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Background

- Autistic individuals have a lifelong need for services across the lifespan¹, but studies over the last two decades have revealed gaps in service coverage² exacerbated by inequitable access based on race, ethnicity, and socioeconomic status^{3,4}.
- Despite this emerging literature, our understanding of longitudinal intervention use is limited. Studies examining this question^{5,6} have studied demographically restricted samples or examined long-term (lifespan) changes, leaving trajectories of intervention use at the sub-yearly scale still unexplored.

Objectives:

- 1. To identify and describe trends in trajectories in intensity of intervention use for autistic children
- 2. To examine the association between different trajectories and child demographic factors

Methods

Participants

- As part of their participation in a multisite longitudinal biomarker study, parents of school-age (N=280) children on the autism spectrum reported the number of hours of each of 18 types of intervention their children received during a series of five consecutive six-week intervals. Parents also reported a range of demographic information, including race/ethnicity of child, parental education, and household income (Table 1)
- The Differential Ability Scale, 2nd Edition (DAS-II)⁷ was used to measure cognitive ability. Children were required to have a General Conceptual Ability (GCA) score (full-scale IQ) score between 60 and 150.

| Table 1 | N=188 (141 Male) | | | |
|------------------------------------|--------------------------|--|--|--|
| Age at Time 1 (years) | | | | |
| Mean (SD) [Range] | 8.57 (1.66) [6.01,11.5] | | | |
| IQ | | | | |
| Mean (SD) [Range] | 98.6 (18.0) [60.0, 150] | | | |
| ADOS-2 comparison score | | | | |
| Mean (SD) [Range] | 7.70 (1.84) [4.00, 10.0] | | | |
| | | | | |
| American Indian / Alaskan Native | 1 (0.5%) | | | |
| Asian | 10 (5.3%) | | | |
| Black or African American | 16 (8.5%) | | | |
| White | 129 (68.6%) | | | |
| Mixed race | 27 (14.4%) | | | |
| Other | 5 (2.7%) | | | |
| Ethnicity | | | | |
| Hispanic or Latino | 30 (16.0%) | | | |
| Highest level of parental | | | | |
| education Less than high school | 1 (0.5%) | | | |
| High school degree | 5 (2.7%) | | | |
| GED | 3 (1.6%) | | | |
| Some college | 28 (14.9%) | | | |
| Associate's degree | 13 (6.9%) | | | |
| | | | | |
| Bachelor's degree | 40 (21.3%) | | | |
| Some graduate work | 14 (7.4%) | | | |
| Graduate degree | 82 (43.6%) | | | |
| Unsure | 2 (1.1%) | | | |
| Family annual income | | | | |
| \$0-5,000 \$F 001 10 000 | 1 (0.5%) | | | |
| \$5,001-10,000 | 3 (1.6%) | | | |
| \$10,001-15,000 | 1 (0.5%) | | | |
| \$15,001-25,000 | 7 (3.7%) | | | |
| \$25,001-35,000 | 13 (6.9%) | | | |
| \$35,001-50,000 | 15 (8.0%) | | | |
| \$50,001-75,000 | 25 (13.3%) | | | |
| \$75,001-100,000 | 29 (15.4%) | | | |
| \$100,001-150,000 | 44 (23.4%) | | | |
| > \$150,000 | 48 (25.5%) | | | |
| Not Reported | 2 (1.0%) | | | |

- criteria¹⁰.
- whose included in the analysis (N=188).

Intervention Intensity Measures

clustering and regression analyses.

Analysis

- Monthly Changes in Weekly Intervention **Hours:** Difference scores between consecutive month.
- Clustering Fréchet distance partitioning¹¹ (Figure 3).
- Modelling Cluster Membership into less sparse categories (Figure 4).

Exploring seasonal trajectories in intensity of intervention use for children on the autism spectrum

Diagnosis was based on the on the Autism Diagnostic Observation Schedule-2 (ADOS-2)⁸, the Autism Diagnostic Interview-Revised (ADI-R)⁹ and expert clinical judgment of DSM-5

• Only participants with all 5 data points and dates on the intervention forms matched their site assessment dates were

 Total Intervention (Ix) Hours per Week: Intervention hours for all 18 types of intervention were summed for each time point and divided by the number of weeks in each interval. Data were natural log-transformed for

measures of Ix hours/week were calculated for individual trajectories and aggregated by One-tailed Student's t-tests were performed to test difference from zero (Figure

Weekly Intervention Hours: Individual trajectories were first clustered using a traditional k-means clustering algorithm via Euclidean distance partitioning to determine an appropriate number of clusters. The partition with the ideal number of clusters was identified by the lowest Bayesian Information Criterion (BIC). The trajectories were then re-partitioned using a shape-respecting k-means algorithm using

with **Demographic Independent Variables:** A multinomial logistic regression model was run with cluster membership as the dependent variable, and age, IQ, ADOS score, race, ethnicity, education, and income as predictors. Race, income, and education were coalesced

Fig 1 Change in Total Intervention Hours Across Time



- January (t = -2.45, p = 0.017) (Figure 2).
- and 4.



the summer and ended in the fall, while Low-Decline displays the opposite pattern (**Figure 4**, red highlights).



• Monthly changes in intervention hours display significant decreases for both August (t =-2.59, p=0.012) and

• Traditional k-means clustering yielded an ideal partition of 6 clusters (BIC = 153.5). Re-partitioning into 6 clusters with a shape-respecting k-means algorithm yielded the 6 clusters and mean trajectories described in **Figures 3**

• Qualitatively, transitions into and out of the summer months seem to partly account for rising and declining trends in cluster means. For example, the Low-Rise cluster includes many participants that began their visits in

- cluster.
- An increase in age makes it less likely that cluster.
- An increase in ADOS score makes it Low-Stable cluster.
- An increase in IQ score makes it (slightly) cluster.

- life and educational progress measures.

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Where discovery inspires care

Results

• Given the homogeneity of our sample in race, income, and education, some of the clusters have no lowincome, Hispanic, or individuals with parents at lower educational levels. As such, only age, IQ, and ADOS score were included as predictors for the multinomial logistic regression. Relative risk ratios (RRR) were derived by exponentiating the regression coefficients of the model, and p-values were computed via a two-tailed z-test based on the standard error of the coefficients. Risk ratios are relative to the Low-Stable

a given participant will be in the High cluster compared to the Low-Stable

more likely that a participant will be in either Medium cluster compared to the

less likely that a participant will be in either Low cluster or the Medium-Decline

| Table 3 | Age (Years) | | ADOS CSS | | IQ | |
|-----------------------|-------------|-------|----------|-------|-------|---------|
| | RRR | Р | RRR | p | RRR | р |
| Low-Decline | 0.810 | 0.155 | 1.063 | 0.642 | 0.968 | 0.028 |
| Low-Rise | 0.909 | 0.556 | 1.030 | 0.834 | 0.966 | 0.034 |
| Medium-Decline | 0.749 | 0.082 | 1.380 | 0.045 | 0.938 | < 0.001 |
| Medium-Rise | 0.761 | 0.096 | 1.413 | 0.025 | 0.982 | 0.246 |
| High | 0.555 | 0.035 | 1.523 | 0.115 | 0.966 | 0.159 |
| | | | | | | |

Conclusions

• Clustering the longitudinal trajectories in intensity of intervention use for autistic children yields clusters that not only reflect differences in absolute intensity of services received (High, Medium, Low), but also temporal instability associated with monthly change.

• Cross-sectional work on intervention or service use for autistic children should consider the effect of seasonality when analyzing intensity at a single time point in order to avoid possible confounds.

• The decrease in intervention hours during August and January is most likely attributable to interruptions in the school year, and a consequent lapse in school-based service delivery. Future work with access to data on intervention setting (school, home, clinic) and funding (public, private) is needed to confirm this hypothesis and better assess the extent and impact of service coverage in this population.

• Previous work has found racial and socioeconomic group differences in intervention use¹² that could not be evaluated in the present sample and should be studied in larger and more heterogeneous samples.

• General trends in relative risk ratios suggest that younger children with higher ASD symptomatology are more likely to have high intensity intervention utilization over time.

• Further research is also needed to properly ascertain the impact of short-term interruptions on quality of

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