

# DenseAlert: Incremental Dense-SubTensor Detection in Tensor Streams

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## 1 General Information

- Version: 1.0
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## 2 Introduction

**DenseStream** is an incremental algorithm for detecting dense subtensors in tensor streams. **DenseAlert** is an incremental algorithm for spotting suddenly emerging dense subtensors. They have the following properties:

- *Fast and 'Any Time'*: By maintaining and updating a dense subtensor, our algorithms detect a dense subtensor in a tensor stream significantly faster than batch algorithms.
- *Provably Accurate*: Our algorithms provide theoretical guarantees on their accuracy, and show high accuracy in practice.
- *Effective*: Our algorithms successfully identify anomalies, such as bot activities, rating manipulations, and network intrusions, in real-world tensors.

Detailed information about our algorithms are explained in the following paper

- Kijung Shin, Bryan Hooi, Jisu Kim, and Christos Faloutsos. “*DenseAlert: Incremental Dense-Subtensor Detection in Tensor Streams*”, ACM SIGKDD Conference on Knowledge Discovery and Data Mining (KDD) 2017, Halifax, Canada

## 3 Installation

- This package requires that java 1.7 or greater be installed in the system and set in PATH.

- For compilation (optional), type `./compile.sh`
- For packaging (optional), type `./package.sh`
- For demo (optional), type `make`

## 4 APIs for DenseStream

### 4.1 Package: *densealert*

### 4.2 Class: *DenseStream*

### 4.3 Algorithms:

- `public DenseStream (int order)`
  - create a *DenseStream* object for a tensor with the given order
  - *order*: the order of the considered tensor
- `public void insert (int[] entry)`
  - process an insertion of or an increment in the tensor entry
  - *entry*: an integer array in the form of  $(i_1, i_2, \dots, i_N, \delta +)$  where  $(i_1, i_2, \dots, i_N)$  is the index of the considered entry, and  $\delta +$  is the increment in the value of the entry with index  $(i_1, i_2, \dots, i_N)$ .  $\delta +$  should be greater than 0.
- `public void delete (int[] entry)`
  - process a deletion of or a decrement in the tensor entry
  - *entry*: an integer array in the form of  $(i_1, i_2, \dots, i_N, \delta -)$  where  $(i_1, i_2, \dots, i_N)$  is the index of the considered entry, and  $\delta -$  is the decrement in the value of the entry with index  $(i_1, i_2, \dots, i_N)$ .  $\delta -$  should be greater than 0.
- `public double getDensity ()`
  - return the density of the current maintained subtensor
- `public Map<Integer, int[]> getSliceIndices()`
  - return the slice indices in the input tensor that compose the maintained subtensor
  - *return*: a map whose keys are modes and values are the lists of indices in the corresponding mode composing the maintained subtensor

### 4.4 Example Code: see *DenseStreamExample.java* for an example code using *DenseStream*

## 5 APIs for DenseStream

5.1 Package: *densealert*

5.2 Class: *DenseAlert*

5.3 Algorithms:

- `public DenseAlert (int order, long window)`
  - create a *DenseAlert* object for a tensor with the given order
  - *order*: the order of the considered tensor
  - *window*: the length in seconds of the time window
- `public void insert (int[] entry, long timestamp)`
  - process an insertion of or an increment in the tensor entry
  - *entry*: an integer array in the form of  $(i_1, i_2, \dots, i_N, \delta +)$  where  $(i_1, i_2, \dots, i_N)$  is the index of the considered entry, and  $\delta +$  is the increment in the value of the entry with index  $(i_1, i_2, \dots, i_N)$ .  $\delta +$  should be greater than 0.
  - *timestamp*: unixtime when this change happened in the input tensor
- `public double getDensity ()`
  - return the density of the current maintained subtensor
- `public Map<Integer, int[]> getSliceIndices ()`
  - return the slice indices in the input tensor that compose the maintained subtensor
  - *return*: a map whose keys are modes and values are the lists of indices in the corresponding mode composing the maintained subtensor

5.4 Example Code: see *DenseAlertExample.java* for an example code using *DenseAlert*