PROTECTING WITH SENSOR NETWORKS: PERIMETERS AND AXES

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ABSTRACT

Sensors, in one form or another, have always been a component in physical security systems. Usually such sensors are configured on a perimeter, or perhaps on concentric perimeters. The work was motivated by the realization of the fact that the probability of detecting an intruder is a Quality of Service (QoS) parameter. This implies an interesting trade-off between the amount of resources that a defender can muster and the QoS (in terms of probability of detection) that they get. We study this trade-off for a family of structures with an axial design reminiscent of a snowflake. We show that such a structure presents interesting qualities. The relations geometrically deduced in the paper provide a form of sensitivity analysis. The cumulative nature of the detection is discussed and, in addition, a possible implementation in sensor networks is explored.

Keywords: physical intrusion, detection probability, Quality-of-Service, wireless sensor networks.

INTRODUCTION

There is a wide range of situations that include within them protection problems. For example, banks must protect against bank robbers, and museums must protect against thieves. Adversarial situations often involve two different objectives; on the one hand to protect something important one owns, while, on the other hand, to penetrate and defeat the protection of the opponent.

In the field of situation management several ways of reasoning about the environment are discussed and analysed [1]. In order for such schemes to work, it is necessary to categorize the environment and to map corresponding techniques for responding to different identified scenarios. The work reported in this paper is the first step toward a different way of looking at protection-related situations. We are interested in alternative ways of sensing, leading to better and perhaps different categorization. We are also interested in alternative ways of responding. As part of this paper, we will develop observations about how alternative sensing and protection techniques are related.

Our ability to protect often revolves on the way we deploy two different types of resources. The first are sensing resources, and the second are responding resources. Guards in a museum can fulfil both roles – they can see someone attempt to take a painting, and then can intercept the thief. However, in large museums, the tasks are sometimes differentiated. Valuable objects have sensors attached to them, to alert guards that someone may be too close to the object.

Readers may notice that the problem bears some resemblance to the class of problems in computational geometry known as the *art gallery problems* [2]. Usually such problems try to determine a covering set; in our case a covering set would be a set of sensors which guard the entire territory. The association of the art gallery problem to sensor networks has been explored before (e. g. [3-5])

One technology that is available but not yet widely used in situation management and emergency response systems is *wireless sensor network* technology. It is anticipated that in the near future networked sensors combined with novel data collection and fusion techniques will make monitoring and emergency response systems more accurate and affordable than conventional systems.

In this paper we consider a general problem of protection, in which a number of sensor units are to be configured around a central valuable item. We wish to achieve high levels of protection while minimizing the overall cost of the system. Our approach is consistent with others who have observed that security is a QoS issue [6].

The paper is sequenced in the following way. First, a security situation is described, and possible sensor configurations are drawn. Next, the defensive capabilities of one configuration are analyzed. Finally, the results are discussed and conclusions are drawn.

THE SITUATION

We imagine the following situation:

A valuable item is to be protected from being taken. The item to be protected is in the open, and an intruder may approach from any angle.

Our problem is to place the sensors in such a way as to minimize cost (the fewer sensors the better) while achieving a high degree of protection.

We assume that an intruder at distance at most d from a sensor is sensed and assessed as an intruder with a certain probability that is hardware specific. In the sequel, we consider two models: (1) in the first model the intruder is detected with probability 1 within a disk of radius r centered at the sensor and with probability 0 outside, and (2) in the second model, the intruder is detected with probability 1 inside the above disk and with probability p up to distance d from the sensor.

Note that the complexity of the problem lies in the adversarial component. For, the intruder will seek to understand the defenses. Intruders may intentionally attempt to set off sensors in order to figure out their location and capability well before actually attacking [7].

As a result, our job is to provide the negotiated level of resilience with the additional constraint of revealing as little as possible to an intruder.

PERIMETERS AND AXES

A common way to defend against intruders is to create a physical perimeter such as a fence; there are a number of factors to be considered in such a design [8]. In many situations, however, physical perimeters are expensive to construct, and sensor perimeters are used in their stead; for example when one crosses a certain line, a bell rings, which alerts a defender.

In high security situations, concentric perimeters are constructed, so that an intruder missed at one perimeter may be caught at the second one (see figure 1).

However, perimeters may provide too much information. Through observation or testing, it might be possible for an intruder to figure out exactly where the perimeters are, and therefore to plan more effectively.

What alternatives might exist? We might build a structure based on an axial design, such as figure 2. This may go against our intuition initially, as the structure looks easy to penetrate. However, radial structures such as this may provide interesting benefits.

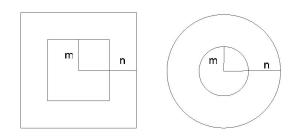


Figure 1. Square or circular concentric perimeter arrangements. There is often an outside perimeter n units away, and an inside perimeter m units away from the center.

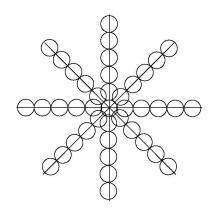


Figure 2. Snowflake defense, an axial design.

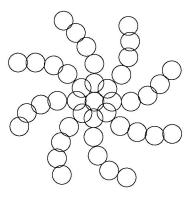


Figure 3. A curved snowflake defense

THE BASELINE SCENARIO

The simplest scenario is that of a *linear attack* performed by an unsophisticated adversary that proceeds in a straight line towards the asset - henceforth referred to as the *center*. We assume that the defensive infrastructure consists of sensors placed in the snowflake configuration of Figure 2. The angle between consecutive "branches" of the snowflake is θ , considered to be a system parameter. The choice of θ is dictated by the amount of resources available and the desired Quality of Service, taken here to mean "probability of detection". Indeed, it is intuitively clear that the larger θ , the less effective the detection. To avoid inconsequential notational complications we assume that $\frac{2\pi}{\theta}$ is an

integer.

Each sensor has a sensing radius of r and a transmission range of 2r. To begin, we assume that an intruder at distance at most r from the sensor is detected with probability 1. Later in the paper we shall revisit this assumption. The radius of the circular deployment area is R. We write

$$R = (2\tau + 1)r \tag{1}$$

where τ is a system parameter that depends on the type of sensors available and on the desired coverage area. For example, in Figure 2, τ =5 and, consequently, R=11r. It is easy to confirm that, excluding the central sensor, the number of sensors in each branch equals τ , and that the total number of sensors deployed is $\frac{2\pi\tau}{\theta}$ +1. As an illustra-

tion, in Figure 2, $\theta = \frac{\pi}{4}$ and the total number of sensors deployed is 41.

The snowflake infrastructure offers a *layered* protection in a sense that we now define. Referring to Figures 2 and 4(a), the first layer consists of the set of outermost sensors; for every *i*, i>0, the *i*-th layer consists of the set of sensors at distance R-(2i-1)r from the center. To orient the reader, we note that the dotted circle in Figure 4(a), contains the sensors in the *i*-th layer

We are interested in evaluating the detection probability offered by the snowflake infrastructure with the above parameters. Referring to Figure 4(b), let $2\alpha_i$ be the angle determined by the two tangents from the center to the sensing disk of a sensor in layer *i*. Simple trigonometry shows

that
$$\sin \alpha_i = \frac{r}{R - (2i - 1)r}$$
 and, consequently,
(2) $\alpha_i = \arcsin \frac{r}{R - (2i - 1)r}$.

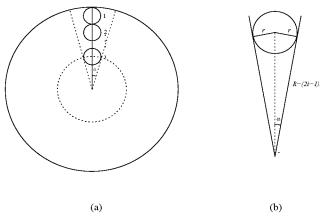


Figure 4: Illustrating the baseline scenario

Let D_i , (i>0) be the event that occurs if some sensor in layer *i* detects the intruder, assuming that intrusion takes indeed place. It is easy to see that the corresponding probability $P[D_i]$ is given by the following expression

$$P[D_i] = \frac{2 \arcsin \frac{r}{R - (2i - 1)r}}{\theta}.$$
 (3)

To justify (3) observe that, as illustrated in Figure 4(b), each sensor in layer *i* "covers" an angle of measure $2\alpha_i$ centered at the asset. Since there are $\frac{2\pi}{\theta}$ sensors in layer *i*, and since the coverage areas are disjoint, they cover a total angle of $\frac{2\pi}{\theta}(2\alpha_i)$. Now, the probability of detection is the ratio between the total angle covered and 2π .

A somewhat simpler expression of (3) can be obtained by using (1). Indeed, after standard manipulations we obtain

$$P[D_i] = \frac{2 \arcsin \frac{1}{2(\tau - i + 1)}}{\theta}.$$
 (4)

Equation (4) captures the essence of the defensive capabilities of the baseline scenario: the probability that the layer *i* sensors detect intrusion, assuming intrusion occurs, is a function of the density of deployment and the sensing range *r* of individual sensors. Moreover, the equation can be perceived as offering some sensitivity analysis: indeed, (4) tells us how more protection we obtain by increasing the deployment density and the capabilities of sensors and, conversely, how much protection we loose should we decrease the amount of these resources. For example, we may wonder about the probability of detection offered by the sensors in the fourth layer in Figure 4. Since $\tau=5$, i=4, and $\theta = \frac{\pi}{4}$, equation (4) reveals that $P[D_4] = 0.6434...$

Importantly, the snowflake infrastructure satisfies the property

$$D_1 \subset D_2 \subset \ldots \subset D_i \subset \ldots$$

Consequently, we can write

$$P[D_1] < P[D_2] < \dots < P[D_i] < \dots$$
 (5)

It is clear that detection will occur eventually, since the central asset is protected by a collocated sensor (the central sensor). However, in many types of attacks it is not wise to rely on detection by the central sensor. For example, art galleries worry not only about theft, but also about defacement.

An important question that has to be answered for the snowflake infrastructure is that of *early detection*, defined as the identity of the outermost layer k such that $P[D_k]=1$. Referring to Figure 2 again, we notice that detection is guaranteed in layer 5 as the sensing disks overlap.

We now address this important problem in its full generality. As illustrated in Figure 5, $P[D_k]=1$ is guaranteed to hold as soon as $\alpha_k \ge \frac{\theta}{2}$. Now, replacing this value in (2) and the integral of $\alpha_k \ge \frac{\theta}{2}$.

in (2) we obtain

$$\sin\frac{\theta}{2} \le \frac{r}{R - (2k - 1)r} \,. \tag{6}$$

In turn, (1) and (6) combined yield

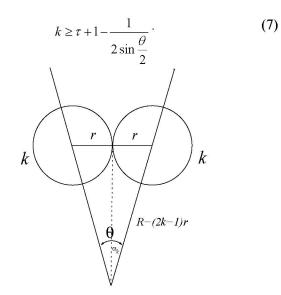


Figure 6: *Illustrating* $P[D_k] = 1$

Finally, we are interested in determining the layer that detects the intruder with a given probability at least q. Let j

be the subscript of the first layer in top-down order for which $P[D_i] \ge q$. Using (4) we obtain

$$\arcsin \frac{1}{2(\tau - j + 1)} \ge \frac{q\theta}{2}$$

from which we get easily

$$j \ge \tau - \frac{1}{2\sin\frac{q\theta}{2}} + 1$$

THE ENHANCED SCENARIO

In real-life applications it is rather unusual for the probability of detection to drop off abruptly from 1 to 0. Rather, as illustrated in Figure 7, the probability of detection is 1 within a disk of radius r centered at the sensor, dropping off to some probability p (strictly less than 1) within a disk of radius d. Notice this is a discrete version of the continuous case where the probability of detection might degrade exponentially with the distance from the center of the sensor. Naturally, p, r and d are system parameters that depend on the actual hardware at hand.

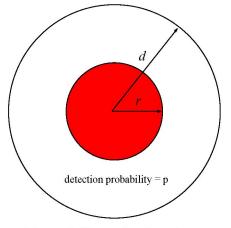


Figure 7: Illustrating detection ranges

We are interested in evaluating the detection probability at layer *i*. For this purpose, it makes sense to distinguish between the following cases, illustrated in Figures 8 and 9, respectively.

Case 1. Neighboring detection disks do not intersect.

Referring to Figure 8, let α_i (resp. β_i) stand for the angle determined by the half-line joining the central point (the asset to protect) and the sensor with the tangent to the disk of radius *r* (resp. *d*). It is easy to confirm the the angle between the two tangents to the radius d disks is $\theta - 2\beta_i$.

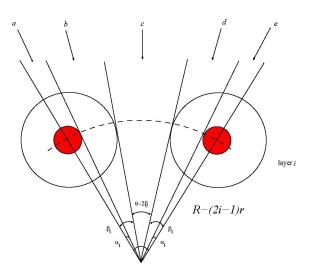


Figure 8: Illustrating Case 1

Next, consider a possible attacker. This attacker may come from any of the directions a, b, c, d or e. In each case, the probability of detection is different. To wit,

if the attacker comes from directions a or e the probability of detection is 1,

if the attacker comes from directions b or d, the probability of detection is p,

if the attacker comes from direction c, the probability of detection is clearly 0.

At the risk of some notational overload, we let D_i stand for the event that the intruder is detected. It is easy to see that in Case 1, the probability of detection, $P[D_i]$, can be expressed as follows

$$P[D_i] = \frac{2(1 \times \alpha_i + p \times (\beta_i - \alpha_i))}{\theta} = \frac{2}{\theta} [(1 - p)\alpha_i + p\beta_i].$$

Of course, in case p=0, we obtain the expression in (3), as expected.

Case 2. Neighboring detection disks intersect.

We find it convenient to import the notation and terminology established for Case 1 above. Referring to Figure 9, consider again a possible attack from one of the directions a, b, c, d or e. In each case, the probability of detection is different as illustrated next:

if the attacker comes from directions a or e the probability of detection is 1,

if the attacker comes from directions b or d, the probability of detection is p,

if the attacker comes from direction c, the probability of detection is p(2-p). To see this, observe the intruder is not detected with probability $(1-p)^2$ which amount to saying that detection occurs with probability $1-(1-p)^2 = p(2-p)$ as claimed.

It is not hard to see that in this case the detection probability can be written as

$$P[D_i] = \frac{2(1-p)\alpha_i + 2p\beta_i - p^2(\theta - 2\beta_i)}{\theta}.$$

As before, in case p=0, we obtain the expression in (3), as expected.

In Figure 9, we looked at a situation where the sensor areas might overlap in coverage. In Figure 10, we look at different concept of overlap. As an intruder moves toward the center, there are several straight paths the intruder can take, akin to the letter-coded directions of figure 8. In direction b or d, the intruder's path will overlap the outer circle of the outermost detector. The probability of detection is p. However, as the intruder continues, the probability of the intruder being detected after crossing through the next detector is now p + (1 - p)p. More generally, the cumulative detection probability at time step t, assuming steps of size 2r, can be thought of as a recurrence relation:

$$p_t = p_{t-1} + (1 - p_{t-1})p$$

 $p_1 = p$

whose solution is

$$p_t = 1 - (1 - p)^t$$

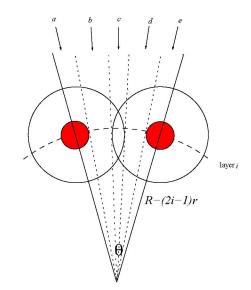


Figure 9: Illustrating Case 2

CUMULATIVE DETECTION

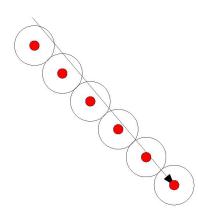


Figure 10: *Cumulative chances of detection as the intruder moves toward the center.*

In Figure 10, the intruder crosses four regions of detection probability p before crossing two regions of certain detection. Even for low probability detectors, the situation is not favorable for the intruder; given sensors with a probability of detecting of 1/2, at time step 2 the chances of the intruder evading detection are 25%; at time step 4 they are < 7%.

It is clear that there are a number of path-sensor overlap situations that can occur, depending on the angle of initial attack. The highest probability of success for the intruder will usually occur with an approach along angle c. If the intruder comes in between the axes, detection cannot occur until the coverage areas begin to overlap along the axes (which is one level outside the center in figure 2).

In order to prevent such an attack, a configuration such as that in figure 3 might be considered. The configuration would be constructed to curve the axes to close off a potential attack along an angle c.

At this point, the best an intruder can do is an attack along a curved trajectory parallel to the curved axes. If we assume sensors are not visible, then discovering such a trajectory may be difficult even in a large series of tests, for the number of possible curved trajectories is high.

DISCUSSION

Perimeters can be constructed so that the probability of detection is close to certain by tightly arranging sensors in one perimeter, or by using concentric perimeters of more loosely linked sensors. However, perimeters may be expensive to establish. Also, perimeter sensors are often connected to perimeter barriers, so their position may be obvious to an intruder. In many situations, friendly people need to be let through the perimeter; a hostile intruder may choose to deceive or attack the guard.

The axial defense might provide an alternative configuration.

Sensor networks can be constructed deterministically; however, much of the current research on sensor networks presumes that inexpensive sensors are dropped, forming a random pattern. Some researchers point out that, if possible, a one time movement could improve the overall detection capabilities [9].

If the density of the dropped sensors is high, then it is possible to form all different number of arrangements, including both perimeters and axes, by powering off unneeded sensors.

An axial approach is interesting in the case of randomly scattered set of sensors. For, in such networks, communication will tend to flow toward the center for integration. A radial pattern of communication may be put into place for this reason. This radial pattern might double as an axial detection configuration. In other words, the detection and the communication pattern might match.

It is probably the case that, in different situations, different types of configuration will yield better detection. Consistent with theme of situation management, future work may consider extending these ideas to form a more comprehensive, situational, approach to security, with an expanded set of sensor patterns, and a mapping between the perceived situation and sensor configuration to be used.

CONCLUSIONS

Usually, physical security is accomplished through the establishment of a perimeter, which serves a double purpose as a barrier and as a detection mechanism. Here we have considered the merits of an axial design of sensors. An axial design is consistent with a probabilistic, quality of service approach to security.

We have analyzed defence against straight line attacks using an axial model. Equations are provided which might be used to examine the effects of varying sensor parameters on early detectability. There is a cumulative effect to an axial network of sensors; with each time step, the probability of detection may increase. Whereas perimeter defenses are often easy to spot and to plan against, we suggest that intruders may find the probabilistic and cumulative nature of the axial defense difficult to perceive and hence to attack.

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