

# QuarkOS: Pushing the operating limits of micro-powered sensors

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## Abstract

As sensors penetrate into deeply embedded settings such as implantables, wearables, and textiles, they present new challenges due to their tiny energy buffers and extremely low harvesting conditions under which they need to operate. However, existing low-power operating systems are not designed with the goal of scaling down to such severely constrained environments. We address these challenges with QuarkOS, an OS that scales down by carefully dividing every communication, sensing, and computation task into tiny fragments (e.g. half-bit, one pixel) and introduces sleeps between such fragments to re-charge. In addition QuarkOS is designed to have minimal run-time overhead, while still adapting performance to harvesting conditions. Our results are promising and show continuous communication from an RF-powered CRFID can occur at a third of the harvesting levels of prior approaches, and continuous image sensing to be performed with a tiny solar panel under natural indoor light.

## 1 Introduction

Technology trends in self-powered sensors are enabling them to be deployed in more deeply embedded settings than before, including miniaturized wearable and implantable bio-sensors that continuously measure physical and physiological parameters [14] [15], perpetual deployments of sensors embedded within buildings and pipes [11], miniature robotic insect swarms [6], and others. In addition, emerging 3D nano-fabrication techniques [5] promise cheaper sensors that can be printed in a cost-effective manner at high volumes, enabling applications such as smart textiles and smart surfaces. In most of these scenarios, large energy buffers are infeasible due to form-factor and cost considerations, and are instead replaced by a tiny rechargeable energy storage and a micro-harvester that scavenges energy from light, electro-magnetic, vibrations, and/or temperature [3]. By combining such tiny harvesters with low-power electron-

ics and manufacturing, the aim is to achieve affordable, perpetual, and miniature form-factor sensor systems.

System design for micro-power based sensors is extraordinarily challenging for two reasons — small energy buffer size and tiny harvesting rate. The small form-factor demands of deeply embedded sensors mean that micro-powered sensors rely more on continuous harvesting and less on energy storage. In turn, this places substantial burden on a programmer to carefully construct tasks such that they can be executed within the stringent energy constraints. In addition, micro-harvesters provide energy in tiny trickles and in a time-varying manner. This results in several idiosyncrasies that the system needs to handle: a) the harvesting rate is often considerably lower than the active mode power draw, hence outages can occur, b) voltage regulation is expensive, hence harvesting systems need to adapt to variable power from the harvester, and c) even a simple operation such as analog-to-digital conversion (ADC) to measure the current energy level is expensive at the micro-scale, and needs to be avoided.

In this paper, we look at design abstractions that can enable an operating system for micro-powered systems to scale down to the most extreme harvesting conditions and the most stringent energy buffer limitations. Traditional sensor operating systems such as TinyOS [9] and Contiki [7] are designed for battery-powered systems, and use larger tasks that simply do not scale down to these regimes. More recently, MementOS [13] and Dewdrop [4] address some of the challenges in micro-powered environments. MementOS introduces checkpoints within computation tasks such that it can recover from outage and continue execution. Dewdrop is a system that adapts task execution to harvesting conditions such that the efficiency of execution is optimized. While these are important steps to deal with the constraints in micro-powered systems, they do not scale down with the energy buffer size and available energy. For example, both of these systems execute on a light-powered Intel

WISP placed in the presence of strong light (2000 lux), but placing it under natural indoor light that is a factor of ten smaller (200 lux) makes these systems inoperable.

In this paper, we argue for a simple but powerful abstraction — we deconstruct every task within the operating system and look for opportunities to insert sleep gaps to allow for the buffer to replenish before continuing execution of the task. We look at packet transfer, and identify opportunities between bits as well as within a single bit where sleeps can be inserted. We look at complex sensors such as imagers, and identify how sleeps can be inserted between and within individual pixel sensing operations. Similarly, processing tasks can be broken down into smaller segments that may be only a few instructions in size. The ability to breakdown every possible task into the smallest contiguous execution unit allows QuarkOS to scale down to extremely power-deprived regimes where existing systems cannot operate.

Optimizing systems for resource-impooverished conditions can limit performance when scaling up to regimes where there is more available energy. This is because active to sleep transition overheads can dominate when each execution unit is extremely small. To avoid this, QuarkOS continually adapts to harvesting conditions, and adjusts the size of each execution unit to ensure that transition overhead is minimized. Importantly, such adaptation is performed by avoiding power-hungry operations such as ADC reads, which can limit the conditions under which QuarkOS can operate.

Our preliminary results show that QuarkOS can scale-down to the most extreme of conditions: a) QuarkOS runs on a UMass Moo CRFID equipped with a capacitor that is two orders of magnitude smaller than its default configuration, b) QuarkOS establishes continuous communication with a reader at a third of the harvested power that is required for existing CRFIDs, and c) QuarkOS enables continuous image capture while harvesting from natural indoor light despite a small solar harvester, and a limited energy buffer.

## 2 Case for QuarkOS

At the heart of QuarkOS is a simple hypothesis — by breaking down every component of a task (communication, sensing and computation) into its smallest atomic units, we can enable the system to scale down to extremely resource-impooverished regimes and stringent platform constraints. We discuss some of the considerations that influence our design, as well as the limitations of prior work.

### 2.1 Why fragment tasks?

The need to break down every task in a system into its smallest units arises from two considerations — limitations of the platform and limitations of the harvest-

ing source. The limitations enforced by the sensor platform are often driven by form-factor, cost, and fabrication capabilities. Many emerging sensor applications such as implantable and wearable sensors require extremely small form factor devices, and one of the sacrifices that platform designers are increasingly making is reducing the size of the energy buffer and substituting it with a micro-harvester. Table 1 shows that the buffer size shrinks by more than six orders of magnitude between a Mote sensor and its “smart dust”-sized counterpart, a Michigan Micro-Mote ( $M^3$ ). Even across micro-harvesting platforms, there are differences — for example, the Intel WISP has a buffer that is an order of magnitude larger than the  $M^3$  mote.

Table 1: Shrinking buffer size.

	Buffer size
Mica Mote [12]	2850mAh
CRFID (WISP/Moo)[2][16]	5.44uAh
Michigan Micro Mote ( $M^3$ )[10]	0.6uAh

The limitations imposed by the harvesting source arises due to the fact that energy is available in small trickles that varies over time. For example, the  $M^3$  mote is attached to a small single-cell solar panel that harvests about 10 uW of power and a CRFID (WISP) harvests about 400 uW at a distance of 1m from a reader. While trickle charging can be addressed by filling up the buffer and executing a task, it is often not possible to charge a buffer to its maximum capacity under extremely low harvesting conditions. To fully charge a buffer, the voltage/current has to be boosted up via analog circuits, which are too power hungry to operate under such conditions. Therefore, many platforms (e.g. WISP, Moo) put the burden on the run-time system to adapt to varying levels of available energy.

The design of an OS for devices with tiny buffers and variable amounts of available energy is extraordinarily complex — even tasks as simple as transmitting a single packet may not be feasible on the energy available per charge cycle, rather communication may need to be broken down to a few bits or perhaps even a fraction of a bit at a time. Similarly, sensing tasks such as capturing an image or obtaining samples from an accelerometer may need to be broken down further in-order to operate.

### 2.2 Limitations of prior work

A wide range of operating systems have been proposed for Mote-class devices over the last decade including TinyOS [9], Contiki [7], Nano-RK [8], and others. These OSs are designed to operate on a finite buffer that can last several days, weeks, or months, and the core emphasis is on maximizing lifetime given such a buffer rather than optimizing the size of a task. For example, while programmers are encouraged to use small task sizes in

TinyOS, this is only because there is no pre-emption across tasks, hence a large task can starve a smaller one which may have timing requirements. But while these tasks are relatively small compared to larger platforms, they are, in fact, orders of magnitude larger than what can be executed with buffers on micro-powered platforms.

More related to our regime is MementOS and Dewdrop, which have addressed challenges in RF-harvesting based Computational RFIDs (CRFIDs). MementOS [13] is an operating system for CRFIDs that introduces checkpoints within a task such that it can continue execution after an outage. While MementOS fragments tasks across outages, it is limited in three ways: a) tasks that have timing requirements, for example communication and sensing, are difficult to split across outages due to the non-determinism of boot-up and shut-down operations, b) checkpointing using flash is expensive energy-wise compared to sleep, and c) flash requires relatively high voltage, and therefore this is not appropriate under extremely low harvesting conditions.

Dewdrop [4] is an energy-aware runtime system for CRFIDs where the system adapts to available energy and wakes up to run a task only when it believes that there is sufficient energy for the task to execute. While Dewdrop does not address task splitting, the harvesting-awareness capability is important to QuarkOS as well. However, Dewdrop uses ADC sampling for tracking harvesting rates, which is an energy-hog and renders the system inoperable under severely constrained settings.

### 2.3 QuarkOS Abstraction

QuarkOS addresses the above challenges by breaking down all tasks in the system into the smallest units that need to be contiguously executed — fraction of a bit, fraction of a sensing unit (e.g a part of a pixel), single byte of storage, and single instruction execution. This allows QuarkOS to operate under extreme scenarios — for example, on a device that only has enough energy to transmit one bit at a time, a packet can be transmitted over several tiny re-charge cycles of one bit duration. In between these execution units, QuarkOS introduces sleeps where the platform operates in sleep mode while it waits for the energy buffer to re-charge.

## 3 QuarkOS Design

In this section, we describe the key components of QuarkOS. We first describe how we can breakdown the communication and sensing stacks to operate under extremely constrained conditions, and then how the QuarkOS controller adapts to harvesting conditions in a lightweight manner.

### 3.1 Fragmenting the network stack

One of the key innovations in QuarkOS is the capability to break-down packet transmission such that it can

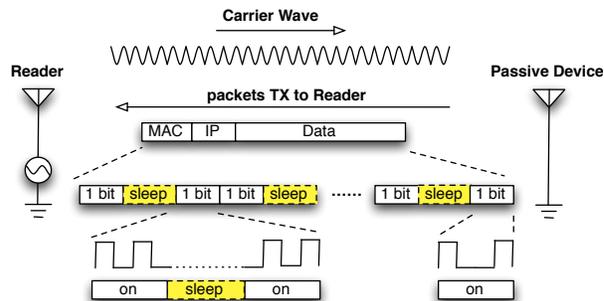


Figure 1: QuarkOS based bit-level networking.

operate one-bit at a time (more precisely, a fragment of a bit at a time). We focus on passive backscatter communication in this section since it is considerably lower power than active radios and therefore more appropriate for harvesting-based devices. We start by introducing relevant information about passive communication, and describe how it can be broken into one bit or half-bit fragment, and then discuss the challenges in designing a complete network stack over such an abstraction.

**Communication in passive radios** A passive radio is designed to both provide power to a passive device as well as to enable communication. As shown in Figure 1, the reader provides a carrier wave, which can be reflected by a passive device back to the reader with its own information bits. The Intel WISP [2] and UMass Moo [16] are examples of sensor platforms that rely on passive radio. A unique difference between active and passive radios is that while active radios need an oscillator to clock the bits, the clock for passive communication is obtained from reader’s carrier wave. The implication is that fragmenting passive communication into smaller fragments does not incur significant transition overheads since the oscillator is often the component that takes the most time/energy to stabilize.

**Inter-bit and intra-bit sleeps** QuarkOS exploits two opportunities to insert sleep gaps into a packet transmission (Figure 1): between bits and within bit. First, since hardware timers on the micro-controller are responsible for generating the OOK pulses on the passive radio, sleep gaps can be inserted between bits by clearing the hardware timers and putting micro-controller into low power mode. Second, sleep gaps can even be inserted within a single bit by setting the transmission unit as half bit. The conjunction of two half bits is carefully designed to maintain the timing information within each bit.

**QuarkOS network stack** While we have discussed the building blocks of a bit-by-bit network stack, several challenges remain. A fundamental challenge imposed by QuarkOS is variable delays between fragments comprising a packet, which impacts every component of the wireless network stack that implicitly or explicitly relies on timing. Such variability has implications on pream-

ble design, signal decoding, MAC and transport layer timeouts, ACK mechanisms, and so on. Variable delays also have implications on the design of a reliable protocol stack. In a traditional stack, packet losses could result either from channel losses or collisions, but in our scenario, it could also be because of energy losses where a device suddenly stops transmitting because its energy buffer is depleted. Finally, variable delays also have implications on the design of a many-to-one communication protocol — in a network where several micro-powered sensors running QuarkOS are communicating with a reader, how should communication be scheduled for maximal concurrency while taking into account the differences in harvesting rates on nodes? We are exploring these challenges in our ongoing work.

### 3.2 Fragmenting the sensing stack

Having described how communication tasks can be broken down into tiny fragments, we turn to sensing tasks. Micro-powered platforms are almost always designed with the ability to sense, hence the ability to breakdown complex sensing tasks is crucial to the design of QuarkOS. Our key insight is that opening up the inner workings of the sensing pipeline allows us to break it down into smaller fragments that can execute given energy limitations, with sleeps between fragments to replenish energy. We focus on one such sensing task - image capture - because it represents a particularly complex sensing task that would normally be considered far too power-hungry for micro-powered platforms. The mechanism by which we break down image sensing parallels our approach for the network stack. We breakdown the individual components of an imager and look for opportunities to insert sleeps between small fragments such that the overall image sensing task can still be performed despite harvesting and buffer limitations.

**Breaking down an imager** A photo image sensor is a device that converts an optical image into electronic signals. To capture a whole optical image, the electronic signal at each pixel needs to be sampled. While most commercial imagers are designed to capture an entire image and transfer it to a processor, some recent low-power imagers allow greater control over pixel acquisition [1]. In addition, the sampling of a single pixel in such imagers can be broken down into several steps as shown in Figure 2: 1) configure corresponding sensor registers, 2) turn on the analog circuit to perform photon to electronic signal conversion, 3) perform ADC readings to digitize the electronic signal, and 4) turn off the analog circuit and the ADC. The decomposed pixel sensing operations provide several potential opportunities to insert sleep gaps.

**Inter-pixel and intra-pixel sleeps** QuarkOS exploits two opportunities to insert sleep gaps into an image sens-

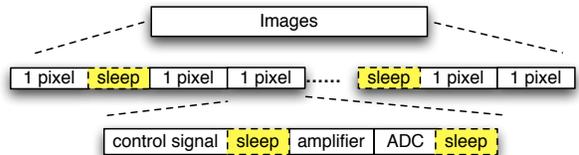


Figure 2: QuarkOS based pixel-level image sensing.

ing: a) sleeps can be introduced between pixel acquisitions during which the power-consuming units such as amplifiers and ADCs can be switched off, and b) sleeps can be inserted at an intra-pixel granularity before turning on the amplifier or after the ADC readings to restore energy in the buffer. Thus, the minimum energy required for making progress with image sensing is smaller than even a single pixel capture.

**QuarkOS image processing stack** While we have discussed the building blocks of a pixel-level image sensing stack, several challenges remain in designing a robust and useful sensing stack over this abstraction. For example, when capturing a dynamic scene, the reduced sampling rate will result in motion blur. Handling motion blur is particularly complex if the sleep gaps vary over time due to harvesting source variations. One approach to address this problem might be to exploit a regression model to learn the time series patterns of inserted sleep gaps and compensate the corresponding blur according to the model prediction. Another might be to limit the scenarios under which images are captured to those where harvesting conditions are relatively stable.

### 3.3 QuarkOS interface and OS scheduler

Fragmentation of tasks in QuarkOS has implications both on application design as well as the OS scheduler.

**Application Interface** At a high level, QuarkOS seeks to abstract the idiosyncrasies of harvesting energy dynamics from the application developer. Thus, an application developer can use QuarkOS to execute a variety of sensing, processing, and communication tasks while remaining agnostic of how the tasks are fragmented. However, QuarkOS can introduce variable-sized gaps depending on harvesting conditions, which impacts timing-sensitive tasks. For example, when capturing an image under dynamic conditions, sleep gaps result in motion blur and variable gaps can make the image difficult to interpret. To address this, tasks can specify the maximum sleep gap, and maximum jitter in sleep gap, as well as the number of fragments that need to be executed back-to-back within a wakeup cycle, which are used by QuarkOS to determine whether or not the task can be executed given current conditions.

**OS scheduler** The QuarkOS scheduler is responsible for dynamically selecting how many fragments of a task to execute in a single wakeup interval, as well as the

duration of sleep gap, while taking into consideration task requirements in terms of execution rate and jitter. The QuarkOS scheduler builds on Dewdrop [4] to adapt to harvesting conditions, but addresses two limitations to enable it to scale-down to more constrained settings. First, QuarkOS takes the sleep-wakeup transition into account to minimize the overall overhead of transitions — this is not a problem for Dewdrop, which does not fragment tasks, but becomes an issue when each task is divided into hundreds of fragments. Second, QuarkOS avoids ADC costs and only uses information from a threshold detector that detects when the voltage drops below a threshold that is considered high risk for outage. Instead of tracking operating voltage, it tracks the time after a voltage threshold interrupt that it needs to wait before executing a fragment. Finally, the QuarkOS scheduler also continually tracks gap sizes and jitter, and uses this to decide under what conditions to execute a task.

## 4 Preliminary results

We now present some initial results of our fragmentation-based network and image sensing stacks.

**Bit-by-bit data transfer** Figure 3 compares the bit-by-bit transfer capability of QuarkOS against a packet-based transfer scheme (4 byte packets) on the UMass Moo platform. We power the CRFID with an RFID reader and increase the transmit power levels. We constrain the device by replacing the default 10uF capacitor with a 0.1uF capacitor. Note that even though the buffer has less energy than required to transmit an entire packet, packet transfer can still work under sufficiently high harvesting conditions.

There are two interesting observations from the results. First, QuarkOS can operate at harvesting power levels that are a third of the minimum operating conditions for the packet-based transfer. In fact, QuarkOS’s bit-by-bit transfer only fails when harvested energy is smaller than the system’s lowest sleep power requirement. Second, it shows the adaptive capability of the QuarkOS controller, which increases the number of fragments per wakeup cycle as harvesting rates increase, thereby amortizing sleep overhead. Even under high harvesting conditions, the adaptive approach achieves close to the performance of the non-adaptive packet-based transfer mechanism.

**Pixel-by-pixel image capture** We implemented and evaluated the pixel-level image sensing using a low power camera (Stonyman [1]) and a CRFID platform (Moo) as the sensor controller. The whole image sensing platform is powered by a 3cm×3cm array of 9 solar cells under natural indoor light. We compare pixel-by-pixel capture in QuarkOS against a full-image capture scheme, where system starts image sensing when harvested volt-

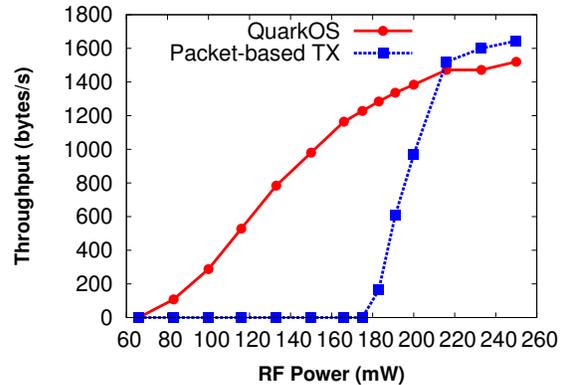


Figure 3: Throughput of bit-by-bit packet transfer.

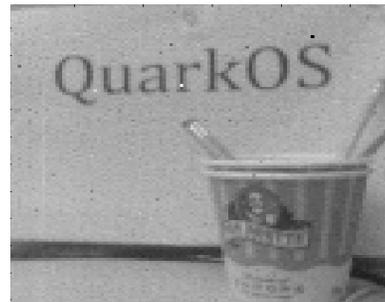


Figure 4: Image captured using pixel-by-pixel image capture.

age is higher than a predefined threshold (3.3V, the image sensor’s operating voltage). Figure 2 shows a static 112×112 image captured by QuarkOS at a slow rate of about 1 image per minute. In contrast, the full-image capture scheme doesn’t even get a chance to capture a single pixel because the system dies prior to this point.

## 5 Conclusion

In this paper, we present a simple but powerful abstraction, QuarkOS, that can enable systems to seamlessly scale down to miniature buffer sizes as well as ultra-low and dynamic harvesting conditions. Our approach is to deconstruct every task within the operating system and look for opportunities to insert sleep gaps to allow for the energy buffer to replenish before continuing execution of the task. Results show that our QuarkOS provides substantial benefits in pushing the limits of operation of micro-powered devices, and allow them to perform useful work under more extreme environments than previously thought possible. We believe that designing an operating system that works under such conditions can make it valuable to a wide range of emerging micro-powered embedded systems and applications.

## 6 Acknowledgement

We thank the anonymous reviewers for their valuable comments. This research was supported by NSF grants 0855128, 0916577, 1217606, and 1239341.

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