

# Avalanches, Brains and Stocks: Simulating Self-Organised Criticality

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# Abstract

Experiments with a granular bead pile have shown that the pile can model critical systems such as avalanches. In the experiments, a bead is dropped on the apex of the pile of beads. Eventually, one such bead causes several beads of the conical bead pile to avalanche. The experiments have studied the distribution of avalanches and how the distribution is affected by altering the bead type, bead cohesion, and bead drop height. In this study we present a computational simulation of the experiment. The simulation models each bead as independent particles with their own positions and velocities. The internal and external forces on each particle are accumulated to provide the new particle positions using Newton's second law of motion. The independence of each particle allows a natural way to express parallelism which we utilise by threading various processes of the particles to the graphical processing unit. This allows the simulation run in real-time while still having 60k particles on the pile.

With this simulation we can learn new information from the system that may have been challenging to study with the actual experiment. For example, we can vary the shapes and numbers of the beads. With the simulation it is also possible to record the velocity of each particle on the surface and even inside the pile.



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# Chapter 1

## Introduction

### 1.1 Per Bak and Sand in Brains

In 1999 a Danish Scientist by the name Per Bak explained the disordered electrical neural activity of a brain in an audacious way that left many neurologists puzzled. He suggested that the brain's neural activity worked in a similar procedure as a sand pile which incur avalanches of varying sizes to maintain stability (instabilities paradoxically helping provide the system with stability). As more sand is added to the pile, more avalanches occur along the surface of the conical shape. Even with these unpredictable surface avalanches, the conical shape of the pile is maintained. Per Bak pointed out that although the individual avalanches were unpredictable in timing and size, the *distribution* of the timings and sizes of several avalanches *demonstrate a regularity*. He termed this phenomena of finding order in systems which appeared to be unpredictable with a term he created - “self-organised criticality” (SOC). He explained to the neurologists that perhaps brains, like sand piles, behave as a self organised critical system. This is because the ordered complexity in a brain which permits the ability to think arises spontaneously from the disordered electrical activity of neurons .

### 1.2 The Origins of SOC: Tipping Points

In the 1980s, Bak began studying phase transitions in the hopes of better understanding how it is possible to find order in nature which is constituted by a disordered assortment of particles. Phase transitions, the process in which matter transforms from one phase to another, can involve a sudden change, like the magnetization of ferro-magnets, or can involve a gradual change, like ice transitioning to water. In any transition, there is a precise moment called the tipping or critical point at which the matter is halfway between each phase. In the case for most phase transitions, there are certain criteria that need to be met before matter can transition to another phase. For example – the local

temperate and pressure must be within a specific range for ice to transition into water. Studying these transitions which are dependent on the surrounds to occur lead Bak to question transitions which were able to occur spontaneously. He observed that in spontaneously phase transitioning systems, interactions of local elements of the system could spontaneously bring the system to a critical point – a self organised critical point. In 1987 Per Bak and a group of his colleagues published the first paper on SOC and soon afterward, Bak even published a book titled *‘How Nature Works’*. In the book, Bak extends the concept of SOC and demonstrates its presence in other complex systems ranging from financial markets, evolution, earthquakes, galaxy distributions and even the brain. According to Bak, these systems hover between the fence separating order from disorder.

One of the first empirical tests of Baks sand pile model took place in 1992, in the physics department of the University of Oslo. The physicists confined piles of rice between glass plates and added grains one at a time, capturing the resulting avalanche dynamics on camera. They found that the piles of elongated grains of rice behaved much like Baks simplified model. Most notably, the smaller avalanches were more frequent than the larger ones, following the expected power law distribution. That is, if there were 100 small avalanches involving only 10 grains during a given time frame, there would be 10 avalanches involving 100 grains in the same period, but only a single large avalanche involving 1,000 grains. (The same pattern had been observed in

## 1.3 The Experiment

## 1.4 Simulation

### 1.4.1 Previous Work

### 1.4.2 Speed Boosts with GPUs

### 1.4.3 Unified Particle Physics and Position Based Dynamics

## 1.5 Overview of Thesis

# Chapter 2

## Theory

### 2.1 Physics of the Experimental System

#### 2.1.1 SOC and the power Law

Effect of Drop Height

Effect of Cohesion

#### 2.1.2 Angle of Repose

#### 2.1.3 Cohesion between Beads

### 2.2 How to take Advantage of GPUs

#### 2.2.1 GPUs traditional role in Computers

#### 2.2.2 Parallelising Code and Threading

### 2.3 Algorithms Used

#### 2.3.1 Boundary Volume Hierarchy

#### 2.3.2 Position-Based Dynamics

#### 2.3.3 Unified-Particle Solving



## Chapter 3

# Results

### 3.1 Comparing Simulation to Experiment

### 3.2 Novel Results







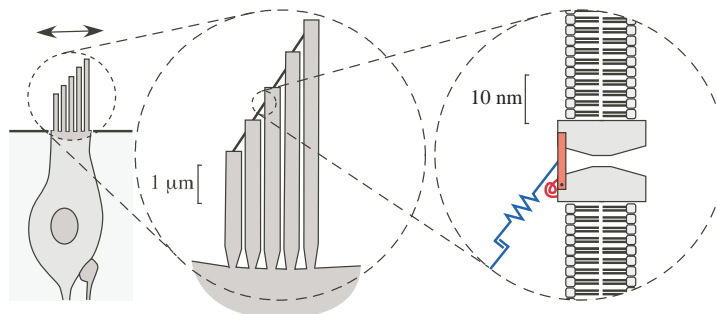


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Table 4.1: Table captions go on top.

abscissa	ordinate
1.0 s	5.6 m
2.0 s	6.7 m
3.0 s	9.9 m









## Appendix B





# Bibliography

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