## RECONSTRUCTING THE ACCRETION HISTORY OFTHE GALACTIC STELLAR HALO FROM CHEMICALABUNDANCE RATIO DISTRIBUTIONS (CARDs)

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# Reconstructing the Galaxy's Accretion History <br> <br> Simulations of Halo Accretion 

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Credit: James Bullock

Reconstructing the Galaxy's Accretion History

## Simulations of Halo Accretion



Reconstructing the Galaxy's Accretion History
Observations of Hierarchical Merging


- Stellar halo "substructure" found using star counts
- Dynamical models can be applied to "extract" recent accretion history
- "Phase mixing" limits the scope of dynamical modeling (no streams)


## Reconstructing the Galaxy's Accretion History

## Motivation


green - halo
blue - low mass dSph
red - Sgr
cyan-LMC
(data compilation from
Geisler et al, 2007)
$\star$ Observations indicate that dwarf galaxies lie "unique" locations in chemical abundance ratio distribution (CARD) space

## Reconstructing the Galaxy's Accretion History

## Theory: Accretion Events are recorded in the Halo's Chemical Abundance Ratio Distributions

- "Chemical Tagging" - First envisioned as a means of tracing disk evolution (Freeman \& Bland-Hawthorn 2002; Bland-Hawthorn \& Freeman 2004)

- Observations reveal trends in 2-D metallicity-space
$\Rightarrow$ Metallicity distributions of satellites are correlated with their accretion time \& mass

Reconstructing the Galaxy's Accretion History


## Reconstructing the Galaxy's Accretion History

Models: Accretion Events \& the Halo's CARD

- Can we reconstruct the accretion history of the Galactic halo from stellar distributions in 2-D metallicity-space?

Accretion Time [Gyrs] $\rightarrow$ O.I dex errors for mock obs.


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## Reconstructing the Galaxy's Accretion History

## Summary of Method

- Construct satellite template sets (STS) to use in generative mixture models of "MW-like" halos
- We apply the EM algorithm to simulated halo accretion data using STS
$\uparrow$ Obtain estimates for the rel. contributions to the total luminosity of each simulated halo



## Reconstructing the Galaxy's Accretion History

## Parameterizing Accretion History

$$
F\left(x_{n}\right)=\sum A_{i} * F_{i}\left(x_{n}, M_{s a t}, t_{a c c}\right) ; \sum A_{i}=1
$$

$F\left(x_{n}\right)$ => distribution of observed halo stars in C-space ( $\mathrm{n}=\#$ of tracked elements)
$A_{i}=>$ accretion history of the halo
$F_{i}\left(x_{n}, M_{s a t}, t_{a c c}\right)=>$ chemical abundance [ratio] distributions of models of dwarfs/accreted systems

Use the Expectation-Maximization Algorithm to determine model contributions to the simulated halos

## Reconstructing the Galaxy's Accretion History

## Evaluating our EM Estimates

$$
\langle\mathrm{FoE}\rangle=\sum_{j=1}^{m} w_{j} \cdot \mathrm{FoE}_{j}
$$

"Factor-of-Error" values $(\mathrm{FoE})=$ the $\max \left(\mathrm{A}_{E M} / \mathrm{A}_{\mathrm{T}}, \mathrm{A}_{T} / \mathrm{A}_{\mathrm{EM}}\right)$
$j=$ indicates the ${ }^{\mathrm{j}}$ th satellite templates
$\mathrm{m}=\#$ of satellite templates
$\mathrm{w}_{\mathrm{j}}=>$ weighting for average Factor-of-Error <FoE> value

- $\mathrm{w}_{\mathrm{j}}=\mathrm{m}^{-1}$ (uniform weighting) is used for the general valuation of EM estimates ( $\mathrm{A}_{\mathrm{EM}}$ ) in the study


## Reconstructing the Galaxy's Accretion History

## Some Notable Results I




- Results indicate that we can recover a majority of the luminosity function (LF) of the halo in most cases examined with "high precision" - i.e., within a FoE = 2

Reconstructing the Galaxy's Accretion History Accuracy of stellar mass fractions across halo realizations: <FoE>


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-3 - $2-1$
Duane $\begin{gathered}{[\mathrm{Fe} / \mathrm{H} \text { H] } \mathrm{Hee}(\mathrm{SHAO})}\end{gathered}$
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Reconstructing the Galaxy's Accretion History Accuracy of stellar mass fractions across


Duane $\begin{gathered}{[\mathrm{Fe} \text {. } \mathrm{M} \text { Hee }} \\ \text { (SHAO) }\end{gathered}$
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## Reconstructing the Galaxy's Accretion History Some Notable Results II


$\star$ Results indicate that we can recover the accretion history of the halo in most cases examined with "high precision" - i.e., within a FoE = 2

## Reconstructing the Galaxy's Accretion History

## Comparison of results across all STS



## Reconstructing the Galaxy's Accretion History

## Reliability of results across all STS



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## Reconstructing the Galaxy's Accretion History Some Notable Results III



- $w_{i}=\left(A_{T}\right) J^{-1}$ is used for low-mass dwarf weights early Universe. sensitive to older accretion events involving low-luminous dwarfs e.g. ultra-faint dwarfs - precisely those events that are too ancient to be seen by phase-space studies of stars and too faint to be seen by high-z studies of the
$\checkmark$ Method is particularly
- $w_{j}=\left(A_{T}\right)$, is used for high-mass dwarf weights


## Reconstructing the Galaxy's Accretion History

- Test of simulation models: \# of "stars" observed range from $\sim 10^{3}-3 \times 10^{4}$
- Planned APOGEE halo observations: \#'s range from ~1000, ~10,000, 25,000+ halo field stars
What about LAMOST???
(from G. Zasowski et al. 2013)

Summary: Typically, we can recover the accretion history for $\gtrsim 75-90 \%$ of the total stellar halo mass to within a factor of $\sim 2$ in sim halos

Future Work: Development of more realistic CARD models for dwarf galaxy templates

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## So...

Summary: Typically, we can recover the accretion history for $\gtrsim 75-90 \%$ of the total stellar halo mass to within a factor of $\sim 2$ in sim halos ... and for the MW halo given...
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