Experiences with Self-Organizing, Decentralized Grids Using the Grid Appliance

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Abstract—"Give a man a fish, feed him for a day. Teach a man to fish, feed him for a lifetime" - Lau Tzu

Large-scale Grid computing projects such as TeraGrid, Grid'5000, and OpenScience Grid provide researchers access to vast amounts of compute resources, but in doing so, require the adaption of their workflows to comply to the environments and policies provided by these systems. In many scenarios, user communities benefit from systems that, while smaller in scale, but where they have flexibility in deploying resources, assigining users, and configuring the environment and policies. However, researchers do not have many alternatives as creating these types of systems involve coordination of distributed systems and expertise in networking, operating systems, file systems, security, and grid middleware. This results in many research groups creating small, in-house compute clusters where scheduling is often ad-hoc, thus limiting effective resource utilization. To address these challenges, we present the "Grid Appliance." The "Grid Appliance" enables researchers to seamlessly deploy, extend, and share their systems both locally and across network domains for both small and medium scale computing grids. This paper details the design of the "Grid Appliance" and reports on experiences and lessons learned over four years of development and deployment involving wide-area grids.

I. INTRODUCTION

Grid computing presents opportunities to combine various distributed resources together to form powerful computing systems. Due to the challenges in coordinating the organization of grids, researchers typically become members of existing grids. However, often times existing grids are limited in terms of flexibility and policies provided, and users resort to setting up and managing their local resources (in many cases, inefficiently through ad-hoc resource discovery and allocation). While there is a wealth of grid middleware available, including resource managers like Condor [1], Torque (PBS) [2], and Sun Grid Engine [3] and parallelization tools like MPICH [4], Hadoop [5], and UPC [6], most researchers see the entry barrier to installing and future management of these system as being greater than their usefulness. Virtual machine based "Cloud" computing infrastructure-as-a-service is a promising model for hosting small/medium-scale ondemand Grids; however, the challenge remains of configuring the cloud middleware that goes within a cloud instance, especially considering that users may want to tap into the availability of internal cloud resources and/or multiple external providers on isolated infrastructures.

To address these concerns, we have implemented the "Grid Appliance" allowing users to focus on making use of grids and minimizing their effort in setting up and managing the underlying components. The "Grid Appliance" allows users to deploy small/medium scale computing Grids on their own

resources within a LAN, collaboratively across a WAN, as well as on cloud-provided infrastructure. This paper details the design of the "Grid Appliance", which evolved with feedback from experiences with real deployments and users over four years, summarizes lessons learned, and presents an evaluation of its ability to deploy zero-configuration virtual Grids that seamlessly span across distributed resources, including a local cluster and commercial and research cloud resources.

At the heart of our approach lies a P2P infrastructure based upon a distributed hash table (DHT), useful for decentralized organization of the grid. Peers are able store key, value pairs into the DHT and to query the DHT with a key and potentially receive multiple values efficiently. The P2P layer connects all users together to avoid potential network asymmetries. A virtual private network (VPN) builds upon the P2P system to allow unmodified applications to run. Resources are configured through files generated by a Web interface, followed by automated interactions involving the DHT or VPN based IP multicast.

Users can either download pre-configured virtual machine (VM) or cloud images or configure their own through common package managers as the core components of the system have been packaged into a software repository. The end result is all the same, a "Grid Appliance," a preconfigured environment emphasizing user-centricity and trivial installation, providing researchers with a plug-and-play tool to create ad-hoc virtual compute clusters for their own groups, local or federated. A graphical overview of the system is illustrated in Figure 1.

Users configure their system through a Web interface. At this site, users create or join groups, similar to an online social networking group. An administrators of a group has the ability to accept or deny users and remove misbehaving users. Members of a group are able to create and download configuration files, which plug into the "Grid Appliance" as a floppy disk or as a file in its file system. The file specifies the type and purpose of the "Grid Appliance" instance and uniquely identifies the owner. Upon first boot, an appliance instance contacts the "GroupAppliances" site specified in the configuration file to obtain a certificate authority (CA) signed certificate, after which the system becomes completely decentralized and connects to other systems through the P2P overlay.

To justify our techniques, consider the difficulty in combining resources across disparate networks, which may or may not involve multiple research groups. The set up of security, connectivity, and the continuous management of the system may require an information technology (IT) expert. Network

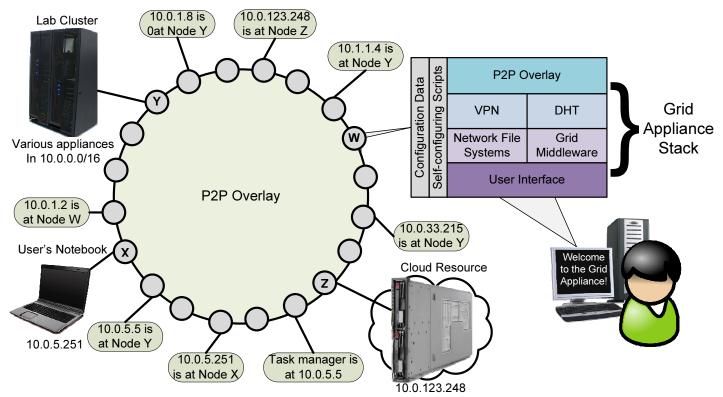


Fig. 1. A "Grid Appliance" system consisting of various users and resource types. The grid uses the P2P overlay for connectivity through a VPN and discovery mechanisms through the DHT. The Grid Appliance software stack consists of P2P software, VPN, DHT, grid middleware with self-configuring scripts, and a user interfaces for the middleware.

constraints present another complexity beyond configuration and organization of distributed resources. Contributing groups may have resources behind different network address translators (NATs) and firewalls, preventing direct communication with each other. Even assuming that an institution's network administrator is willing to make exceptions for the grid, additional rules may be required for each new cluster or resource added internally and externally, quickly becoming unmanageable. Our approach embraces decentralized systems behind NATs and novice grid administrators.

The rest of this paper discusses these challenges in more detail and our solutions addressing them. Section II provides an overview of the "Grid Appliance" and the systems involved as well as highlights our core design. In Section III, we present a detailed review of available grid middleware to address the ambiguity in the previous section. As described in Section IV, the other key component of the system is a P2P VPN that makes created distributed systems significantly more simple. Section V provides a case study of a grid deployment using standard grid deployment techniques compared to our "Grid Appliance," describing qualitatively the benefits of this approach. Using the system described in the previous section, Section VI presents a quantitative evaluation of the time taken to self-configure a "Grid Appliance" wide-area virtual clusters. We share our experiences from this long running project in Section VII. Finally, Section VIII compares and contrasts other solutions to these problems.

II. THE "GRID APPLIANCE": FROM A USER'S STANDPOINT

This section highlights the different aspects of the system as shown in Figure 2. This presents what a first time user would experience including interaction with the Web site and the services used directly or indirectly to configure a working grid system. Later on in Section V, this effort will be compared to the configuration and use of a manually configured grid.

A. Creating the Grid

Prior to starting, the user should be aware of the core user components of "The Grid Appliance," understand the group Web site, ability to deploy VMs or alternatively physical resources, and how to interact with he grid task scheduler of choice in the baseline appliance (Condor [1], s motivated by Section III). To address users who may not be familiar with these parts, helpful tutorials are provided on www.grid-appliance.org.

The process begins with the first step, labeled "User," where a user either creates a new grid or joins an existing one via groups. There are two types of groups: "GroupVPN" groups and "GroupAppliance" groups. A "GroupVPN" group constitutes a virtual private network that provides connectivity within a grid and isolation from other grids, while "GroupAppliance" groups represent subsets of a grid. This approach allows for delegation of responsibilities across the grid and as a means to ensure higher priority for members of the same "GroupAppliance." The latter is important in a scenario where multiple independent departments at a universty or group

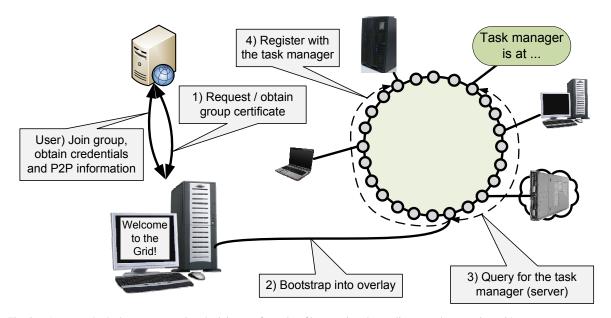


Fig. 2. An example deployment scenario: obtaining configuration files, starting the appliance, and connecting with a resource manager.

collaborators across multiple institutions may desire to share resources together, to take advantage of each others idle cycles. Though when a deadline approaches, they will want priority on their contributed resources. Without priority, they may avoid a grid altogether. Though with the "Grid Appliance," the "GroupVPN" allows the departments to collaborate their resources into a common university grid, while still maintaining priority to their own resources through "GroupAppliances."

Creating a new grid involves the creation of a new a "GroupVPN" group followed by a "GroupAppliance" group. Joining an existing grid requires a user to join its "GroupVPN" group and then a "GroupAppliance" group matching their affiliation or creating their own. Members of a "GroupAppliance" group are presented with the options of obtaining configuration files to create managers, workers, and clients.

A new grid requires a manager to coordinate workers and clients. In the context of traditional cluster and grid middleware, this is the machine that keeps track of the global task queue and enforces user priorities. Machines used only to run tasks are called workers. Finally, client systems have the ability to submit tasks and other features useful for interacting with the grid in addition to the roles of a worker. While these terms are used loosely in this discussion, their use is determined by the self-configuring scripts for the middleware installed. Section III-A presents their relationship when used with Condor.

Once a user has the configuration files to bootstrap managers, workers, and clients, they can start "Grid Appliance" instances on physical, virtual, or cloud machine. Users can either download a preconfigured VM, start a cloud instance, or create their own system through the use of package management systems, like APT and YUM. To create a new system, users can take an existing Linux installation, add the "Grid Appliance" repository, and install the packages by executing commands such as "yum install grid-appliance" or "apt-get install grid-appliance." Alternatively, this process can

be automated during the installation of the operating system through a preseed or kickstart file. The grid configuration files can be added to the system via a floppy disk for a virtual or physical machine, user data for cloud instances, or placed in a specific directory inside the system or on a local Web site for all three types of configurations. Again, this process can be streamlined with operating system installation or done afterward.

For users seeking to deploy their own grid rather than join an existing one, they need to deploy a single manager, and one or more workers and/or clients. From Figure 2 step "1," during system boot and without user interaction, each machine contacts the group Web site to obtain a valid "GroupVPN" certificate. This approach allows a single floppy disk to bootstrap many systems. Once the machine has a certificate, it connects to the P2P overlay whose bootstrap peers are listed inside the configuration file, "step 2." At which point, the machine starts the VPN service running on top of the P2P overlay, also part of step "2." The self-configuring VPN hides from the user the complexity of setting up a common fabric that is subject to network dynamics and connectivity, issues further explored in Section IV. At this point, the machine will automatically obtain a unique IP Address and find its place inside the grid. A manager machine will register itself with the P2P system (not shown), while clients and workers will attempt to find available managers by querying the P2P overlay, step "3," and then the managers directly, step "4." The technical details for our approach with Condor are described in Section III-A.

B. Improving User Experience

With the proceeding steps completed, the grid system has been created. A user can submit tasks and receive tasks to run on their systems. The remaining issues focus on user access, which needs to address questions including: how do users easily move files across the grid or into their local machine? If a user runs a client in a virtual machine on their desktop,

how can the client be informed to refuse running jobs, while the user is on the desktop?

Systems like these have many potential security issues and its not trivial to design an approach that balances usability with security. Our goal is to secure the system to the point that the only viable attacks are those directly against the software running on the machine and not poorly chosen passwords or resources outside of the grid, thus creating a sandbox. To do so, tasks running on a remote machine are severly limited in what they are capable of doing. File system access is limited to only those files and directories allowed for everybody and that specific user. Escalation of privilege attacks due to poor passwords are prevented by disallowing use of "su" or "sudo." Finally, network access is limited to the VPN, thus they are unable to perform denial of service attacks on the Internet.

For accessibility, users have access to network file systems and remote login. These services are secured by preventing access to them via the Internet and the VPN to prevent malicious exploitation. These servies include a SSH server and a Samba or Windows File Share with the user name set to that of the name on the group Web site and the password defaulted to "password." The "Grid Appliance" hosts its own Samba share as oppose to using traditional virtual machine file shares. This is the reverse of typical VM approaches, which mount the hosts file system, but doing so creates potential security risks. To access these services, users can add a second Ethernet device, on a trusted network. In a virtual machine environment, this may be connected to "host-only" in other words, only the host machine may use it. Alternatively in a cluster, the first Ethernet may be connected to the Internet and the second to the LAN only.

When running a VM on a desktop, the VM is unable to detect if there is an active user on the host. To address these concerns, we have written an agent that communicates with the client through the second Ethernet device. The agent discovers a server through multicast service discovery and verifies that it is running on the local machine by limiting the discovery to networks other than that of the default network device on the host. The agent notifies the client's server process, whenever a user is accessing the host. Then the server will prevent tasks from being scheduled on the local machine until sufficiently long time has passed since it last heard from the agent, typically 10 minutes.

While grid middleware typically provide data distribution mechanisms, it is important to also provide support for a common, O/S layer data sharing facility. For example, an individual worker may only need a fraction of the data contained within a large file, transferring the entire file may make use of the grid disadvantageous. To support these sort of sparse data transfers, each "Grid Appliance" has a local NFS share, which is exported with read-only permission. There still exists that challenge that traditionally in a Unix system a file systems must be manually mounted. Fortunately, there exist tools to automatically mount file systems, e.g. autofs. The autofs tools work by intercepting file system calls inside a specific directory, parsing the directory link, and mounting

a remote file system. In the "Grid Appliance," this occurs through the path /mnt/ganfs/hostname, where the hostname is either the IP address or hostname of another instance. Accessing a file in that path will automatically mount the NFS for that "Grid Appliance" without the need for superuser intervention. Mounts are automatically unmounted after a sufficient period of time without any access to the mounted file system.

III. GRID MIDDLEWARE

Grid middleware is used to connect various distributed resources together in order to run computing tasks. These type of systems include resource management systems like Torque, Condor, and Oracle / Sun Grid Engine (SGE), which consist of three fundamental components: execute nodes, resource managers, and submission nodes. Users access a submission site, craft task description files, and submit them to a scheduler or resource manager, which will queue tasks to the various execute nodes to run when available.

Some of the issues that arise when configuring grids include: how will users connect to resources, who will be able to submit jobs, where will the job queue be located, how can priority be given to local users, how large can the grid become, and what if any changes will the user need to make to their software to run it on the grid. In Table I, we compare both popular grid solutions with recent research projects like BonjourGrid [7] and PastryGrid [8] that are aimed at resolving some of the more challenging issues regarding coordination.

Many grids are configured to have a single site for job submission, such that all users of the system, both local and remote, must have direct access to the submission site. At this site, users each have a unique account for their use and have the ability to execute programs and store files. This means that an administrator must explicitly create an account and that the user must be trusted. A malicious user could run an application that escalates privileges, distribute copyrighted materials, or interfere with others use of the grid. The goal of the "Grid Appliance" is to isolate users and make them self-sufficient, in doing so, we require that submission sites be created on demand and potentially be single user and optionally multiuser. By doing so, users are never given explicit accounts on privileged resources inside of secure environments. Instead all job submissions occur from their own resources.

Having a single job queue can lead to unfair sharing of resources, for example, consider a multi-site grid with a single job queue. If the managers of the job queue were in dire need for resources, they could manipulate the system in order to obtain higher priority on all resources, abusing their power and obtaining an unfair portion of all grid resources. On the other hand, a user or a site that provides resources for the grid should have high priority on their own resources, otherwise, their motivation for sharing would be limited, because they could just as well remove their resources from being shared whenever the user or a member of the site wanted to use them. Having to deal with these issues is undesirable and could inevitably lead to a fractured grid, as many users may simply

	Description	Scalability	Job queue / submission site	API Requirements
Boinc	Volunteer computing, applications ship with Boinc and poll head node for data sets	Not explicitly mentioned, limited by the ability of the scheduler to handle the demands of the client	Each application has a dif- ferent site, no separation from job queue and sub- mission site	Applications are bundled with Boinc and must be written to use the Boinc API in order to retrieve data sets and submit results to the head node
BonjourGrid	Desktop grid, use zeroconf / Bonjour to find available resources in a LAN	No bounds tested, limits include multicasting overheads and processing power of job queue node	Each user has their own job queue / submission site	None
Condor	High throughput comput- ing / on demand / desktop / etc / general grid comput- ing	Over 10,000 ¹	Global job queue, separate submission site, optionally one per user	Optional API to support job migration and check-pointing
PastryGrid	Use structured overlay Pastry to form decentralized grids	Decentralized, single node limited by its process- ing power, though collec- tivitely limited by the Pas- try DHT	Each connected peer maintains its own job queue and submission site	None
PBS / Torque [2]	Traditional approach to dedicated grid computing	up to 20,000 CPUs ²	Global job queue and sub- mission site	
SGE	Traditional approach to dedicated grid computing	Tested up to 63,000 cores on almost 4,000 hosts ³	Global job queue and sub- mission site	None
XtremWeb	Desktop grid, similar to Condor but uses pull in- stead of push, like Boinc	Not explicitly mentioned, limited by the ability of the scheduler to handle the demands of clients	Global job queue, separate submission site, optionally one per user	No built-in support for shared file systems

TABLE I GRID MIDDLEWARE COMPARISON

desire for a simpler setup, where there is no concern about ensuring privilege on their own resources. Furthermore, when grids are financed by third parties, the third parties like to receive statistics about their use, if a member of a grid were to remove their resources every time a local user needed them, those results would not be recorded nor available to the third party. We believe at a minimum each site should have the opportunity to run their own job queue, at a minimum their will be a job queue for the entire network, and optionally, each submission site will behave as a job queue in a completely decentralized system.

While its not particularly common, some systems, like Boinc, require that a user wishing to deploy tasks on a grid compile their software using particular APIs. Some, like Condor, provide optional APIs to provide extended features like process check-pointing and migration. Having firm requirements that force users to write specialized code may work for certain environments, but doing so increases the entry barrier and may provide too much challenge for courses in grid computing. Having optional requirements, lets dedicated users take advantage of special features without affecting the use of less complex tasks.

Considering these three issues: submission site, job queue site, and API requirements, we firmly believe that out of the potential choices Condor matches best. While systems like PastryGrid and BonjourGrid are developing nicely, our

attempts to get PastryGrid online failed as Pastry suffers from dynamic bootstrapping issues and PastryGrid was unable to actually execute our submitted tasks and both do not support priority nor fairness. Also, systems like PBS/Torque and SGE are significantly centralized and while using systems that allow cross-domain grids through middleware like Globus [9] could potentially enable these systems to meet our goals, we found the end result too complex. Boinc is completely inappropriate for our approach as it really works well when used to facilitate a single project from a central point.

A. Resource Managers and the DHT Approach

To efficiently and transparently construct wide area grids, we employ a DHT. To do so, a manager places its IP address into the DHT at the key *managers*. When workers and clients join the grid, the systems automatically query this key and configure to report to one or more managers, application dependent. Likewise, managers can query this key to learn of other managers to coordinate with each other.

Of the resource management middlewares that we have surveyed, Condor matched closest with our goals due to its decentralized properties and focus on desktop grids and voluntary computing. As described above, most of the available cluster and grid software do not easily support multiple submit points, in fact, most require another piece of software to bridge the gap between cluster and grid, or more explicitly distribution of the system.

Further motivating Condor is the ease in adding new resources. To add new resources to a Condor system, an execute or submission node must have the IP address for the manager,

¹http://www.cs.wisc.edu/condor/CondorWeek2009/condor_presentations/sfiligoi-Condor_WAN_scalability.pdf

²http://www.clusterresources.com/docs/211

³http://www.sun.com/offers/docs/Extreme_Scalability_SGE.pdf

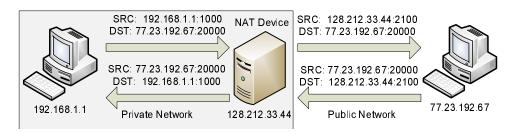


Fig. 3. A typical NAT interaction. The peer behind a NAT has a private address. When the packet is sent through the NAT, the NAT translates the source information into a public mapping, keeping the original source information so that if a packet from the remote peer comes back, it can be translated and delivered to the original source.

the rest of the system organization is performed entirely transparent to the user. Conversely, in SGE and Torque, after resources have been added into the system, the user must manually configure the manager to control them.

Finally, Condor supports opportunistic cycles. Most scheduling software assumes that resources are dedicated and do not handle cases, where other processors or a user also interact with the system. Condor, however, can detect the presence of other processes or a user and suspend, migrate, or terminate a job.

A caveat to our approach is the requirement of a manager, while the system organizes through a decentralized means, it still results in a distributed system relying heavily on a small subset of nodes. For future work, we are investigating means to completely decentralized the manager node, potentially by making each node a manager for its own node and through decentralized resource discovery and priority ranking algorithms. In the meantime, we have taken advantage of a feature known as "flocking" in Condor. Flocking allows submission sites to connect to multiple managers. This serves two purposes: 1) to provide transparent reliability by supporting multiple managers and 2) users can share their resources through their own manager.

To configure Condor, we store managers IP addresses into the DHT using the key *managers*. When a new peer joins, it queries the DHT, obtains the list of all managers, and randomly selects one as its primary manager. The rest are set to flocking. If the system prefers managers from its group, it will randomly contact each manager in an attempt to find a match, selecting one at random if no match is found. If no managers are found, the process repeats every 60 seconds. Once a manager has been found, it is checked every 10 minutes to ensure it is online and additional managers that have come online are added to the flock list.

1) Hadoop, MPICH, and Multicast Discovery: Alternatively users may want to experiment with tools meant for LANs but not want to invest the time to install and configure them. In which case, DHT use does not translate well if they want to install software without using our appliance domain. To support these endeavours, we have investigated methods to bootstrap grid middleware through IP multicast. IP multicast works on all LANs and is used by many popular applications for discovery, such as Windows Media Center and iTunes by meanas of the UPNP (DLNA) and DAAP protocols, respectively.

The two systems that we have used to configure through IP multicast are Hadoop and MPICH. Hadoop configuration consists of a head node and worker nodes, where the head node distributes map tasks to the worker nodes. In MPICH, each resource is identically configured to support interprocess communication through the MPICH library, it is up to the application developer to determine roles of individual nodes. In both cases, the way multicast discovery works is to send out a beacon requesting that all nodes supporting these services respond.

Our appliance setup for these applications consists of a common ssh key, so that all resources in a grid can connect with each other and a multicast discovery application so a coordinator can organize the resources. The ssh key only enables access on host only networks and VPNs, preventing malicious third-parties from gaining access to the grids. The IP multicast script is run by the user on a single access node, which will act as the coordinator. The resource discovery sends out a beacon several times and after a 30 second delay, the process completes and all responding resources are automatically configured through ssh.

IV. THE MOTIVATION FOR VPNs

As of 2010, a majority of the Internet is connected via Internet Protocol (IP) version 4, which is quickly approaching its limit of available addresses, 2^{32} (approximately 4 billion). With the Earth's population at over 6.8 billion and each individual potentially having multiple devices with Internet connectivity, the IPv4 limitation is becoming more and more apparent. There are two approaches to addressing this issue: 1) the use of NATs to enable many machines and devices to share a single IP address but preventing bidirectional connection initiation, and 2) IPv6 which supports 2¹²⁸ addresses. The use of NATs, as shown in Figure 3, complicates grid systems that require all-to-all communication, which include all of those which we consider. In addition, firewalls may prevent peers from receiving incoming connections. And while the eventual widespread use IPv6 may eliminate the need for address translation, it does not deal with the issue of firewalls. and the future of NATs in IPv6 is unclear.

The use of VPNs motivates beyond the impetus for traversing NATs and firewalls. With a VPN, users can avoid the headaches associated with dynamic IP addresses, as each VPN instance can claim and maintain a globally unique IP address and, regardless of the machines physical location and mobility,

ideal condition for laptop users. In addition, it abstracts the user from having to be concerned about network addresses. For example, when using machines across networks or even a virtual machines inside the same LAN but behind virtual machine manager NATs, users must be wary of all nodes in the systems ability to connect with each other. When using a VPN, these considerations are unwarranted, the grid software need only concern itself of the VPN and the direct connectivity provided through it.

Our work relies on a group enabled IPOP VPN called Group VPN [10]. IPOP through its underlying P2P infrastructure supports NAT traversal allowing peers behind NATs and firewalls to communicate directly and indirectly through relays in the P2P system. The VPN enables many of the key features in the "Grid Appliance." For example, if there were not a VPN, users of MPI and Hadoop would need to ensure that all resources were bridged to the LAN and not through a VM NAT, the typical configuration, otherwise the multicast message would not be delivered to all participants. The VPN software supports the ability to self-organize using existing infrastructures including IP multicast, public overlays, and Xmpp as described in our previous work [11]. This is in contrast to other VPNs like Hamachi [12], OpenVPN [13], Tinc [14], Violin [15], ViNe [16], or VNET [17], that are either centralized and require a dedicated node to coordinate peers or decentralized solutions that require manual configuration of links between peers.

Using the aforementioned techniques "Grid Appliances" can be constructed in one of two ways: local and wide area. The "Grid Appliance" ships with two default configurations, one that connects users to a globally available public system and another that allows for LAN only grids. Local grids can be constructed by booting the appliances, which will then use multicast self-discovery to find other resources, create the DHT overlay, and then form VPN links. Alternatively, the user can connect to the default public system or use "GroupAppliances" to create and manage their own grid, both of which bootstrap from a public shared DHT overlay. This does not prohibit more advanced users from downloading our "GroupAppliances," as its available as a VM, and host their own DHT overlay.

V. A CASE STUDY ON DEPLOYING A CAMPUS GRID

We now present a case study to explore the qualitative differences in deploying a campus grid using traditional techniques versus a grid constructed by "Grid Appliance." One of the target environments for the "Grid Appliance" is resources provided in distributed computer labs and many small distributed clusters on one or more university campus as shown in Figure 4. In this case study, we examine approaches to setting up a grid connecting these different sets of resources using commodity components in contrast to the "Grid Appliance."

A. Traditional Configuration of a Campus Grid

The first step in joining the resources is determining the network configuration of the system. Condor like most other

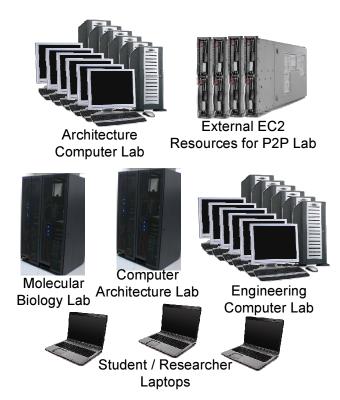


Fig. 4. A collection of various computing resources at a typical university. push based schedulers requires that the submission sites have direct continuous network access to the workers in the system. To deal with potential network asymmetries, all systems can be placed on a common VLAN, though this may be complicated across a campus and even more difficult if resources were to include other universities or cloud resources. Thus to deal with these potential network asymmetries, the user would need to deploy a VPN. The most straight-forward approach would be to deploy an OpenVPN on the manager node. Using OpenVPN, like most VPNs, requires that each node be preconfigured with a unique key and signed-certificate, a tedious process that takes time and effort. The problem with using most VPNs is there lack of support for dynamics in the system. If a node in the critical path between two nodes goes offline, network communication will be broken. The only VPN resilient to these types of failures is IPOP as there are no critical nodes between two communicating peers.

With the grid in place, users will want to submit jobs. A global submission site will allow for a simpler though not necessarily trivial network configuration. Whereas having each user supply their own submission site would require nearly all-to-all connectivity in the system, which is not very common on a university campus. So while a global submission site may reduce networking configuration costs, it increases administration costs both in terms of utilities and personel. A global submission site requires administration, Boinc makes claims that a fully functional system should require approximately 20 hours a week of effort to maintain this system. Using a global submission site will also cost computing and electrical resources, as more users are added to the system, file system space, memory, and processing power may be needed on the

submission site. Alternatively, if each user supplies their own submission site, all these issues will be negated though all the users will need to maintain uninterupted connectivity to the worker machines. Regardless of the path taken, someone will have to sign a new certificate for each resource a user wants to connect to the resource or create a new account for each new user.

Once those details have been fleshed out, the next consideration is ensuring homogeneity on the resources. If there are different system configurations on the various machines, an application that works well on one platform could cause a segmentation fault on another, through no fault of the developer, but rather due to library incompatibilities. The easiest way to deal with this approach is to use a virtual machine and there are many groups that do this. Owners of the clusters could either use these virtual machines or manually install the same software on their machines.

Once the machines are fully installed, they will need to be configured to point to the global job queue or server, which in Condor can be multiple individual queues as well as be separate from individual submission sites. Condor supports a high availability mode as well as having parallel queues via flocking. Regardless of which approach is taken, the IP address or hostname of these end points will need to be added to each of the resources. If they ever change, each machine will need to be reconfigured to point to the new locations.

The final component deals with fairness, which has to aspects: users who contribute resources should have priority on them and if a user is directly accessing a computer lab's resource directly it should not be hampered by remote users' jobs. To support user and group based priorities, Condor has mechanisms that can be enforced at the server that allows for abitrary means to allow one user to have higher priority than another user on a specific machine. This is done through specifying on the worker machine two variables, the contributing users name and/or the contributing groups name. When the server receives a job request, it compares the submission nodes user name / group name with that of workers, if there is a mapping that user will get priority over other users. This can either be realized by the next time the resource is available, it will be given to that user or by pre-empting a non-owners job from that resource.

The format for this configuration is as follows:

Job queue (server):

NEGOTIATOR_PRE_JOB_RANK = 10 * (MY.RANK) Worker:

GROUP_RANK = TARGET.Group =?= MY.Group USER_RANK = TARGET.User =?= My.User RANK = GROUP_RANK || USER_RANK

Worker and Submitter:

Group = "Group's Name"

User = "User's Name"

The huge caveat is that even with this in place, if there is no mechanism for verifying the identity of the submitting node, a malicious user can obtain priorities not granted to them. In the Grid Appliance, this is addressed by storing this information

inside the certificate of the VPN, which the server can request using a XMLRPC link to the P2P VPN. In other systems, this may require accessing a centralized user database or requiring all users in Condor to use a certificate.

A campus computing lab will lose its purpose if those directly using lab resources do not have priority over remote users. If the Condor is running natively on the host, the administrator can enable Condor features that monitor for keyboard and mouse movement that will bump jobs off the machine. Though most likely, in most common cases virtual machines will be running on the desktops. If this is the case, there is not a very intuitive solution on informing Condor running on the virtual machine, that a user is actually on the host. For the Grid Appliance, our solution was to run an agent that monitors usage on the host and reports it to the virtual machine. Discovering the existence of a virtual machine only requires that the VM have a host-only interface. The agent will send multicast discovery messages to all the VM interfaces on the host and if it discovers a VM will then send notifications of usage to a service on VM. That service will in turn simulate an active user inside the VM, causing jobs on the VM to be suspended, migrated, or removed.

Further motivating the desire for having multiple submission sites is desire for users to the ability to access their data files through NFS. While it may be easier to have a single NFS mount on all the workers, it will also add additional costs to the global submission node. Earlier we described how we use autofs to automatically mount NFS stores from submission nodes. This same approach could be used in the case of a manually configured grid. It would require that each machine was configured the same way though.

B. Grid Appliance Configuration of a Campus Grid

All these considerations are exactly the reasons why "Grid Appliance" and its associated group Web interface are desirable for small and medium scale grids. The first component is deciding which Web interface to use, the public one at www.grid-appliance.org or another one hosted on their own resources, similarly the users can deploy their own P2P overlay or use our shared overlay. At which point, users can create their own VPN groups for different grids and then their grid groups to ensure priority on their own resources.

The Web site enforces unique names for both the users and the groups. Once the user has membership in a "GroupAppliance" group, they can download a file that can be used automatically configure their resource. This means obtaining a signed certificate, configuring the group information in Condor, connecting to a decentralized VPN, and discovering the server in the grid. The user does not need to be concerned about location thanks to the VPN or changes in the configuration of the grid thanks to decentralized discovery of the server. Finally, the "Grid Appliance" approach ensures homogeneity as all users install the same packages on the same platforms. Whereas a traditional grid would require users to conform with each other or deal with the incompatibilities across machines.

C. Comparing the User Experience

After a user has obtained an account and done all the other appropriate steps to connect with the grid, in the traditional setup, they will SSH into the submission site. Their connectivity to the system is instantaneous, their jobs will begin executing as soon as it is their turn in the queue, which can be instanteous in a lowly utilized system.

The procedure taken by the "Grid Appliance" is slightly different. When the user first boots a "Grid Appliance," sometimes it will have already connected with the server prior to the user having access to a command prompt and sometimes not. Typically a "Grid Appliance" will be completely ready within 30 seconds or less, though our current approach relies on polling the state of the P2P overlay and the VPN rather than using events, which may further lower this time. To ensure users that everything is progressing normally, we have a window appear telling them the state of the system, including the state of the VPN and Condor.

Once a user has access to a prompt, they can submit jobs. Their jobs will too begin executing as soon as it is their turn in the queue; however, before a job can be executed a direct VPN link must be established between the submission site and the task worker. The amount of time required varies on the network configuration, though in all cases a direct link will be established. Sometimes that direct link consist of routing through a well chosen proxy as discussed in [10].

With the "Grid Appliance," users are not limited to accessing their files through SSH and SFTP. We have also configured the "Grid Appliance" to support a local Samba mount or Windows file share. Something recognized as not being safe to do on an open / untrusted network but is safe to do since the "Grid Appliance" runs on the users local resources.

VI. EVALUATION

In the previous section, we qualified why the approach was easier than configuring a grid by hand, though by doing so we introduce overheads related to configuration and organization. This section verifies that these overheads do not conflict with the utility of our approach. The tasks in this evaluation are to determine the time required to start a grid individually at multiple sites individually and then cumulatively. We compare a statically configured grid versus our dynamic "Grid Appliance." The three environments chosen are Amazon's EC2 supporting a simple 1:1 NAT, University of Florida directly behind an "iptables" NAT and then a Cisco NAT, and finally a Future Grid at University of Indiana's using Eucalyptus behind a AAA NAT.

Prior to beginning the evaluation a manager and submission node are started and connectivity between the two are verified. In the case of the static system, OpenVPN is run from the manager node, which has been assigned a static IP address. The experiments are run three times for each environment, the times measured during the evaluation are: "start" - time from starting the instances to when they register as being turned on, "connect" - the time delta between the end of "start" and when all resources appear in "condor_status," that is, have registered

with the manager, and "run" - time taken to submit a 5 minute job to all the resources in the system, which measures the time for VPN connections to establish between the submission node and the workers. All tasks are automated through scripts with human interaction required only to start the events of grid boot and job submission. Results are presented in Figure 5.

	50 - EC2	50 - NEU	50 - UF	150 - All
Start	2:44	10:21	20:23	21:14
Connect	2:27	11:36	3:53	17:13
Run	7:15	6:35	5:53	21.19

Fig. 5. Time in minutes:seconds to start and connect execute nodes from various sites, Amazon EC2, Northeastern University, and University of Florida, to an already online resource manager, and then the time to run a 5 minute job from a freshly connected submission node.

As the systems consist of various hardware and software configurations, the time to start is only provided as a reference to potential overheads in bootstrapping the resources. Some of the interesting experiences of the experiment were: 1) the combination of the "iptables" and VMware NAT was more easily traversable than the combination of "iptables" and KVM NAT and 2) in the experiment consisting of 150 peers, nodes were actually well connected much earlier, but due to missed packets and Condor timeouts, not all resources were accounted for in Condor as early as in the other tests. With regards to the KVM NAT, it appears to be particularly aggressive as NAT mappings last for less than 10 seconds, while typical NATs keep mappings for over 30 seconds.

VII. LESSONS LEARNED

In this section, we will present some of our previous experiences in using and developing the Grid Appliance that were not obvious when we started. A significant component of our experience stems from the computational grid provided by Archer [18], an active grid deployed for computer architecture research, which has been online for over 3 years. Archer currently spans four seed universities contributing over 500 CPUs as well as contributions and activities from external users. The Archer grid has been accessed by over hundreds of students and researchers submitting jobs totaling over 400,000 hours of job execution in the past two years alone.

The Grid Appliance has also been utilized by groups at the Universities of Florida, Clemson, Arkansas, and Northwestern Switzerland as a tool for teaching grid computing. While Clemson and Purdue are constructing campus grids using the underlying VPN, GroupVPN / IPOP, to connect resources together. Recently, several private small-scale systems have come online using our shared system available at www. grid-appliance.org with other groups constructing their own independent systems. Feedback from users through surveys have shown that non-expert users are able to connect to our public Grid appliance pool in a matter of minutes by simply downloading and booting a plug-and-play VM image that is portable across VMware, VirtualBox, and KVM.

A. Stacked File Systems

Configuring systems can be difficult, which makes it important to have the ability to share the resulting system with others. The approach of actually creating packages can be overly complicated for novices, to adress this concern, our original "Grid Appliance" supported a built-in mechanism to create packages through a stackable file system using copyon-write, as describe in [19]. The appliance at that time ran only on VM consisting of 3 disks: the "Grid Appliance" base image, the software stack configured by us; a module; and a home disk. In normal usage, both the base and module images are treated as read-only file systems with all user changes to the system being recorded by the home image, as depicted in Figure 6.

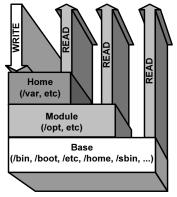


Fig. 6. Example of a stackable file system from our previous "Grid Appliance." A file will be read from the top most file system in the stack and all writes are directed to Home.

Users could easily upgrade to new versions of the "Grid Appliance" by replacing their base image with a new one, while keeping their module and home disks. While the purpose of the module was to allow users to extend the configuration of the "Grid Appliance." To do so, the user would launch into developer mode, where all changes would be written to the module image, rendering the home image unused. Upon completing the changes, a user would run a script that would clean the system and prepare it for sharing. A user could then share the resulting module image with others.

While there were users for this approach, the issues with it made it unattractive to continue using. First, there exists no kernel level support for stackable file systems, we had to add UnionFS [20] to the kernel, adding the weight of maintaining a kernel unto our shoulders. While there does exist FUSE, or filesystem in userspace, solutions, using those properly require modifications to the initial ramdisk, reproduced automatically during the installation of every new kernel, furthermore, our experience with them suggests they are not well suited for production systems.

The approach was also limited to VMs, hosts such as clouds and physical resources could not, easily, take advantage of it. So while we still think the concept is great, we have removed it from our mainline appliance. We feel that the future work for this type of application will be to allow users to configure a system and then make it easy for them to create packages. Doing so will allow the packages to be significantly more

portable and less configuration headaches. Also, to deal with upgrades, we use standard package management, so users do not need to deal with VM disk images to upgrade.

B. Timing in Virtual Machines

Certain applications, particularly license servers, are sensitive to time. When constructing a grid consisting of many distributed resources, there is a good possibility that time will be wrong somewhere. With regards to VMs, VMWare [21] suggests synchronizing with the hosts time and to avoid using services like NTP (network time protocol), which may have adverse affects on timing inside the virtual machine. Our experiences recommend the opposite, we have experienced drastic timing jumps and significantly off virtual clocks due to host clocks being set incorrectly. It seems the virtual clock would force an immediate jump in timing for the virtual clock, which could be quite significant if the VM had not been scheduled recently enough. NTP, on the other hand, gradually corrects time. This major jump would cause the system to completely stall due to software that was unable to handle the unreliability in time. Because in many cases, the VMs run on machines that are not owned by the VM owner, correcting the host time is not possible. Our conclusion is that developers should be wary when using virtual timing, especially if they are constructing distributed systems. Rather they should consider using NTP, especially if your application will run on a device where the user may not have the ability to change the hosts timing. It should be noted that the paper from VMWare does not explicitly recommend against NTP, just that it can be difficult to properly to configure. For example, if a solitary NTP server is chosen, it may be offline or behave erratically, an issue typically bypassed when using the default NTP server provided the operating system distributor.

C. Selecting a VPN IP Address Range

The challenging to deploying a VPN is ensuring that the address space does not overlap with that over the environments where it will be used. If there is overlap, users will be unable to connect to the VPN. Doing so will confuse the network stack, because there would be two network interfaces connected to the same address space but not the same network. One potential solution is for a user to run the VPN behind a NAT, like inside a VM behind a VM NAT or a cluster beind a NAT device.

Users of the "Grid Appliance" should not have to concern themselves of these issues. Prior work on the topic by Ala Rezmerita et al. [22] recommended using the experimental address class E ranging between 240.0.0.0 - 255.255.255.254, though this requires Linux kernel modifications. Though with the amount of bugs and security fixes regularly pushed into the kernel, maintaining a forked kernel requires a significant amount of time, duplicating the work already being performed by the OS distribution maintainers. This also limited deployment in physical and cloud machines. Users that wanted to multipurpose a physical resource may not want to run a modified kernel, while in most cloud setups the kernel choice is limited.

We have since moved towards using the 5.0.0.0 - 5.255.255.255 address range. Like the class E address space it is unallocated, but it requires no changes to any operating systems. The only limitation is that some other VPNs also use it, thus a user would not be able to run two VPNs on the same address space concurrently. This approach is much better than providing kernels or dealing with network address overlaps. Interestingly, even with this in place, we still see some "GroupVPNs" using address ranges in normal private network address ranges for the VPN, like 10.0.0.0 - 10.255.255.255 and 192.168.0.0 - 192.168.255.255.

D. Securing the VPN and Overlay

Our original design secured the virtual network through a kernel level IPsec stack. A model kept through our first generation Archer deployment and GroupVPN. The problem with this approach is that securing links of the VPN only partially secures the P2P VPN and using IPsec, which is not trivially configured, to pre-configured environments. Securing the P2P layer is important, otherwise malicious users could easily derail the entire system, but securing with IPsec would practically negate the benefits of the P2P system, because of network configuration issues related to NATs and firewalls.

To address these, we implemented a security system directly into the P2P system, thus securing both VPN and P2P communication. The security filter supports both DTLS and a protocol similar to IPSec. The overheads of using security turned out to be significantly small, as we explored in [11].

E. Towards Unvirtualized Environments

Users comfortable with the system and wanting to dedicate computers to their "Grid Appliance" grid wanted to remove the overheads of using a VM as well as being able extend their compute resources into the cloud. So while, we could create shareable cloud instances, but a physical machine is a little more complicated as it requires specialized non-standard software to create a shareable image. Especially since other machines may have different hardware configurations that may actually prevent reusing a shared image.

Due to requests from users wanting better integration with physical machines and as a result of moving away from stackable file, we move towards creating installable packages. Also, we improved the VPN to support a router mode, whereby a single VPN can be used by many machines inside a LAN. The implications of packages mean that users can easily produce "Grid Appliances" from installed systems or during system installation. While the VPN router allows resources inside a LAN to communicate directly with each other rather than through the VPN. That means if they are on a gigabit network, they can full network speeds as opposed to being limited to 20% of that due to the VPN, this was discussed more in our previous work [23].

F. Advantages and Challenges of the Cloud

We have had the experience of deploying the "Grid Appliance" on three different cloud stacks: Amazon's EC2 [24], Future Grid's Eucalyptus [25], and Future Grid's Nimbus [26].

All of the systems, encountered so far, allow for data to be uploaded with each cloud instance started. The instance can then download the data from a static URL only accessible from within the instance, for example, EC2 user data is accessible at http://169.254.169.254/latest/user-data. A "Grid Appliance" cloud instances can be configured via user-data, which is the the same configuration data used as the virtual and physical machines, albeit zip compressed. The "Grid Appliance" seeks the configuration data by first checking for a physical floppy disk, then in specific directory (/opt/grid_appliance/var/floppy.img), followed by the EC2 / Eucalyptus URL, and finally the Nimbus URL. Upon finding a floppy and mounting it, the system continues on with configuration.

Beyond the use of extending into clouds for on-demand resources, they are also very convenient for debugging. Doing so on Amazon though is not free. Fortunately, grid researchers now can have free access to Future Grid with both Eucalyptus and Nimbus style clouds. We did have to do some tinkering to get these systems to work. First, because the user data is binary data and the communication exchange uses RPC, which may have difficulty handling binary data, it must be converted to base64 before transferring and converted back into binary data afterward. EC2 handles this transparently, if using command-line tools. Unfortunately, Eucalyptus and Nimbus do not, even though Eucalyptus is supposed to be compatible with EC2.

Furthermore, when starting an EC2 instance, networking is immediately available, whereas with Eucalyptus and Nimbus, networking often times takes more than 10 seconds after starting to be available. Thus a startup script must be prepared for networking not to be ready and hence unable to immedately download user data. The best approach to deal with this in a distribution independent manner is to wait until the primary Ethernet device (eth0) has an IP and then continuing.

VIII. RELATED WORK

Existing work that falls under the general area of desktop grids/opportunistic computing include Boinc [27], Bonjour-Grid [7], and PVC [22]. Boinc, used by many "@home" solutions, focuses on adding execute nodes easy; however, job submission and management rely on centralization and all tasks must use the Boinc APIs. BonjourGrid removes the need for centralization through the use of multicast resource discovery; the need for which limits its applicability to local area networks. PVC enables distributed, wide-area systems with decentralized job submission and execution through the use of VPNs, but relies on centralized VPN and resource management.

Each approach addresses a unique challenge in grid computing, but none addresses the challenge presented as a whole: easily constructing distributed, cross-domain grids. Challenges that we consider in the design of our system are ensuring that submission sites can exist any where not being confined to complex configuration or highly available, centralized locations; ability to dynamically add and remove resources by starting and stopping an appliance; and the ability for individual sites to share a common server or to have one or more

per site so that no group in the grid is dependent on another. We emphasize these points, while still retaining the ease of use of Boinc, the connectivity of PVC, and the flexibility of BonjourGrid. The end result is a system similar in organization to OurGrid [28], though whereas OurGrid requires manual configuration amongst sites and networking considerations to ensure communication amongst sites, the "Grid Appliance" transparently handles configuration and organization issues with a VPN to transparently handle network constraints.

IX. CONCLUSIONS

In this paper, we have described a novel grid architecture that enables both wide area and educational grid middleware. Our approach significantly reduces the entry barrier to constructing wide-area grids from scratch. The work required to reproduce a grid system as useful as the one constructed by the "Grid Appliance" is quite significant as illustrated in Section V. We have replaced those requirements through the use of a Web interface that produces configuration files that enable grid resources to automatically acquire security credentials and organize the grid, a P2P VPN that transparently enables all-to-all connectivity, and easy deployment through virtual machines and packages.

Users are welcome to share our public Web interface or deploying their own, from there, they can begin to construct their own grid by establish a group for VPN purposes and appliance subgroups for priority and delegation purposes. With this in place, users of the grid can deploy pre-configured cloud or virtual systems or configure physical resources by adding a package repository and installing the "Grid Appliance" packages, lending itself well to beginners but allowing more options for more power users.

Our results from Section VI show that the process of connecting the resources together is not significantly longer than that of actually starting the resources. Furthermore, we have shown that submission sites have very low overheads in connecting to the resources. The main limitation, which is common to all grids is requirement of a global job queue or server, our future work will focus mechanisms to support completely decentralized grid computing while maintaining the trust and reliability of our current system.

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