The Emergence of NWP Fulfilment of a Dream & Realization of a Fantasy

#### Peter Lynch School of Mathematics & Statistics University College Dublin

IoP, London, 23 January 2020



#### Outline

**Pioneers of NWP: The Dream** 

The Dynamical Core

**ENIAC Integrations** 

**ECMWF System** 

**NWP Today & Tomorrow** 

**Forecast Factory: The Fantasy** 

Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

# A Recent Paper in Nature

Note         International weekly journal of science           Home         News & Comment         Research         Careers & Jobs         Current Issue	Archive
Archive Volume 525 $ ightarrow$ Issue 7567 $ ightarrow$ Reviews $ ightarrow$ Article	
NATURE   REVIEW 日本語要約	<
The quiet revolution of numerical weather prediction	
Peter Bauer, Alan Thorpe & Gilbert Brunet	

#### The Origins of Numerical Weather Prediction

Nature, 3 September 2015 Vol 525 pg. 47



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

### The Quiet Revolution of NWP [Abstract]

- Advances in NWP represent a quiet revolution.
- Steady accumulation of technological advances.
- Among the greatest impacts of physical science.
- NWP is a computational problem comparable to:
  - Modelling the behaviour of the human brain.
  - Simulating the evolution of the early universe.





### The Quiet Revolution of NWP [Abstract]

- Advances in NWP represent a quiet revolution.
- Steady accumulation of technological advances.
- Among the greatest impacts of physical science.
- NWP is a computational problem comparable to:
  - Modelling the behaviour of the human brain.
  - Simulating the evolution of the early universe.
- Performed daily at operational weather centres.



Factory

ECMWF

Today/Tomorrow

#### Outline

#### **Pioneers of NWP: The Dream**

- The Dynamical Core
- **ENIAC Integrations**
- **ECMWF System**
- **NWP Today & Tomorrow**

**Forecast Factory: The Fantasy** 





Stokes

ENIAC

ECMWF

Today/Tomorrow

### **Pioneers of Scientific Forecasting**







# **Cleveland Abbe**

By 1890, the American meteorologist Cleveland Abbe had recognized that:

Meteorology is essentially the application of hydrodynamics and thermodynamics to the atmosphere.

Abbe proposed a mathematical approach to forecasting.



Pioneers

Stokes

ENIA

ECMWF

Т

Today/Tomorrow



# Vilhelm Bjerknes

A more explicit analysis of weather prediction was undertaken by the Norwegian scientist Vilhelm Bjerknes

He identified the two crucial components of a scientific forecasting system:

- Analysis
- Integration



Pioneers

ECMWF

Today/Tomorrow

## Lewis Fry Richardson



The English Quaker scientist Lewis Fry Richardson attempted a direct solution of the equations of motion.

He dreamed that numerical forecasting would become a reality 'one day in the distant future'.



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

# Lewis Fry Richardson



The English Quaker scientist Lewis Fry Richardson attempted a direct solution of the equations of motion.

He dreamed that numerical forecasting would become a reality 'one day in the distant future'.

Today, forecasts are prepared routinely using his method ... his dream has indeed come true.



Factory

Pioneers

ECMWF

Today/Tomorrow

w

### Lewis Fry Richardson, 1881–1953.



During WWI, Richardson computed by hand the pressure change at a single point.

It took him two years !



#### Pioneers

Stokes

FNIAC

FCMWF

Today/Tomorrow

### Lewis Fry Richardson, 1881–1953.



During WWI, Richardson computed by hand the pressure change at a single point.

It took him two years !

His 'forecast' was a catastrophic failure:

 $\Delta p =$  145 hPa in 6 hrs



#### Pioneers

Stokes



ECMWF

VF

Today/Tomorrow

### Lewis Fry Richardson, 1881–1953.



**During WWI, Richardson** computed by hand the pressure change at a single point.

It took him two years !

His 'forecast' was a catastrophic failure:

 $\Delta p = 145$  hPa in 6 hrs

#### Yet, Richardson's method was scientifically sound.



Pioneers

FCMWF

Today/Tomorrow

#### Initialization of Richardson's Forecast

Richardson's Forecast has been re-run on a computer.

The atmospheric observations for 20 May 1910 were recovered from original sources.

• ORIGINAL: 
$$rac{\partial oldsymbol{\mathcal{P}_s}}{\partial t} = +$$
145 hPa/6 h



Factory

Pioneers



Today/Tomorrow

#### Initialization of Richardson's Forecast

Richardson's Forecast has been re-run on a computer.

The atmospheric observations for 20 May 1910 were recovered from original sources.

► ORIGINAL:   

$$\frac{\partial p_s}{\partial t} = +145 \, hPa/6 \, h$$

 ► INITIALIZED:   
 $\frac{\partial p_s}{\partial t} = -0.9 \, hPa/6 \, h$ 

#### **Observations: The barometer was steady!**



Pioneers

ECMWF

Today/Tomorrow

#### Outline

- The Dynamical Core



**Pioneers** 

Stokes



FCMWF

Today/Tomorrow

#### Weather and Climate Models

Computer models for simulating weather and climate are known as Earth System Models.

They are of great complexity.

At the heart of every model is a Dynamical Core.

At the kernel of the core lie the Navier-Stokes Equations.



Factory

Pioneers

Stokes

ECMWF

Today/Tomorrow

w

### George Gabriel Stokes



G. G. Stokes was born in Skreen, Co. Sligo, just 200 years ago.

His equations for fluid flow underlie all atmospheric and ocean models.

$$\frac{\partial \boldsymbol{V}}{\partial t} + \boldsymbol{V} \cdot \boldsymbol{\nabla} \boldsymbol{V} = -\frac{1}{\rho} \boldsymbol{\nabla} \boldsymbol{\rho} + \nu \nabla^2 \boldsymbol{V} - \boldsymbol{g}$$



Pioneers

Stokes

FCMWF

Today/Tomorrow

#### Outline

**Pioneers of NWP: The Dream** 

**The Dynamical Core** 

**ENIAC Integrations** 

**ECMWF System** 

**NWP Today & Tomorrow** 

Forecast Factory: The Fantasy



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

#### Crucial Advances, 1920–1950

Dynamic Meteorology

- Quasi-geostrophic Theory
- Numerical Analysis
  - CFL Criterion
- Atmopsheric Observations
  - Radiosondes
- Electronic Computing
  - ENIAC





#### **The ENIAC**





Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

### **The ENIAC**



The ENIAC was the first multipurpose programmable electronic digital computer:

- 18,000 vacuum tubes
- ► 70,000 resistors
- 10,000 capacitors
- ▶ 6,000 switches
- Power: 140 kWatts



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

#### von Neumann Charney Fjørtoft



#### Numerical integration of the barotropic vorticity equation Tellus, 2, 237-254 (1950).



**Pioneers** 

Stokes

ENIAC

FCMWF

Today/Tomorrow

### Charney, et al., Tellus, 1950.

- The atmosphere is treated as a single layer.
- The flow is assumed to be nondivergent.
- Absolute vorticity  $\zeta + f$  is conserved.

$$\frac{\mathsf{d}(\zeta+\mathsf{f})}{\mathsf{d}\mathsf{t}}=\mathsf{0}.$$



**Pioneers** 

Stokes

FNIAC

FCMWF

Today/Tomorrow

### The ENIAC Algorithm: Flow-chart





Factory

Pioneers

Stokes

ENIAC

FCMWF

Today/Tomorrow

#### **ENIAC Forecast for Jan 5, 1949**





**Pioneers** 

Stokes

ENIAC

ECMWF

Today/Tomorrow

### **NWP Operations**

The Joint Numerical Weather Prediction Unit was established on July 1, 1954:

- Air Weather Service of US Air Force
- The US Weather Bureau
- The Naval Weather Service.

May 1955: Operational numerical weather forecasting using a 3-level quasi-geostrophic model.



Pioneers

Stokes

ENIAC

ECMWF

\*

-

Today/Tomorrow

#### Outline

**Pioneers of NWP: The Dream** 

- The Dynamical Core
- **ENIAC Integrations**
- **ECMWF System**

**NWP Today & Tomorrow** 

**Forecast Factory: The Fantasy** 



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

# European Centre for Medium-Range Weather Forecasts (ECMWF, Reading, UK)





#### Pioneers

Stokes

#### ENIA



Today/Tomorrow

### **Forecast of Hurricane Sandy**



#### Figure : Landfall, New Jersey, 30 October 2012



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

#### **Resolution of the IFS System**



### **Growth in Forecast Skill**



Figure : Anomaly correlation of 500 hPa geopotential height



Pioneers

ECMWF

Today/Tomorrow

#### Outline

**Pioneers of NWP: The Dream** 

- The Dynamical Core
- **ENIAC Integrations**
- **ECMWF System**

**NWP Today & Tomorrow** 

**Forecast Factory: The Fantasy** 



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

# Reasons for Progress in Weather Forecasting

- Faster computers;
- Better numerical schemes;
- Enhancements in model resolution;
- New observational data from satellites;
- More comprehensive physical processes;
- Paradigm shift to probabilistic forecasting;
- More sophisticated methods of data assimilation.



Factory

Today/Tomorrow

# **Physical Processes in the Atmosphere**



**Pioneers** 

Stokes

ENIAC

ECMWF

Today/Tomorrow

The Equations of the Atmosphere



#### THERMODYNAMIC EQUATION

#### EQUATIONS OF MOTION: Navier-Stokes Equations

#### **CONTINUITY EQUATION**

#### WATER SUBSTANCE EQUATION



Pioneers

Stokes

EN

ECMWF

Tod

Today/Tomorrow

### The Primitive Equations

 $\frac{du}{dt} - \left(f + \frac{u \tan \phi}{a}\right)v + \frac{1}{\rho}\frac{\partial p}{\partial x} + F_x = 0$  $\frac{dv}{dt} + \left(f + \frac{u \tan \phi}{a}\right)u + \frac{1}{\rho}\frac{\partial p}{\partial v} + F_y = 0$  $\frac{\partial p}{\partial z} + g\rho = 0$  $p = R_{\rho}T$  $\frac{dT}{dt} + (\gamma - 1)T\nabla \cdot \mathbf{V} = \frac{Q}{C_{\rm p}}$  $\frac{\partial \rho}{\partial t} + \nabla \cdot \rho \mathbf{V} = \mathbf{0}$  $\frac{\partial \rho_{w}}{\partial t} + \nabla \cdot \rho_{w} \mathbf{V} = [\mathbf{Sources} - \mathbf{Sinks}]$ 



Pioneers

ECMWF

Today/Tomorrow

### Scientific Forecasting in a Nut-Shell

- The atmosphere is a physical system
- Its behaviour is governed by the laws of physics
- These laws are expressed quantitatively in the form of mathematical equations
- Using observations, we can specify the atmospheric state at a given initial time: "Today's Weather"
- Using the equations, we can calculate how this state will change over time: "Tomorrow's Weather"



### Scientific Forecasting in a Nut-Shell

#### **Problems:**

- The equations are very complicated (non-linear): Powerful computer required to solve them.
- The accuracy decreases as the range increases; There is an inherent limit of predictibility.



Factory

Pioneers



#### **Future Progress**

- ► Faster computers ⇒ Increased model resolution.
- More complex computer architecture Smarter parallelisation algorithms.
- New observational data from satellites More advanced methods of data assimilation.
- More comprehensive physical processes.
- More comprehensive chemical processes.
- Greater emphasis on probabilistic forecasting.



Pioneers

Stokes

\_\_\_\_

ENIAC

ECMWF

Today/Tomorrow

orrow

#### Outline

**Pioneers of NWP: The Dream** 

- **The Dynamical Core**
- **ENIAC Integrations**
- **ECMWF System**

**NWP Today & Tomorrow** 

#### Forecast Factory: The Fantasy



Pioneers

Stokes

ENIAC

ECMWF

Today/Tomorrow

#### **Richardson's Forecast Factory**





#### © Stephen Conlin, 1986

Stokes

ENIAC

Today/Tomorrow

### **Zoom: Richardson Directing the Forecast**



# Lewis Fry Richardson conducting the forecast



Factory

#### **Pioneers**

Stokes

ENIAC

ECMWF

Today/Tomorrow

orrow

# **Zoom: Historical Figures in Computing**



#### Napier / Babbage / Pascal / Peurbach



**Pioneers** 

Stokes

ENIAC

ECMW

Today/Tomorrow

### **Zoom: Experimentation & Research**



# Babbage's Analytical Engine Kelvin on left. Boole on right.



Factory

Pioneers

Stokes

ENIAC

ECMW

Today/Tomorrow

#### **Richardson's Forecast Factory**



#### 64,000 Computers: the first Massively Parallel Processor



**Pioneers** 

ENIAC

ECMWF

Today/Tomorrow

### The Fantastic Forecast Factory



The North Atlantic Ocean and climate change Pen portrait of P. A. Sheppard Richardson's fantastic forecast factory Missing the expected in the Cairngorms

An Artist's Impression of **Richardson's Fantastic Forecast Factory.** Weather, 71, 14-18.

[Reprint on my website]

#### **High-res Image** on my website.

[http://maths.ucd.ie/~plynch]



**Pioneers** 

Stokes

FCMWF

Today/Tomorrow

#### Thank you



Pioneers

Sto

Eľ

ECM\

Today/Tomorrow

### **Growth in Forecast Skill**



Figure : Anomaly correlation of 500 hPa geopotential height



Factory

Pioneers

ECMWF

Today/Tomorrow