

Sequencing Impact at the University of Missouri

Prepared by Bob Schnabel, Scott Givan and Diane Oerly with Input from Researchers across Campus

This document was created to convey why it is necessary for the University of Missouri to provide additional computational capacity and disk storage to support the explosion of data that has been and will continue to be generated by enhancements to high throughput sequencing research. A sustainable funding model is also provided.

Executive Summary

It would be an understatement to say that “next-generation” sequencing technology has been revolutionary. Over the last 10 years, sequencing has created a paradigm shift in biological sciences where more and more a component of research involves “just sequence it”. This is because the types of data, applications and resulting insights are expanding every year. Further, the volume and speed of data generation are growing exponentially, while the costs to generate these data are decreasing exponentially. The Human Genome Project completed the first draft genome sequence in 2001 at an estimated cost of \$3 billion. Next-generation sequencing became mainstream around 2007 and enabled the re-sequencing of a human genome at a cost of approximately \$50,000. In late 2015, Illumina announced the availability of their X10 sequencer for use on non-human samples enabling the re-sequencing of a mammalian (human, cow, dog etc.) genome for approximately \$1,500 and with an annual throughput of 10,000 genomes per year. The ease, rapidity and cost effectiveness of generating sequence data has created a computational analysis bottleneck. The growth of computational resources on the MU campus has not kept pace with the growth in data generation capability.

In order for Mizzou to maintain a competitive research environment, we need to expand the computational resources available for bioinformatics analysis of large data which include sequence data. It will require an initial investment of \$619,000 in early 2016 to build the needed core infrastructure and will require ongoing funding to maintain and expand this infrastructure.

Initial investments (cost share of \$231,000) made by Mizzou in 2005 to bring next-generation sequencing to this campus have been returned many-fold. Based on a survey sent to MU researchers in November 2015, a total of 66 grants have been awarded involving sequencing for a total of \$87.5M. \$7.6M of that is directly attributable to sequence data generation/analysis. In addition, another \$7.9M in grant funding has been submitted and remains pending. This research has led to 173 refereed journal articles in top-tier journals producing over 6,000 citations. Additionally, 19 M.S., 62 Ph.D. and 21 postdocs have been trained as a result of these sequence related research projects. Plant and animal researchers at MU have been at the forefront of the next-generation sequencing revolution. However, based on the diversity of grants and papers gathered by the survey, sequence analysis provides a common foundation that ties together many disciplines on campus. As such, investment in computational capacity directed at sequence data analysis will serve the entire campus and provide technological ties between disciplines.

The following is a detailed description of the history of sequencing/bioinformatics, a description of the computation resources required, and a model for sustainability and an analysis of the impacts of next-generation sequencing at Mizzou.

History of Sequencing at MU

The story of high throughput sequencing at MU is the story of how a small investment can produce enormous success. It started with a proposal to the National Science Foundation (NSF). Ten years ago (August, 2005) MU was awarded a Major Research Instrumentation (MRI) award to purchase Illumina instruments (both genotyping and sequencing) totaling \$925,500. MU's cost share was about \$231,000. The NSF was particularly impressed that the project served BOTH plant sciences and animal sciences and that the shared instrumentation would be housed in MU's DNA Core Facility where it could generate revenue from various other research projects and businesses. The DNA Core Facility staff collaborated with research support computing staff and industry to generate, analyze and distribute the massive quantities of data involved in High Throughput Sequencing (HTS) and genotyping.

This cost share with the NSF led to several significant outcomes including:

- Mark McIntosh was Principal Investigator on a grant from the State of Missouri which contributed \$1.3M in salary support that enabled the creation of MU's **Informatics Research Core Facility**. This revenue generating facility provides bioinformatics data management and support for a variety of researchers. As envisioned, the Director, Scott Givan serves as co-investigator on many of the current research grants. The collaborations strengthen research proposals and facilitate high-throughput sequencing-based projects to a broad base of faculty and staff.
- The US Congress selected MU as the location of the National Center for Soybean Biotechnology (NCSB) <http://www.soybiotechcenter.org/>. Henry Nguyen, of MU's Interdisciplinary Plant Sciences Group who served as PI on the MRI award directs the center. See: <http://soybeangenomics.missouri.edu/personnel/nguyenbio.htm> MU was selected to host the center based on our record of interdisciplinary research on soybean genetics, genomics, and related sciences. The NCSB is a collaborative program among scientists at the University of Missouri, the USDA-ARS Plant Genetics Unit in Columbia, and the Donald Danforth Plant Science Center in St. Louis, MO to provide innovative molecular approaches that can be applied toward soybean improvement. The NCSB's 40+ researchers have expertise in diverse fields including agronomy, microbiology and plant pathology, chemistry, biochemistry, animal science, food science, molecular biology, engineering, computer science, and agricultural economics. Their many successful collaborations include SOYKB – see: <http://engineering.missouri.edu/2015/06/soykb-a-powerful-tool-at-the-junction-of-plant-biology-and-computer-science/>. Scientists working in the NCSB successfully compete for funding from a variety of other sources including the Missouri Soybean Merchandising Council (MSMC), federal agencies, and private industry. For information on their research projects, see: <http://www.soybiotechcenter.org/research/>.
- A historic \$5.6 million gift. In Spring of 2004, MU officials announced a historic donation from one of the nation's top private livestock producers. The David W. Gust family, owners of Circle A Ranch in Iberia, MO donated detailed animal performance data on approximately 6,000 animals, including DNA samples. Jerry Taylor, Curators' Professor and Wurdack Chair in Animal Genomics, who was Co-PI on the MRI award- was able to secure this gift which was heralded as the first such gift to a public institution. See: <http://cafnr.missouri.edu/alumni-files/gratitude/s2004-gratitude.pdf> Animals from this

donation were among the 10,000 animals genotyped on the Illumina genotyping system from the NSF MRI award.

- Mizzou Advantage targeted investment led to the hire of researcher Chris Elsik with the knowledge and skills to support and advance plant AND animal research – <http://mizzouadvantage.missouri.edu/people/christine-elsik/>. Dr. Elsik and her lab collaborate with scientists from around the world performing a fundamental role in gene prediction, organization of community annotation and the analysis of model organism genomes. Her lab <http://genomes.missouri.edu/elsiklab> has developed and maintains the Bovine Genome Database, and the Hymenoptera Genome Database (which includes BeeBase, NasoniaBase and the Ant Genomes Portal). Chris is also highly involved in Missouri's EPSCOR project that has received \$20 million in funding. Note the Research and Accomplishments information at: <http://www.epscormissouri.org/>

The initial Illumina sequencing instruments obtained as part of the NSF MRI grants in 2005/2008 have been replaced as new technology/instruments become available. Currently the DNA Core Facility operates two Illumina Hi-Seq and two Illumina Mi-Seq instruments. The DNA Core has seen exponential growth in its services reflective of the demand for sequencing. (**Fig. 1**). This increased demand for sequencing capacity has been due to an increasing number of funded grants that involve sequence generation.

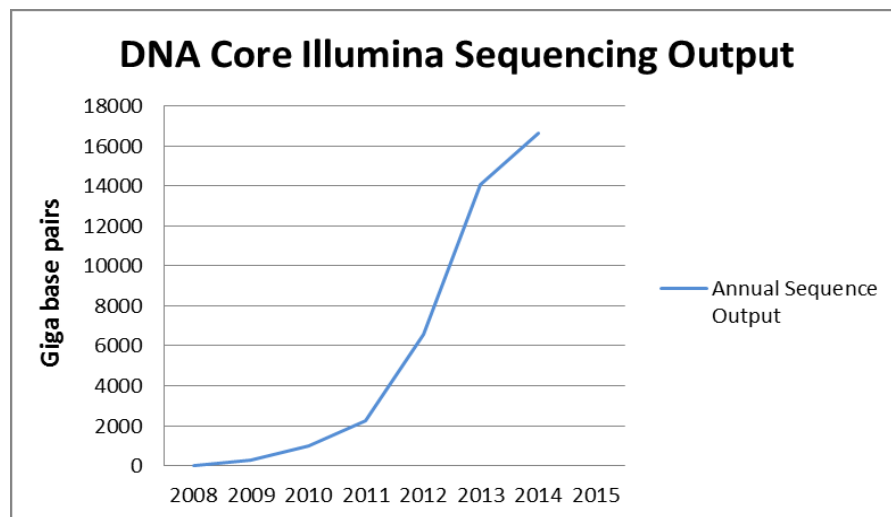


Fig. 1. Exponential growth of sequence data generation at the Mizzou DNA Core facility. <http://biotech.missouri.edu/dnacore/initiateproject.html#>

Impact of Sequencing Technology at Mizzou

To quantify the impact of the DNA Core Facility sequence data generation, in November, 2015, an e-mail questionnaire was sent to Mizzou researchers involved with sequence generation and analysis. The e-mail contained an Excel template for researchers to list grant information, publications and students trained. Responses to this e-mail survey are summarized below.

A total of 66 grants that involve sequence generation/analysis (**Fig. 2**) have been funded since 2001 (detailed in Appendix A). This represents \$87,530,171 in total funding and \$7,647,758 directly attributable to sequence data generation/analysis (Fig. 3 A-B). As previously noted, the DNA Core Facility received its first DNA sequencer in 2008. This enabled researchers to generate preliminary data with which to write additional grants. The result of this acquisition can be seen in **Fig. 3** where a large number of grant dollars in 2011 primarily coming from two grants to the Animal Genomics group: Integrated Program for Reducing Bovine Respiratory Disease Complex in Beef and Dairy Cattle (\$10M) and National Program for the Genetic Improvement of Feed Efficiency in Beef Cattle (\$5M). As detailed in Appendix A, and depicted in **Fig. 1**, the total number of grants, total dollars and dollars attributable to sequence generation have continued to increase year over year which is in part responsible for the exponential growth in sequence generation from the DNA Core Facility.

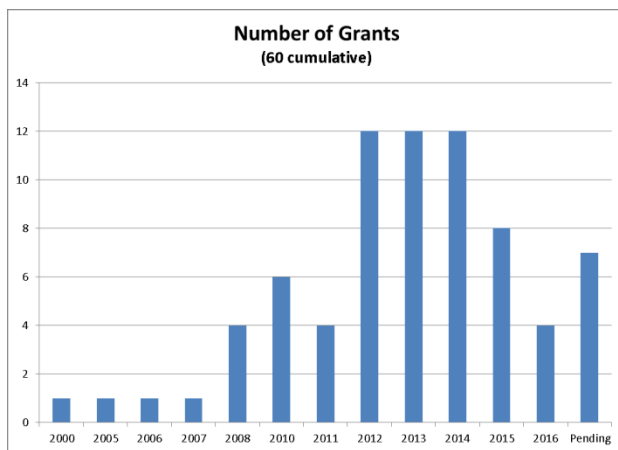


Fig. 2. Number of sequencing related grants funded.

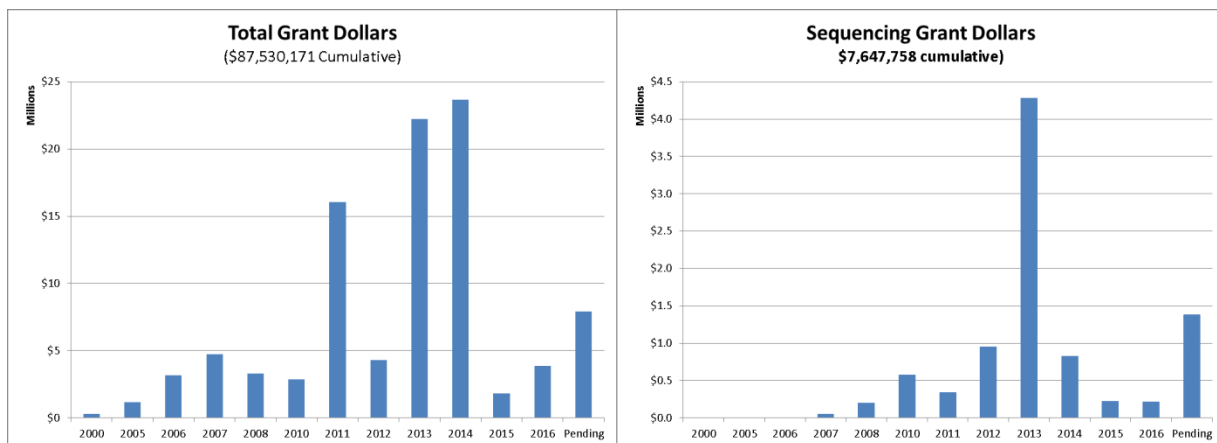


Fig. 3. Total dollars by year (A) and sequencing expenditures (B) for grants received by MU researchers.

The success of MU researchers in competing for grant dollars has also had an impact on the number and quality of peer reviewed papers published. In response to the e-mail survey, researchers provided a list of all publications related to sequencing (**Appendix C**). In order to quantify the impact of these publications, the number of citations per paper and the journal metrics were obtained from Thompson Reuters InCites Journal Citation Reports.

<https://jcr.incites.thomsonreuters.com/JCRJournalHomeAction.action>. A total of 173 papers were submitted that have a combined 6716 citations as of 12/1/2015. As can be seen from **Fig. 4**, the increase in the number of papers coincides with the increase in grants and grant dollars obtained and also the amount of sequence data generated. It is common knowledge that there is a “lag” in citations of several years from the time a paper is published. Given the rapid rise in the number of sequencing papers in the last two years (2014-15), one can extrapolate that the citation counts of these papers in the coming years will be significant and positively impact Mizzou’s AAU metrics.

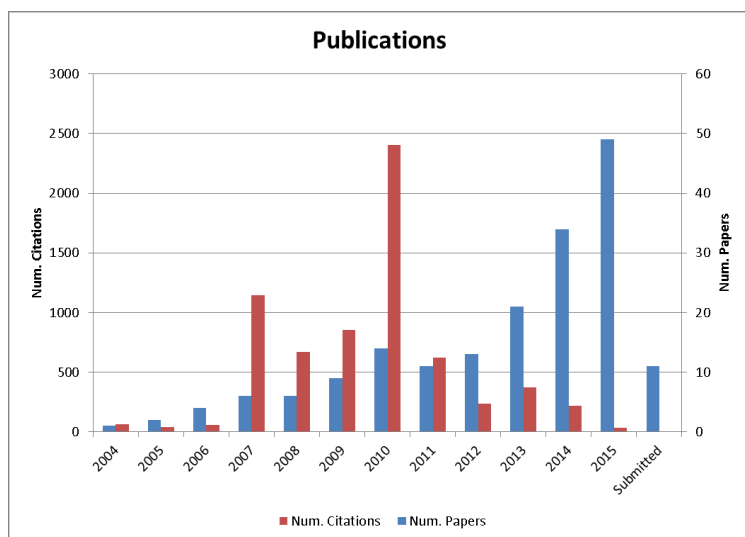


Fig. 4. Total number of sequencing related papers and the numbers of citations.

One paper of particular note is from 2008: Simultaneous SNP discovery and allele frequency estimation by high throughput sequencing of reduced representation genomic libraries. *Nature Methods*. 5:247-252. This was the cover article and currently has 319 citations. This paper is noteworthy because it was the first paper describing the use of next-generation sequencing to directly estimate allele frequencies for the development of a genotyping assay. The assay that was developed was used to genotype over 10,000 cattle samples by the DNA Core Facility using instrumentation acquired from the initial NSF MRI award. The assay itself was marketed by Illumina and has sold over 2 million units worldwide. In 2010, this group received the USDA Secretary’s Honor Award - the highest award given by the USDA. All of this was made possible by the initial investment in the Illumina technology at Mizzou.

The breadth of sequencing related activities is also reflected in the journals that Mizzou researchers have published in (**Appendix B**). The 173 papers were published in 81 journals covering 27 categories/disciplines. Of the 173 papers, 143 (77%) are from journals ranked in the first quartile (Q1) of their discipline with 6% (Q2), 6% (Q3), 4% (Q4) and 5% in journals without a ranking. Sixteen papers were published in nine journals with impact factors >10, again demonstrating the relevance and high impact of sequencing related activities.

Another measure of impact is in the training of graduate students. A total of 16 researchers from 10 departments/divisions indicated that 19 M.S., 62 Ph.D. and 21 postdocs have been trained in

bioinformatics associated with sequence data analysis (**Table 1**). This demonstrates a broad educational impact focused on the common technology of sequence data analysis.

Table 1. Number of students trained in sequence data analysis.

Mizzou PI/Co-I	Dept/Division	Number MS	Number Ph.D.	Number Postdocs
Taylor, JF	Animal Science	4	3	1
Prather, RS	Animal Science	1	2	0
Lyons, LA	Animal Science	1	0	0
Lyons, LA	CVM - VMS	2	0	0
Beerntsen, BT	Veterinary Pathobiology	0	0	1
Xu, D	Computer Science	4	11	3
King, EG	Biological Sciences	1	2	1
Joshi, T	MMI / MUII / CS /IPG	2	3	0
Wall, J	Biochemistry	0	2	2
Spencer, T	Animal Science	0	6	0
Taylor, KH	Pathology and Anatomical Sciences	2	3	0
Stacey, G	Plant Sci/Biochem	1	10	8
Elsik, CG	Animal Science	0	6	0
Johnson, GS	Veterinary Pathobiology	0	3	0
Flint-Garcia, S	USDA-ARS, Div Plant Sci	0	2	2
Pires, JC	Biological Sciences	1	9	3
Total		19	62	21

Informatics Research Core Facility

As mentioned above, the MU Informatics Research Core Facility (IRCF) works extensively with researchers to manage, analyze and visualize high-throughput data. A significant focus of the IRCF is working with Illumina sequence data, both Hi-Seq and Mi-Seq, generated by the MU DNA Core. One measure of IRCF activities is its broad client base. Since 2011, the IRCF has worked closely with nearly 100 research groups. These research groups come from a number of MU colleges and departments, including Biology, Microbiology, Veterinary Medicine, Agriculture and Natural Resources, Chemistry, Biochemistry and the Medical School. The IRCF also has a number of external clients, including from the University of Texas, Montana State University and Virginia Tech. Another measure of the growth of IRCF is the revenue generated by these activities. As illustrated in **Fig. 5**, since 2011, which is the first year that the IRCF charged for services, revenue has grown to over \$100,000 per calendar year.

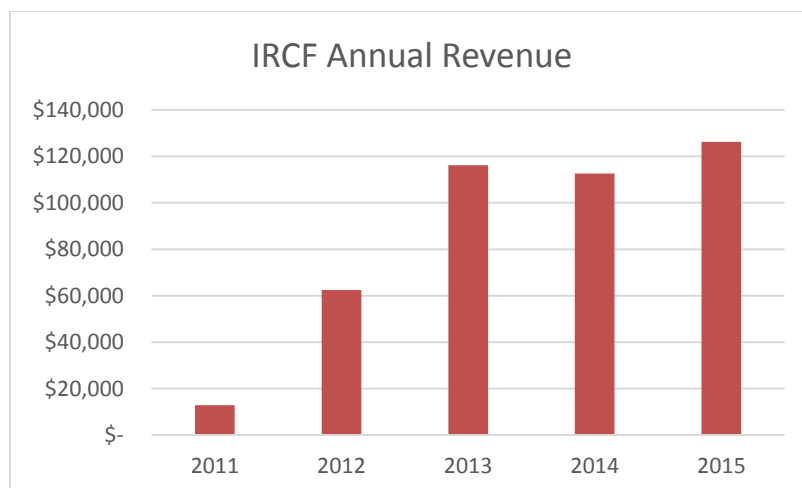


Fig. 5. Annual revenues of the Informatics Research Core Facility demonstrating a rapid increase and sustained demand for services.

Computational Demand

The success of researchers competing for grant dollars has become a double-edged sword. While we have clearly demonstrated the growth of sequencing and its academic impact at Mizzou, the computational resources necessary to continue this growth have been absent. The University maintains a high performance computing (HPC) cluster named **Lewis3** (<https://umbc.rnet.missouri.edu/resources/lewis3.html>). The original **Lewis** cluster was upgraded in 2015 to include 32 compute nodes with 128 GB of memory each and 8 compute nodes with 256 GB of memory each and each compute node has 24 Intel Xeon cores (960 total CPU cores). While this may seem like a large compute system it is actually quite small compared to our peer research institutions. For example, Texas A&M operates several HPC systems, one of which has 16,900 CPU cores <http://sc.tamu.edu/systems/>. Likewise, Iowa State University operates several HPC clusters with over 2,500 CPU cores (<http://www.hpc.iastate.edu/systems>).

HPC systems have traditionally been built based on the characteristics of the type of analyses to be performed. Typically these systems have a large number of compute nodes with a large number of CPU cores but low memory in the range of 12-48 GB/node. For physical sciences (e.g., physics and chemistry), which are generally characterized by extremely large numbers of “small” jobs that individually operate on a small piece of data, the traditional HPC system performs very well. In many cases, an analysis job can be distributed across a large number of nodes/cores.

Bioinformatics analysis, in particular sequence data analysis, has very different compute requirements. Sequence data analysis is characterized by very large input files, even larger intermediary files and most importantly, large memory requirements. These characteristics make sequence analysis on traditional HPC systems either extremely difficult or in most cases impossible. For example, two common analysis pipelines are *de-novo* transcriptome or genome assembly, and error correction. Both often require greater than 256 GB of memory and sometimes as much as 1 TB. The University of Missouri HPC systems generally lack compute nodes capable

of performing these types of analysis. For example, the **Lewis3** cluster only has two compute nodes capable of performing these types of analyses.

The large amount of sequence data generated by Mizzou researchers and the lack of centrally supported high performance computing capable of processing these data have led to the creation of independently acquired and managed systems to handle the sequence data. The Informatics Research Core Facility (IRCF) manages the **BioCluster**, which currently contains 9 servers with a total of 328 processors and 225 TB of storage. The Division of Animal Sciences manages the **MUgenomics** infrastructure which contains 8 servers with a total of 424 CPU cores and 160 TB of storage. While the total CPU count of these systems is smaller than the **Lewis3** system, they are different from **Lewis3** in two very important aspects. The **BioCluster** and **MUgenomics** consist primarily of high memory and high CPU core nodes, most of which have 64 cores and 512 GB memory. These two systems were specifically built to analyze sequence data because the University operated **Lewis** system was incapable of analyzing the sequence data.

The exponential increase in sequence data being generated by an ever increasing number of funded grants demands an investment in a new HPC system designed to meet the computing characteristics of these new data. In order to determine the hardware architecture requirements for a new Informatics HPC we present an analysis of a typical sequence analysis pipeline, variant calling from genomic resequencing.

Sequence Analysis Benchmark

The Broad Institute has created “best practices” guidelines for using the Genome Analysis ToolKit (GATK), which is a widely used analysis pipeline for variant calling <https://www.broadinstitute.org/gatk/guide/best-practices.php>. The GATK best practices pipeline was implemented on the **MUgenomics** infrastructure. The pipeline, as implemented by the Animal Genomics group, consists of 17 steps. Each of these steps has different hardware requirements in terms of CPU, disk and memory usage. In order to characterize each of these steps, a profiler program was written that captures system statistics at 5 second intervals during the entire pipeline throughput and produces a summary plot.

The server used was **MUgenomics07** with 48 cores (4 x 12 core AMD 6348 2.8 GHz) and 512 GB DDR2 1866 RAM. This server is the Postgres database server for the Animal Genomics group and was chosen because of its fast disk storage system to illustrate the I/O requirements of a sequence data pipeline. The storage on this server consists of 30 - 300 GB Seagate 15K rpm SAS2 drives (ST333000657SS) configured as a 4 TB RAID10 array on an Adaptec 78165 controller.

The data used were genomic sequence data from a domestic dog. This dog had approximately 30X of genome sequence coverage of raw data (2 x 100 bp) from the MU DNA Core’s Illumina HiSeq2000 instrument. The gzip compressed input data size was 76.2 Gb. Note that the analysis presented below is part of the Animal Genomics group’s standard pipeline and these figures are available for over 400 animals. This animal was chosen as a representative of the total data processed.

Fig. 6 presents the system characteristics of the pipeline. First, note that it took over 21 hours to process the data for this single animal. This pipeline has been highly optimized and tailored to the **MUgenomics** infrastructure to maximize hardware usage and minimize total run time. This is

representative of a typical 30X mammalian genome using this hardware and this pipeline. The Animal Genomics group has over 400 such animals and if restricted to a single server would require almost a year to process the data. The red peaks in **Fig. 6** are characteristic of multithreaded programs that are able to utilize all available CPU cores and thus these steps of the pipeline are CPU-bound which is nearly half (47.3%) of the total required processing time. The blue peaks in **Fig. 6** are characteristic of stages that have high volumes of disk writes where processed data need to be physically written to storage. High disk I/O (>200 MB/s) represents 33.1% of the total processing time. Finally, stages with elevated disk wait (%wa > 1.0) are illustrated in pink. The I/O wait on this server is generally not an issue due to the high throughput of the storage subsystem. Note that the I/O in blue is relative to the right Y-axis and is in MB/s. A significant portion of processing time is spent performing I/O >200 MB/s and a non-trivial amount of time performing I/O at >800 MB/s. This has profound implications for HPC infrastructure where compute nodes use shared data storage and storage bandwidth needs to be a primary design criteria.

The memory subsystem performance is not presented, although cache and dirty bytes are captured in the profiler. This is because this analysis pipeline has been optimized and requires a compute node with 512 GB memory. The large memory is used for cache and significantly speeds up the entire process.

In summary, compute infrastructure for the analysis of sequence data has drastically different resource requirements than provided by traditional HPC environments. These requirements are characterized by compute nodes with high CPU core counts (>40 but preferably 64), high memory (minimum 512 GB) and very high bandwidth to storage (>200 MB/s sustained for long periods).

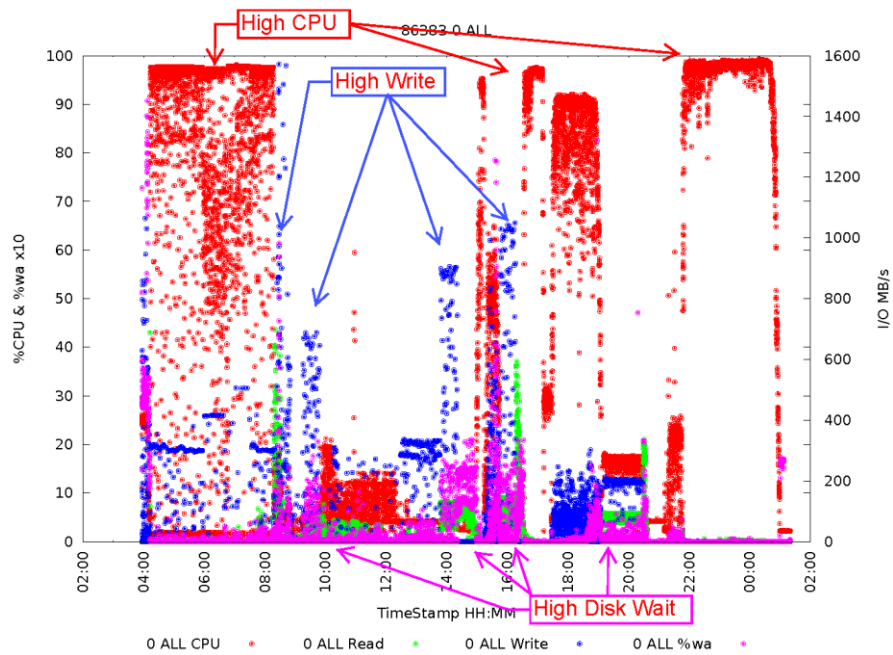


Fig. 6. System profile of the GATK best practices pipeline for variant calling from genomic data.

Key Trends Make Computational Capacity More Critical

The next generation of DNA sequencer will again increase throughputs and lower costs. The implications for Mizzou researchers are significant. A researcher can afford to over-deliver by generating 2-5 times the amount of data that were originally proposed in a sequencing budget. The decrease in cost and increase in data generation make it feasible for researchers to write grants to perform population level analyses. This too will require an increase in the computation required to store, process, and analyze these data. In the past, a lab could process and analyze the data on a small number of machines, for example the **BioCluster** or **MUgenomics** servers. The increased amount of compute power required will be beyond what a single lab can manage and requires an extensive infrastructure to take advantage of multiple nodes to process the data in parallel in order to compute the results in a *competitive time*.

In terms of genomics, a common target is a “1000 Genome Project” for a species. The first Human 1000 genome project was a massive effort <http://www.1000genomes.org/participants>. Similar projects have been completed for most highly-researched species. Of particular interest at Mizzou are the 1000 Bull Genomes project (Taylor, Schnabel, Decker), 1000 Soybean Genomes project (Nguyen, Xu, Joshi), Maize Genome (Flint-Garcia), 1000 Dog Genomes (Johnson, O’Brien, Schnabel, Taylor) and the cat Nine Lives project (Lyons, Gandolfi). Technological advancements have made it possible for an individual lab to conduct their own 1000 Genomes Project for their favorite species. Therefore, considering active projects at Mizzou, a logical short-term target for building a new bioinformatics cluster is the ability to process 1000 genomes in a reasonable timeframe.

A single ongoing analysis on campus requires the processing of about 1000 genomes and consumes roughly 1 million core-hours of compute time. A single 56 core node would take about two years of compute time to complete the required analyses. There is only one machine in the campus cluster (**Lewis3**) with sufficient RAM to complete the analysis but it only has 24 cores. A cluster of 20 such **Lewis3** nodes would reduce the processing time down to about 36 days for this single project.

This proposal is to acquire an initial bioinformatics cluster and establish a sustainable funding model which would enable researchers to directly include the cost of the analysis in their grant funding. Research Computing Support Services has already invested over \$500K in the General Purpose Research Storage to create a sustainable storage environment that allows researchers to easily include the cost of data storage in their grants. The bioinformatics cluster would be built and tuned specifically for the analyses required to process and analyze sequence data.

Description of the Proposed Hardware Infrastructure

The sequencing projects commonly conducted at Mizzou have the structural characteristics described in **Table 2** and result in about 10 million core hours, and a 20 node cluster could compute this in about one year. The cost of the system is described in **Table 3**.

Table 2. Characteristics of proposed 20 node Bioinformatics cluster.

Analysis Type:	# Cores	RAM (GB)	Scratch (TB)	Jobs /Batch	Batches	Length (Day)	# Labs	Core Hours
Alignment/Variant Calling	64	512	1	1000	1	0.75	5	7,680,000
RNA Assembly- Big	64	1024	1	10	2	14	5	2,150,400
RNA Assembly – Small	64	512	1	100	2	0.5	5	768,000

The cost of such a cluster is estimated as having an initial capital investment of \$619,000. Note: that this does not include operational costs such as space, power, cooling, hardware or software support or the expertise to run a High Performance Computing cluster. The division of IT Research Computing Support Services proposes to run the newly acquired cluster as a part of its core mission to provide centralized research computing capability for the campus and the system.

Table 3. Cost characteristics of proposed 20 node Bioinformatics cluster

Item	Cost	Count	Total
Compute Node	\$24,000	20	\$480,000
10/40 Gigabit Switch	\$6,000	1	\$6,000
Rack/Power	\$3,000	1	\$3,000
100TB High Speed Scratch	\$120,000	1	\$120,000
Miscellaneous	\$10,000	1	\$10,000
Total			\$619,000

Sustainability Model

Although some compute infrastructures already exist at Mizzou such as the **BioCluster** and the **MUgenomics** servers, they are not scalable to accommodate the demand of the growing campus community involved in bioinformatics. Computing infrastructure has an inherent lifecycle and must be upgraded and/or replaced. The model we propose involves the University and researchers sharing the costs. Under this model, the University pays for the initial acquisition of a system and researchers “buy-in” by allocating grant money to acquire additional compute nodes, storage and pay for life cycle updates. Recent upgrades of **Lewis3**, the purchase of General Purpose Research Storage and the proposed Bioinformatics cluster investment, position MU to establish a fee structure to make the system sustainable.

Storage

The Research Computing Support Services recently invested over \$500K to implement more than one Petabyte (PB) of disc storage for the University’s General Purpose Research Storage (GPRS). <https://doit.missouri.edu/services/research/general-purpose-research-storage/>.

This service offers a sustainable and flexible research data storage environment at reasonable cost. The Division of IT’s Research Computing staff manage the data storage and will actively recruit

and support additional investments by researchers and other units on campus. GPRS options available to researchers include:

Individual Storage: Individual researchers are given 10 GB of private storage for private use at no charge. Additional storage is allocated in 256 GB increments at the cost of \$10/TB/month.

Project Storage: Storage associated with specific groups of researchers or instruments are allocated on a per project basis. Each project is provided with 10 GB of storage at no charge. Additional storage will be allocated in 256 GB increments at the cost of \$10/TB/month.

Special Project Storage: 50 TB of storage have been designated for special cases where the storage will be provided at a reduced cost or at no charge. These projects are expected to be short exploratory projects or special projects evaluated on a case-by-case basis considering the storage needs (size and duration). Special Projects might include promising exploratory research for short periods of time, exemplary research that has little chance of external funding or needs leading to the likely securing of funding, and other special-use cases as determined by MU's CI Council.

Large Storage Investment: Researchers with larger storage needs can invest in half or multiple entire nodes, around 100 TB per node, for five years of service. Investors receive dedicated access to one (half-node) or two (full-node) 10 Gigabit Ethernet (GbE) network storage ports. Nodes will be taken out of service after five years, but as part of a future storage offering, may be placed in a depreciated storage system.

The GPRS investment and cost structure now make it possible to budget for a project's storage costs during the grant writing process. Prior to the 2015 purchase of the GPRS this was not possible at Mizzou because no such infrastructure existed.

Budgeting the Costs in a Project Proposal

This has not traditionally occurred at Mizzou during the grant writing process because these types of cost templates have not been available. This has been for two reasons: 1) the infrastructure did not exist, and 2) there has not been the volume of data on campus with which to build these models.

The initial investment by the University in the Bioinformatics cluster will provide a baseline for estimating the cost structure associated with providing the required computational capacity in a sustainable way similar to the manner in which the General Purpose Research Storage (GPRS) operates. There are several groups on campus (IRCF, Animal Genomics and Soybean) with experience in managing large volumes of sequence data of multiple varieties such as genomic resequencing, RNA-seq, etc. These groups will create a template that new researchers can use to estimate the storage and computational costs associated with their project. For example, the Animal Genomics group has estimated that the cost to store and process a 30X coverage mammalian genome is approximately \$264. This includes the cost to store the raw and processed data at \$10/TB/mo for five years and the cost of purchasing an additional compute node at \$15,000 amortized over 100 animals. Therefore, if someone was writing a new grant application proposing to sequence 100 genomes they would budget \$26,400 to enable the sustainability of the Bioinformatics cluster and cover the computational costs associated with the research. The computational costs template can be included in the grant budget justification. Funding agencies, in particular, NSF, NIH and USDA routinely require data management plans and expect applicants to budget and make provisions for long-term data storage.

APPENDIX A

Sequencing related grants funded at MU organized by year of funding.

Species	Mizzou PI/Co-I	Dept /Division	Agency	Funding years	Total budget	Sequencing budget	Title
Soybean	Stacey, G	Plant Sci/Biochem	United Soy Board	2000 - 2005	\$300,000		Development of soybean genetics and genomics
Plants	Pires	Biological Science	NSF	2005 - 2011	\$1,176,000		Functional genomics of plant polyploids
Plants	Pires	Biological Science	NSF	2006 - 2011	\$3,170,304		Toward unraveling the morphological plasticity and genome redundancy of Brassica oleracea
Maize	Evans (Stanford)/Givan	MMI	NSF	2007 - 2013	\$4,755,985	\$48,000	Functional Genomics of Maize Gametophytes
	Pires	Biological Science	MU Richard Wallace Research Incentive Grant Award	2008 - 2008	\$4,000		Improving phylogenetic thinking in biology undergraduates
	Pires	Biological Science	NSF	2008 - 2010	\$10,000		COLLABORATIVE RESEARCH: Comparative Investigation of Incipient Sex Chromosome Evolution in the genus Asparagus
	Pires	Biological Science	NSF	2008 - 2011	\$275,093		COLLABORATIVE RESEARCH: From Acorus to Zingiber: Assembling the phylogeny of monocots
Soybean	Stacey, G	Plant Sci/Biochem	NSF	2008 - current	\$3,000,000	\$200,000	Soybean root hairs as a model for single cell systems biology
Human	Taylor K.	Pathology & Anatomical Sciences	Mizzou Advantage	2010 - 2010	\$10,000	\$10,000	Methylation analysis in leukemia
	Pires	Biological Science	MU Research Board	2010 - 2011	\$30,000		Improving DNA barcoding using next-generation sequencing
Human	Taylor K.	Pathology & Anatomical Sciences	NIH	2010 - 2015	\$750,000	\$130,600	Towards defining the functional methylome in acute lymphoblastic leukemia
Dog	Johnson/O'Brien	Veterinary Medicine	Internal funding	2010 - current	\$300,000	\$300,000	Mizzou Comparative Canine Sequencing
Dog	O'Brien	Veterinary Medicine	Mizzou Advantage	2010-2010	\$70,000	\$70,000	Whole genome sequencing of an animal model of cerebral cortical dysplasia: Developing the next generation of genomics for human and animal health
Human trophoblast	Roberts/Ezashi	Animal Sciences	NIH	2010-2015	\$1,717,855	\$60,000	Pluripotent stem cells as models for normal and diseased trophoblast NIH R01 HD67790

Species	Mizzou PI/Co-I	Dept /Division	Agency	Funding years	Total budget	Sequencing budget	Title
	Pires	Biological Science	NSF	2011 - 2013	\$14,951		DISSERTATION RESEARCH: Systematics of the Order Brassicales and Family Brassicaceae, and comparative genomic analyses (nuclear and organellar genomes): a phylogenomic approach
Cow	Taylor	Animal Science	USDA/AFRI	2011 - 2016	\$10,000,000	\$150,000	Integrated Program for Reducing Bovine Respiratory Disease Complex in Beef and Dairy Cattle
Cow	Taylor	Animal Science	USDA/AFRI	2011 - 2016	\$5,000,000	\$180,000	National Program for the Genetic Improvement of Feed Efficiency in Beef Cattle.
Metagenomic	Bryda		NIH	2011 - 2016	\$1,038,598	\$10,000	Rat Resource and Research Center
Mouse	Cummings/Givan		MU Research Board	2012 - 2013	\$69,576	\$16,992	Characterizing 5-HT and GABA Receptor Expression in 5-HT Deficient Mice
Varroa mite	Elsik	Animal and Plant Sciences	USDA/AFRI	2012 - 2013	\$124,066	\$124,066	Genome Characterization of the Mite Varroa destructor, the Primary Pest of Honey Bees.
Mosquito	Beerntsen	Veterinary Medicine	Internal funding	2012 - 2013	\$18,000	\$17,610	Mosquito Innate Immunity: From Immune Recognition Proteins to Signaling Pathways
	Pires	Biological Science	NSF	2012 - 2013	\$14,999		Phylogeny and evolution of the Brassica crops and wild relatives (tribe Brassiceae, Brassicaceae): morphological diversity and homoplasy
Bacteria	Wall	Biochemistry	Discovery Project from DOE LBNL-SFA	2012 - 2014	\$60,000	\$12,000	Development of 3' RNA-seq for Quantifying Transcript End Sites
Mosquito	Beerntsen	Veterinary Medicine	Research Board	2012 - 2014	\$62,186	\$55,600	Mosquito Immunity: Pathogen Recognition to Signaling
Human	Taylor K.	Pathology & Anatomical Sciences	Hyundai	2012 - 2015	\$250,000	\$38,500	Elucidating the role of DNA methylation in pediatric ALL relapse
Hymenopteran Insects	Elsik	Animal and Plant Sciences	USDA/AFRI	2012 - 2015	\$392,685	\$196,000	Mining Hymenoptera Genomes for Functional Sequences
	Pires	Biological Science	NSF	2012 - 2015	\$468,844		Phylogenomics of polyploidy in the Brassicales
Cow	Elsik	Animal and Plant Sciences	USDA/AFRI	2012 - 2015	\$660,451	\$330,000	The Next Generation Bovine Genome Database
Sheep	Spencer	Animal Science	USDA/AFRI	2012 - 2016	\$499,000	\$40,000	Physiological Roles of Hydroxysteroid (11-beta) Dehydrogenases and Cortisol in Early Pregnancy
Cow	Spencer	Animal Science	NIH	2012 - 2017	\$1,700,000	\$120,000	System biology approach to understand endometrial receptivity & pregnancy loss
Cat	Lyons/Gandolfi	Veterinary Medicine & Surgery	Winn Feline Foundation	2013 - 2014	\$30,552	\$25,000	9 Lives Cat Genome Sequencing Initiative

Species	Mizzou PI/Co-I	Dept /Division	Agency	Funding years	Total budget	Sequencing budget	Title
Dog	O'Brien/Johnson	Veterinary Medicine	Poodle Club of America Foundation	2013 - 2014	\$15,000	\$12,000	Applying Whole Genome Sequencing to Identify the Mutation Responsible for Polymicrogyria in Standard Poodles.
Cat	Lyons/Gandolfi	Veterinary Medicine & Surgery	Donation	2013 - 2014	\$70,000	\$70,000	Unrestricted gift
Sheep	Conant	Animal Science	USDA/AFRI	2013 - 2015	\$124,000	\$80,000	Improving Profitability and Sustainability of Sheep Production
Soybean	Nguyen/Xu/Joshi	Plant Science/CS/MUII/MMI/PG	United Soybean Board	2013 - 2015	\$869,000	\$300,000	Large Scale Sequencing of Germplasm to Develop Genomic Resources for Soybean Improvement
Cow	Patterson	Animal Science	USDA/AFRI	2013 - 2016	3,000,000	\$504,000	Identification and management of alleles impairing heifer fertility while optimizing genetic gain in Angus cattle
Bacteria	Xu	Computer Science	USDA	2013 - 2016	\$450,000	\$100,000	Prediction and Control of the Performance of Anaerobic Digestion of Animal Manure through Metagenomics for Renewable Energy
Cow	Elsik	Animal and Plant Sciences	USDA/AFRI	2013 - 2016	\$499,876	\$250,000	Web-Based Tools for Curation and Display of Locus-Specific Alternate Assemblies
Maize	Buckler PI (Cornell)/Flint-Garcia (Mizzou)	Plant Sciences/USDA	NSF	2013 - 2018	\$12,500,000	\$2,685,000	Biology of rare alleles in maize and its wild relatives
Cow	Spencer	Animal Science	USDA/AFRI	2013 - 2018	3,000,000	\$150,000	Improving Fertility of Dairy Cattle Using Translational Genomics
Human	Ezashi, Schust/Schulz	Animal Science/Ob Gyn	NIH	2013 - 2018	1,592,565	\$24,000	Pluripotent Stem Cells: Modeling syncytiotrophoblast development and pathogenesis
Cat	Lyons/Gandolfi	Veterinary Medicine & Surgery	Endowment	2013 - current	\$80,000	\$80,000	Gilbreath McLorn Endowment of Comparative Medicine
	Pires	Biological Science	USDA	2014 - 2015	\$13,240		Genomic diversity among morphotypes of Brassica rapa vegetable accessions
Dog	O'Brien/Johnson	Veterinary Medicine	Black Russian Terrier Club of America	2014 - 2015	\$12,000	\$6,000	Identification of the Mutation Responsible for Juvenile Laryngeal Paralysis & Polyneuropathy in Black Russian Terriers
Cat	Lyons/Gandolfi	Veterinary Medicine & Surgery	National Geographic	2014 - 2015	\$70,000	\$72,000	Sequencing the genomes of twelve cats
	Pires	Biological Science	MU Research Board	2014 - 2015	\$24,922		The evolution of grass photosynthesis
Mouse	Spencer	Animal Science	NIH	2014 - 2016	\$415,250	\$40,000	Biological Role of Endometrial Glands in Uterine Function
Human	Taylor K.	Pathology & Anatomical Sciences	Gift	2014 - 2016	\$28,444	\$15,000	Palmer Histiocytosis Research

Species	Mizzou PI/Co-I	Dept /Division	Agency	Funding years	Total budget	Sequencing budget	Title
	Pires	Biological Science	Mizzou Advantage	2014 - 2016	\$65,269		The evolution of grass photosynthesis: applications for food and sustainable energy
Mosquito	Franz	Veterinary Pathobiology	NIH	2014 - 2016	\$275,000	\$20,000	Transgenic resistance of <i>Aedes aegypti</i> to the four serotypes of dengue virus
Brassica (cabbage, kale, cauliflower etc)	Pires	Biological Sciences	NSF	2014 - 2017	2,179,716	\$400,000	Ploidy and plasticity in the crop Brassicas
Bacteria	Wall	Biochemistry	DOE LBNL SFA	2014 - 2017	\$530,000	\$30,000	Rapid deduction and comparative genomics of survival mechanisms of metal-reducing microbes
Soybean	Walker/Elsik	Animal and Plant Sciences	NSF	2014 - 2019	\$20,000,000	\$190,000	The Missouri Transect: Climate, Plants, and Community
Cat	Lyons/Gandolfi	Veterinary Medicine & Surgery	MUGiveDirect	2014 - current	\$50,000	\$50,000	Direct donations for cat sequencing.
Human	Taylor K.	Pathology & Anatomical Sciences	BTCF foundation	2015 - 2016	\$59,000	\$20,000	Acute lymphoblastic leukemia research
Fruit Fly	Hagen	Animal Science	MU Research Council	2015 - 2016	\$9,890	\$9,890	Analysis of non-coding RNA in <i>Wolbachia</i> induced cytoplasmic incompatibility
	Pires/Conant	Biological Science/Animal Science	NSF	2015 - 2016	\$15,329		DISSERTATION RESEARCH: C4 Photosynthetic Evolution; Subtypes, Diversity, and Function within the Grass Tribe Paniceae
Bacteria	Wall	Biochemistry	Mizzou Advantage	2015 - 2016	\$149,954	\$15,000	Genetic Requirements for Biofilm Formation of <i>Desulfovibrio vulgaris</i> Hildenborough
Cow	Hagen	Animal Science	MU Research Board	2015 - 2016	\$48,000	\$42,000	Genome-wide DNA methylation in Bovine LOS
Human	Bashkin (UMSL)/Givan	MMI	UM IDIC	2015 - 2016	\$100,000	\$50,000	Prevention of Cervical Cancer: Footprinting Anti-HPV Drug-DNA Interactions in Live Cells Using Gamma Ray-Generated Hydroxyl Radicals and Next-Generation DNA Sequencing
Sheep	Spencer	Animal Science	USDA/AFRI	2015 - 2019	\$452,000	\$60,000	Biological Roles of Exosomes/Microvesicles in Conceptus Elongation and Uterine Interactions During Early Pregnancy
Metagenomic	Franklin	Veterinary Pathobiology	NIH	2015 - 2020	\$986,454	\$25,000	The Mutant Mouse Resource and Research Center (MMRRC) at the University of Missouri
Mouse	Spencer	Animal Science	NIH	2016 - 2018	\$422,124	\$20,000	Generation of a Transgenic Mouse Model to Study Uterine Gland Function
Bacteria	Taylor/Schnabel	Animal Science	USDA/AFRI	2016 - 2019	\$499,993	\$18,500	A novel in silico approach to GWAS for enhanced resistance to bacterial mastitis in dairy cattle

Species	Mizzou PI/Co-I	Dept /Division	Agency	Funding years	Total budget	Sequencing budget	Title
Sheep	Spencer	Animal Science	USDA/AFRI	2016 - 2021	1,700,000	\$150,000	Exosomes/microvesicles: Novel Mediators of Uterine Receptivity and Conceptus-Maternal Interactions
Human	Taylor K.		NIH	2016 - 2021	1,250,000	\$25,000	Functional analyses of differentially methylated regulatory elements in leukemia

APPENDIX B

Summary of peer reviewed journal activity. Shaded journals have an impact factor > 10.

Journal Name	Num. Papers	Impact Factor	Category	Rank/total	Quartile
Acta Veterinaria Scandinavica	1	1.377	Veterinary Sciences	36/133	Q2
American Journal of Physiology-Regulatory, Integrative and Comparative Physiology	1	3.106	Physiology	25/83	Q2
Animal Genetics	1	2.207	Agriculture, Dairy & Animal Science	3/57	Q1
Applied and Environmental Microbiology	2	3.668	Biotechnology & Applied Microbiology	34/163	Q1
Archives of Virology	1	2.390	Virology	18/33	Q3
Artificial Intelligence in Medicine	1	2.019	Computer Science, Artificial Intelligence	40/123	Q2
Bioinformatics	2	4.981	Biochemical Research Methods	8/79	Q1
Biology of Reproduction	4	3.318	Reproductive Biology	5/30	Q1
BMC Bioinformatics	4	2.576	Biochemical Research Methods	34/79	Q2
BMC Evolutionary Biology	1	3.368	Evolutionary Biology	17/46	Q2
BMC Genomics	18	3.986	Biotechnology & Applied Microbiology	26/163	Q1
BMC Plant Biology	2	3.813	Plant Sciences	22/204	Q1
BMC Systems Biology	1	2.435	Mathematical & Computational Biology	13/57	Q1
BMC Veterinary Research	1	1.777	Veterinary Sciences	21/133	Q1
Cancer Research	1	9.329	Oncology	11/211	Q1
Cellular Reprogramming	2	1.788	Cell & Tissue Engineering	17/21	Q4
Cold Spring Harbor Symposia on Quantitative Biology	1	0.856	Biochemistry & Molecular Biology	224/261	Q4
Crop Science	1	1.575	Agronomy	23/81	Q2
DNA Research	1	5.477	Genetics & Heredity	23/167	Q1
Epigenetics	3	4.780	Biochemistry & Molecular Biology	56/290	Q1
FASEB JOURNAL	1	5.043	Biochemistry & Molecular Biology	50/290	Q1
Frontiers in Microbiology	1	3.989	Microbiology	27/119	Q1
Frontiers in Plant Science	2	3.948	Plant Sciences	19/204	Q1
Functional Plant Biology	1	3.145	Plant Sciences	34/204	Q1
Genes and Development	1	10.798	Cell Biology	16/184	Q1
Genetics	4	5.963	Genetics & Heredity	21/167	Q1
Genome	1	1.424	Biotechnology & Applied Microbiology	114/163	Q3
Genome Biology	3	10.381	Biochemistry & Molecular Biology	5/163	Q1
Genome Biology and Evolution	1	4.229	Evolutionary Biology	9/46	Q1
Genome Research	5	14.630	Biochemistry & Molecular Biology	4/290	Q1
Human Genomics	1	2.146	Genetics & Heredity	105/167	Q3

Journal Name	Num. Papers	Impact Factor	Category	Rank/total	Quartile
International Journal of Data Mining and Bioinformatics	1	0.495	Mathematical & Computational Biology	56/57	Q4
International Journal of General Systems	1	1.637	Computer Science, Theory & Methods	18/102	Q1
Investigative Ophthalmology and Visual Science	1	3.404	Ophthalmology	7/57	Q1
Journal of Animal Science	1	2.108	Agriculture, Dairy & Animal Science	5/57	Q1
Journal of Bioinformatics and Computational Biology	2	0.783	Mathematical & Computational Biology	48/57	Q4
Journal of Experimental Botany	3	5.526	Plant Sciences	12/204	Q1
JOURNAL OF PROTEOME RESEARCH	1	4.245	Biochemical Research Methods	14/79	Q1
Journal of Reproduction and Development	1	1.515	Agriculture, Dairy & Animal Science	13/57	Q1
Journal of Veterinary Internal Medicine	4	1.879	Veterinary Sciences	17/133	Q1
Molecular Breeding	1	2.246	Agronomy	14/81	Q1
Molecular Genetics and Genomics	1	2.728	Biochemistry & Molecular Biology	144/290	Q2
Molecular Genetics and Metabolism	2	2.625	Biochemistry & Molecular Biology	149/290	Q3
Molecular Plant Pathology	1	4.724	Plant Sciences	16/204	Q1
MOLECULAR PLANT-MICROBE INTERACTIONS	1	3.944	Plant Sciences	20/204	Q1
Molecular Psychiatry	1	14.496	Biochemistry & Molecular Biology	5/290	Q1
Molecular Reproduction and Development	2	2.527	Biochemistry & Molecular Biology	159/290	Q3
Nature	2	41.456	Multidisciplinary Sciences	1/57	Q1
Nature Communications	1	11.470	Multidisciplinary Sciences	3/57	Q1
Nature Genetics	1	29.352	Genetics & Heredity	2/167	Q1
Nature Methods	1	32.072	Biochemical Research Methods	1/79	Q1
Neurobiology of Disease	2	5.078	Neurosciences	39/252	Q1
New Phytol	1	7.672	Plant Sciences	6/204	Q1
Nucleic Acids Research	8	9.112	Biochemistry & Molecular Biology	20/290	Q1
PHYSIOLOGICAL ENTOMOLOGY	1	1.416	Entomology	31/92	Q2
Physiological Genomics	3	2.374	Cell Biology	128/184	Q3
Plant Biotechnology Journal	3	5.752	Biotechnology & Applied Microbiology	15/163	Q1
Plant Cell	3	9.338	Plant Sciences	4/204	Q1
Plant Genetic Resources-Characterization and Utilization	1	0.580	Plant Sciences	165/204	Q4
Plant Journal	2	5.972	Plant Sciences	10/204	Q1
Plant Physiology	4	6.841	Plant Sciences	8/204	Q1
Plant Science	1	3.607	Plant Sciences	27/204	Q1
PLoS Biology	1	9.343	Biochemistry & Molecular Biology	17/290	Q1
PLoS Genetics	4	7.528	Genetics & Heredity	14/167	Q1

Journal Name	Num. Papers	Impact Factor	Category	Rank/total	Quartile
PLoS Neglected Tropical Diseases	1	4.446	Parasitology	5/36	Q1
PLOS ONE	19	3.234	Multidisciplinary Sciences	9/57	Q1
Proceedings of the National Academy of Sciences USA	5	9.674	Multidisciplinary Sciences	4/57	Q1
Proceedings of the Royal Society B: Biological Sciences	1	5.051	Biology	8/85	Q1
RNA-A PUBLICATION OF THE RNA SOCIETY	1	4.936	Biochemistry & Molecular Biology	53/290	Q1
Science	1	33.611	Multidisciplinary Sciences	2/57	Q1
Science of the Total Environment	1	4.099	Environmental Sciences	18/223	Q1
World Mycotoxin Journal	1	2.157	Mycology	13/24	Q3
Asian J. Plant Pathology	1				
Current Opinion in Insect Science	1				
G3: Genes Genomes Genetics	2				
Genome Announcements	1				
International Journal of Bioinformatics Research and Applications	1				
International Society for Microbial Ecology Journal	1				
Journal of Computer and Science Technology	1				
The Journal of Physiology	1				
Theoretic Applied Genetics	1				

APPENDIX C

Sequencing Research Related Publications

Submitted (10)

Valliyodan B, Qiu D, Patil G, Zeng P, Huang J, Dai L, Chen C, Zeng L, **Joshi T**, Song L, Vuong T, Musket T, **Xu D**, Shannon JG, Shifeng C, Liu X, Nguyen HT. Landscape of genomic diversity and trait discovery in soybean. 2015. *Submitted*.

Liu Y, Khan SM, Wang J, Chen S, Rynge M, Wang J, Maldonado dos Santos JV, Valliyodan B, Merchant N, **Nguyen HT**, **Xu D**, **Joshi T**. PGen: Large-Scale Pegasus Workflow for Genomic Variation Analysis in SoyKB. Bioinformatics Application Notes. 2015 *Submitted*.

Oswaldo Valdés-López, Josef Batek, Nicolas Gomez'Hernandez, Ning Zhang, **Trupti Joshi**, **Dong Xu**, Kim K, Hixson, Karl K, Weitz, Joshua T. Aldrisch, Ljiljana Paša-Tolic and **Gary Stacey**. Soybean root hairs grown under heat stress show global changes in their transcriptional and proteomic profile. *Frontiers in Plant Science*. 2015 *Submitted*.

Lyons, L.A., Creighton, E.K., Alhaddad, H., Beale, H.C., Grahn, R.A., Rah, H., Maggs, D.J., Helps, C.R., and **Gandolfi, B.** (2015). Whole Genome Sequencing Identifies an AIPL1 Variant in Persian Cats as a New Model for Leber's Congenital Amaurosis. *Submitted*.

Gandolfi, B., Alamri, S., Darby, W.G., Adhikari, B., Lattimer, J.C., Malik, R., Wade, C.M., **Lyons, L.A.**, Cheng, J., Bateman, J.F., McIntyre, P., Lamande, S.R., and Haase, B. (2015). A dominant TRPV4 variant implicated in osteochondrodysplasia of Scottish fold cats. *Submitted*.

Bickhart DM, L Xu, JL Hutchison, JB Cole, DJ Null, SG Schroeder, J Song, JF Garcia, TS Sonstegard, CP Van Tassell, **RD Schnabel**, **JF Taylor**, HA Lewin, and GE Liu. 2015. The tandem distribution pattern of cattle CNV facilitates its population genetic analyses. *DNA Res*. *Submitted*.

Taylor JF, LK Whitacre, JL Hoff, PC Tizioto, **JW Kim**, **JE Decker** and **RD Schnabel**. 2015. Lessons from cattle genome and transcriptome sequencing. *Genet Sel Evol* *Submitted*.

Forde N, Maillo V, O'Gaora P, Simintiras CA, Sturmey RG, Ealy AD, **Spencer TE**, Gutierrez-Adan A, Rizos D, Lonergan P. Sexually dimorphic gene expression in male and female bovine conceptuses at the initiation of implantation. *Proc Natl Acad Sci USA*; *Submitted*.

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Emma L Ivansson, Kate Megquier, Sergey V Kozyrev, Eva Murén, Izabella Baranowska Körberg, Ross Swofford, Michele Koltookian, Noriko Tonomura, Rong Zeng, Ana L Kolichski, Liz Hansen, Martin L Katz, Gayle C Johnson, Gary S Johnson, Joan R Coates, Kerstin Lindblad-Toh. Variants within SP110 modify risk of canine degenerative myelopathy: a model for amyotrophic lateral sclerosis. *Nature Communications*, *Submitted*.

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Liu, Z, J Cook, S Melia-Hancock, K Guill, **C Bottoms**, A Garcia, O Ott, RJ Nelson, J Recker, P Balint-Kurti, S Larsson, N Lepak, E Buckler, L Trimble, W Tracy, MD McMullen, and **SA Flint-Garcia**. Expanding maize genetic resources with pre-domestication alleles: maize-teosinte introgression populations. (2016) *The Plant Genome*. doi: 10.3835/plantgenome2015.07.0053

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Whitacre LK, PC Tizioto, **JW Kim**, TS Sonstegard, LJ Alexander, JF Medrano, **RD Schnabel**, **JF Taylor** and **JE Decker**. 2015. What's in your next-generation sequence data? An exploration of unmapped DNA and RNA sequence reads from the bovine reference individual. *BMC Genomics* 16: 1114.

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- Brooks KE, **Spencer TE**. Biological roles of interferon tau (IFNT) and type I IFN receptors in elongation of the ovine conceptus. *Biol Reprod* 2015; 92(2):47. citations 1.
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