# I Am ALTREP (And So Can You!)

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The Year: R v0-3.4 (1997- 2018)

## You Know What The R C API Needs?



 $\sim$  Me probably, circa 2016

Two primary sections

► SEXP header







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  - Length
  - SEXP type
  - Various other info

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  - The values of the vector elements

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Atomic vector objects were tightly coupled with their data

header+payload contiguous in memory

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- payload data in simple array format

# An Incomplete History of (Not) Duplicating Data in R < 3.6.0



Pass-by-value semantics

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  - Duplicate then, and only then

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- Modifying attributes duplicates only the "container" list

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This Worked Well, Obviously

No way for compressed/shared/out of core data to interact with R internals

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- Full duplication on modifying of atomic vector attributes
- No way for vectors to retain information about themselves
  - Sortedness, presence of NAs, etc

# The Idea of ALTREP

## Atomic Vectors, By Way Of







# Design Intent

Generalize storage of data payload for atomic vector SEXPs
Implement "Smart Vectors"

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- Implement "Smart Vectors"
- Decouple data and attributes
- Completely transparent at the R level







#### Location

- In memory
- Out of core
- Owned by another process/object

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  - Efficient representations
  - E.g., compact integer/real sequences







sortedness



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- lack of NAs

### Know metadata about themselves

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Fully compatible with R internals

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  - Implemented by Luke for 3.6.0 for vectors > certain size

# How to Spot an ALTREP - R Code Edition



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  exception: hooks to call ALTREP methods





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## The Deets

# ALTREP

## One Bit To Rule Them All

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 ALTREP(x) function checks the bit

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Contains method table

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Contains method table

R\_altrep\_inherits only API provided, no getter/setter

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Data 2

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- "Often" placeholder for "Expanded" version
- ALTREP Class
  - Contains method table
  - R\_altrep\_inherits only API provided, no getter/setter
- Currently Implemented as CONS cells, but this may change without warning

## How R Internals Interact With Vectors





Access data (payload)Modify data<sup>^</sup>

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- Modify data<sup>^^</sup>
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- (Un)Serialize

Define Methods Which

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- Remember, ALTREPS should be passable to all R internal functions

# Select ALTREP Class Methods



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- Don't define USE\_RINTERNALS

If Someone on R-Core Tells You Not To Do Something in C Code





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  - Yes, even you.

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- Often just duplicate into std SEXP vector and use that from now on

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  - pointer to full data array

#### int Elt(SEXP x, R\_xlen\_t i)

## int Elt(SEXP x, R\_xlen\_t i) Return value of vector at single position

#### Sortedness in ALTREP

```
enum {SORTED_DECR_NA_1ST = -2,
    SORTED_DECR = -1,
    UNKNOWN_SORTEDNESS = INT_MIN, /*INT_MIN is NA_INTEGE.
    SORTED_INCR = 1,
    SORTED_INCR_NA_1ST = 2,
    KNOWN_UNSORTED = 0};
```







Always return an enum value by name

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- and is not sorted in either directoin

## Creating ALTREP Class

```
static void InitVWindowRealClass(DllInfo *dll)
{
    R_altrep_class_t cls =
    R_make_altreal_class("vwindow_real", "vectorwindow", dl
```

```
/* ALTREP methods */
R_set_altrep_Inspect_method(cls, vwindow_Inspect);
/* etc */
```

#### /\* ALTVEC methods \*/

R\_set\_altvec\_Dataptr\_method(cls, vwindow\_Dataptr);
/\* etc \*/

```
/* ALTREAL methods */
R_set_altreal_Elt_method(cls, vwindow_real_Elt);
/* etc */
```

#### Be extremely careful and conservative

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  - Mark things as not-mutable to get read-only shared access to memory

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Always use those even in your own methods

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Always use those even in your own methods

Do not write C code which calls R\_altrep\_data\* or especially R\_set\_altrep\_data\* outside of ALTREP methods

#### R Internal Data Access API

#### Accessing the Data



Accessing Full Data (Integer Vector)

INTEGER - returns int \* to full data in array form

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- (\*) INTEGER\_RO returns const pointer

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- (\*) INTEGER0 efficiently return pointer for non-ALTREPs
- (\*) INTEGER\_RO returns const pointer
- (\*) INTEGER\_OR\_NULL returns NULL pointer if ALTREP "prefers not to" populate full data array
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Should be used in your C code where possible

### Retrieving Partial Data

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  - Copies data so not ALTREP destructive

### How Not To Talk To ALTREPs

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- INTEGER\_ELT in tight loop painfully slow



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- ITERATE\_BY\_REGION\_PARTIAL(|0)
  - Same as above but specify starting position and count

### An Example - which Internals

(Part of) the C code implementing the which R function:

```
int ioffset = 1;
int *buf = (int *) R_alloc(len, sizeof(int));
/* use iteration macros to be ALTREP safe <snip> */
ITERATE_BY_REGION(v, ptr, idx, nb, int, LOGICAL, {
    for(int i = 0; i < nb; i++) {</pre>
    if(ptr[i] == TRUE) {
        buf[j] = ioffset + i; // offset has +1 built is
        j++;
    }
    }
    ioffset += nb; // move to beginning of next buffer
});
len = j;
// buf has ints in it and we're returning ints, <snip>
PROTECT(ans = allocVector(INTSXP, len));
```

## Example ALTREP packages

https://github.com/ALTREP-examples

## Acknowledgements

- Luke Tierney
- Michael Lawrence
- Tomas Kalibera
- Mike Smith and Bioc Devel Forum
- You

## Full List of ALTREP Methods

# ALTREP Class Methods (All ALTREP Types)

- UnserializeEX
- Unserialize
- Serialized\_state
- DuplicateEX
- Duplicate
- Coerce
- Inspect
- Length

## ALTVEC Class Methods (Vectors)

ALTREP methods, plus

- Dataptr
- Dataptr\_or\_null
- Extract\_subset

## ALTINTEGER, ALTREAL Class Methods

- ▶ Elt
- Get\_region
- Is\_sorted
- No\_NA
- Sum
- ▶ Min
- ► Max

# ALTLOGICAL Class Methods

- Elt
- Get\_region
- Is\_sorted
- ► No\_NA
- Sum

## ALTRAW/ALTCOMPLEX Class Methods

- Elt
- Get\_region

## ALTSTRING

- Elt
- Set\_elt
- Is\_sorted
- ► No\_NA