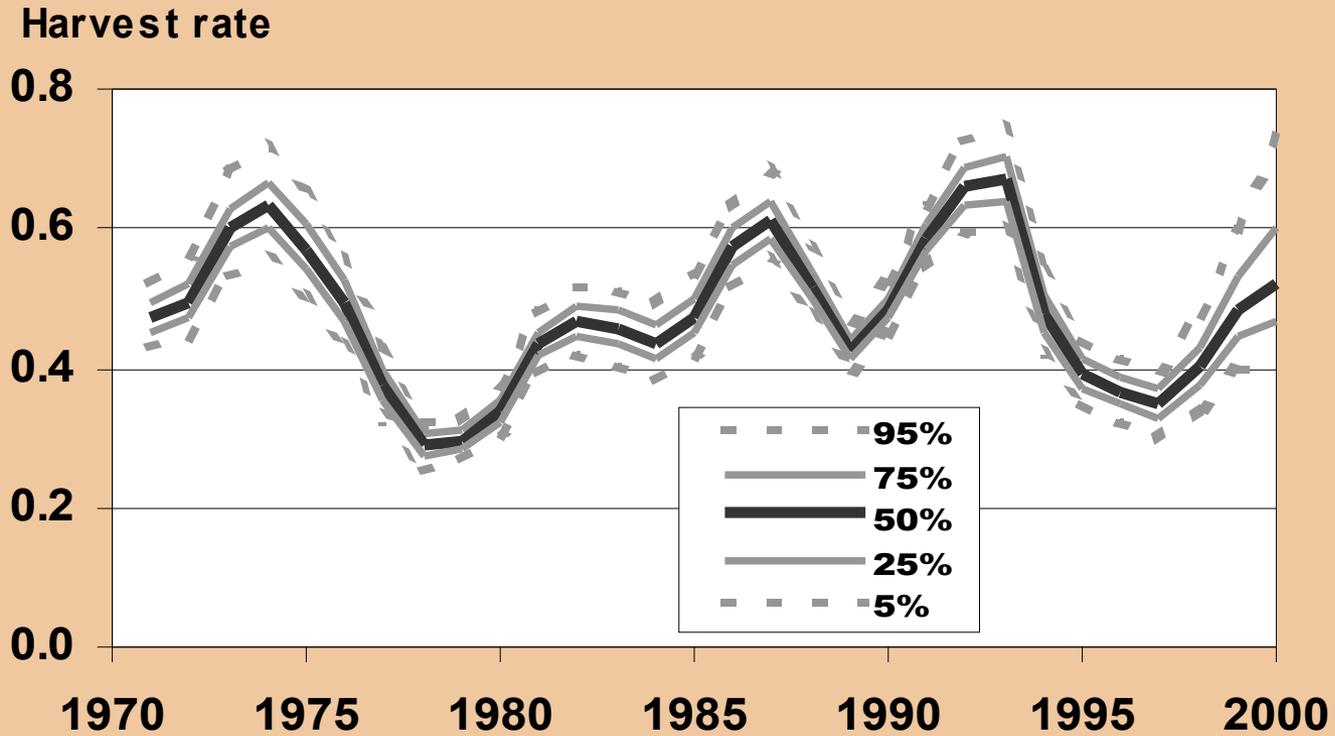
Icelandic cod



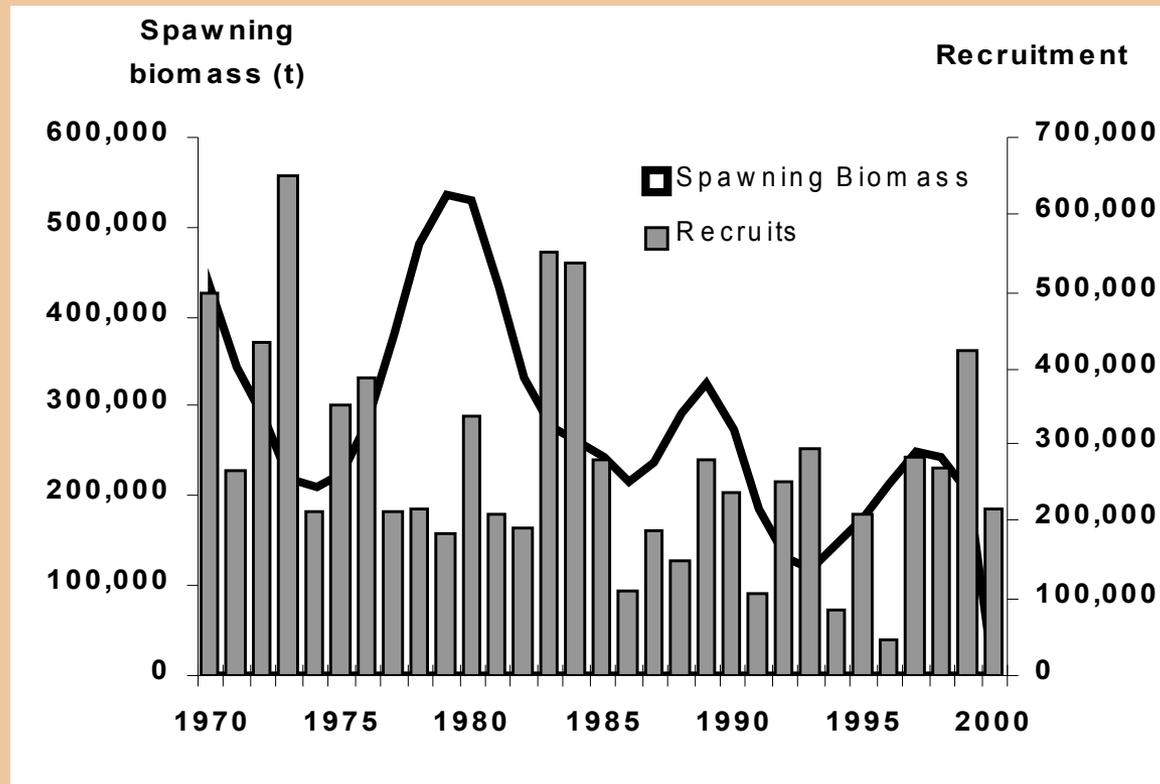
Icelandic cod



Icelandic cod

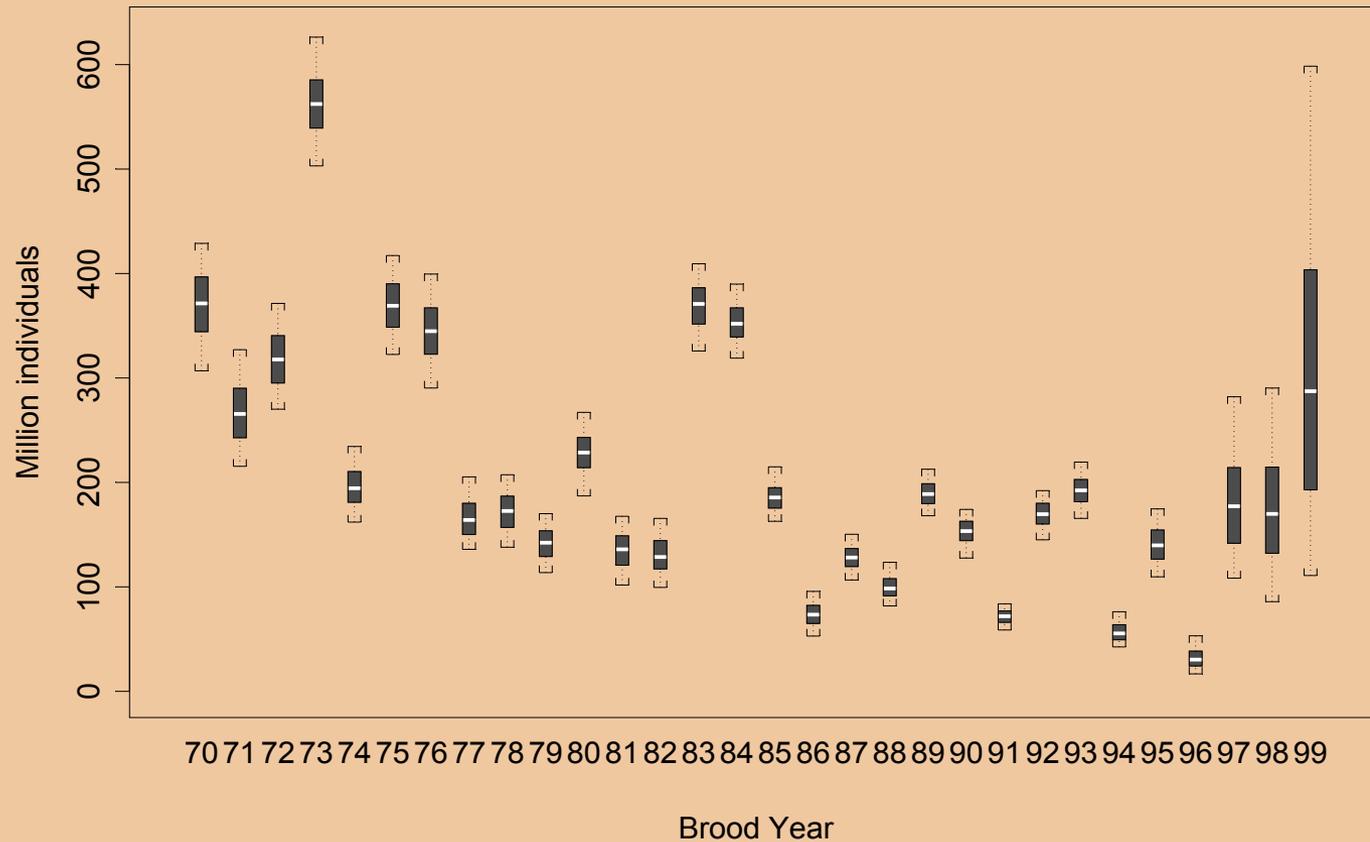


Icelandic cod



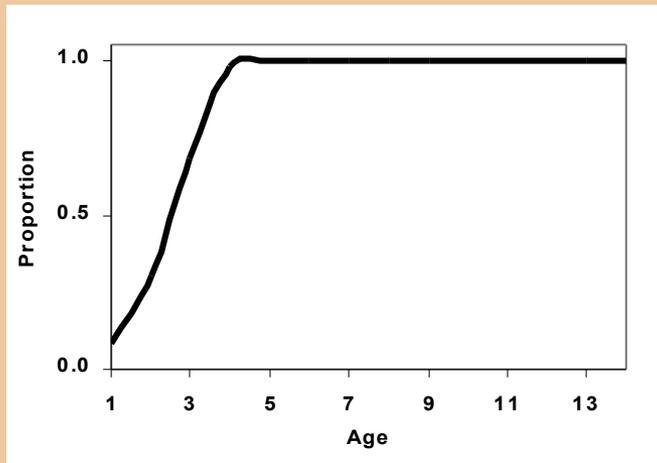
Icelandic cod

Recruitment (3 yr old) distribution: Percentiles from MCMC runs

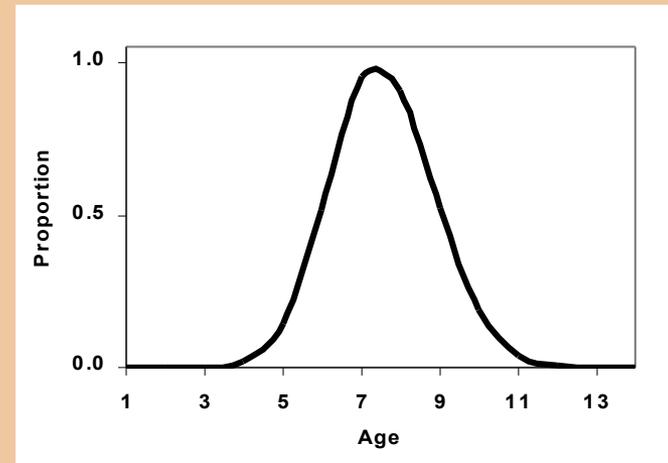


Icelandic cod

spring survey
selectivity



net survey
selectivity



Coleraine

Homepage

<http://www.fish.washington.edu/research/coleraine>

User manual

<http://www.fish.washington.edu/Publications/pdfs/0116.pdf>

(Hilborn et al. 2001, UW School Aquat. Fish. Sci. Rep.)