

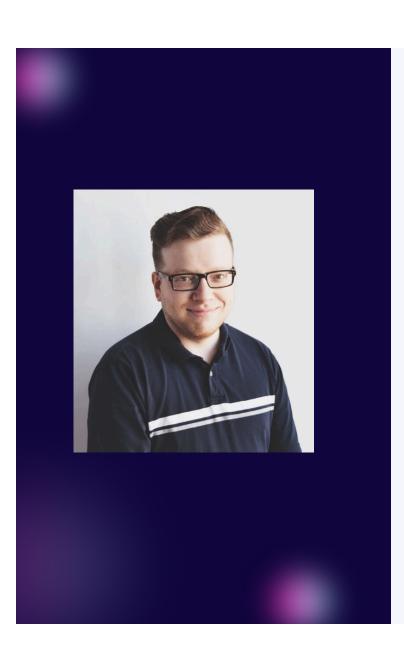
**Lessons from Pandium's Experimentation with LLMs** 

Presented by Shon Urbas



## **Agenda**

- 1. What is Pandium
- 2. Our Al Journey: The Early Days
- 3. The Smallest Problem: JSON Key Path Mapping
- 4. Building the Foundation
- 5. A Rekindling: Al in Production July, 2024
- 6. The Revival: Q4 2024 Success
- 7. Live Demo
- 8. Key Lessons Learned
- 9. The Future of AI in Integration Development
- 10. Closing: The Real Al Revolution



## **Shon Urbas**

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- CTO & Co-Founder of Pandium
- Former Platform Enginering Manager at Handshake (Aquired by Shopify)

# What is Pandium?



#### What is Pandium?

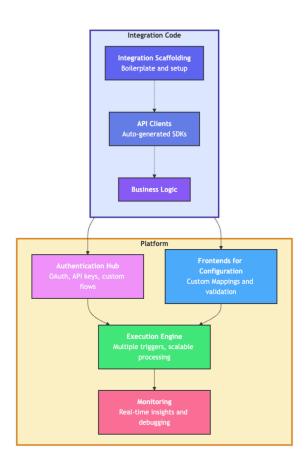
#### **The Integration Challenge**

Our typical engineer users face:

- **Time sink:** 60-80% of development time on integrations, not core features
- Complexity creep: Each integration touches authentication, data mapping, error handling, rate limiting
- Maintenance burden: APIs change, breaking existing integrations

## **What is Pandium?**

#### **Pandium's Solution**





#### Phase 1: The "Whole Shabang" Approach (Birth of ChatGPT Era)

#### Late 2022: Ambitious but Naive

- Goal: Generate entire integrations from natural language prompts
- Reality: Models produced syntactically correct but functionally broken code

**Example**: "Connect Salesforce to Slack"  $\rightarrow$  200 lines of code that didn't actually work, forget about at scale

#### **The Expert Partnership Experiment**

#### Mid-2023: Bringing in the Consultants

- Partnered with AI consulting firms
- Promise: "We'll make this production-ready"
- Results:
  - 3x longer timelines then quoted
  - Couldn't even approach doing the whole thing
  - Drove us to think smaller so that's good, but even failed at that
  - Key insight: Hype was ahead of practicality

The Pivot: From Sky-High to Surgical

Discovery: Most integration work doesn't need Al

- 90% can be handled deterministically
- 10% requires intelligent transformation
- Focus shift: Target the 90% that we can, and give the AI stuff more time.

# The Smallest Problem: JSON Key Path Mapping



## The Smallest Problem: JSON Key Path Mapping

#### The "Aha!" Moment

**Problem:** Mapping arbitrary JSON structures

```
// Source API
{
   "customer_info": {
      "full_name": "John Doe",
      "contact": {"email": "john@example.com"}
}

// Target API expects
{
   "name": "John Doe",
   "email_address": "john@example.com"
}
```

```
$.customer_info.full_name -> $.name
$.customer_info.contact.email -> $.email_address
```

# **Building the Foundation**



## **Building the Foundation**

#### What We Automated Deterministically

**Q4 2024: Focus on the 90%** 

#### **API Client Generation**

- Parse OpenAPI specs
- Generate type-safe
   SDKs
- Handle authentication patterns

#### **Project Scaffolding**

- Standard project structure
- Configuration templates
- Testing frameworks

#### **Documentation**

- Auto-generated API docs
- Integration guides
- Specification

# A Rekindling: Al in Production July, 2024



## A Rekindling: Al in Production July, 2024

#### Fresh off our JSON mapping struggles, I was convinced AI was all hype

- My brilliant idea: Submit talk proposal "Al Integration Hype vs Reality: Why It Doesn't Work"
- Conference committee's response: REJECTED ○

#### What I Learned:

- Peoples enthusiasm in exploring the space was infectious
- Not all the things shown were production ready, but that wasn't really the point
- Lots of clever design patterns.
- Early glimpses of what we'd later call "agentic programming"

**Key insight:** Reinforced the thought that by working on the deterministic parts first, we could build a foundation for a successful Al model



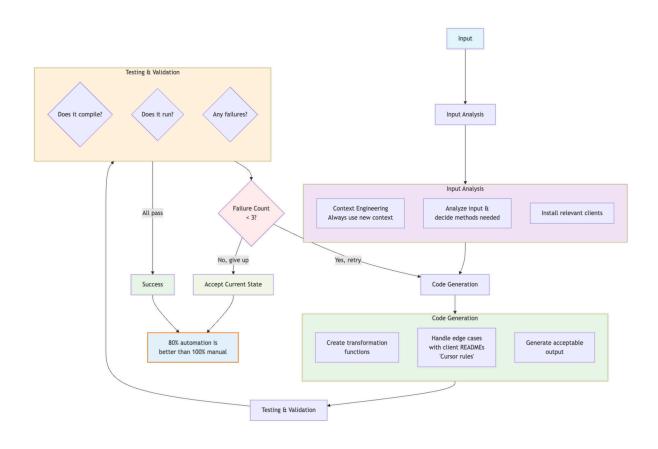
#### What Changed?

#### **Technology maturation:**

- Much larger contexts, but still has constraints.
- "Context Engineering:" i.e. making sure only needed info is in prompt
- More reliable code generation

#### Our refined "Agentic" approach:

- Narrow Al scope to mapping functions only (a huge upgrade from just JSON PATHs)
- Robust testing and validation
- Iterative failure handling



#### The "Give Up Early" Principle

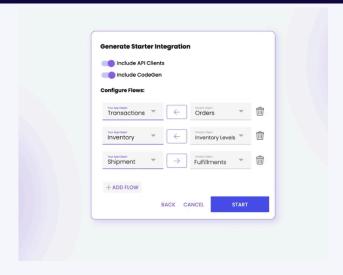
**Key insight:** Not everything needs to be perfect. i.e. We only try 3 times, for a successful flow before moving on.

- **Deterministic parts:** Keep them deterministic
- Al parts: Allow controlled failure
- Success criteria: 90% automation is better than 100% manual

# **Example**



## **Example: Inputs**



#### The "Prompt" for user:

**Connector A: ActiveCampaign** 

**Resource A: Sales** 

**Connector B: MindBody** 

**Resource B: Order** 

## **Example: Method Defs**

#### **Example of a "Product"**

```
"listProducts": {
        "requestType": "ProductsApiListProductsRequest",
        "responseType": "Promise<AsyncGenerator<ShipbobProductsApiViewModelsPublicProductViewModel, any, unknown>>",
           "ProductsApiListProductsRequest": "interface ProductsApiListProductsRequest { readonly referenceIds?: Array<string>; readonly page?: number; readonly limit?: number; readonly iDs?: Array<number>; readonly search?: string; readonly
activeStatus?: ShipbobProductsCommonModelsProductActiveStatus; readonly bundleStatus?: ShipbobProductsCommonModelsProductBundleStatus; readonly shipbobChannelId?: number; }",
           "ShipbobProductsCommonModelsProductActiveStatus": "const ShipbobProductsCommonModelsProductActiveStatus { readonly Any: \"Any\"; readonly Active: \"Active\"; readonly Inactive: \"Inactive\"; }\n\nexport type
ShipbobProductsCommonModelsProductActiveStatus = typeof ShipbobProductsCommonModelsProductStatus[keyof typeof ShipbobProductsCommonModelsProductActiveStatus];",
            "ShipbobProductsCommonModelsProductBundleStatus": "const ShipbobProductsCommonModelsProductBundleStatus { readonly Any: \"Any\"; readonly Bundle: \"Bundle\"; readonly NotBundle: \"NotBundle: \"NotBundle\"; }\n\nexport type
ShipbobProductsCommonModelsProductBundleStatus = typeof ShipbobProductsCommonModelsProductBundleStatus[keyof typeof ShipbobProductsCommonModelsProductBundleStatus];",
            "ShipbobProductsApiViewModelsPublicProductViewModel": "interface ShipbobProductsApiViewModelsPublicProductViewModel { id?: number; reference_id?: string | null; bundle_root_information?:
ShipbobProductsApiViewModelsPublicBundleRootInformationViewModel; created_date?: string; channel?: ShipbobProductsApiViewModelsPublicChannelViewModel; sku?: string | null; name?: string | null; barcode?: string | null; gtin?: string | null; upc?: string
| null; unit_price?: number | null; total_fulfillable_quantity?: number; total_onhand_quantity?: number; total_committed_quantity?: number; fulfillable_inventory_items?: Array<ShipbobProductsApiViewModelsPublicInventoryItemViewModel> | null;
fulfillable_quantity_by_fulfillment_center?: Array<ShipbobProductsApiViewModelsPublicFulfillmentCenterQuantityViewModel> | null; }",
            "ShipbobProductsApiViewModelsPublicBundleRootInformationViewModel": "interface ShipbobProductsApiViewModelsPublicBundleRootInformationViewModel { id?: number; name?: string | null; }",
           "ShipbobProductsApiViewModelsPublicChannelViewModel": "interface ShipbobProductsApiViewModelsPublicChannelViewModel { id?: number; name?: string | null; }",
            "ShipbobProductsApiViewModelsPublicFulfillmentCenterQuantityViewModel": "interface ShipbobProductsApiViewModelsPublicFulfillmentCenterQuantityViewModel { id?: number; name?: string | null; fulfillable_quantity?: number; onhand_quantity?:
number: committed quantity?: number: }".
            "ShipbobProductsApiViewModelsPublicInventoryItemViewModel": "interface ShipbobProductsApiViewModelsPublicInventoryItemViewModel { id?: number; name?: string | null; quantity?: number; }"
```

## Example: All + Imports

```
Section Control of Con
```

All the Code Generated

```
import MindbodyClient, { SaleApiGetSalesRequest } from '@pandium/mindbody-client';
import ActivecampaignClient, {
   DefaultApiCreateOrderRequest,
   CreateOrderRequest,
   CreateOrderRequestEcomOrder,
   CreateOrderRequestEcomOrderOrderProducts
} from '@pandium/activecampaign-client';
import { Config } from '../lib.js';
```

Imports

## Example: Mapper

```
const saleToOrder = (sale: any, connectionId: string, customerId: string): DefaultApiCreateOrderRequest | undefined => {
      const orderProducts: CreateOrderRequestEcomOrderOrderProducts[] = sale.Items?.map((item: any) => ({
        name: item.Description || 'Unknown Product',
       price: item.UnitPrice || 0,
        quantity: item.Quantity || 1,
        externalid: item.Id?.toString() || `item-${Date.now()}`,
        description: item.Description || '',
        sku: item.Id?.toString() || ''
      })) || [];
      const ecomOrder: CreateOrderRequestEcomOrder = {
        externalid: sale.Id?.toString() || `sale-${Date.now()}`,
        source: 'Mindbody',
        email: sale.ClientEmail || '',
       orderProducts: orderProducts,
       totalPrice: sale.TotalAmount || 0,
        taxAmount: sale.TaxAmount || 0,
        discountAmount: 0, // Mindbody doesn't provide discount directly
        currency: sale.PaymentMethod?.Currency || 'USD',
        connectionid: parseInt(connectionId),
        customerid: parseInt(customerId),
        orderNumber: sale.Id?.toString() || '',
        externalCreatedDate: sale.SaleDateTime || new Date().toISOString()
      const orderRequest: CreateOrderRequest = {
       ecomOrder: ecomOrder
      return {
       createOrderRequest: orderRequest
    } catch (error) {
      console.error(`There was an error in transforming Mindbody sale ${sale.Id || 'unknown'} into Activecampaign order payload: ${error}`);
    return undefined;
```

## Example: The loop

```
49 v export const syncMindbodySalestoActivecampaignOrders = async(
        mindbody: MindbodyClient,
       activecampaign: ActivecampaignClient,
       config: Config
       const connectionId = config.activecampaign_connection_id;
       const customerId = config.activecampaign_customer_id;
       if(!connectionId) {
        console.error('Cannot sync Mindbody sales to Activecampaign orders: missing activecampaign_connection_id config');
         console.error(`----- STOPPING SYNC OF MINDBODY SALES -----`);
         console.error('Cannot sync Mindbody sales to Activecampaign orders: missing activecampaign_customer_id config');
         console.error(`----- STOPPING SYNC OF MINDBODY SALES -----
                    ---- STARTING TO SYNC MINDBODY SALES TO ACTIVECAMPAIGN ORDERS ------
        const request: SaleApiGetSalesRequest = {};
        const salesGenerator = await mindbody.getSales(request);
       for await (const sale of salesGenerator) {
         const saleData = sale as any; // Type assertion to handle the 'never' type
         const orderPayload = saleToOrder(saleData, connectionId, customerId);
         if (!orderPayload) continue;
           await activecampaign.createOrder(orderPayload);
            console.error(`Successfully created an Activecampaign order for Mindbody sale ${saleData.Id || 'unknown'}');
           console.error(`There was an error in creating Activecampaign order based on Mindbody sale ${saleData.Id || 'unknown'}: ${error}`);
        console.error(
                        -- COMPLETED SYNCING MINDBODY SALES TO ACTIVECAMPAIGN ORDERS -----
```

## **Example: Result**

#### 99.999% deterministic code

User given (including API clients) ~200k of code to start integration With 96 lines trully generated by LLM. Rest is all normal Code Gen

# **Key Lessons Learned**



## **Key Lessons Learned**

#### **Technical Lessons**

- Scope Limitation: Al excels at narrow, well-defined tasks
- Hybrid Approach: Combine AI with deterministic systems
- Validation is Critical: Al output must be thoroughly tested
- Failure Recovery: Build systems that handle AI mistakes gracefully

## **Key Lessons Learned**

#### **Business Lessons**

- Solution-First Thinking: Find problems that fit AI capabilities
- Avoid "Al for Al's Sake": Value must be demonstrable
- Developer Experience: Al should enhance, not replace, developer control
- Iterative Development: Start small, prove value, scale up

# The Future of AI in Integration Development



## The Future of AI in Integration Development

#### What's Next for Pandium

#### **Short-term (next 3 months):**

- Multiple Objects to Single Objects Flows
- Event Based
- CLI Access

#### **Medium-term (3+ months):**

- Forking and Build (i.e. I have a Xero Integration... now make a QBO one.)
- Al Assisted API Client generation
- Automated performance tuning

## The Future of AI in Integration Development

#### **Industry Predictions**

#### What will happen:

- Al will augment, not replace, developers
- Hybrid human-Al workflows will become standard
- Domain-specific AI tools will outperform general-purpose ones (just like real life)

#### What won't happen:

- Complete automation of complex integrations
- Al replacing the need for technical expertise
- One-size-fits-all Al solutions

# **Closing: The Real Al Revolution**



## **Closing: The Real Al Revolution**

#### **The Bottom Line**

#### Al's true value in integration development:

- Not: Building entire systems from scratch
- But: Accelerating the tedious, repetitive work
- Result: Developers focus on business logic

# **Questions?**







**Shon Urbas** 

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**Thank You! Any Questions?**