# BEAGLE Imputation in SVS for Human and Animal SNP Data

<mark>0???1?1?01</mark>1??1?0

<u>1???</u>1?1?011??1?0

<mark>0</mark>???1?1?011??1?0

<mark>1???1?1?</mark>011??1?0

January 11, 2017

Gabe Rudy VP Product & Engineering









# **3** Why BEAGLE and Value of BEAGLE in SVS

# 4 Live Demo and Questions







# **Questions?**

Use the Questions pane in your GoToWebinar window

| <ul> <li>Question</li> </ul> | ons                | 12 ×  |
|------------------------------|--------------------|-------|
| Show /                       | Answered Questions |       |
| х                            | Question           | Asker |
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| Ask Ques                     | tions Here         | ~     |
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**F** 

Golden Helix is a global bioinformatics company founded in 1998.





Filtering and Annotation Clinical Reports Pipeline: Run Workflows



Variant Warehouse Centralized Annotations Hosted Reports Sharing and Integration GWAS Genomic Prediction Large-N-Population Studies RNA-Seq CNV-Analysis

SNP &



# **Over 300 customers globally**

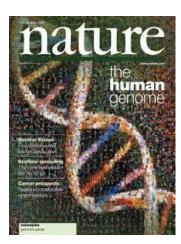


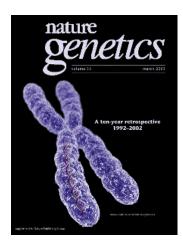


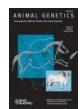
# **Cited in over 1000 peer-reviewed publications**



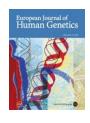






















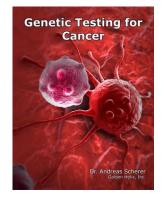




When you choose a Golden Helix solution, you get more than just software

- REPUTATION
- TRUST
- EXPERIENCE





- INDUSTRY FOCUS
- THOUGHT LEADERSHIP
- COMMUNITY

- TRAINING
- SUPPORT
- RESPONSIVENESS





- TRANSPARENCY
- INNOVATION and SPEED
- CUSTOMIZATIONS



# Why Imputation

## Fill in Missing Genotypes

- Improve quality of GT calls

## Harmonizing Arrays

 Facilitate meta-analyses that combine studies genotyped on different sets of variants

## Increase Genotypes

- Increase the power and resolution of genetic association studies
- Find candidate susceptibility variants to guide fine-mapping

### **Typical imputation scenario**

|                               | 0 | 0 | 1 | 11    | 0 0              | 1 | 1 | 0 0   | 0 | 11  | 1 |            |
|-------------------------------|---|---|---|-------|------------------|---|---|-------|---|-----|---|------------|
| HapMap or                     | 0 | 0 | 0 | 00    | 1 1              | 1 | 0 | 1 1   | 1 | 00  | 1 | Reference  |
| 1,000 Genomes                 | 1 | 1 | 1 | 11    | 0 0              | 0 | 1 | 00    | 0 | 00  | 0 | haplotypes |
|                               | 1 | 0 | 1 | 10    | 0 0              | 1 | 1 | 1 1   | 1 | 00  | 1 |            |
| ←                             |   |   |   | -+-+- | + +              |   |   | -+-+- |   | -+  |   | <br>•      |
|                               | 1 | ? | ? | 2 ?   | ? 0              | ? | ? | ??    | 0 | 1 ? | 1 |            |
|                               | 1 | ? | ? | ? 1   | ? 0              | ? | ? | ??    | ? | 0 ? | 0 |            |
|                               | 0 | ? | ? | ? 1   | ? 1              | ? | ? | ??    | 1 | 0 ? | 1 |            |
| Cases and                     | 1 | ? | ? | ? 2   | ? 0              | ? | ? | ??    | 0 | 1 ? | 1 | Study      |
| controls typed<br>on SNP chip | ? | ? | ? | ? 2   | 0 ?              | ? | ? | ??    | 0 | 0 ? | 0 | genotypes  |
| on SNP chip                   | 1 | ? | ? | ? 1   | ? 1              | ? | ? | ??    | 1 | 0 ? | ? |            |
|                               | 0 | ? | ? | 2 ?   | <mark>?</mark> 0 | ? | ? | ??    | 0 | 1 ? | 1 |            |
|                               | 1 | ? | ? | ? 1   | ? 1              | ? | ? | ??    | 1 | 1 ? | 2 |            |
|                               |   |   |   |       |                  |   |   |       |   |     |   |            |



# **Evolution of Imputation Methods**



#### IMPUTE

- June 2007

#### **BEAGLE v1**

- Nov 2007

#### **BEAGLE v3**

- Feb 2009

#### **IMPUTE2**

- June 2009

#### IMPUTE2 (v2.3)

- 2011 / 2013

#### **BEAGLE v4**

- V4.0 Dec 2015
- V 4.1 Jul 2016



A new multipoint method for genome-wide association studies by imputation of genotypes nature renetics

Jonathan Marchini<sup>1,2</sup>, Bryan Howie<sup>1,2</sup>, Simon Myers<sup>1</sup>, Gil McVean<sup>1</sup> & Peter Donnelly<sup>1</sup>

Rapid and Accurate Haplotype Phasing and Missing-Data Inference for Whole-Genome Association Studies By Use of Localized Haplotype Clustering

Sharon R. Browning\* and Brian L. Browning\*

A Unified Approach to Genotype Imputation and Haplotype-Phase Inference for Large Data Sets of Trios and Unrelated Individuals

IHG

Brian L. Browning<sup>1,\*</sup> and Sharon R. Browning<sup>1</sup>

### A Flexible and Accurate Genotype Imputation Method for the Next Generation of Genome-Wide Association Studies PLOS GENETICS

Bryan N. Howie<sup>1<sup>n</sup></sup>, Peter Donnelly<sup>1,2</sup>, Jonathan Marchini<sup>1</sup>\*

# Genotype Imputation with Thousands of Genomes

#### Bryan Howie,<sup>\*,1</sup> Jonathan Marchini,<sup>\*,1</sup> and Matthew Stephens<sup>\*,†</sup> \*Department of Human Genetics and <sup>†</sup>Department of Statistics, University of Chicago, Chicago, Illinois 60637, and <sup>‡</sup>Department of Statistics, University of Oxford, Oxford OX1 3TG, United Kingdom

## Genotype Imputation with Millions of Reference Samples

Brian L. Browning<sup>1,2,\*</sup> and Sharon R. Browning<sup>2</sup>



# Value of Integrated BEAGLE

## Integrated and Supported

- Don't need to run command line tools
- Supported fully and integrates into the rest of your SVS analytics

## Leverage SVS Data Management

- Import your SNP data from any source (PLINK, Illumina, Affy etc)
- Also can import VCF

## Handles NGS Variants as Well as SNPs

- BEAGLE 4.1 only reads VCFs with strict formatting requirements

### Error while running BEAGLE for genotype imputation

Error while running **BEAGLE** for genotype imputation I am trying to run **BEAGLE** 4.1 for an imputation run run. I have core exome chip **data** on variants of 20th chromosome in BED/BIM/FAM format, which I phased convert option in it. But, now when I try to run a **BEAGLE** imputation run by this: java -jar beagle.jar gt=test by hshabbeer.09

#### Phasing genotype per chromosomes in Beagle software

chromosomes in **Beagle** software I want to use **beagle** to phase my genotyped per chromosome, my **data** is in AB bgl missing=? out=Myrun, I am not getting phase **data** per chromosomes and I am also expecting the program by somakina

#### A: Background information and recommendations for phasing ASW whole genomes

You wouldn't need to re-phase the 1KG *data*, just tell *BEAGLE* to use it as a reference panel. by Zev.Kronenberg

#### Beagle 4.1 error : Possible data conversion issue

**Beagle** 4.1 error : Possible **data** conversion issue Hi, I have PLINK format **data** (PED/MAP) and I wanted to VCF so that I can input it in **BEAGLE** 4.1 to phase them, as **BEAGLE** only use VCF format. I wanted a trivial ran **beagle** (gt) on the input its giving me Java exceptions/errors. Its not a problem with **beagle** jar sample VCF format **data** downloaded from 1000Genomes. However, when I convert the **data** to VCF using PLINK PLINK and then use it as **BEAGLE** 4.1 input, then it doesn't like it. It'd be great if anyone can by aritra90

#### converting vcf to haploview with keep phasing

after haplotype phasing with *beagle* v4, now i have vcf (phased file *data*) file. but i don't know how phasing while converting. previous version of *beagle* software (v3.2) for haplotype inferring was good by goreishi

### Phasing Data With Beagle

Phasing Data With Beagle Hey I need phased genotype data for another statistic I want to calculate and and I decided to phase my data with BEAGLE. Before even starting to phase I extracted with PLINK the can just phase this data set or hether youw ould recommend keeping the whole data set (all markers) but by Tim

### BEAGLE 4.1 imputation

**BEAGLE** 4.1 imputation Hi all, I am new to the field of imputation. I am trying to use **BEAGLE** v4.1 to could be the target **data** for the imputation? 3. If I have a multiple target **data** sets, how can I do a a imputation of all of them with same reference **data** set at a time? 4. How to check the strand inconsistencies inconsistencies between reference and target **data**? If inconsistency occurs, how to make them consistent? Thank by cholingken

## BioStars.org Questions on using BEAGLE





# **Strand Consistencies and SNPs vs Variants**

- Arrays Genotypes use Platform-Specific Allele Encoding
  - Illumina and Affymetrix defined their own "referenceindependent" strand encodings
- Sometimes Can Keep A/B Encoding
  - Different Arrays from Same Vendor
- Sometimes Have Mapping to Human Reference
- Otherwise...

| Unsort              |                  | G 43467       | G 43468       | G 43469        |  |
|---------------------|------------------|---------------|---------------|----------------|--|
| Map Sample          |                  | SNP_A-8427496 | SNP_A-2179932 | SNP_A-2207425  |  |
| C                   | hromosome        | 1             | 1             | 1<br>164314302 |  |
|                     | Position         | 164309029     | 164312048     |                |  |
|                     | Cytoband         | q24.1         | q24.1         | q24.1          |  |
| d                   | bSNP RS ID       | rs6672167     | rs7524575     | rs10800181     |  |
| Ass                 | sociated Gene    | LOC284685     | LOC284685     | LOC284685      |  |
|                     | Strand           | -             | +             | -              |  |
| Strand Versus dbSNP |                  | reverse       | same          | reverse        |  |
| Refer               | ence Alleles A/B | [A/T]         | [A/G]         | [C/T]          |  |
| -                   | Top Alleles      | [T/A]         | [A/G]         | [G/A]          |  |
| Bo                  | ottom Alleles    | [A/T]         | [T/C]         | [C/T]          |  |
| 775                 | NA19722          | A_A           | A_B           | A_B            |  |
| 776                 | NA19723          | A_A           | B_B           | B_B            |  |
| 777                 | NA19724          | A_A           | A_B           | A_B            |  |
| 778                 | NA19725          | A_A           | A_B           | B_B            |  |
| 779                 | NA19726          | A_A           | B_B           | B_B            |  |

| Recode Genotype Column Data by Allele Name    |                       |  |  |  |  |  |
|---|-----------------------|--|--|--|--|--|
| Recoue Genotype Column Data by Allele Name    |                       |  |  |  |  |  |
| O Flip DNA strands for AGCT encoded genotypes |                       |  |  |  |  |  |
| Transcode AB to AGCT encoding using mapping:  |                       |  |  |  |  |  |
| Marker map field in format 'A/B':             | Reference Alleles A/B |  |  |  |  |  |
| O Transcode using allele mapping:             |                       |  |  |  |  |  |
| Marker map field in format 'A:G B:T'          | Chromosome 🔻          |  |  |  |  |  |



# **Recode SNPs to Variants**

**F** 

- Select the RSID Map Field
- Select a dbSNP Annotation Track
- For each SNP we:
  - Look up the SNP
  - Pull the allele frequency if present
  - Match your variants to the allele frequency, or the Major => Ref
  - Recode alleles (AB => AGCT)
- Note this allows "lifting over" an older NCBI36 (hg18) snp data to GRCh37 (hg19)
  - Also provides the Reference alleles required DNA-Seq analysis
  - Take advantage of new OMIM/CADD/OncoMD premium annotations



| Recode SNPs to Variants   | _             | o x          |
|---------------------------|---------------|--------------|
| rsID Marker Map Field:    |               |              |
| dbSNP RS ID               |               | -            |
| Variant Source:           |               |              |
| 🕍 dbSNP 147, NCBI         |               | Select Track |
| Create New Spreadsheet as | Child of:     |              |
| Project root              | O Current spr | readsheet    |
|                           |               |              |
|                           | Ōĸ            | Cancel       |

| Unsort |                       | G 12         |   | Unsort                  |                     | <b>G</b> 11   |  |
|--------|-----------------------|--------------|---|-------------------------|---------------------|---------------|--|
| Мар    | 1ap sub SNP_A-4290489 |              | 1 | Мар                     | Markers             | SNP_A-4290489 |  |
|        | Chromosome            | 22           |   | Chromosome              |                     | 22            |  |
|        | Position              | 15268900     |   |                         | Position            | 15268900      |  |
|        | Cytoband              | q11.1        |   |                         | Reference           | G             |  |
|        | dbSNP RS ID           | rs5748616    |   |                         | Alternates          | С             |  |
|        | Associated Gene       | LOC100128190 |   | Cytoband<br>dbSNP RS ID |                     | q11.1         |  |
|        | Strand                | -            |   |                         |                     | rs5748616     |  |
|        | Strand Versus dbSNP   | reverse      |   | Associated Gene         |                     | LOC100128190  |  |
| 1      | GSM233256_GSM233257   | B_B          |   | 1                       | GSM233256_GSM233257 | C_C           |  |
| 2      | GSM233258_GSM233259   | B_B          | / | 2                       | GSM233258_GSM233259 | C_C           |  |
| 3      | GSM233260_GSM233261   | B_B          |   | 3                       | GSM233260_GSM233261 | C_C           |  |
| 4      | GSM233262_GSM233263   | B_B          |   | 4                       | GSM233262_GSM233263 | C_C           |  |
| 5      | GSM233264_GSM233265   | B_B          |   | 5                       | GSM233264_GSM233265 | C_C           |  |
| 6      | GSM233266_GSM233267   | A_B          |   | 6                       | GSM233266_GSM233267 | G_C           |  |
| 7      | GSM233268_GSM233269   | A_B          |   | 7                       | GSM233268_GSM233269 | G_C           |  |

# **Creating a Reference Panel**

# **C**

- Saves to local ImputeRefPanels folder
  - Saves as TSF, relocatable
  - Uses current Project Genome

## Allele Encoding

- Recode to Reference/Alternate of reference sequence if possible
- If within same platform, alleles are matched alphabetically between reference and target samples

## Imputed Data will use:

- Column Headers
- Optional Map Fields

| Create Imputation F            | Reference Panel   | _              | - 🗆          | ×      |  |  |  |  |
|--------------------------------|---|----------------|--------------|--------|--|--|--|--|
| 565 samples and 131059 markers |   |                |              |        |  |  |  |  |
| Options Advanced               |   |                |              |        |  |  |  |  |
| Reference Panel Out            | out Options   |                |              |        |  |  |  |  |
| Folder: ImputationRe           | <u>efPanels</u>   | Reset          | Browse       | ····   |  |  |  |  |
| Base Name:                     | 500К НарМар   |                |              |        |  |  |  |  |
| Project Genome:                | Homo sapiens (Human), G   | RCh37 hg19 (Fe | b 2009)      |        |  |  |  |  |
| Allele Encoding:               | Alphabetically (A/B)  | O Referen      | ce / Alterna | ates   |  |  |  |  |
| Included Map Fields:           | Cytoband<br>dbSNP RS ID<br>Associated Gene<br>Strand<br>Strand Versus dbSNP<br>Reference Alleles A/B<br>Top Alleles<br>Bottom Alleles<br>Flank<br>Probe Count |                |              |        |  |  |  |  |
| Number of concurre             | Chromosome<br>mosome enables parrallele<br>ent runners (cores):   |                |              | Cancel |  |  |  |  |



# **Running Imputation**

- Select from detected references
- Detects Allele Encoding
- Impute Regionally
  - For targeted regions
- Optionally output GT Probabilities
  - Also drop low-prop GTs

## Advanced

- BEAGLE Parameters
- Trade off time vs accuracy

|     | Ge  | notype Imputation     | with BEAGLE              |                   |           | _                  |         | × |  |  |  |
|-----|---|-----------------------|--------------------------|-------------------|-----------|--------------------|---------|---|--|--|--|
| 350 | 1500 samples and 388709 markers   |                       |                          |                   |           |                    |         |   |  |  |  |
| C   | Options Advanced  |                       |                          |                   |           |                    |         |   |  |  |  |
|     | Reference Panel   |                       |                          |                   |           |                    |         |   |  |  |  |
|     | Folder: ImputationRefPanels Browse  |                       |                          |                   |           |                    |         |   |  |  |  |
|     | Pr  | oject Genome Filter:  | Homo sapiens (Human), G  | RCh37 g1k (Feb 20 | 09)       |                    |         |   |  |  |  |
|     |   |                       | Name                     | # Samples         | # Markers | Modified           | romosom |   |  |  |  |
|     | 1   | chr22                 |                          | 2504              | ?         |                    | 22      |   |  |  |  |
|     | 2   | Small Panel           |                          | 181               | 1355      | 2017-01-06         | 22      |   |  |  |  |
|     | Only impute to ref markers within       1000000         Output       Output   |                       |                          |                   |           |                    |         |   |  |  |  |
|     |   |                       | RLMM WTCCC SNP - After Q |                   | 0.0       |                    |         |   |  |  |  |
|     | Sp  | readsheet as child of |                          | ect Root          | Οa        | urrent Spreadsheet |         |   |  |  |  |
|     | <ul> <li>Output Spreadsheet with per-Genotype Probabilities</li> <li>Set genotype to missing if genotype probability is less than 0.85</li> <li>Split Output by Chromosome</li> <li>Outputting by chromosome enables parrallele processing.</li> <li>Number of concurrent runners (cores):</li> </ul> |                       |                          |                   |           |                    |         |   |  |  |  |
|     | Help     Restore Options▼     Save Options▼   |                       |                          |                   |           |                    |         |   |  |  |  |





## 85 Million Variants in Phase3

- 2504 Samples
- Extremely expensive to phase
- BEAGLE v4 Pre-Phased
  - Per-Chr VCF files
  - Place in ImputeRefPanels folder
- Use Regional Window!
  - Use option

GOLDEN HELX

Accelerating the Quest for Significant

| chr1.1kg.phase3.v5a.vcf.gz      |
|---------------------------------|
| chr1.1kg.phase3.v5a.vcf.gz.tbi  |
| chr2.1kg.phase3.v5a.vcf.gz      |
| chr2.1kg.phase3.v5a.vcf.gz.tbi  |
| chr3.1kg.phase3.v5a.vcf.gz      |
| chr3.1kg.phase3.v5a.vcf.gz.tbi  |
| chr4.1kg.phase3.v5a.vcf.gz      |
| chr4.1kg.phase3.v5a.vcf.gz.tbi  |
| chr5.1kg.phase3.v5a.vcf.gz      |
| chr5.1kg.phase3.v5a.vcf.gz.tbi  |
| chr6.1kg.phase3.v5a.vcf.gz      |
| chr6.1kg.phase3.v5a.vcf.gz.tbi  |
| chr7.1kg.phase3.v5a.vcf.gz      |
| chr7.1kg.phase3.v5a.vcf.gz.tbi  |
| chr8.1kg.phase3.v5a.vcf.gz      |
| chr8.1kg.phase3.v5a.vcf.gz.tbi  |
| chr9.1kg.phase3.v5a.vcf.gz      |
| chr9.1kg.phase3.v5a.vcf.gz.tbi  |
| chr10.1kg.phase3.v5a.vcf.gz     |
| chr10.1kg.phase3.v5a.vcf.gz.tbi |
| chr11.1kg.phase3.v5a.vcf.gz     |
| chr11.1kg.phase3.v5a.vcf.gz.tbi |
| chr12.1kg.phase3.v5a.vcf.gz     |
| chr12.1kg.phase3.v5a.vcf.gz.tbi |

 $\sim$ 

Name

| Date modified    | Туре     | Size       |
|------------------|----------|------------|
| 1/5/2017 2:03 PM | GZ File  | 737,074 KB |
| 1/5/2017 2:00 PM | TBI File | 205 KB     |
| 1/5/2017 2:04 PM | GZ File  | 788,570 KB |
| 1/5/2017 2:00 PM | TBI File | 217 KB     |
| 1/5/2017 2:04 PM | GZ File  | 671,966 KB |
| 1/5/2017 2:01 PM | TBI File | 179 KB     |
| 1/5/2017 2:04 PM | GZ File  | 690,066 KB |
| 1/5/2017 2:01 PM | TBI File | 173 KB     |
| 1/5/2017 2:47 PM | GZ File  | 599,745 KB |
| 1/5/2017 2:44 PM | TBI File | 162 KB     |
| 1/5/2017 2:49 PM | GZ File  | 624,556 KB |
| 1/5/2017 2:44 PM | TBI File | 154 KB     |
| 1/5/2017 2:49 PM | GZ File  | 557,489 KB |
| 1/5/2017 2:45 PM | TBI File | 143 KB     |
| 1/5/2017 2:49 PM | GZ File  | 520,870 KB |
| 1/5/2017 2:45 PM | TBI File | 131 KB     |
| 1/5/2017 2:49 PM | GZ File  | 408,758 KB |
| 1/5/2017 2:45 PM | TBI File | 109 KB     |
| 1/5/2017 2:49 PM | GZ File  | 475,940 KB |
| 1/5/2017 2:45 PM | TBI File | 121 KB     |
| 1/5/2017 3:03 PM | GZ File  | 466,314 KB |
| 1/5/2017 3:00 PM | TBI File | 121 KB     |
| 1/5/2017 3:03 PM | GZ File  | 453,060 KB |
| 1/5/2017 3:00 PM | TBI File | 120 KB     |

## **Example Workflows**

- GWAS Follow Up
- Harmonize Cases and Controls
- Animal Genomics







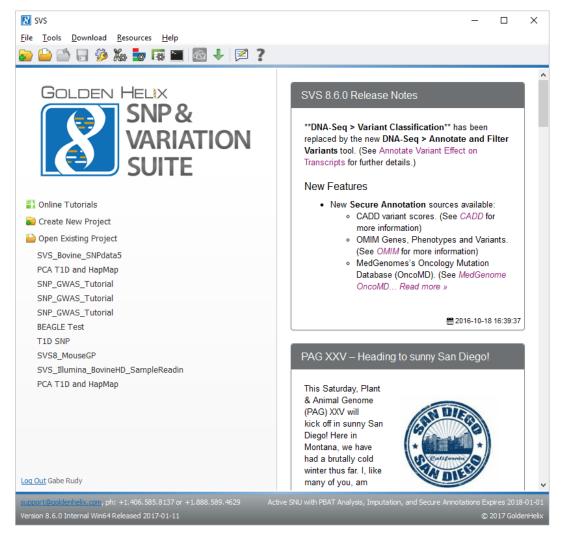
# GOLDEN HELIX SNP & VARIATION SUITE

[Demonstration]

# Upcoming in SVS 8.7



- Recode SNPs to Variants
- BEAGLE Genotype Imputation
- PhoRank Gene Ranking
  - Phenotypes are linked to genes through HPO and GO ontologies
- Various Polish Items





# Questions or more info:

- Email info@goldenhelix.com
- Request an evaluation of the software at <u>www.goldenhelix.com</u>



