# **Bulk Flows in Theory and Practice**

**Rick Watkins** 

July 5, 2016

Willamette University Salem, Oregon



# **Bulk Flow Theory**

- Can only measure radial component  $s_i = \vec{v}_i \cdot \hat{r}_i$
- Individual velocities typically have absurdly large uncertainties
- Uncertainty in zero-point of distance relations or Hubble constant can lead to systematic error in velocities
- Velocity field only linear on large scales

## Weighted Average to Reduce Uncertainty:

General Velocity Moments defined as

$$U_n \equiv \sum_i w_{n,i} \ s_i$$

Weights can be chosen to

- Minimize Uncertainty
- Estimate Standardized Flow (i.e. comparable between surveys)
- Match Physical Definition (*e.g.* integral of velocity over spherical volume)
- Probe *P*(*k*) in particular way (*e.g.* focus on large, linear, scales)
- Minimize dependence on the value of  $H_o$

or a combination of these.

Bulk flow as integral of velocity field over spherical volume

$$\vec{U} = \int_{sphere} \vec{v} \ d^3x$$

For *ideal* survey (uniform, no errors)

$$w_{n,i} = \frac{\hat{r}_i \cdot \hat{r}_n}{r^2}$$

are the weights to estimate  $U_n$  (see Nusser 2014)

Weights should also have an uncertainty dependence.

#### Maximum Likelihood Method

- Minimizes uncertainty in Bulk Flow
- Bulk Flow estimate not comparable between surveys

## Minimum Variance Method

- Estimate Standardized Bulk Flow (Comparable between surveys)
- Constraints easily incorporated
- Uncertainty cost not very high.

## **Statistics Aside**

Distance Modulus  $\mu \sim \log(r)$  has Gaussian errors, not distance r

Standard Estimator:

$$v_e = cz - H_o r_e$$

Biased and non-Gaussian errors

New, Improved Estimator:

$$v_e = cz \log(cz/H_o r_e)$$

Unbiased and Gaussian errors  $\Rightarrow$  proper cancellation of errors (See Watkins & Feldman 2015)

#### Unbiased:

$$\begin{array}{ll} \langle v_e \rangle &=& -cz \left( \langle \log(H_o r_e) \rangle - \log(cz) \right) \\ &=& -cz \left( \log(H_o r) - \log(cz) \right) \\ &=& -cz \left( \log(cz - v) - \log(cz) \right) \\ &=& -cz \left( \log(1 - v/cz) \right) \\ &\approx& v \end{array}$$

assuming  $v/cz \ll 1$  which it true for most galaxies and clusters.

<u>Gaussian Distributed Errors</u> since  $\propto$  distance modulus  $\mu$ 

- Velocity perturbations enhanced on large scales relative to density perturbations,  $P_v(k) = P(k)/k^2$ , so peculiar velocities can tell us things that densities can't.
- We only know the theoretical *variance* of the bulk flow components. The only way to reduce this variance is to go to large scales. To have a possibility of getting a greater than  $3\sigma$  result need to have  $\sigma \sim 100$  km/sec per component.

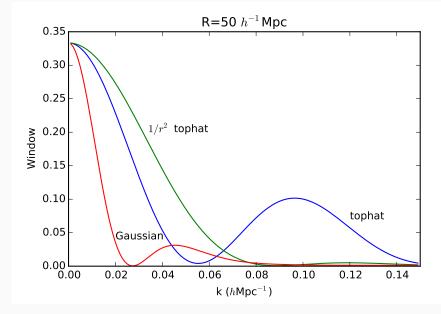
Advantage of Velocity Moments:

Easy to calculate angle-averaged Window Function W(k) for  $U_n$  such that

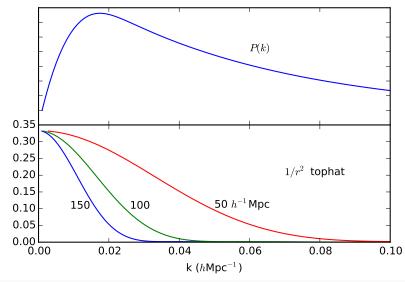
$$\langle U_n^2 \rangle = \int_0^\infty P(k) W(k) \, dk$$

• W(k) tells us precisely what scales  $U_n$  probes.

## Window Functions



## Window Functions



## **Minimum Variance Method**

$$U_n = \sum_i w_{n,i} s_i$$

Determine weights  $w_{n,i}$  that minimize  $\langle (U_n - u_n)^2 \rangle$ , where  $u_n$  is velocity moment that would be measured by an ideal survey with desired radial distribution.

- Need to assume a velocity power spectrum.
- Uncertainty cost over Maximum Likelihood estimator generally small.
- Easy to incorporate *constraints* using Lagrange multipliers, *e.g.* normalization condition.

see Watkins, Feldman, & Hudson (2009) and Feldman, Watkins, & Hudson (2010)

MV method weights survey objects in order to probe space in same way as ideal survey.

- Objects in oversampled (undersampled) regions will be down(up)-weighted.
- Ensures that results won't be biased to reflect regions where there is more information, *e.g.* at small distances.

Contribution to  $U_n$  from change in zero-point or Hubble constant  $\propto \sum_i w_{n,i} cz_i$  (assuming new estimator).

Suggests constraint:

$$\sum_i w_{n,i} \ cz_i = 0$$

Creates moments  $U_n$  that are <u>independent</u> of choice of  $H_o$  or zero-point.

#### How to determine positions of objects for MV method?

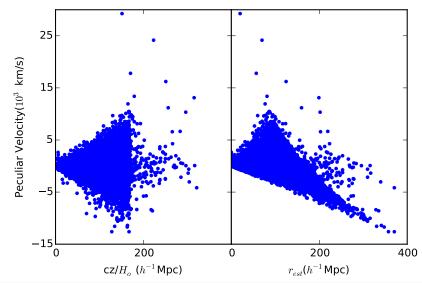
<u>Redshift</u> as distance indicator <u>Distance</u> as distance indicator

$$r_{cz} = cz/H_o = r - v/H_o$$
  $r_{meas} = r + \delta r$ 

- For reasonably distant objects  $v/H_o \ll \delta r$
- Reduces Malmquist biases

## *cz* vs. *r*<sub>meas</sub> as Distance Indicator:

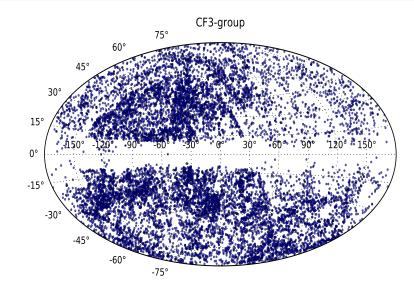


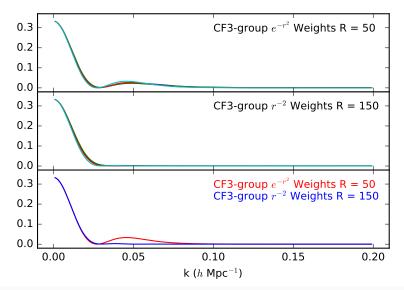


# New Results: Measuring Bulk Flows using CosmicFlows-3

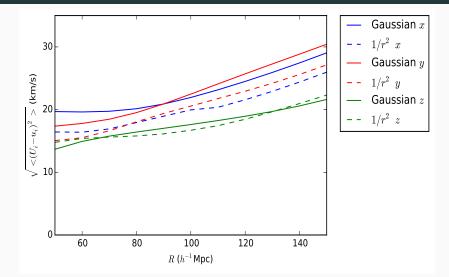
- Used 11,878 individual galaxies and groups of galaxies
  - Addition of 6dFGS, etc.  $\Rightarrow$  Distribution  $\underline{not}$  isotropic.
- Used  $cz/H_o$  as distance estimate
- Used new velocity estimator  $v = cz \log(cz/H_o)$
- Used new constraint to make independent of choice of  $H_o$
- Used both Gaussian Ball and  $1/r^2$  tophat ideal surveys

## **CosmicFlows3: Galactic Coordinates**





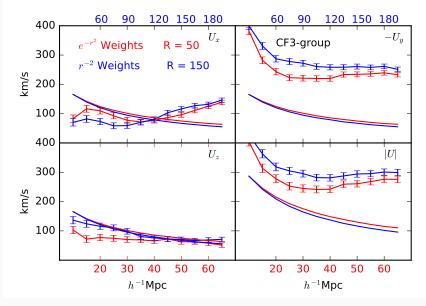
## Expected difference with Ideal Survey: $\sqrt{\langle (U_i - u_i)^2 \rangle}$



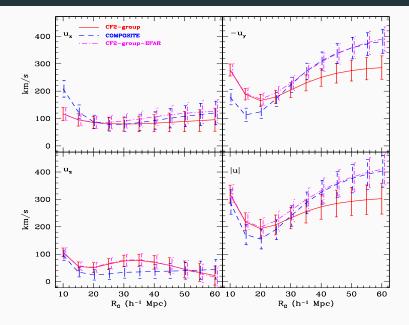
Better match to ideal case with  $1/r^2$  tophat weighting

- More desirable window function.
- Smaller  $\sigma$  for Bulk Flow Moments
- Better match to realistic surveys.
- Matches intuitive physical definition of Bulk Flow

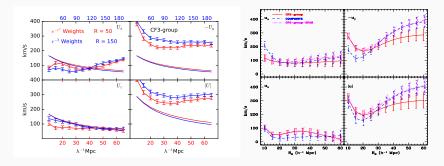
## New Results from the CF3



## **Compare to Previous Results**



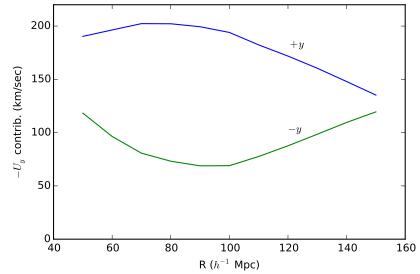
## **Compare to Previous Results**



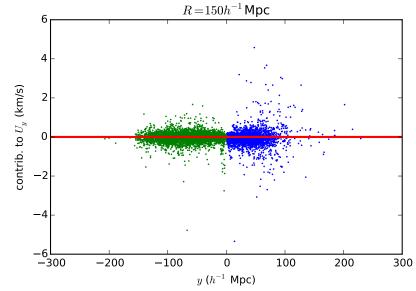
#### Key Results for CF3:

- Bulk Flow doesn't increase with distance.  $\ddot{\smile}$
- Generally lower amplitude Large Scale Flow
- <u>But</u>...still doesn't fall off as fast as expected.

## +y vs. -y contributions

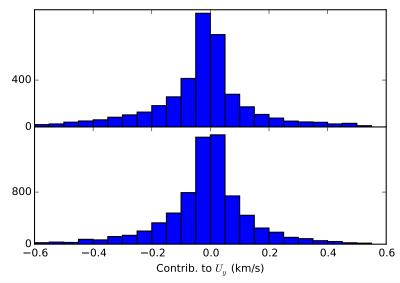


## Contribution to $U_y$ for each object $c_i = w_i s_i$



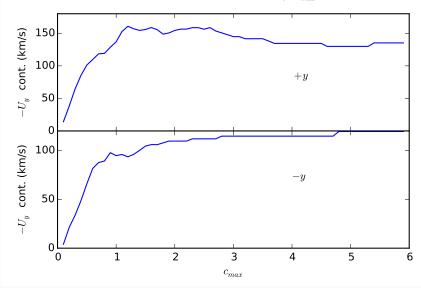
## Contribution to $U_y$ for each object $c_i = w_i s_i$

 $R = 150 h^{-1} \operatorname{Mpc}$ 

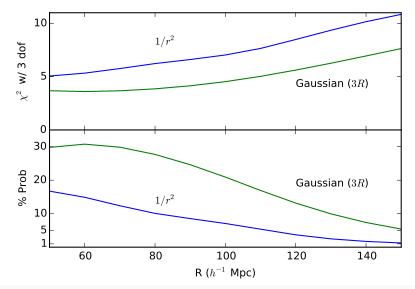


## Sum of contributions to $U_y$ with $c_i < c_{max}$

Sum of contributions with  $c_i < c_{max}$ 



## $\chi^2$ with 3 degrees of freedom



- CF3 catalog gives bulk flow w/ more "reasonable" *R* dependence.
- Smaller bulk flow on Large scales:  $\sim$  300km/s for  $R = 150 h^{-1} {\rm Mpc}$  for  $1/r^2$  weights
- Still "Tension" with Standard Cosmological Model:  $\sim 1\%$  Prob. for  $1/r^2$  weights w/  $R = 150h^{-1}$ Mpc
- Need more distance measurements in +y direction