

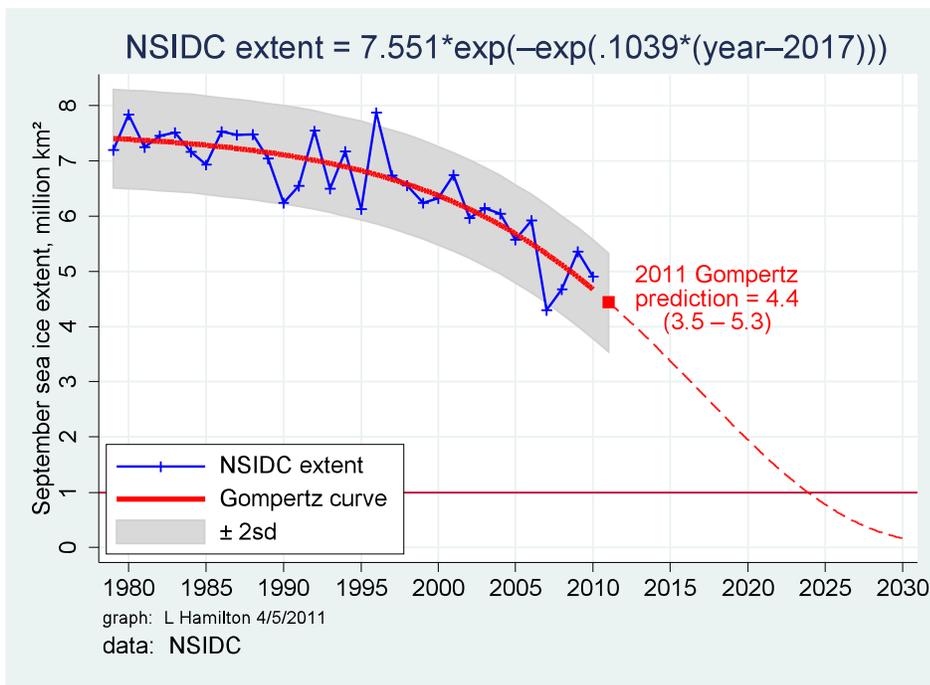
## PAN-ARCTIC OUTLOOK — Hamilton

### 1. Extent Projection

A Gompertz (asymmetrical S curve) model estimated by iterative least squares suggests a mean September 2011 ice extent of **4.4 million km<sup>2</sup>** (NSIDC). *The 95% confidence interval for this projection is approximately 3.5 to 5.3 million km<sup>2</sup>.*

### 2. Methods / Techniques

**Figure 1** shows this naive, purely statistical model. It predicts September mean extent simply from a Gompertz curve representing the trend over previous years. Estimation data are the NSIDC monthly mean extent reports from September 1979 through September 2010.



**Figure 1**

Parameters for the model are estimated via iterative least squares, using the **nl** procedure of Stata. Figure 1 also shows confidence bands calculated as the prediction plus or minus twice the standard deviation of the residuals.

In the command below, **gom3** specifies a 3-parameter Gompertz curve. **nsidc** refers to September mean NSIDC sea ice extent, in millions of km<sup>2</sup>. **year** refers to the calendar year.

```
. nl gom3: nsidc year
(obs = 32)
```

Source	SS	df	MS		
Model	1404.20492	3	468.068308	Number of obs =	32
Residual	6.14037236	29	.211736978	R-squared =	0.9956
				Adj R-squared =	0.9952
				Root MSE =	.4601489
Total	1410.34529	32	44.0732905	Res. dev. =	37.98485

3-parameter Gompertz function, nsidc = b1\*exp(-exp(-b2\*(year - b3)))

nsidc	Coef.	Std. Err.	t	P> t	[95% Conf. Interval]	
/b1	7.55082	.2923261	25.83	0.000	6.952946	8.148694
/b2	-.1039094	.0310938	-3.34	0.002	-.1675033	-.0403155
/b3	2017.088	2.499096	807.13	0.000	2011.977	2022.199

The squared correlation between observed and predicted values (not shown) is  $r^2 = .77$ . There is no significant autocorrelation among the residuals, as tested by Ljung–Box  $Q$  statistics.

```
. predict resid, resid
. corrgram resid, lag(6)
```

LAG	AC	PAC	Q	Prob>Q	-1	0	1	-1	0	1
					[Autocorrelation]			[Partial Autocor]		
1	-0.2199	-0.2215	1.6968	0.1927	-			-		
2	-0.0757	-0.1398	1.9048	0.3858				-		
3	-0.2247	-0.3082	3.799	0.2840	-			--		
4	0.0467	-0.1357	3.8837	0.4220				-		
5	0.1589	0.1787	4.9013	0.4280		-			-	
6	-0.1763	-0.2768	6.2017	0.4010	-			--		

### 3. Rationale

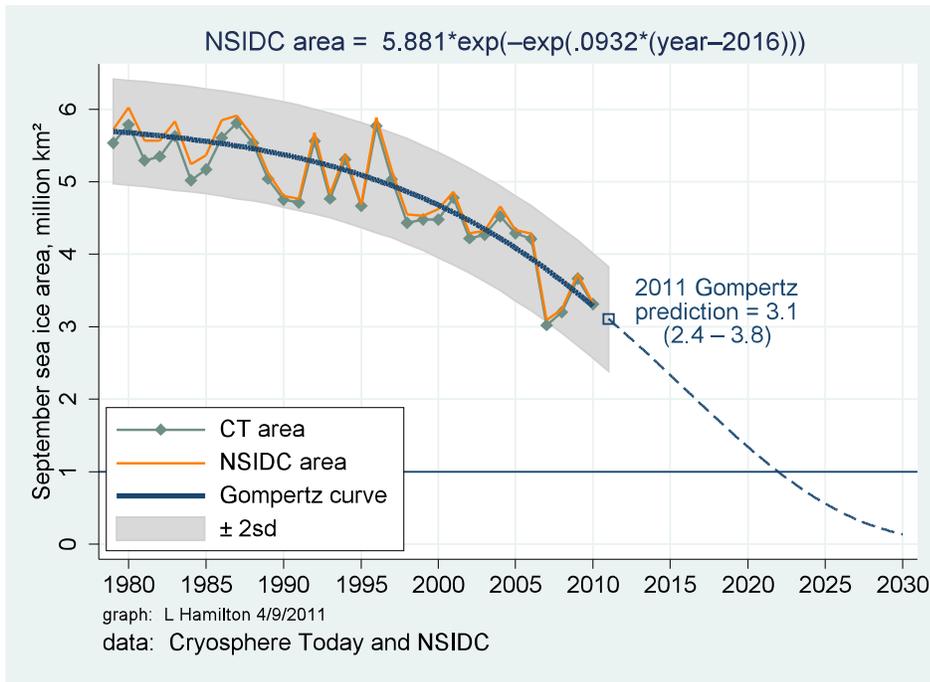
This is a naive model proposed at the start of the 2011 melt season. As more data become available between now and September, I expect that prediction can be improved.

Most trend-line analyses of Arctic sea ice have used linear, quadratic, exponential or logistic models. The Gompertz curve appears more plausible than any of these alternatives, in several respects.

- It allows for a gradually accelerating decline in the 1970s and 80s, going back even to earlier years.
- The decline later steepens at an accelerating rate, as observed since the mid-2000s.
- Model predictions do not cross or exactly reach zero extent. Rather they approach this limit asymptotically.

Although out-of-sample extrapolation is just speculative, it is interesting to note that the model suggests extent falling below 1 million km<sup>2</sup> before 2025.

For comparison, I fit similar Gompertz curve models to northern ice *area*, as seen in **Figure 2**. This suggests a September 2011 NSIDC area prediction of 3.1 million km<sup>2</sup> (confidence interval 2.4–3.8). As with the extent model in Figure 1, extrapolating the area model in Figure 2 implies a decline to very low values by 2025.



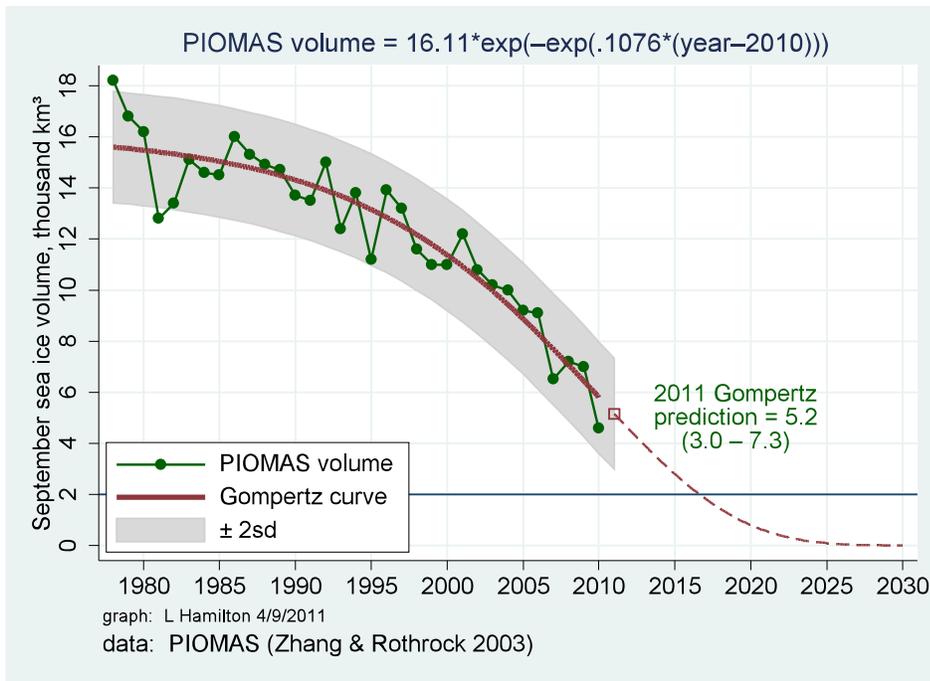
**Figure 2**

Finally, I fit a similar Gompertz model to PIOMAS estimates of Arctic ice *volume*. This yields a September 2011 volume prediction of 4.2 thousand km<sup>3</sup>. Extrapolating, the volume curve falls to very low levels (below 2,000 km<sup>3</sup>) sooner than the extent or area curves do.

Further elaboration and discussion of these simple models can be found in two Arctic Sea Ice Blog posts:

<http://neven1.typepad.com/blog/2011/04/trends-in-arctic-sea-ice-extent.html>

<http://neven1.typepad.com/blog/2011/04/trends-in-arctic-sea-ice-volume.html>



**Figure 3**

#### 4. Executive Summary

Mean September NSIDC ice extent 1980–2010 appears reasonably well described by the naive but physically plausible Gompertz statistical model, graphed as an asymmetrical S-shaped curve. **This model yields a predicted September 2011 extent of 4.4 million km<sup>2</sup>**, with a confidence interval from 3.5 to 5.3 million km<sup>2</sup>. Refinements to this predict should be possible when we have further information, as the 2011 melt season progresses.

#### 5. Estimate of Forecast Skill

Over 1979–2010, the standard deviation of NSIDC September ice extent is 0.92 million km<sup>2</sup>. The standard deviation of residuals from the model in Figure 1 is just 0.45 million km<sup>2</sup>. Thus, the model explains about 77% of the variance ( $\text{Var}[\text{predicted}]/\text{Var}[\text{observed}] = .77$ ) in observed September ice extent. Using only 1979–2009 data, a similar model predicts the 2010 extent as 4.5 (3.7–5.4); the actual 2010 value was 4.9, well within this range.

Gray bands show a range of plus or minus two standard deviations around the curves in Figures 1–3. Regarding predicted 2011 extent (4.4 million km<sup>2</sup> as seen in Figure 1), these suggest a confidence interval from 3.5 to 5.3 million km<sup>2</sup>.