

## (12) United States Patent Ide et al.

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#### ANOMALY DETECTION BASED ON (54)DIRECTIONAL DATA

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### Notice: Subject to any disclaimer, the term of this

patent is extended or adjusted under 35 U.S.C. 154(b) by 1288 days.

This patent is subject to a terminal dis-

claimer.

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### Related U.S. Application Data

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707/100

Field of Classification Search

USPC ......714/799, 760; 712/26; 382/197; 707/100; 6/799

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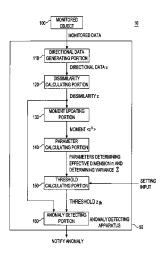
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#### (57)**ABSTRACT**

Properly detects an anomaly on the basis of directional data that are obtained in sequence from a monitored object. An anomaly detecting method includes: sequentially generating directional data indicating a feature of each piece of monitored data correspondingly to the monitored data which are input in sequence; calculating the dissimilarity of the directional data to a reference vector; updating a moment of the distribution of the dissimilarity appearing when the directional data is modeled with a multi-dimensional probability distribution, based on the moment already corresponding to the monitored data; calculating a parameter determining the variance of the multi-dimensional probability distribution, on the basis of the moment; calculating a threshold of the dissimilarity on the basis of the multi-dimensional probability distribution the variance of which is determined by the parameter; and detecting an anomaly in the monitored data that corresponds to the dissimilarity if the dissimilarity exceeds the threshold.

### 16 Claims, 10 Drawing Sheets



See application file for complete search history.