

Power Consumption in Enterprise-Scale Backup Storage Systems

Appears in the tenth USENIX Conference on File and Storage Technologies (FAST 2012)

Zhichao Li[†] Kevin M. Greenan[‡] Andrew W. Leung[‡] Erez Zadok[†]
[†]*Stony Brook University* [‡]*Backup Recovery Systems Division*
EMC Corporation

Abstract

Power consumption has become an important factor in modern storage system design. Power efficiency is particularly beneficial in disk-based backup systems that store mostly cold data, have significant idle periods, and must compete with the operational costs of tape-based backup. There are no prior published studies on power consumption in these systems, leaving researchers and practitioners to rely on existing assumptions. In this paper we present the first analysis of power consumption in real-world, enterprise, disk-based backup storage systems. We uncovered several important observations, including some that challenge conventional wisdom. We discuss their impact on future power-efficient designs.

1 Introduction

Power has become an important design consideration for modern storage systems as data centers now account for close to 1.5% of the world’s total energy consumption [14], with studies showing that up to 40% of that power comes from storage [25]. Power consumption is particularly important for disk-based backup systems because: (1) they contain large amounts of data, often storing several copies of data in higher storage tiers; (2) most of the data is cold, as backups are generally only accessed when there is a failure in a higher storage tier; (3) backup workloads are periodic, often leaving long idle periods that lend themselves to low power modes [31, 35]; and (4) they must compete with the operational costs of low power, tape-based backup systems.

Even though there has been a significant amount of work to improve power consumption in backup or archival storage systems [8, 21, 27], as well as in primary storage systems [3, 33, 36], there are no previously published studies of how these systems consume power in the real world. As a result, power management in backup storage systems is often based on assumptions and commonly held beliefs that may not hold true in practice. For example, prior power calculations have assumed that the only power needed for a drive is quoted in the vendor’s specification sheet [8, 27, 34]. However, an infrastructure, including HBAs, enclosures, and fans, is required to support these drives; these draw a non-trivial amount of power, which grows proportionally with the number of drives in the system.

In this paper, we present the first study of power

consumption in real-world, large-scale, enterprise, disk-based backup storage systems. We measured systems representing several different generations of production hardware using various backup workloads and power management techniques. Some of our key observations include considerable power consumption variations across seemingly similar platforms, disk enclosures that require more power than the drives they house, and the need for many disks to be in a low-power mode before significant power can be saved. We discuss the impact of our observations and hope they can aid both the storage industry and research communities in future development of power management technologies.

2 Related Work

Empirical power consumption studies have guided the design of many systems outside of storage. Mobile phones and laptop power designs, which are both sensitive to battery lifetime, were influenced by several studies [7, 17, 22, 24]. In data centers, studies have focused on measuring CPU [18, 23], OS [5, 6, 11], and infrastructure power consumption [4] to give an overview of where power is going and the impact various techniques have, such as dynamic voltage and frequency scaling (DVFS). Recently, Sehgal et al. [26] measured how various file system configurations impact power consumption.

Existing storage system power management has largely focused on managing disk power consumption. Much of this existing work assumes that as storage systems scale their capacity—particularly backup and archival systems—the number of disks will increase to the point where disks are the dominant power consumers. As a result, most solutions try to keep as many drives powered-off as possible, spun-down, or spun at a lower RPM. For example, archival systems like MAID [8] and Pergamum [27] use data placement, scrubbing, and recovery techniques that enable many of the drives in the system to be in a low-power mode. Similarly, PARaid [33] allows transitioning between several different RAID layouts to trade-off energy, performance, and reliability. Hibernator [36] allows drives in a RAID array to operate at various RPMs, reducing power consumption while limiting the impact to performance. Write Off-Loading [19] redirects writes from low-power disks to available storage elsewhere, allowing disks to stay in a low-power mode longer.

Our goal is to provide power consumption measure-

ments from real-world, enterprise-scale backup systems, to help guide designs of power-managed storage systems.

3 Methodology

We measured several real-world, enterprise-class backup storage systems. Each used a Network-Attached-Storage (NAS) architecture with a storage controller connected to multiple, external disk drive enclosures. Figure 1 shows the basic system architecture. Each storage controller exports to file-based interfaces to clients, such as NFS and CIFS—and backup-based interfaces, such as VTL and those of backup software (e.g., Symantec’s OST [20]). Each storage controller performs inline data deduplication; typically these systems contain more CPUs and memory than other storage systems to perform chunking and to maintain a chunk index.

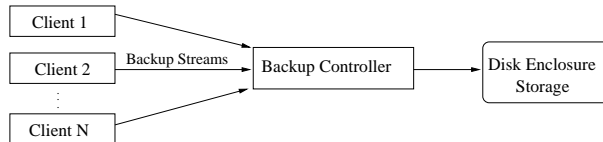


Figure 1: Backup system architecture

	DD880	DD670	DD860	DDTBD
Ship Year	2009	2010	2011	Future
Intel CPU	X7350	E5504	E5504	E7-4870
# CPUs	2	1	2	4
RAM	64GB	16GB	72GB	256GB
NVRAM	2GB	1GB	1GB	4GB
# Disks	4	7	4	4
# Pow Sup	2	2	2	4
# Fans	8	8	8	8
# NICs	1	1	1	2
# HBAs	3	1	3	4

Table 1: Controller hardware summary

Table 1 details the four different EMC controllers that we measured. Each controller was shipped or will be shipped in a different year and represents hardware upgrades over time. Each controller, except for DD670, stores all backup data on disks in external enclosures, and the four disks (three active plus a spare) in the controller store only system and configuration data. DD670 is a low-end, low-cost system that stores both user and system data in its seven disks (six active plus a spare). DDTBD is planned for a future release and does not yet have a model number. Each controller ran the same software version of the DDOS operating system.

Table 2 shows the two different enclosures that we measured. Each enclosure can support various capacity SATA drives. Based on vendor specifications, the drives we used have power usage of about 6–8W idle, 8–12W active, and less than 1W when spun-down. Controllers communicate with the enclosures via Serial Attached SCSI (SAS). Large system configurations can support more than fifty enclosures attached to a single controller,

which can host more than a petabyte of physical capacity and tens of petabytes of logical, deduplicated capacity.

	ES20	ES30
Ship Year	2006	2011
# Disks	16	15
# SAS Controllers	2	2
# Power Supplies	2	2
# Fans	2	4

Table 2: Enclosure hardware summary

Experimental setup. We measured controller power consumption using a Fluke 345 Power Quality Clamp Meter [10], an in-line meter that measures the power draw of a device. The meter provides readings with an error of $\pm 2.5\%$. We measured enclosure power consumption using a WattsUP Pro ES [32], another in-line meter, with an accuracy of $\pm 1.5\%$ for measured value plus a constant error of ± 0.3 watt-hours. All measurements were done within a data center environment with room temperature held between 70°F and 72°F .

We connected the controllers and enclosures to the meters separately, to measure their power. Thus we present component’s measurement separately, rather than as an entire system (e.g., a controller attached to several enclosures). The meters we used allowed us to measure only entire device power consumption, not individual components (e.g., each CPU or HBA) or data-center factors (e.g., cooling or network infrastructure). We present all measurements in watts and all results are an average of several readings with standard deviations less than 5%.

Benchmarks. For each controller and enclosure, we measured the power consumption when idle and when under several backup workloads. Each workload is a standard, reproducible workload used internally to test system performance and functionality. The workloads consist of two clients connecting over a 10 GigE network to a controller writing 36 backup streams. Each backup stream is periodic in nature, where a full backup image is copied to the controller, followed by several incremental backups, followed by another full backup, and so on. For each workload we ran 42 full backup generations. The workloads are designed to mimic those seen in the field for various backup protocols.

	WL-A	WL-B	WL-C
Protocol	NFS	OST	BOOST
Chunking	Server	Server	Client

Table 3: Backup workloads used

We used the three backup protocols shown in Table 3. Clients send backup streams over NFS in WL-A, and over Symantec’s OST in WL-B. In both cases, all deduplication is performed on the server. WL-C uses, BOOST [9], an EMC backup client that performs stream chunking on the client side and sends only unique chunks to the server, reducing network and server load. To mea-

sure the power consumption of a fully utilized disk subsystem, we used an internal tool that saturates each disk.

4 Discussion

We present our analysis for a variety of configurations in three parts: isolated controller measurements, isolated enclosure measurements, and whole-system analysis using controller and enclosure measurements.

4.1 Controller Measurements

We measured storage controller power consumption under three different scenarios: idle, loaded, and power managed using processor-specific power-saving states.

Controller idle power. A storage controller is considered idle when it is fully powered on, but is not handling a backup or restore workload. In our experiments, each controller was running a full, freshly installed, DDOS software stack, which included several small background daemon processes. However, as no user data was placed on the systems, background jobs such as garbage collection, were not run. Idle power consumption indicates the minimum amount of power a non-power-managed controller would consume when sitting in the data center.

It is commonly assumed that disks are the main contributor to power in a storage system. As shown in Table 4, the controllers can also consume a large amount of power. In the case of DDTBD, the power consumption is almost equal to that of 100 2TB drives [13]. This is significant because even a controller with no usable disk storage can consume a lot of power. Yet, the performance of the controller is critical to maintain high deduplication ratios, and necessary to support petabytes of storage—requiring multiple fast CPUs and lots of RAM. These high idle power-consumption levels are well known [15]. Although computer component vendors have been reducing power consumption in newer systems, there is a long way to go to support true power proportionality in computing systems; therefore, current idle controller power levels must be factored into future designs.

■ **Observation 1:** *The idle controller power consumption is still significant.*

Table 4 shows a large difference in power consumption between controllers. DDTBD consumes almost $3.5\times$ more power than DD670. Here, difference is largely due to the different hardware profiles. DDTBD is a more powerful, high-end controller with significantly more CPU and memory, whereas DD670 is a low-end model. However, this is not the case for the power differences between DD880 and DD860. DD880 consumes more than twice the power as DD860, yet Table 1 shows that their hardware profiles are fairly similar. The amount of CPU and memory plays a major role in power consumption; however, other factors such as the power efficiency of in-

	DD880	DD670	DD860	DDTBD
Idle Power (W)	555	225	261	778

Table 4: Idle power consumptions for storage controllers

dividual components also contribute. Unfortunately, our measurement methodology prevented us from identifying the internal components that contribute to this difference. However, part of this difference can be attributed to DD860 being a newer model with hardware components that consume less power than older models.

To better compare controller power consumption, we normalized the power consumption numbers in Table 4 to the maximum usable physical storage capacity. The maximum capacities for the DD880, DD670, DD860, and DDTBD are 192TB, 76TB, 192TB, and 1152TB, respectively. This gives normalized power consumption values of 2.89W/TB for DD880, 2.96W/TB for DD670, 1.35W/TB for DD860, and 0.675W/TB for DDTBD. Although the normalized values are roughly the same for DD880 and DD670, the watts consumed per raw byte trends down with newer generation platforms.

■ **Observation 2:** *Whereas idle controller power consumption varies between models, normalized watts per byte goes down with newer generations.*

Controller under load. We measured the power consumption of each controller while running the aforementioned workloads. Each controller ran the DDFS deduplicating file system [35] and all required software services. Services such as replication were disabled. The power consumed under load approximates the power typically seen for controllers in-use in a data center. The workloads used are performance-qualification tests that are designed to mimic real customer workloads, but do not guarantee that the controllers are stressed maximally.

Figure 2(a) shows the power consumed by DDTBD while running the WL-A workload. The maximum power consumed during the run was 937W, which is 20% higher than the idle power consumption. Since the power only increased 20% when under load, it may be more beneficial to improve idle consumption before trying to improve active (under load) consumption.

	DD880	DD670	DD860	DDTBD
WL-A	44%	24%	58%	20%
WL-B	58%	29%	61%	36%
WL-C	56%	28%	57%	23%

Table 5: Power increase ratios from idle to loaded system

Table 5 shows the power increase percents from idle to loaded across controller and workload combinations. Several combinations have an increase of less than 30%, while others exceed 50%. Unfortunately, our methodology did not allow us to identify which internal components caused the increase. One noticeable trend is that the increase in power is mostly due to the controller model

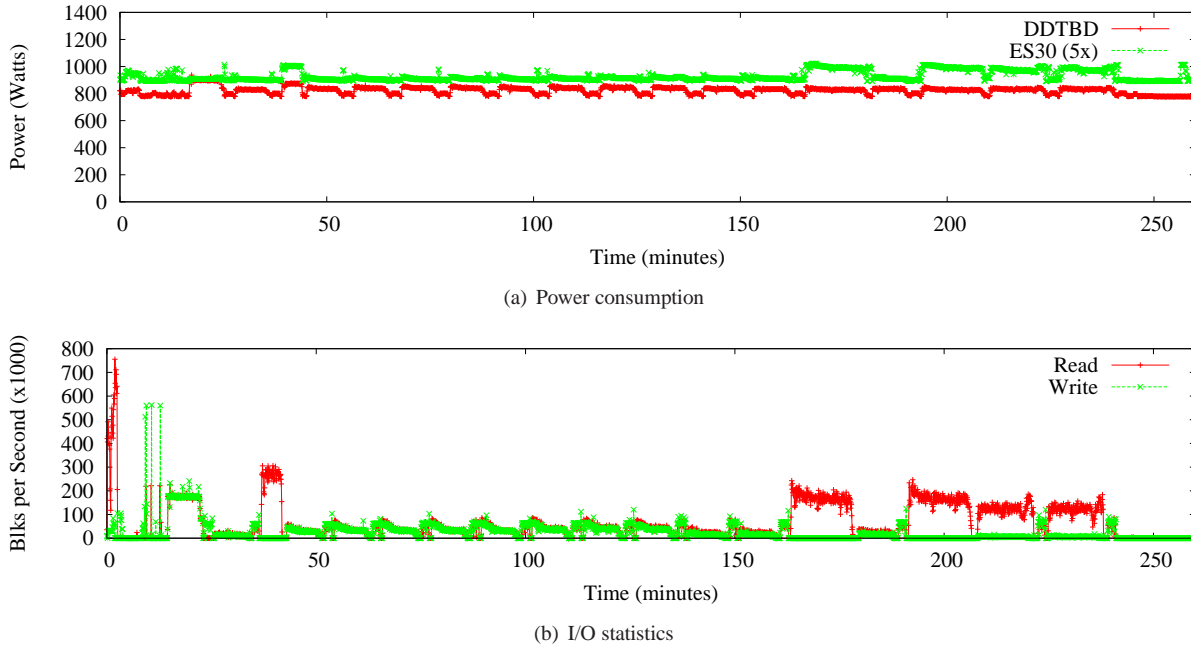


Figure 2: Power consumption and I/O statistics for WL-A on DDTBD, along with the 5 ES30 enclosures attached to it

rather than the workload, as DD880 and DD860 always increased more than DD670 and DDTBD.

■ **Observation 3:** *The increase in controller power consumption under load varies much across models.*

I/O statistics from the disk sub-system help explain the increases in controller power consumption. Figure 2(b) shows the number of blocks per second read and written to the enclosures attached to DDTBD during WL-A. We see that a higher rate of disk I/O activity generally corresponds to higher power consumption in both the controller and disk enclosures. Whereas I/Os require the controller to wait on the disk sub-system, they also increase memory copying activity, communication with the sub-system, and deduplication fingerprint hashing.

Power-managed controller. Our backup systems perform in-line, chunk-based deduplication, requiring significant CPU and RAM amounts to compute and manage hashes. As the data path is highly CPU-intensive, applying DVFS techniques during backup—a common way to manage CPU power consumption—can degrade performance. Although it is difficult to throttle CPU during a backup, the backup processes are usually separated by large idle periods, which provide an opportunity to exploit DVFS and other power-saving techniques.

Intel has introduced a small set of CPU power-saving states, which represent a range of CPU states from fully active to mostly powered-off. For example, on the Core i7, C1 uses clock-gating to reduce processor activity, C3 powers down L2 caches, and C6 shuts off the core’s power supply entirely [28]. To evaluate the effi-

cacy of the Intel C states on an idle controller, we measured the power savings of the deepest C state. Unfortunately, DDTBD was the only model that supported the Intel C states. We used a modified version of CPUIDLE to place DDTBD into the C6 state [16]. In this state, DDTBD saved just 60W, a mere 8% of total controller power consumption. This finding suggests that DVFS alone is insufficient for saving power in controllers with today’s CPUs and a great deal of RAM. Moreover, deeper C states incur higher latency penalties and slow controller performance. We found that the latencies made the controller virtually unusable when in the deepest C state.

■ **Observation 4:** *Placing today’s Intel CPUs into deep C state saves only a small amount of power and significantly harms controller performance.*

4.2 Enclosure Measurements

We now analyze the power consumption of two generations of disk enclosures. Similar to Section 4.1, we analyzed the power consumption of the enclosures when idle, under load, and using power-saving techniques.

Enclosure idle power. An enclosure is idle when it is powered on and has no workload running. The idle power consumption of an enclosure represents the lowest amount of power a single enclosure and the housed disks consume without power-management support. Figure 3 shows that an idle ES20 consumes 278W. The number of active enclosures in a high-capacity system can exceed 50, so the total power consumption of the disk enclosures alone can exceed 13kW.

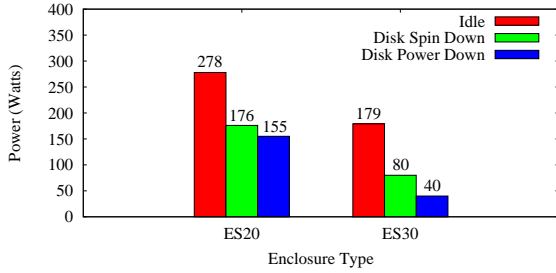


Figure 3: Disk power down vs. spin down. ES20 and ES30 are specified as in Table 2.

We found that the enclosures have very different power profiles. The idle ES20 consumes 278W, which is 55% higher than the idle ES30, at 179W. We believe that newer hardware largely accounts for this difference. For example, it is well known that power supplies are not 100% efficient. Modern power supplies often place guarantees on efficiency. One standard [1] provides an 80% efficiency guarantee, which means the efficiency will never go below 80% (e.g., for every 10W drawn from the wall, at least 8W is usable by components attached to the power supply). The ES30 has newly designed power supplies, temperature-based fan speeds, and a newer internal controller, which contribute to this difference.

■ **Observation 5:** *The idle power consumption varies greatly across enclosures with new ones being more power efficient.*

Enclosure under load. We also measured the power consumption of each enclosure under the workloads discussed in Section 3. We considered an enclosure under load when it was actively handling an I/O workload.

As shown in Figure 2(a), the total power consumption of the five ES30 enclosures connected to DDTBD, processing WL-A, increased by 10% from 900W when idle to about 1kW. Not surprisingly, Figure 2(b) shows that an increase in enclosure power correlates with an increase in I/O traffic. Percentages for the other enclosure and workload combinations ranged from 6–22%.

Our deduplicating file system greatly reduces the amount of I/O traffic seen by the disk sub-system. As described in Section 3, we used an internal tool to measure the power consumption of a fully utilized disk sub-system. Table 6 shows that ES20 consumption grew by 22% from 278W when idle to 340W. ES30 increased 15% from 179W idle to 205W. Interestingly, these increases are much smaller than those observed for the controllers under load in Section 4.1.

■ **Observation 6:** *The consumption of the enclosures increases between 15% and 22% under heavy load.*

Power managed enclosure. We compared the power consumption of ES20 and ES30 using two disk power-saving techniques: power-down and spin-down. With

	ES20	ES30
Idle Power (W)	278	179
Max Power (W)	340	205

Table 6: Max power for enclosures ES20 and ES30

spin-down, the disk is powered on, but the head is parked and the motor is stopped. With power-down, the enclosure’s disk slot is powered off, cutting off all drive power.

As shown in Figure 3, the relative power savings of the ES20 and ES30 are quite different. For ES30, spin-down reduced power consumption by 55% from 179W to 80W. For ES20, the power dropped by 37% from 278W to 176W. Although the absolute spin-down savings was roughly 100W for both enclosures, power-down was much more effective for ES30 than ES20. Power-down for ES30 reduced power consumption by 78%, but only 44% for ES20. As mentioned in Section 3, each disk consumes less than 1W when spun-down. However, for both ES20 and ES30, power-down saved more than 1W per disk compared to spin-down.

■ **Observation 7:** *Disk power-down may be more effective than disk spin-down for both ES20 and ES30.*

Looking closer at the ES20 power savings, the enclosure actually consumes more power than the disks it is housing (an improvement opportunity for enclosure manufacturers). With all disks powered down, ES20 consumes 155W, which is more than the 123W saved by powering down the disks (consistent with disk vendor specs).

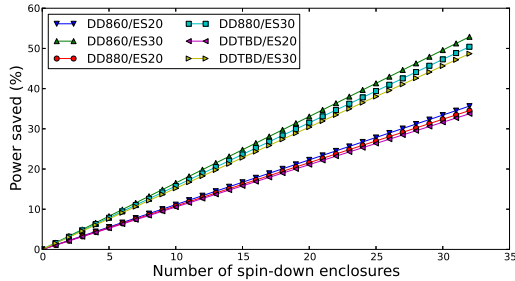
■ **Observation 8:** *Disk enclosures may consume more power than the drives they house. As a result, effective power management of the storage subsystem may require more than just disk-based power-management.*

We observed that an idle ES30 enclosure consumes 64% of an idle ES20, while a ES30 in power-down mode consumes only 25% of the power of an ES20 in power-down mode. This suggests that newer hardware’s idle and especially power-managed modes are getting better.

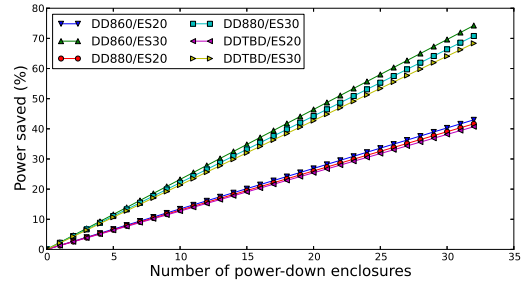
4.3 System-Level Measurements

A common metric for evaluating a power management technique is the percentage of total system power that is saved. We measured the amount of power savings for different controller and enclosure combinations using spin-down and power-down techniques. We considered system configurations with an idle controller and 32 idle enclosures (which totals 512 disks for ES20 and 480 disks for ES30) and we varied the number of enclosures that have all their disks power managed. We excluded DD670 because it supports only up to 4 external shelves.

Figure 4 shows the percentage of total system power saved as the number of enclosures with power-managed disks was increased. In Figure 4(a) disks were spun down, while in Figure 4(b) disks were powered down. We found that it took a considerable number of power-



(a) Disk Spin Down vs. Power Savings Percentage



(b) Disk Power Down vs. Power Savings Percentage

Figure 4: Total system power savings using disk power management

managed disks to yield a significant system power savings. In the best case with DD860 and ES30, 13 of the 32 enclosures must have their disks spun down to achieve a 20% power savings. In other words, over 40% of the disks must be spun down to save 20% of the total power. In the worse case with DDTBD and ES20, 19 of the 32 enclosures must have their disks spun down to achieve a 20% savings. This scenario required almost 60% of the disks to be spun down to save 20% of the power. Only two of our six configurations were able to achieve more than 50% savings even when all disks were spun down. These numbers were improved when power down is used, but a large number of disks was still needed to achieve significant savings.

■ **Observation 9:** *To save a significant amount of power, many drives must be in a low power mode.*

The limited power savings is due in part to the controllers consuming a large amount of power. As seen in Section 4.1, a single controller may consume as much power as 100 disks. Additionally, as shown in Section 4.2, disk enclosures can consume more power than all of the drives they house, and the number of enclosures must scale with the number of drives in the system. These observations indicate that for some systems, even aggressive disk power management may be insufficient to save enough power and that power must be saved elsewhere in the system (e.g., reducing controller and enclosure power consumption, new electronics, etc.).

5 Conclusions

We presented the first study of power consumption in real-world, large-scale, enterprise, disk-based backup storage systems. Although we investigated only a handful of systems, we already uncovered a three interesting observations that may impact the design of future power-efficient backup storage systems.

(1) We found that components other than disks consume a significant amount of power, even at large scales. We observed that both storage controllers and enclosures can consume large amounts of power. For example, DDTBD consumes more power than 100 2TB drives and

ES20 consumes more power than the drives it houses. As a result, future power-efficient designs should look beyond disks to target controllers and enclosures as well.

(2) We found a large difference between idle and active power consumption across models. For some models, active power consumption is only 20% higher than idle, while it is up to 60% higher for others. This observation indicates that existing systems are not achieving energy proportionality [2, 4, 12, 29, 30], which states that systems should consume power proportional to the amount of work performed. For some systems, we found a disproportionate amount of power used while idle. As backups often run on particular schedules, these systems may spend a lot of time idle, opening up opportunities to further reduce power consumption.

(3) We discovered large power consumption differences between similar hardware. Despite having similar hardware specifications, we observed that the older DD880 model consumed twice as much idle power as the newer DD860 model. We also saw that an idle ES20 consumed 55% more power than an idle ES30. This suggests that the power profile of an existing system can be improved by retiring old hardware with newer, more efficient hardware. We hope to see continuing improvements from manufacturers of electronics and computer parts.

Future work. To evaluate the steady state power profile of a backup storage system, we plan to measure a system that has been aged and a system with active background tasks. For comparison, we would like to study power use of primary storage systems and clustered storage systems, whose hardware and workloads are different than backup systems. Lastly, we would like to investigate the contribution of individual computer component (e.g., CPUs and RAM) on overall power consumption.

Acknowledgements. We thank the EMC/Data Domain performance team for their help. We also thank Windsor Hsu, our shepherd Jiri Schindler and our anonymous reviewers for their helpful feedback. This work was supported in part by NSF award CCF-0937854.

References

- [1] 80 PLUS Certified Power Supplies and Manufacturers. www.plugloadsolutions.com/80PlusPowerSupplies.aspx.
- [2] H. Amur, J. Cipar, V. Gupta, G. R. Ganger, M. A. Kozuch, and K. Schwan. Robust and flexible power-proportional storage. In *Proceedings of the 1st ACM Symposium on Cloud Computing, SoCC '10*, 2010.
- [3] D. G. Andersen, J. Franklin, M. Kaminsky, A. Phanishayee, L. Tan, and V. Vasudevan. FAWN: A Fast Array of Wimpy Nodes. In *Proceedings of the 22nd ACM Symposium on Operating Systems Principles (SOSP '2009)*, pages 1–14. ACM SIGOPS, October 2009.
- [4] L. A. Barroso and U. Hözl. The case for energy-proportional computing. *Computer*, 40:33–37, December 2007.
- [5] F. Bellosa. The benefits of event-driven energy accounting in power-sensitive systems. In *Proceedings of the 9th workshop on ACM SIGOPS European workshop*, pages 37–42, 2000.
- [6] W.L. Bircher and L.K. John. Complete system power estimation: A trickle-down approach based on performance events. In *Proceedings of the 2007 IEEE International Symposium on Performance Analysis of Systems and Software*, pages 158–168, 2007.
- [7] A. Carroll and G. Heiser. An analysis of power consumption in a smartphone. In *Proceedings of the 2010 USENIX Conference on USENIX Annual Technical Conference*, Boston, MA, USA, 2010.
- [8] D. Colarelli and D. Grunwald. Massive Arrays of Idle Disks for Storage Archives. In *Proceedings of the 2002 ACM/IEEE conference on Supercomputing*, pages 1–11, 2002.
- [9] Data Domain Boost Software, EMC Corporation, 2012. <http://www.datadomain.com/products/dd-boost.html>.
- [10] Fluke 345 Power Quality Clamp Meter. www.fluke.com/fluke/caen/products/categorypqttop.htm.
- [11] D. Grunwald, C. B. Morrey III, P. Levis, M. Neufeld, and K. I. Farkas. Policies for dynamic clock scheduling. In *Proceedings of the 4th Symposium on Operating System Design & Implementation*, San Diego, CA, 2000.
- [12] J. Guerra, W. Belluomini, J. Glider, K. Gupta, and H. Pucha. Energy proportionality for storage: Impact and feasibility. *ACM SIGOPS Operating Systems Review*, pages 35–39, 2010.
- [13] Hitachi Deskstar 7K2000. www.hitachigst.com/deskstar-7k2000.
- [14] J. G. Koomey. Growth in data center electricity use 2005 to 2010. Technical report, Standord University, 2011. www.koomey.com.
- [15] R. Kothiyal, V. Tarasov, P. Sehgal, and E. Zadok. Energy and Performance Evaluation of Lossless File Data Compression on Server Systems. In *Proceedings of the Second ACM Israeli Experimental Systems Conference (SYSTOR '09)*, Haifa, Israel, May 2009. ACM.
- [16] S. Li and A. Belay. cpuidle — do nothing, efficiently... In *Proceedings of the Linux Symposium*, volume 2, Ottawa, Ontario, Canada, 2007.
- [17] J. R. Lorch. A Complete Picture of the Energy Consumption of a Portable Computer. Master's thesis, University of California at Berkeley, 1995. <http://research.microsoft.com/users/lorch/papers/masters.ps>.
- [18] A. Miyoshi, C. Lefurgy, E. V. Hensbergen, R. Rajamony, and R. Rajkumar. Critical power slope: understanding the runtime effects of frequency scaling. In *Proceedings of the 16th International Conference on Supercomputing (ICS '02)*, pages 35–44, 2002.
- [19] D. Narayanan, A. Donnelly, and A. Rowstron. Write off-loading: practical power management for enterprise storage. In *Proceedings of the 6th USENIX Conference on File and Storage Technologies (FAST 2008)*, 2008.
- [20] Symantec OpenStorage, Symantec Corporation, 2012. <http://www.symantec.com/theme.jsp?themeid=openstorage>.
- [21] E. Pinheiro and R. Bianchini. Energy Conservation Techniques for Disk Array-Based Servers. In *Proceedings of the 18th International Conference on Supercomputing (ICS 2004)*, pages 68–78, 2004.
- [22] A. Sagahyroon. Power consumption breakdown on a modern laptop. In *Proceedings of the 2004 Workshop on Power-Aware Computer Systems*, pages 165–180, Portland, OR, 2004.
- [23] A. Sagahyroon. Analysis of dynamic power management on multi-core processors. In *Proceedings of the International Symposium on Circuits and Systems*, pages 1721–1724, 2006.
- [24] A. Sagahyroon. Power consumption in handheld computers. In *Proceedings of the IEEE Asia Pacific Conference on Circuits and Systems*, pages 1721–1724, Singapore, 2006.
- [25] G. Schulz. Storage industry trends and it infrastructure resource management (irm), 2007. www.storageio.com/DownloadItems/CMG/MSP-CMG_May03_2007.pdf.
- [26] P. Sehgal, V. Tarasov, and E. Zadok. Evaluating performance and energy in file system server workloads extensions. In *Proceedings of the Eighth USENIX Conference on File and Storage Technologies (FAST '10)*, pages 253–266, San Jose, CA, February 2010. USENIX Association.
- [27] M. W. Storer, K. M. Greenan, E. L. Miller, and K. Voruganti. Pergamum: replacing tape with energy efficient, reliable, disk-based archival storage. In *Proceedings of the Sixth USENIX Conference on File and Storage Technologies (FAST '08)*, San Jose, CA, February 2008. USENIX Association.
- [28] E. L. Sauer and G. Heiser. Slow down or sleep, that is the question. In *Proceedings of the 2011 USENIX Annual Technical Conference*, Portland, Oregon, USA, 2011.
- [29] E. Thereska, A. Donnelly, and D. Narayanan. Sierra: a power-proportional, distributed storage system. In *Proceedings of EuroSys 2011*, 2011.
- [30] A. Verma, R. Koller, L. Useche, and R. Rangaswami. Srmmap: Energy proportional storage using dynamic consolidation. In *Proceedings of the 8th USENIX Conference on File and Storage Technologies, FAST'10*, 2010.
- [31] G. Wallace, F. Douglis, H. Qian, P. Shilane, S. Smaldone, M. Chamness, and W. Hsu. Characteristics of backup workloads in production systems. In *Proceedings of the Tenth USENIX Conference on File and Storage Technologies (FAST '12)*, San Jose, CA, February 2012. USENIX Association.
- [32] Watts up? PRO ES Power Meter. www.wattsupmeters.com/secure/products.php.
- [33] C. Weddle, M. Oldham, J. Qian, A. A. Wang, P. Reiher, and G. Kuenning. PARAD: a gear-shifting power-aware RAID. In *Proceedings of the Fifth USENIX Conference on File and Storage Technologies (FAST '07)*, pages 245–260, San Jose, CA, February 2007. USENIX Association.
- [34] A. Wildani and E. Miller. Semantic data placement for power management in archival storage. In *PDSW 2010*, New Orleans, LA, USA, 2010. ACM.
- [35] B. Zhu, K. Li, and H. Patterson. Avoiding the disk bottleneck in the data domain deduplication file system. In *Proceedings of the Sixth USENIX Conference on File and Storage Technologies (FAST '08)*, San Jose, California, USA, 2008.
- [36] Q. Zhu, Z. Chen, L. Tan, Y. Zhou, K. Keeton, and J. Wilkes. Hibernator: Helping Disk Arrays Sleep Through the Winter. In *Proceedings of the 20th ACM Symposium on Operating Systems Principles (SOSP '05)*, pages 177–190, Brighton, UK, October 2005. ACM Press.