# POWER CONSUMPTION-BASED AND TRANSMISSION RATE-BASED ALGORITHMS IN COMMUNICATION-BASED NETWORK APPLICATIONS

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Abstract: In order to realize eco societies, we have to reduce the total electrical power consumption in information systems. We classify network applications into transaction and communication based applications. CPU resources of servers are mainly consumed in the transaction based ones. In this paper, we consider communication based applications where a server transmits a large volume of data to a client like file transfer protocol (FTP). We discuss a power consumption model for communication-based applications. In the model, the total power consumption of a server depends on the total transmission rate and number of clients where the server concurrently transmits files. A client has to select a server in a set of possible servers, each of which holds a file, so that the power consumption of the server is reduced. We newly discuss a pair of PCB (power consumption-based) and TRB (transmission rate-based) algorithms to select a server. In the evaluation, we show the total power consumption can be reduced by the PCB and TRB algorithms compared with the traditional round-robin (RR) algorithm and PCB is more practical than TRB.

## **1 INTRODUCTION**

In the green IT technologies (Green IT, 2010), the total electric power consumption of computers and networks has to be reduced. Various types of hardware technologies like low-power consumption CPUs and storages are now being developed. A cloud computing system (Grossman, 2009; Zhang and Zhou, 2009) is composed of a huge number of server computers like Google file systems (Ghemawat et al., 2003). Biancini et al. (Bianchini and Rajamony, 2004) discuss how to reduce the power consumption of a cluster of homogeneous servers by turning off servers which are not required for executing a collection of web requests. Various types of algorithms to find required number of servers in homogeneous and heterogeneous servers are discussed (Heath et al., 2005; Rajamani and Lefurgy, 2003; Aikebaier et al., 2009; Yang et al., 2009b). In wireless sensor networks (Akyildiz and Kasimoglu, 2004; Yang et al., 2009a), routing algorithms (Zhao et al., 2010) to reduce the power consumption of the battery in a sensor node are discussed.

There are transaction-based and communicationbased network applications. We discussed how to reduce the power consumption in transaction-based applications like Web applications (Aikebaier et al., 2009; Enokido et al., 2010b; Enokido et al., 2010a; Yang et al., 2009b). Clients issue Web requests to servers. Then the servers encode multimedia contents and send replies with the encoded contents to the clients. We assume the communication bandwidth is infinite, i.e. the communication overhead is so small as to be neglected compared with the processing overhead of servers, mainly for encoding multimedia objects. In another type of application like the file transfer protocol (FTP), a large volume of data is transmitted by a server to a client. According to our experiments, the power consumption of the server to transmit a file to a client depends on the transmission rate of the server. First, a client finds a server which holds a file so that not only the time constraints

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are satisfied but also the power consumption of the server is reduced. In this paper, we discuss a power consumption model for transmitting files based on the experimental results. We newly discuss a pair of PCB (power consumption-based) and TRB (transmission rate-based) algorithms to select a server in a set of servers so that the total power consumption can be reduced. We evaluate the PCB and TRB algorithms in terms of the total power consumption and the total transmission time compared with the traditional round-robin (RR) algorithm (Weighted Least Connection (WLC), 1998; Weighted Round Robin (WRR), 1998). We show the total power consumption and the total transmission time can be reduced in the PCB and TRB algorithms. The TRB algorithm is based on the transmission rate but it is difficult to estimate the bandwidth since the transmission rate is in reality changed in the networks. Hence, the PCB algorithm is more useful than the others since the transmission rate is not considered.

In section 2, we discuss a model of file transmission. In section 3, we show the experimental results of the total power consumption in file transfer applications and then discuss the power consumption model. In section 4, we discuss how to select a server for downloading a file to reduce the power consumption. In section 5, we evaluate the PCB and TRB algorithms compared with the RR algorithm.

### 2 FILE TRANSFER MODEL

Suppose there are a collection  $S = \{s_1, ..., s_n\}$  of servers, where each server  $s_t$  holds a full replica of a file f. A client  $c_s$  selects one server  $s_t$  in the server set S and issues a transmission request to the server  $s_t$ . Then, the server  $s_t$  transmits the file f to the client  $c_s$  as shown in Figure 1.



Suppose a server  $s_t$  concurrently sends files  $f_1, ..., f_m$  to a set  $C_t$  of clients  $c_1, ..., c_m$  at rates  $tr_{t1}(\tau), ..., tr_{tm}(\tau)$  ( $m \ge 1$ ), respectively, at time  $\tau$ .  $b_{ts}$  shows the maximum bandwidth [bps] between a server  $s_t$  and a client  $c_s$ . Let *Maxtr<sub>t</sub>* be the maximum transmission rate [bps] of the server  $s_t$  ( $\le b_{ts}$ ) which is smaller than the bandwidth  $b_{ts}$  of the network. Here, the total transmission rate  $tr_t(\tau)$  of the server  $s_t$  at time  $\tau$  is given as  $tr_t(\tau) = tr_{t1}(\tau) + \cdots + tr_{tm}(\tau)$ . Here,  $0 \le t$ 

 $tr_t(\tau) \leq Maxtr_t$ .

Each client  $c_s$  receives messages at receipt rate  $rr_s(\tau)$  at time  $\tau$ . Let  $Maxrr_s$  indicate the maximum receipt rate of the client  $c_s$ . Here,  $tr_{ts}(\tau) \leq Maxrr_s$ . We assume each client  $c_s$  receives a file from at most one server at rate  $Maxrr_s$  (=  $rr_s(\tau)$ ). The server  $s_t$  allocates each client  $c_s$  with transmission rate  $tr_{ts}(\tau)$  so that  $tr_{ts}(\tau) \leq Maxrr_s$  at time  $\tau$ .

Let  $T_{ts}$  be the total transmission time of a file  $f_s$  from a server  $s_t$  to a client  $c_s$ . If the server  $s_t$  sends files to other clients concurrently with the client  $c_s$ , the transmission time  $T_{ts}$  is increased. Let  $minT_{ts}$  show the minimum transmission time  $|f_s| / min(Maxrr_s, Maxtr_t)$  [sec] of a file  $f_s$  from a server  $s_t$  to a client  $c_s$  where  $|f_s|$  indicates the size [bit] of the file  $f_s$ .  $T_{ts} \ge minT_{ts}$ .

The average transmission rate (ATR)  $A_{ts}$  of the server  $s_t$  to the client  $c_s$  is defined as  $1 / T_{ts}$  [1/sec]. Let  $maxA_{ts}$  be  $1 / minT_{ts}$ .  $maxA_s = max(maxA_{1s}, ..., maxA_{ns})$  and  $minA_s = min(maxA_{1s}, ..., maxA_{ns})$ .

Let  $tr_{ts}(\tau)$  show the transmission rate of a file  $f_s$ from the server  $s_t$  to the client  $c_s$  at time  $\tau$ . Suppose the server  $s_t$  starts and ends transmitting a file  $f_s$  to the client  $c_s$  at time st and et, respectively. Here,  $\int_{st}^{et} tr_{ts}(\tau) d\tau = |f_s|$  and the transmission time  $T_{ts}$  is et- st. If the server  $s_t$  sends only the file  $f_s$  to the client  $c_s$  at time  $\tau$ ,  $tr_{ts}(\tau) = min(Maxtr_t, Maxrr_s)$  [bps].

The laxity  $l_{fts}(\tau)$  is  $|f_s| - \int_{\tau}^{et} tr_{ts}(x) dx$  [bit] at time  $\tau$ , i.e. how many bits of a file  $f_s$  the server  $s_t$  still has to transmit to the client  $c_s$  at time  $\tau$ .

There are types of computers with respect to the normalized transmission rate (NTR). Let  $\mathbf{F}_{\mathbf{t}}(\tau)$  be a set of current files which the server  $s_t$  is transmitting to clients at time  $\tau$ . Let  $C_t(\tau)$  be a set of clients  $c_{t1}, ..., c_{tm}$  to which the server  $s_t$  transmits files  $f_1, ..., f_m$  in  $\mathbf{F}_{\mathbf{t}}(\tau)$ , respectively, at time  $\tau$ . First, we consider a model where a server  $s_t$  satisfies the following properties:

**[Server-bound Model].** If  $Maxrr_1 + \cdots + Maxrr_m \ge Maxtr_t$ , for every time  $\tau$ ,  $\sum_{c_{ts} \in C_t(\tau)} A_{ts}(\tau) = d(\tau) \cdot maxA_t$ .

Here,  $d(\tau) (\leq 1)$  shows the degradation factor  $\gamma^{(1-|C_t(\tau)|)} (0 < \gamma \leq 1)$  at time *t*. Here, the *effective transmission rate* of the server  $s_t$  is  $d(\tau) \cdot maxA_t$ . The more number of clients a server concurrently sends files, the smaller effective transmission rate.

Let us consider three files  $f_1$ ,  $f_2$ , and  $f_3$  which a server  $s_t$  sends to clients  $c_1$ ,  $c_2$ , and  $c_3$  as an example. First, suppose that the server  $s_t$  serially sends the files  $f_1$ ,  $f_2$ , and  $f_3$  to the clients  $c_1$ ,  $c_2$ , and  $c_3$ , i.e.  $et_{t1}$ =  $st_{t2}$  and  $et_{t2} = st_{t3}$  as shown in Figure 2. Here, the transmission time  $T_t$  is  $et_{t3} - st_{t1} = minT_{tf1} + minT_{tf2} + minT_{tf_3}$ . Next, suppose the server  $s_t$  starts transmitting three files  $f_1$ ,  $f_2$ , and  $f_3$  at time st and terminates at time et as shown in Figure 2 (2). Here, since three



files are concurrently transmitted,  $C_t(t) = 3$  and  $\gamma^{-2}T_t = minT_{tf_1} + minT_{tf_2} + minT_{tf_3}$ . For  $\gamma = 0.98$ , it takes about 1.4% longer time than the serial transmission.

On the other hand, we consider another environment where a client  $c_s$  cannot receive a file from a server  $s_t$  at rate  $Maxtr_t$ , i.e.  $Maxrr_s < Maxtr_t$ . Hence, the transmission rate  $tr_{ts}$  of the server  $s_t$  to a client  $c_s$  is  $Maxrr_s$ .

**[Client-bound model].** If  $Maxrr_1 + \cdots + Maxrr_m \leq Maxtr_t$ ,  $\sum_{c_{ts} \in C_t(\tau)} A_{ts}(\tau) = maxA_t \cdot (Maxrr_1 + \cdots + Maxrr_m) / Maxtr_t$ .

Even if every client  $c_{ts}$  receives a file at maximum rate  $Maxrr_s$ , the effective transmission rate is not degraded.

## 3 EXPERIMENTAL RESULTS AND POWER CONSUMPTION MODEL

#### 3.1 Environment

We measure how much electric power a computer spends to transfer files to other computers by using the power meter Watts up?.Net (Watts up? .Net, 2009) where the power consumption of each computer can be measured every one second. As shown in Figure 3, a pair of server computers  $s_1$  and  $s_2$  are interconnected with a pair of client computers  $c_1$  and  $c_2$  in 1Gbps networks. Table 1 summarizes the specifications of the servers  $s_1$  and  $s_2$ . The server  $s_1$  is equipped with a one-core CPU. The server  $s_2$  is composed of a pair of two-core CPUs. That is, the bandwidth  $b_{ts}$  from a server  $s_t$  to a client  $c_s$  is 1Gbps (t = 1, 2). Each client  $c_s$  downloads a file f from one of the servers. The size of the file f is 43,051,806 bytes long. Here, we measure the total power consumption of the servers  $s_1$  and  $s_2$ .

For each server  $s_t$ , we consider two types of experimentations, one-client  $(1C_t)$  and two-client  $(2C_t)$  environments (t = 1, 2). In the  $1C_t$  environment, one client, say  $c_1$  downloads the file f from the server  $s_t$ . In the  $2C_t$  environment, a pair of the clients  $c_1$  and  $c_2$  concurrently download the file f from the server  $s_t$ .



#### 3.2 Power Consumption

A server  $s_t$  consumes the electric power to transmit files to clients while clients consume less amount of electric power. The power consumption rate shows the electric power consumption for a second [W/sec]. In the  $1C_1$  environment, the server  $s_1$  transmits a file f to one client, say  $c_1$  at rate  $tr_{11}$ . Here, the server  $s_1$  is composed of one one-core CPU. The maximum transmission rate  $Maxtr_1$  is 160 [Mbps] in the network of bandwidth  $b_{11} = 1$ G [bps]. In the 2C<sub>1</sub> environment, the server  $s_1$  concurrently transmits the file f to a couple of clients  $c_1$  and  $c_2$ . Here,  $tr_1 =$  $tr_{11} + tr_{12}$ . Figure 4 shows the power consumption rate of the server  $s_1$  for the total transmission rate  $tr_1$ . At the higher rate  $tr_1$  the server  $s_1$  transmits the file f, the larger amount of power consumption the server  $s_1$  consumes. We obtain the approximated formula  $PC_1(tr)$  to show the power consumption rate of a server s<sub>1</sub> for total transmission rate tr [Mbps] by using the least-squares method to the experimental results. In Figure 4, the bold dotted line shows the approximated power consumption of the server  $s_1$  where one client downloads the file f from the server  $s_1$ . The dotted line shows the approximated power consumption of the server  $s_1$  where a pair of clients  $c_1$  and  $c_2$ concurrently download the file f from the server  $s_1$ . Let  $PC_1^1(tr)$  and  $PC_1^2(tr)$  be the power consumption rates in the 1C<sub>1</sub> and 2C<sub>1</sub> environments, respectively, at total rate tr.

 $1C_1 : PC_1^1(tr) = 0.11tr + 4.15$  [W/sec].

 $2C_1 : PC_1^2(tr) = 0.12tr + 4.43 [W/sec].$ 

In a single-CPU server  $s_t$ , the power consumption rate  $PC_t(tr)$  is proportional to the total transmission rate tr.

Next, we consider another server  $s_2$  which is composed of a pair of two-core CPUs. Here, the maxi-

Server	<i>s</i> <sub>1</sub>	<i>s</i> <sub>2</sub>
Number of CPUs	1	2
Number of cores / CPU	1	2
CPU	AMD Athlon 1648B (2.7GHz)	AMD Opteron 270 (2GHz)
Memory	4,096MB	4096MB
DISK	150GB 7200rpm	74GB 10000rpm x 2 RAID1
NIC	Broadcom Gbit Ether (1Gbps)	Nvidia Ether Controler (1Gbps)

Table 1: Servers.



Figure 4: One-CPU : Power consumption rate [W/sec].

mum transmission rate  $Maxtr_2$  of the server  $s_2$  is 450 [Mbps]. We measure the power consumption rate for the total transmission rate  $tr_2$  for 1C<sub>2</sub> and 2C<sub>2</sub>. Figure 5 shows the power consumption rate [W/sec] of the server  $s_2$  for the total transmission rate tr. Following Figure 5, the power consumption rate of the server  $s_2$  also depends on the total transmission rate  $tr_2$  like 1C<sub>1</sub>. At the higher rate the server  $s_2$  transmits, the larger power consumption  $s_2$  consumes. The approximated formulas  $PC_2^1(tr)$  and  $PC_2^2(tr)$  of the power consumption rate tr [Mbps] are given in the 1C<sub>2</sub> and 2C<sub>2</sub> environments as follows:

 $1C_2: PC_2^1(tr) = 0.02tr + 3.02$  [W/sec].  $2C_2: PC_2^2(tr) = 0.03tr + 3.34$  [W/sec].

The increase rate of the power consumption of the server  $s_2$  in 2C<sub>2</sub> is about 1.5 times larger than 1C<sub>2</sub>. Compared with the one-CPU case 1C<sub>t</sub>, the power consumption rate is not so much increased for the increase of transmission rate in the two-CPU case 2C<sub>t</sub>.

Following the experiments, the power consumption rate  $PC_t(tr)$  of a server  $s_t$  is lineally increased for transmission rate tr ( $0 \le tr \le Maxtr_t$ ) as follows:

$$PC_t(tr) = \beta_t(m) \cdot \alpha_t \cdot tr + minE_t.$$
(1)

Here,  $\alpha_t$  is the power consumption to transmit one Mbits [W/Mb] for the 1C<sub>t</sub> environment.  $\alpha_t$  depends on a server type  $s_t$ . As shown in Figures 4 and 5, the more number of clients, the more amount of electric power is consumed.  $\beta_t(m)$  shows how much power



Figure 5: Two-CPU : Power consumption rate [W/sec].

consumption is increased for the number *m* of clients,  $\beta_t(m) \ge 1$  and  $\beta_t(m) \ge \beta_t(m - 1)$ . There is a fixed point *maxm<sub>t</sub>* such that  $\beta_t(maxm_t - 1) \le \beta_t(maxm_t) =$   $\beta_t(maxm_t + h)$  for h > 0. *minE<sub>t</sub>* gives the minimum power consumption rate of the server *s<sub>t</sub>* where no file is transmitted.  $\beta_t(maxm_t) \cdot \alpha_t \cdot Maxtr_t + minE_t$  gives the maximum power consumption rate  $maxE_t$  of the server *s<sub>t</sub>*.



Figure 6: Power consumption rate of server  $s_t$  [W/sec].

#### **3.3** Power Consumption Model

We would like to discuss how much electrical power a server  $s_t$  consumes to transfer a file to a client  $c_s$ . Suppose there are  $n \ge 1$  servers  $s_1, \ldots, s_n$ , each of which holds a file f. Let  $E_t(\tau)$  show the electric power consumption rate of a server  $s_t$  at time  $\tau$  [W/sec] ( $\tau = 1, \ldots, n$ ). max $E_t$  and min $E_t$  indicate the maximum and minimum electric power consumption of a server  $s_t$ , respectively. Here,  $minE_t$  shows the power consumption of a server  $s_t$  which is in idle state. That is,  $minE_t \le E_t(\tau) \le maxE_t$ . maxE and minE show  $max(maxE_1, ..., maxE_n)$  and  $min(minE_1, ..., minE_n)$ , respectively.

In this paper, we assume that only file transfer applications are performed on each server. The electric power consumption rate  $E_t(\tau)$  of a server  $s_t$  at time  $\tau$  is given as follows:

$$E_t(\tau) = PC_t(tr_t(\tau)). \tag{2}$$

As discussed in the preceding section,  $E_t(\tau)$  is given in a linear function (1).  $E_t(\tau) = \beta_t(|C_t(\tau)|) \cdot \alpha_t \cdot tr_t(\tau) + minE_t$ . Here,  $C_t(\tau)$  indicates a set of clients to which a server  $s_t$  sends files at time  $\tau$ .

The power consumption  $TPC_t(\tau_1, \tau_2)$  [W] of a server  $s_t$  from time  $\tau_1$  to time  $\tau_2$  is given as follows:

$$TPC_t(\tau_1, \tau_2) = \int_{\tau_1}^{\tau_2} E_t(\tau) d\tau.$$
(3)

## 4 SELECTION ALGORITHMS OF SERVERS

#### 4.1 System Model

There are a set *S* of multiple servers  $s_1, ..., s_n$ , each of which holds a full replica of a file *f*. A client  $c_s$  sends a transfer request of the file *f* to a load balancer *K*. Then, the load balancer *K* selects one server  $s_t$  in the set *S*. The server  $s_t$  transmits the file *f* to the client  $c_s$ . We discuss how to select a server in the set *S* for a client  $c_s$  so that the following constraints are satisfied:

- 1. The file *f* has to be transmitted to the client so as to satisfy the deadline constraint.
- 2. The power consumption of a selected server  $s_t$  to transfer the file f has to be minimized.



#### 4.2 Round-robin Algorithms

In a load balancer K, types of round-robin algorithms are widely used. In the basic round-robin (RR) algorithm, the servers  $s_1, ..., s_n$  in the server set S are totally ordered. A request is first issued to the first server  $s_1$  in the ordered set. If  $s_1$  is overloaded, a request is sent to the second server  $s_2$ . Thus, if servers  $s_1, ..., s_i$  are overloaded, a request is issued to a server  $s_{i+1}$  (i < n).

We further consider weighted round robin (WRR) (Weighted Round Robin (WRR), 1998) and weighted least connection (WLC) (Weighted Least Connection (WLC), 1998) algorithms. For each of the WRR and WLC algorithms, we consider two cases, *Per* (performance) and *Pow* (power). In *Per*, the weight is given in terms of the performance ratio of the servers. That is, the higher performance a server supports, the more number of processes are allocated to the server. On the other hand, the weight is defined in terms of the power consumption rate of the servers in *Pow*. The smaller power a server consumes, the more number of processes are allocated to the server.

## 4.3 Algorithm for Allocating Transmission Rates

At time  $\tau$ , the maximum transmission rate  $maxtr_t(\tau)$ of a server  $s_t$  depends on the degradation factor  $d_t(\tau)$ of the server  $s_t$ , i.e. the number of clients to which the server  $s_t$  concurrently transmits files at time  $\tau$ . Each time a new request is issued by a client  $c_s$  and a current request for a client  $c_s$  is terminated at time  $\tau$ ,  $C_t(\tau)$  $= C_t(\tau) + \{c_s\}$  and  $C_t(\tau) = C_t(\tau) - \{c_s\}$ , respectively. Here, the maximum transmission rate  $maxtr_t(\tau)$  of a server  $s_t$  at time  $\tau$  is calculated as  $\gamma^{1-|C_t(\tau)|} \cdot Maxtr_t$ . Here,  $0 < \gamma \leq 1$ . The transmission rate  $tr_{ts}(\tau)$  of a server  $s_t$  for a client  $c_s$  at time  $\tau$  is calculated as follows:

**CalcMAXTR\_TS**( $s_t$ ,  $c_s$ ,  $\tau$ ) {

check = False;  $maxtr_{t}(\tau) = \gamma^{1-|C_{t}(\tau)|} \cdot Maxtr_{t};$   $nc = |C_{t}(\tau)| + \{c_{s}\};$   $/*C_{t}(\tau) \text{ is sorted in ascending order of } Maxrr_{s}.*/$ SORT( $C_{t}(\tau)$ ); for each  $c_{i}$  in  $C_{t}(\tau)$  {  $/*take a client <math>c_{i}$  in the ascending order.\*/
if  $Maxrr_{i} \leq maxtr_{t}(\tau) / nc$ , {  $if c_{i} = c_{s}, \{$   $tr_{ts}(\tau) = Maxrr_{i};$   $maxtr_{t}(\tau) = maxtr_{t}(\tau) - tr_{ts}(\tau);$  check = True; break;}

$$tr_{ts}(\tau) = maxtr_{t}(\tau) - Maxrr_{i};$$

$$maxtr_{t}(\tau) = maxtr_{t}(\tau) - tr_{ts}(\tau);$$

$$nc = nc - 1;$$

$$\}$$

$$\} /* \text{ for end }*/$$

$$if check = False, {
$$tr_{ts}(\tau) = maxtr_{t}(\tau) / nc;$$

$$break;$$

$$}$$

$$return(tr_{ts}(\tau));$$

$$\}$$$$

In the procedure **CalcMAXTR\_TS**(), each server  $s_t$  can transmit a file at least  $tr_{ts}(\tau) = maxtr_t(\tau) / |C_t(\tau)|$  [Mbps] to a client  $c_s$  in the set  $C_t(\tau)$ . Here, if the maximum receipt rate  $Maxrr_s(\tau)$  of a client  $c_s$  is larger than the maximum transmission rate  $maxtr_t(\tau)$  allocated for a client  $c_s$ , the server  $s_t$  transmits a file to the client  $c_s$  at rate  $tr_{ts}(\tau)$  at time  $\tau$ . Otherwise, the server  $s_t$  transmits at rate maximum transmission rate of the server  $s_t$  for the client  $c_s$  (=  $tr_{ts}(\tau)$  -  $maxrr_s(\tau)$ ) can be used for other clients.

Suppose a server  $s_t$  is selected by three clients  $c_1$ ,  $c_2, c_3 (C_t(\tau) = \{c_1, c_2, c_3\})$  and the maximum transmission rate  $maxtr_t(\tau)$  of the server  $s_t$  is 6 [Mbps] at time  $\tau$  as shown in Figure 8. Suppose  $Maxrr_1 = 1$ [Mbps],  $Maxrr_2 = 2$  [Mbps], and  $Maxrr_3 = 3$  [Mbps]. In the basic fair allocation algorithms, each client  $c_s$ is allocated with the same transmission rate  $tr_{ts}(\tau) =$  $maxtr_t(\tau) / |C_t(\tau)| = 6 / 3 = 2$  [Mbps] as shown in Figure 8 (1). Here, the transmission rate 2 - 1 = 1 [Mbps] is not used for the client  $c_1$ . In addition, the client  $c_3$  cannot use the maximum receipt rate Maxrr<sub>3</sub> (= 3 [Mbps]). On the other hand, the unused transmission rate of the client  $c_1$  (= 1 [Mbps]) can be used for the client  $c_3$  in the procedure **CalcMAXTR\_TS**(). Then, each client  $c_s$  (s = 1, 2, 3) can download files from the server  $s_t$  at the maximum receipt rate Maxrr<sub>s</sub> at time τ.

### 4.4 Selection Algorithms

Next, we discuss how a load balancer K selects a server  $s_t$  for a client  $c_s$  in the server set S. In this paper, we propose two novel allocation algorithms, *transmission rate-based* (*TRB*) and *power consumption-based* (*PCB*) algorithms to select a server for a client. In the TRB algorithm, a server  $s_t$  is selected for a client  $c_s$  where the transmission rate  $tr_{ts}(\tau)$  of the server  $s_t$  to transmit a file f to a client  $c_s$  is the largest. The TRB algorithm is shown as follows:

$maxtr_t(t) = 6$		
$maxtr_3(t) = 2$	maxt	$r_3(t) = 3$
$\int maxtr_2(t) = 2$	maxt	$r_{2}(t) = 2$
$maxtr_1(t) = 2$	maxt	$r_1(t) = 1$



```
TRB(c_s, \tau) {
```

```
server = \phi; MAXTR = 0;

for each s_t in S {

tr_{ts}(\tau) = \text{CalcMAXTR_TS}(s_t, c_s, \tau);

if server = \phi, {

server = s_t;

MAXTR = tr_{ts}(\tau);}

else {

if MAXTR < tr_{ts}(\tau), {

MAXTR = tr_{ts}(\tau);

server = s_t;

}

}

return(server);
```

In the PCB algorithm, a server  $s_t$  is selected for the client  $c_s$  where the power consumption to transmit a file f to a client  $c_s$  is the smallest. Here,  $|f| / tr_{ts}(\tau)$  is an estimated transmission time at time  $\tau$  when a server  $s_t$  starts transmitting a file f to a client  $c_s$  with a transmission rate  $tr_{ts}(\tau)$ . The power consumption rate  $E_{ts}(\tau)$  of each server  $s_t$  at time  $\tau$  is  $\beta_t(|C_t(\tau)|) \cdot \alpha_t \cdot tr_{ts}(\tau)$  as discussed in the preceding section. It is not easy to estimate how much electric power the server  $s_t$  consumes to transmit a file f to the client  $c_s$  since there might be other clients which receive files. Here, the estimated change of power consumption  $EE_{ts}(\tau)$  [W] of a server  $s_t$  for transmitting a file f to a client  $c_s$  at time  $\tau$  when  $s_t$  starts transmitting f is defined as follows:

$$EE_{ts}(\tau) = (|f| / tr_{ts}(\tau)) \cdot \beta_t(|C_t(\tau)|) \cdot \alpha_t \cdot tr_{ts}(\tau) \quad (4)$$
$$= |f| \cdot \beta_t(|C_t(\tau)|) \cdot \alpha_t.$$

Here, a server  $s_t$  is selected for a client  $c_s$  in the PCB algorithm by using  $EE_{ts}(\tau)$  at time  $\tau$  as follows:

$$PCB(c_{s}, \tau) \{ server = \phi; EPC = 0; \\ for each s_{t} in S \{ EPC_{ts}(\tau) = |f| \cdot \beta_{t}(|C_{t}(\tau)|) \cdot \alpha_{t} \\ if server = \phi, \{ server = s_{t}; \end{cases}$$

$$EPC = EE_{ts}(\tau); \}$$
else {
if  $EPC > EE_{ts}(\tau), \{$ 

$$EPC = EE_{ts}(\tau); server = s_t;$$
}
return(server);
}

For example, there are a pair of servers  $s_1$  and  $s_2$ . The maximum transmission rates of the servers s<sub>1</sub> and s<sub>2</sub> are 7 [Mbps] and 6 [Mbps], respectively, i.e.  $Maxtr_1 = 7$  [Mbps] and  $Maxtr_2 = 6$  [Mbps]. The power consumption coefficients  $\alpha_1$  and  $\alpha_2$  to transmit one [Mbit] for one client of servers  $s_1$  and  $s_2$  are 0.10 and 0.03, respectively. A server  $s_1$  is selected by two clients  $c_{11}$  and  $c_{12}$  ( $C_1(\tau) = \{c_{11}, c_{12}\}$ ) and another server  $s_2$  is selected by two clients  $c_{21}$  and  $c_{22}$  $(C_2(\tau) = \{c_{21}, c_{22}\})$  at time  $\tau$ , respectively. The maximum receipt rates of clients  $c_{11}$  and  $c_{21}$  are the same 1 [Mbps] ( $Maxrr_{11} = Maxrr_{21} = 1$  [Mbps]). The maximum receipt rates of clients  $c_{12}$  and  $c_{22}$  are the same 2 [Mbps] ( $Maxrr_{12} = Maxrr_{22} = 2$  [Mbps]). Suppose a client  $c_3$  issues a new request to transmit a file fwhose size is ten Mbytes to a load balancer K at time  $\tau$ . Here, the maximum receipt rate *Maxrr*<sub>3</sub> for the file f on the client  $c_3$  is 4 [Mbps]. According to the procedure CalcMAXTR\_TS( $\cdots$ ), the unused transmission rates of the servers  $s_1$  and  $s_2$  are 4 [Mbps] and 3 [Mbps], respectively. The servers  $s_1$  and  $s_2$  can allocate transmission rates 4 [Mbps] and 3 [Mbps] for the client  $c_3$ , respectively. In the TRB algorithm, a server  $s_t$  which can allocate the maximum transmission rate to a client  $c_3$  is selected. Therefore, the server  $s_1$  is selected for a client  $c_3$ . On the other hand, a server  $s_t$  which has the minimum value of the formula |f|.  $\beta_t(|C_t(\tau)|) \cdot \alpha_t$  is selected in the PCB algorithm, i.e. a server which can mostly save the power consumption is selected at time  $\tau$ . Here, sets  $C_1(\tau)$  and  $C_2(\tau)$  of current clients of servers  $s_1$  and  $s_2$  include three clients, respectively. Suppose the increasing rates  $\beta_1(3)$  and  $\beta_2(3)$  of the power consumption of the servers  $s_1$  and  $s_2$  are 1.2 and 1.09, respectively. Here,  $|f| \cdot \beta_1(3) \cdot \alpha_1 =$  $10 \cdot 1.2 \cdot 0.10 = 1.2$ .  $|f| \cdot \beta_2(3) \cdot \alpha_2 = 10 \cdot 1.09 \cdot 0.03 =$ 0.327. Therefore, the server  $s_2$  is selected for a client  $c_3$  in the PCB algorithm.

## 5 EVALUATION

### 5.1 Evaluation Environment

We evaluate the TRB and PCB algorithms in terms of the total amount of power consumption and total

transmission time of files compared with the basic RR algorithm through the simulation. In the evaluation, there are five servers  $s_1$ ,  $s_2$ ,  $s_3$ ,  $s_4$ , and  $s_5$  as shown in Table 2,  $S = \{s_1, s_2, s_3, s_4, s_5\}$ . The power consumption coefficient  $\alpha_t$  to transmit one Mbits for one client of each server  $s_t$  is randomly selected between 0.02 and 0.11 [W/Mb] based on the experimental results. The increasing rate of the power consumption  $\beta_t(m)$  for the number *m* of clients is randomly selected between 1.09 and 1.5. The minimum power consumption rate *minE<sub>t</sub>* of each server  $s_t$  is randomly selected between 3 and 4 [W]. The maximum transmission rate *Maxtr<sub>t</sub>* of each server  $s_t$  is randomly selected between 150 and 450 [Mbps]. Each server  $s_t$  has a replica of a file *f*. The size of the file *f* is one giga-byte.

Totally 100 clients download the file f from one server  $s_t$  in the server set S. The maximum receipt rate  $Maxrr_s$  of each client  $c_s$  is randomly selected between 0.1 and 100 [Mbps]. Each client  $c_s$  issues a transfer request of the file f to a load balancer K at time  $st_s$ . Here, the starting time  $st_s$  of each client  $c_s$ is randomly selected between 1 and 3,600 [sec] at the simulation time. Each client  $c_s$  issues one request at time  $st_s$  in the simulation. In the simulations of the TRB, PCB, and RR algorithms, the starting time  $st_s$ of the file transmission to each client  $c_s$  is the same.

Table 2: Types of servers.

Servers	α	$\beta(m)$	minE [W]	Maxtr [Mbps]
<i>s</i> <sub>1</sub>	0.03	1.259	3.39	406
<i>s</i> <sub>2</sub>	0.05	1.195	3.17	401
<i>s</i> <sub>3</sub>	0.03	1.285	3.12	249
<i>s</i> <sub>4</sub>	0.09	1.117	3.90	231
<i>s</i> <sub>5</sub>	0.02	1.162	3.02	171

### 5.2 Total Power Consumption

Figure 9 shows the total power consumption rate [W/sec] of the servers  $s_1, ..., s_5$  at each time. Table 3 shows the total power consumptions of the servers in the PCB, TRB, and RR algorithms. The total power consumptions of the PCB, TRB, and RR algorithms are 546,186 [W], 654,161 [W], and 1,073,914 [W], respectively. In the PCB algorithm, the total amount of power consumption is the smallest because a server  $s_t$  is selected for a client  $c_s$ , whose the power consumption is the smallest to transmit a file f to the client  $c_s$ . In the TBR algorithm, a server  $s_t$  is selected for a client  $c_s$ , whose transmission rate for the client  $c_s$  is the largest. Then, the total amount of power consumption is larger than the PCB algorithm. On the other hand, the total amount of power consumption of the TRB algorithm is smaller than the RR algorithm.

RR

ĺ	546,186 [W]	654,161 [W	V] 1,073,9	14 [W]
	65			
	60 - 1		PCB algorithm	
sec	55		RR algorithm	
M	50			
r sec	30 -			1
n pe	45 -			
ptio	40 -			-
unsi	35 - 27			-
r cor	30			-
owe	25			-
Ч	20	1-1		-
	15	20000	20000 1000	
	0 1000	0 20000 Simulation ti	30000 4000 me [sec]	0 50000
	Figure 9:	Total power co	onsumption ra	te.

Table 3: Total amount of power consumption. TRB

PCB

5.3 **Total Transmission Time** 

Table 4 shows the total transmission time of the files to the 100 clients in the PCB, TRB, and RR algorithms. The total transmission time are 28,614 [sec], 28,594 [sec], and 43,744 [sec] in the PCB, TRB, and RR algorithms, respectively. The total transmission time of the TRB algorithm is smaller than the PCB and RR algorithms. However, the difference of the total transmission time between TRB and PCB is neglectable. In the TRB algorithm, a server  $s_t$  is selected, which can supply the maximum transmission rate. Therefore, the difference of the transmission time between PCB and TRB is so small as to be neglected in this simulation.

Table 4: Total transmission time of the files.

PCB	TRB	RR
28,614 [sec]	28,594 [sec]	43,744 [sec]

In the PCB algorithm, a server  $s_t$  is selected for a client  $c_s$  without considering the transmission rate between the server  $s_t$  and the client  $c_s$ . On the other hand, a server  $s_t$  is selected for a client  $c_s$  based on the estimated transmission rate in the TRB algorithm. From the evaluation results, we consider the total power consumption can be more reduced in the PCB algorithm than the TRB algorithm and the difference of the total transmission time between the PCB and TRB algorithms is neglectable. In reality, the transmission rate between a server  $s_t$  and a client  $c_s$  is dynamically changed in the network since the transmission rate of a server  $s_t$  is dynamically changed based on the number of clients. It is not easy to estimate the

transmission rate of the server  $s_t$  to a client  $c_s$  from the practical point of view. In addition, a server  $s_t$ for a client  $c_s$  can be selected without considering the transmission rate between the server  $s_t$  and the client  $c_s$  in the PCB algorithm. Therefore, the PCB algorithm is simpler and more useful than the TRB and RR algorithms.

### 5.4 File Size

We measured the total transmission time [sec] and the total power consumption of the PCB, TRB, and RR algorithms to transmit five types of files whose sizes are 1, 2, 3, 4, and 5 [GB], respectively. Totally the 100 clients download the file f from one  $s_t$  of the servers in the server set  $S (= \{s_1, s_2, s_3, s_4, s_5\})$ . Table 5 and Figure 10 show the total transmission time in the PCB, TRB, and RR algorithms for each file size. The total transmission time of the RR algorithm is longer than the PCB and TRB algorithms.

Figure 11 shows the total transmission time in the PCB and TRB algorithms for file size. The total transmission time of the TRB algorithm is smaller than the PCB and RR algorithms. The difference of the total transmission time between the PCB algorithm and the TRB algorithm is almost neglectable.

Table 5: Total transmission time [sec].

~ ()	PCB	TRB	RR
1GB	28,614	28,594	43,744
2GB	55,599	55,521	430,248
3GB	82,585	82,354	1,722,061
4GB	109,570	108,958	4,570,858
5GB	136,556	135,036	7,276,956



Figure 10: Total transmission time (PCB, TRB, and RR).

Next, we measured the total power consumption [W] of the five servers  $s_1, ..., s_5$  in the PCB, TRB, and RR algorithms. Table 6 and Figure 12 show the total



Figure 11: Total transmission time (PCB and TRB).

amount of power consumption in the PCB, TRB, and RR algorithms for each file size. Figure 13 shows the total amount of power consumption of the servers in the PCB and TRB algorithms. The total amount of power consumption of the PCB algorithm is smaller than the TRB and RR algorithms. The total amount of power consumption of the TRB algorithm is smaller than the RR algorithm. The PCB algorithm is better than the TRB and RR algorithms for any file size.

Table 6: Total power consumption [W].

	PCB	TRB	RR
1GB	546,186	654,161	1,073,914
2GB	1,209,621	1,405,971	10,647,775
3GB	1,971,767	2,215,575	42,670,592
4GB	2,835,375	3,131,209	113,334,809
5GB	3,998,291	4,211,034	180,500,814



Figure 12: Total power consumption (PCB, TRB, and RR).



Figure 13: Total power consumption (PCB and TRB).

## 6 CONCLUDING REMARKS

In this paper, we discussed how much electric power a server consumes to transfer a file to a client. A server consumes the electric power proportional to the transmission rate. Through the experiments, we obtained approximate linear functions showing how much a server computer consumes the electric power to transmit files to clients for transmission rate. We proposed the PCB and TRB algorithms to select a server so that the total power consumption of the servers is reduced. We evaluated the PCB and TRB algorithms in terms of the total power consumption and the total transmission time compared with the basic RR algorithm through simulation. According to the evaluation results, the total power consumption and the total transmission time can be reduced in the PCB and TRB algorithms compared with the basic RR algorithm. In the PCB algorithm, the total power consumption can be more reduced than the TRB algorithm and the difference of the total transmission time between PCB and TRB is almost neglectable. It is not necessary to estimate the transmission rate between a server and a client in the PCB algorithm. In addition, the total power consumption and total transmission time are no increased in the PCB and TRB algorithms compared with the RR algorithm even if the file size is increased. Therefore, the PCB algorithm is more useful for reducing the total power consumption in the communication-based applications.

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